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A Functional Toxicogenomics Approach to Characterize Genotoxicity Mechanisms of the Environmental Contaminant Trichloroethylene

By

Vanessa De La Rosa

A dissertation submitted in partial satisfaction of the requirements for the degree of

Doctor of Philosophy In Molecular Toxicology in the Graduate Division of the University of California, Berkeley

Committee in charge:

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Fall 2014

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Abstract

A Functional Toxicogenomics Approach to Characterize the Genotoxicity Mechanisms of the Environmental Contaminant Trichloroethylene

by

Vanessa De La Rosa

Doctor of Philosophy in Molecular Toxicology

University of California, Berkeley

Professor Christopher Vulpe, Chair

Trichloroethylene (TCE) is an environmental contaminant and human carcinogen that remains an environmental health hazard decades after its introduction. While evidence from rodent and epidemiological studies suggests a mutagenic mode of action mediating TCE kidney carcinogenesis, there remains a lack of molecular evidence to support the association between TCE exposure, mutagenesis and cancer. A clearer understanding of the molecular mechanisms mediating TCE exposure and cancer will strengthen risk assessment analyses, exposure standards and policies regarding TCE cleanup. Advances in genomic technologies make a functional genomics approach in *Saccharomyces cerevisiae* an appealing platform for elucidating toxicity mechanisms for a range of environmental contaminants. The studies of this dissertaion aim to utilize functional profiling platforms in model organisms to (1) identify novel insights into heavy metal and TCE toxicity; (2) assess and characterize the genotoxicity of TCE; and (3) identify candidate human toxicant susceptibility genes.

Heavy metals are widely distributed environmental contaminants increasingly associated with a range of adverse health effects, including neurological disease, developmental abnormalities and cancer. We used functional profiling in yeast to identify ion specific and common molecular pathways that mediate heavy metal toxicity. Our studies with the metals cadmium, lead and zinc revealed that a common subset of pathways and processes, including intracellular trafficking, vacuolar function and protein catabolism are required in response to heavy metal exposure. In the presence of Pb, Cd, and Zn, mutants deficient in components of iron and copper metabolic pathways were hypersensitive, suggesting that metal toxicity is mediated by alterations in iron metabolism. Copper is required for iron uptake, suggesting iron deficiency may be a secondary effect of copper deficiency. Thus, some of the cytotoxic effects associated with these metals could result from disruption of metal homeostasis. These studies revealed the importance of metal homeostasis and identified additional mechanisms important in heavy metal toxicity.

A similar functional genomics approach in yeast was employed to profile trichloroethylene metabolites, including the implicated penultimate metabolite in the kidney, dichlorovinyl cysteine (DCVC). Specific DNA repair pathways such as 1) error prone translesion synthesis repair 2) nucleotide excision repair and 3) homologous recombination were required in response to DCVC exposure. The phenotypic profile generated by DCVC showed high similarity to those

of known DNA interstrand crosslinking agents, implicating direct DNA damage and mutagenic repair as a potential mechanism of renal toxicity. A combination of functional studies in the avian DT40 system and human cell lines deficient in DNA repair were conducted to confirm and further characterize the DNA damage repair response to DCVC. While DNA repair in eukaryotes is highly conserved, these platforms allowed for additional analysis of DNA repair systems not present in yeast. DT40 translesion synthesis mutants were hypersensitive to DCVC, as observed in yeast and supported a role for mutagenic DNA repair in TCE toxicity. This hypothesis was further supported by an increased frequency of point mutations, insertions and deletions at low DCVC exposure levels. Interestingly, strains defective in the Fanconi anemia (FA) repair pathway and homologous recombination were unaffected and hyper-resistant, respectively, to DCVC exposure. This finding is in contrast to prior studies describing the repair of ICL agents and suggests a recombination independent mechanism for repairing DCVC induced DNA damage. Taken together these *in vitro* studies provide mechanistic evidence supporting a mutagenic mode of action for TCE that is mediated by the metabolite DCVC.

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Dedication

This work is dedicated to those I love the most-Alyssa, Chris, Dad, Mamasita and the Reynas

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Abbreviations

ADH- alcohol dehydrogenase ALDH- aldehyde dehydrogenase ANOVA - analysis of variance ATSDR – Agency for Toxic Substances and Disease Registry AUC – area under the curve CGDP- cysteine glutamyl dipeptidase CH- chloral hydrate CYP- cytochrome P450 DCA- dichloroacetic acid DCVC- dichlorovinyl cysteine DCVG- dichlorovinyl glutathione DCVT- dichlorovinvl thiolate DSB- double strand break DSSA- Differential strain sensitivity analysis DT40- avian lymphoblast cell line **EPA-** Environmental Protection Agency FA- Fanconi anemia GFP – green fluorescent protein GGT- gamma glutamyl transpepdidase Gluc-glucuronide GO – Gene Ontology **GSH-** glutathione S-transferase HR-homologous recombination IARC- International Agency for Research on Cancer ICL- interstrand crosslink KIM-1- kidney injury molecule-1 **MN-**micronucleus NER- nucleotide excision repair NHANES - National Health and Nutrition Examination Surveys PCNA- proliferating cell nuclear antigen PDA- parallel deletion analysis ROS- reactive oxygen species TCA- trichloroacetic acid TCE- trichloroethylene TCOH- trichloroethanol TK- thymidine kinase TLS- translesion synthesis TS- template switching Ub- ubiquitin UGT- uridinediphosphoglucuronyl transferase VHL- von Hippel Lindau WES- whole exome sequencing WS- Werner's syndrome WT – wild-type YPD - yeast extract-peptone-dextrose

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CHAPTER I

INTRODUCTION

History of Trichloroethylene

Trichloroethylene (TCE) is a chlorinated organic solvent, environmental contaminant and human carcinogen (1,2). Introduced in the 1920's as a replacement for chloroform and ether, TCE was utilized for medical anesthesia, dry cleaning processes, and as an industrial metal degreaser (1,3). By 1990, metal cleaning use accounted for between 80 and 95% of the trichloroethylene produced in the United States and Western Europe (4). Amid health concerns, the use of TCE declined at the start of the 21st century, but continues to be used mostly as a degreaser in industrial processes (4). This reduction in use has resulted in decreased occupational exposure, but TCE remains an environmental health hazard due to improper disposal and leaching from storage tanks into the surrounding soil, air and water (2,5). TCE is the most common water contaminant with an estimated 9-34% of drinking water sources contaminated with TCE and is the 3rd most prevalent contaminant at Superfund waste sites (2,5). Additionally, chronic indoor air exposure via TCE vapor plumes has become increasingly more common and relevant for the general population, though TCE blood levels remain low (6,7).

Role of Metabolism in TCE Toxicity

TCE is an electrophilic molecule that undergoes complex metabolism via two pathways, cytochrome P450 (CYP)-dependent oxidation and glutathione (GSH) conjugation (Fig. 1.1) (8). The preferrential pathway, oxidative metabolism, occurs mainly in the liver in both rodents and humans but has been observed in the lungs, testses, and kidney to lesser extents (4). Oxidative mtabolsim is mediated mainly by CYP2E1, but additional CYP enzymes such as CYP1A1/2, CYP3A4, and CYP2A6 have also been implicated in various steps of TCE metabolism (8,9). The chemistry of TCE and metabolism by CYP2E1 suggests a TCE-O-CYP intermediate followed by the formation of a highly reactive TCE epoxide intermediate, though these predicted metabolites have not been observed or measured in any cellular system (10). The initial CYP reaction yields a chloral hydrate metabolite, which is reduced to trichloroethanol (TCOH) by alcohol dehydrogenase (ADH) or oxidized by aldehyde dehydrogenase (ALDH) to form trichloroacetic acid (TCA). Trichloroethanol can undergo glucuronidation, forming a TCOH-glucuronide that has been measured as the major metabolite in urine (11). The glutathione conjugation pathway is a common detoxification pathway for electrophilic xenobiotics, but has been shown to yield bioactive metabolites that are more toxic than the parent compound for a variety of organic halogens (12,13). Mass spectrometry measurements in rodents with CYP-mediated metabolism saturated by TCE showed glutathione conjugation metabolites are formed less than oxidative metabolites by a whole order of magnitude indicating that glutathione conjugation serves as a secondary mechanism (14). While oxidative metabolism occurs primarily in the liver, GSH conjugation of TCE is concentrated to the kidney due to higher levels of gamma glutamyl transpeptidase (GGT), cysteine conjugate dipeptidases (CGDP) and beta-lyase levels in the kidney compared to the liver. TCE is conjugated with glutathione by glutathione S-transferase (GST) to form the dichlorovinyl glutathione conjugate. Upon distribution via the hepatic portal vein to the kidney for excretion, DCVG is metabolized by GGT and CGDPs to form the

penultimate reactive metabolite DCVC (8,15,16). In the kidney, DCVC is metabolized by cysteine conjugate beta-lyases to form a potent and highly reactive dichlorovinyl thiolate (DCVT) intermediate that can tautomerize to form a reactive thioketene capable of damaging DNA (12,13).



Figure 1.1. Overview of TCE metabolism and the chemical structures of important metabolites associated predominately with toxicity and carcinogenesis

Numerous studies over the last 25 years have established the role of metabolism in mediating TCE toxicity (8,9,15-17). Oxidative metabolites are associated with liver toxicity and cancer, whereas the glutathione conjugates are implicated in renal toxicity and cancer (15,18,19). Of particular interest are the conjugate metabolites DCVG and DCVC. Both are nephrotoxic, but DCVC is considered the penultimate toxic metabolite causing changes in kidney morphology, renal function and cytotoxicity in vitro and in vivo (20-25). Recent work by Vermeulen et al. reported an increase in the nephrotoxicity biomarker KIM-1 in TCE exposed workers, suggesting that chronic, low level exposures can also cause renal damage in humans (26). Trichloroethylene alone is not considered genotoxic, but DCVG and DCVC have shown mutagenicity in the Ames test, increased unscheduled DNA synthesis, double strand breaks, and chromosomal aberrations, suggesting a mutagenic mode of action (19,21,27-29). Chemical inhibition of glutathione conjugation enzymes *in vitro* and *in vivo* results in decreased nephrotoxicity and mutagenicity, confirming the significant role of metabolism-dependent bioactivation in mediating renal toxicity (8,25,30-32). However, the argument against a mutagenic mode of action is the minute level (less than 0.1% of the total metabolite formation) of DCVC produced and the instability of the reactive thiolate and thioketene intermediates are insufficient to elicit DNA damage and repair (33).

Trichloroethylene and Cancer

The Environmental Protection Agency (EPA) and the International Agency for Research on Cancer (IARC) classify TCE as a human carcinogen by all routes of exposure (5). There is strong evidence from rodent and epidemiological studies supporting the link between TCE exposure and renal cancer (4). The rarity of renal tumors in rodent and human populations makes the findings rather significant. To a lesser extent, evidence supporting associations with TCE exposure and leukemia, liver, and testicular cancers have also been reported (4). The epidemiological evidence regarding kidney cancer and occupational exposure to TCE was first reported in initial cohort studies by Brauch et al. (4,34-36). This was followed by a series of small international case control and cohort studies reporting mixed results on the association between kidney cancer and TCE exposure (4). A more recent meta analysis of all existing studies by Karami et al determined a relative risk ratio of 1.3 to 1.4, supporting an association between TCE and kidney cancer (37). Meta-analysis adjusting for the highest level of TCE exposure increased relative risk to 1.6, suggesting a dose response relationship (37). Occurrence of renal cell carcinoma is associated with mutations in the von Hippel Lindau (VHL) tumor suppressor gene. In the majority of cases, there is a propensity of small base changes, such as insertions, point mutations and deletions that result in loss of VHL function, protein truncation or altered expression (38). Brauch et al. analyzed renal cancer cell tissues for mutations of the VHL gene in TCE exposed workers and reported an increased occurrence of mutations in patients exposed to high concentrations (34,36). A hot spot mutation of cytosine to thymine at nucleotide 454 (C454T) in exon 1 was found in 39% of samples that had a VHL mutation and was not found in renal cell cancers from non-exposed patients. This mutation results in a single amino acid change from proline to serine at codon 81 of the VHL protein (P81S) and causes deregulation of HIF factors in vitro and suppression of apoptosis in tumors (34,39). These initial results suggested a unique genetic signature for TCE exposure and a mechanism for the development of renal cell carcinoma, yet proceeding studies were unable to observe any significant increase in VHL mutations and concluded the high frequency of mutations was irrespective of TCE exposure (35,38). While such findings would provide a link between TCE and renal cancer, inconcistencies in sample size, analysis, risk factors and exposure history render these results inconclusive. There remains a need for molecular evidence supporting a mutagenic mode of action in mediating TCE renal cancer. With the advancement in next generation sequencing and the availability of genome-wide functional profiling platforms, these tools can be utilized in conjunction with human studies to better assess genotoxicity and mutagenic potential as well as identify exposure signatures (40,41).

Functional Genomics: A tool for assessing genotoxicity

Trichloroethylene has been subjected to a battery of traditional genotoxicity tests over the last 25 years, yielding inconsistent results, but suggesting a mutagenic mode of action in mediating renal toxicity and cancer even without adequate mechanistic evidence. This long-lasting approach for identifying and characterizing genotoxicants has relied heavily on a combination of traditional analyses (see Table 1.1), but these tests suffer from high false positive/negative rates and do not offer mechanistic insight on genotoxicity. The Ames test is a bacterial reverse mutation test that detects mutations using strains of *Salmonella typhimurium* (42). Potential mutagens revert mutations present in the strain and restore the functional capability of the bacteria to synthesize

an essential amino acid. While rapid and inexpensive, this system does not accurately portray metabolism, requiring the addition of a metabolically active extract and exhibits poor sensitivity (43,44). Similar forward mutation assays in yeast and mammalian systems include the canavanine resistance (CanR), thymidine kinase (TK) and hypoxanthine-guanine phosphoribosyl transferase (HPRT) tests with mutations measured at the respective loci. The advantage of the thymidine kinase (TK) assay is the autosomal location of the TK locus, which allows for the detection of genetic events such as large deletions and recombination that cannot be detected with the HPRT assay due to it's location on the X chromosome. These tests are more sensitive than the Ames test and have the advantage of metabolism, but suffer from a lack of specificity resulting in false positives (43,44).

Assay	Model System	Endpoint
Ames test	bacteria	mutations
HPRT	mammalian	mutations
Thymidine Kinase (TK)	mammalian	mutations
Micronucleus	mammalian	chromosomal damage
Comet	mammalian	DNA damage
Chromosome aberrration test	mammalian	chromosomal damage
Sister Chromatid Exchange (SCE)	yeast, mammalian	DNA damage
Canavanine	yeast	mutations
FOA	yeast	mutations
PIG-O	DT40	mutations

Table 1.1 Examples of traditional tests used to determine genotoxicity of chemicals

HPRT, hypoxanthine-guanine phosphoribosyl transferase; FOA, 5-Fluoroorotic Acid Monohydrate; PIG-O, phosphatidylinositol glycan complementation group O

In addition to these mutation assays, a suite of chromosomal damage tests has been used both *in vitro* and *in vivo* to determine genotoxicity. The chromosomal aberration (CA) and micronucleus (MN) tests measure structural chromosome aberrations as well as chromosome polyploidy and duplication events. Many compounds that are positive in the CA test are mammalian carcinogens; however, there is not a correlation between this test and carcinogenicity. The sister chromatid exchange (SCE) assay detects reciprocal exchanges of DNA between two sister chromatids of a duplicating chromosome by differentially labeling sister chromatids. The comet assay is a highly sensitive method for measuring DNA strand breaks in individual cells. Again, these assays possess improved sensitivity, but lack specificity, are time consuming and are not amenable to high-throughput testing (43). The persistence of low specificity highlights the need for understanding the mechanisms that mediate genotoxicity in an effort to improve testing.

A functional toxicogenomics approach is amenable to (i) Identifying and characterizing genotoxicants (ii) Providing insight on the molecular pathways involved in mediating genotoxicity and carcinogenicity of toxicants (iii) Identifying novel endpoints to improve genotoxicity testing. With the advancement of gene technologies, functional profiling platforms are available in a variety of model systems, including *S.cerevisiae*, avian cell lines, human cell lines and C. *elegans* that can be utilized in the context of assessing genotoxicity (40). Discussed below are the models of focus for this dissertation.

Yeast

S. cerevisiae has long been a model organism in molecular biology research due to the myriad of resources available to the yeast community. The S. cerevisiae genome is extensively annotated and the majority of the metabolic, signaling, and stress response pathways are conserved in higher eukaryotes. Classical genetic studies in yeast have played a central role in elucidating the highly conserved mechanisms of mammalian DNA repair and genome maintenance (45). With the development of the yeast non-essential diploid deletion collection, genome-wide profiling in yeast has emerged as a tool to enhance our understanding of genotoxicants and DNA repair mechanisms (Table 1.2). The deletion library consists of ~4,600 strains with each strain missing a single non-essential gene and each is uniquely identified by DNA "barcodes" that are flanked by common primer sites (Fig. 1.2) (46). This approach allows for the simultaneous analysis of the entire deletion library, termed parallel deletion analysis (PDA). This approach has proven successful in previous studies investigating toxicity mechanisms across a wide range of toxicant classes including heavy metals, pesticides, and organic solvents (47-51). Several studies have examined a spectrum of chemicals, including novel therapeutics such as platinum acridines and imidazo compounds to determine genotoxicity and construct structure-activity relationships to reduce DNA damage and decrease resistance that is usually associated with chemotherapeutics (Table 1.2).

DT40 Avian cells

The DT40 avian cell line is a leucosis virus transformed B-lymphocyte cell line that undergoes high rates of efficient gene targeting via homologous recombination (52,53). This capability has allowed for the construction of isogenic DT40 cell lines with stable deletions of various DNA repair, cell cycle and signaling genes. Unlike RNAi experiments in mammalian cell culture, DT40 deletion cell lines are more amenable to experimental manipulation and offer full loss of gene function without off-target effects(53). Since their introduction, Takeda *et al.* have and continue to develop sensitive assays to study mechanisms of DNA repair and genotoxicity, including high-throughput viability and mutation assays (53-55). DT40 studies have provided insight on the human DNA damage resposne for a diverse panel of DNA lesions including interstrand crosslinks, base modifications, abasic sites, bulky adducts, single and double strand breaks caused by a variety of alkylating agents, ROS, crosslinking agents, ionizing radiation, and UV rays (54-58). These features make the DT40 system ideal for studying mechanisms of DNA repair and identifying and characterizing unknown genotoxicants.

The availability of functional profiling platforms in these models and others provides a collection of tools well suited for identifying potential genotoxicants, characterizing genotoxicity of chemicals and identifying genetic fingerprints for classes of genotoxicants. This dissertation aims to utlize this approach to identify potential genotoxic mechansisms that mediate the carcinogenesis of the common and often controversial environmental contaminant, trichloroethylene (TCE).

Pool ~4600 tagged deletion strains





Quantify growth by array/sequencing, determine ratio

12 🧲	26 🧲	1.11 🧲 resistant
12 🧲	4 🧲	-1.58 🧲 sensitive
12 🥑	12 🥌	0 🥌 unaffected
control	toxicant	log2 ratio

Figure 1.2 Genome-wide screens in yeast can be conducted in parallel to identify genes required in response to toxicant. ~4600 deletion strains uniquely identified by DNA sequences (barcodes) are pooled and exposed to a toxicant at multiple doses and generation times. Barcodes are amplified from purified genomic DNA by PCR and quantified by hybridization to a microarray or high-throughput sequencing methods. Adapted from (40).

Table 1.2 Summary of functional screens in yeast and avian models to assess genotoxicity of chemicals.

Organism	Chemical(s)	Method	
Yeast			
	Interstrand crosslinking agents	deletion library	(59)
	MMS	deletion library	(60)
	Various agents	deletion library	(61)
	Platinum acrinides	deletion library	(62)
	Benzo[a]pyrene	deletion library	(63)
	DMSO	deletion library	(49)
	Imidazo-pyridines and -pyrimidines	deletion library	(64)
	Benzene	deletion library	(51)
Avian DT40			
	MMS, cisplatin	deletion mutants	(54)
	γ -rays, UV, sodium metaarsenite (NaAsO ₂)	deletion mutants	(55)
	MMS, UV, NQO	deletion mutants	(57)
	MMS, UV, cisplatin	deletion mutants	(56)
	Interstrand crosslinking agents	deletion mutants	(58)

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CHAPTER II

Functional Profiling of the Heavy Metals Cadmium, Lead, and Zinc in Yeast

ABSTRACT

The metals cadmium (Cd), lead (Pb) and zinc (Zn) are common environmental contaminants. A yeast homozygous deletion library of over 4,700 mutant strains, each with a single gene deletion, were assayed in parallel to identify susceptibility genes to metal toxicity. By using this approach, we determined how the unique genotype of each strain in the pool impacts growth in the presence of these toxicants. The genetic requirements for yeast resistance to Cd, Pb and Zn include genes associated with highly conserved intracellular transport pathways, protein ubiquitination, protein catabolism and metal homeostasis. Common yeast resistance pathways included intracellular trafficking pathways and the vacuole despite the different mechanisms of toxicity proposed for these metals. Based on the mutant sensitivity profile, oxidative stress did not appear to be a major mechanism of Cd toxicity in yeast.

INTRODUCTION

Heavy metals cadmium (Cd), lead (Pb) and zinc (Zn) are widely distributed environmental contaminants associated with a range of adverse health effects, including neurological disease, development and cancer [1]. The International Agency for Research on Cancer (IARC) has classified Cd as a Group 1 human carcinogen and inorganic Pb as a Group 2B possible human carcinogen [1]. The prevalence and carcinogenicity of these heavy metals is a long-standing and continued public health concern.

Cadmium is a persistent and bioaccumulative contaminant used mainly in the manufacture of batteries and pigments. General population exposure is via contaminated foods and cigarette smoke. A potent nephrotoxicant, cadmium is associated with an increased risk of kidney cancer as well as prostate and lung cancers [2, 3]. Several mechanisms of Cd toxicity have been proposed, including disruption of Zn-containing enzymes and inhibition of DNA mismatch repair [4], alteration of essential metal homeostasis such as calcium, iron and zinc [5], and generation of reactive oxygen species (ROS) [32, 33, 34, 40].

Although lead use was banned in household paint and gasoline additives, occupational exposure and consumption of contaminated food and water remains a serious health issue. Lead reduces hemoglobin, heme, and vitamin D synthesis resulting in decreased production of many neural and metabolic enzymes, and can also produce ROS and oxidative stress through lipid peroxidation and accumulation of aminolevulinic acid [35, 36, 38, 40] resulting in neuro-, hemopoietic system, and kidney toxicities [6]. Lead is associated with neurotoxicity in children, and hemopoietic system and kidney toxicity [6].

In contrast to cadmium and lead, zinc is an essential trace nutrient serving as a cofactor for the function of numerous enzymes and proteins. Zn toxicity is rare and the most common adverse

health effects (stunted growth, diarrhea, and impaired immunity) are associated with Zn deficiency [37,39]. The applications for Zn are primarily in industrial processes where it is used to galvanize steel and iron and to make alloys. Occupational Zn exposure occurs by inhalation of zinc fumes, causing fever and discomfort in industrial workers [7, 8].

The baker's yeast *Saccharomyces cerevisiae* shares many fundamental cellular processes with humans [9]. Oxidative stress response, DNA replication and repair, protein synthesis, intracellular trafficking, and metal homeostatic mechanisms, all of which are reported to be targets of Cd, Pb and Zn toxicity, are highly conserved in yeast. The involvement of a gene of interest in response to a toxicant has been traditionally assessed in yeast by generating a knock out strain and evaluating the phenotype in the presence of the toxicant, usually by growth assays. Homozygous yeast deletion mutants for non-essential genes can be analyzed simultaneously to interrogate their growth phenotype and functionally profile the yeast genome under selective conditions of interest [10, 11]. We used this parallel, competitive growth approach, to gain insight into the mechanisms of toxicity of Cd, Pb and Zn. We evaluated pools of mutants grown for 5 and 15 generations exposed to different concentrations of each of these toxicants in order to identify the genes that modulate yeast toxicity response.

RESULTS AND DISCUSSION

Functional Profiling of the Yeast Genome in the Presence of Cd, Pb and Zn

The genetic requirements for yeast growth (fitness) in the presence of metals were compared at equitoxic concentrations that resulted in 20% growth inhibition (IC₂₀) of the diploid wild type (Wt) strain BY4743, as well as 50% and 25% of the IC₂₀. The calculated IC₂₀ values for Cd, Pb and Zn were 4, 1000 and 2500 μ M, respectively. Fitness was evaluated at 5 generations (5G) and 15 generations (15G) of growth. Homozygous deletion mutant pools were therefore exposed to 3 metal concentrations for 5G and 15G, totaling 6 treatments per metal, with 3 biological replicates each (**Table 2.1**).

The number of identified strains (genes) increased with increased dose and number of generations of growth, ranging from a few genes after 5G to several hundred after 15G (Fig. 2.1, Appendix 1-3). Genes consistently identified as sensitive in at least 4 of the 6 treatments (Tables 2.2, 2.3 and 2.4), were mostly associated with intracellular transport and were metal-specific. Of the total 89 genes, Cd and Pb only shared 4 genes; Cd and Zn shared 6 genes; while Pb and Zn did not have any genes in common. Further, the sensitive or resistant phenotype increased with treatment concentration and number of generations of exposure.

Enrichment Analysis

Most of the identified genes were associated with vacuole biogenesis and transport processes and were required against all three metals, as identified by gene ontology scoring (**Table. 2.5**). In contrast, protein ubiquitination, (a post-translational modification that identifies proteins for degradation) and catabolism genes were predominant only against Cd and Pb toxicity. Previously genes individually associated with metal detoxification were also identified. One of these genes was *ZSP1*, which has been shown to be essential for growth at high Zn concentrations, although its function is unknown. The *zsp1* strain was very sensitive to Zn at the IC₂₀ but not at the lower concentrations tested, i.e. 0.625 and 1.25 mM, both after 5G and 15G.

In other cases, known genes involved in detoxification were not identified. In the case of Cd, requirement of metallothionein genes or glutathione biosynthesis could not be verified. These discrepancies may be due to the shorter exposure, lower doses (more than 100-fold lower than previously reported [26]) and/or functional redundancy, as is the case for the metallothionein genes.

Pathway enrichment, hierarchical clustering and network clustering analyses reveal shared tolerance requirements

We performed two pathway analyses of the microarray data (described in Methods). First, we identified significantly enriched KEGG (Kyoto Encyclopedia of Genes and Genomes) pathways required for tolerance to treatment for each metal. 43 KEGG pathways were represented in the data sets. These 43 were then clustered to determine shared tolerance pathways in a compound-and generational-dependent context (**Figure 2.6**). Additionally, data for all metals was mapped to the STRING database of *S. cerevisiae* protein-protein interactions and clusters (sub-networks) enriched for targets of any metal were identified (**Figure 2.7**). 6 sub-networks were identified at 5G, and 16 at 15G. Overrepresentation of Gene Ontology (GO) biological process categories were identified for each sub-network. These analyses identified common pathways required in response to all three metals and complement DSSA and network analyses conducted for each metal individually.

Intracellular Transport and Vacuolar Function

Several genes encoding subunits of the endosomal sorting complex required for transport (ESCRT) I, II and III, as well as genes associated with vacuole biogenesis and function, were essential for growth in the presence of all three metals (**Fig. 2.3, 2.4 and 2.5**). Another complex associated with intracellular trafficking and important in Cd resistance was the retromer complex, involved in endosome-to-Golgi retrograde protein transport; deletion of the Pep8p, Vps17p, and Vps35p subunits resulted in Cd sensitivity. There was high similarity in the requirements of genes associated with vacuolar/lysosomal transport and protein targeting, sorting, and translocation for growth in Cd and Zn. This finding indicated common metabolic and/or detoxification pathways. Among the overlapping high-confidence genes were *VPS3*, *VPS24*, *VPS9*, *PEP12* and *VPS21*. However, Cd was >600-fold more toxic than Zn based on yeast growth IC₂₀ values; thus, Cd toxicity appears to be mediated through mechanisms not common to Zn.

The vacuole participates in Cd and Zn detoxification by functioning as a storage location. Cadmium is sequestered into this organelle by Ycf1p [12], whereas Zn by the vacuolar zinc transporter Zrc1p [13]. The latter was essential for growth and the deletion mutant exhibited a very sensitive phenotype in the presence of Zn. However, *ycf1* was not identified in the screen as sensitive and this could be due to experimental variability or to the existence of an alternative detoxification pathway that operates at the Cd concentrations tested. The mechanisms of Pb detoxification in yeast are not known. However, the similarity of the intracellular trafficking mutant profiles with Cd and Zn suggests that the vacuole also plays an important role in Pb detoxification.

Identification of vacuolar H⁺-ATPase genes provided additional evidence of the importance of the vacuole in Zn detoxification (**Fig. 2.5**), as acidification is necessary for proper function of

this organelle. Considering the number of genes identified, vacuolar acidification appeared to be more important for resistance to Zn than to Cd and Pb at the concentrations tested. Essential genes included ones encoding the vacuolar H⁺-ATPase subunits (*VMA5*, *VMA8* and *YCL007C*) or elements involved in its assembly (*VPH2*, *VMA22*, *RAV1*, *RAV2*). Interestingly, *YCL007C* and the V-ATPase-associated genes *VMA5*, *VMA8* and *VMA22* were sensitive to Zn at all concentrations tested at 5G but not at 15G.

Two yeast dubious open reading frames, *BRP1* and *YCL007C*, were identified as essential for growth in Cd and Zn, respectively. In growth assays, *brp1* Δ was sensitive to Cd and high Zn concentrations but not Pb (**Fig. 2.2**). The requirement of *BRP1* could be related to its proximity to *PMA1*, which encodes a plasma membrane H+-ATPase that regulates cytoplasmic pH and plasma membrane potential. Similarly, *YCL007C* overlaps with *VMA9*, a subunit of the V-ATPase V0 subcomplex of the H⁺ ATPase involved in vacuolar acidification. Deletion of PMA1 and VMA9 results in a nonviable phenotype so they were not evaluated in the screen.

Protein synthesis and catabolism

Several genes identified as essential for Cd resistance are involved in protein ubiquitination and catabolism processes (*STP22*, *VPS25*, *VPS24*, *SNF7*, *SRN2*, and *VPS28*). Cadmium has been shown to alter proteasome activity and to induce accumulation of high-molecular weight polyubiquitinated proteins in rat primordial germ cells and Sertoli cell co-cultures, and ubiquitination of mixed-disulfide proteins in mouse neuronal cells [14, 15]. Pb identified protein catabolism as a significantly enriched biological process although only two genes (*SNF7* and *VPS36*) were present. In contrast, this category was not essential for growth in Zn. Further, ribosomal (*MRPL11*, *YDR186C*, *RSM18*, *MRPL9*, *RPL2B*, *RSM25*, *MRPL31*, and *MRPS17*) and mitochondrial ribosomal genes (*RSM18*, *RSM25*, *MRPS17*, *MRPL9*, *MRPL11*, and *MRPL31*) were consistently identified as detrimental in Pb and indicated that Pb effects protein synthesis.

Metal homeostasis

Biological processes associated with metal metabolism and homeostasis were not significant in the gene ontology scoring. However, several important genes involved in these processes that are markers of metal homeostasis disruption were identified. The toxic effects of Cd, Pb and Zn on the metabolism of essential metals have been reported extensively in the literature. Cadmium can gain access into cells by mimicking calcium, iron and Zn and disrupt cellular processes in which these essential metals participate [5]. Excess Zn resulted in decreased intracellular iron levels [16]. The iron metabolic pathways are highly conserved among species and have been extensively studied in yeast. The transcription factor AFT1, the iron transporter FTR1, the low affinity transporter FET4 and the iron ferroxidase FET3 are involved in iron uptake under iron deficiency conditions. The Cd, Pb and/or Zn sensitivity of mutants with deletions of these genes suggests an effect on iron metabolism. An exception was FET3, which deletion resulted in resistance to Pb but sensitivity to Cd and Zn. The fet3 Δ mutant was found to be sensitive to copper, Zn, cobalt and manganese due to competition of these metals with iron for uptake by Fet4p [17]. The reason for *fet3* Δ resistance to Pb is unknown. *AFT1* was essential for growth in all metals in at least one concentration at 5G. AFT1 encodes a transcription factor that is upregulated and induces the expression of iron uptake transporters in iron deficiency conditions [18]. Thus, these results suggest that Cd, Pb, and Zn toxicity alter iron metabolism. In the case of Cd, all three concentrations tested in the screen resulted in a significant decrease in growth of *aft1* Δ . There were a total of 66 genes identified in the Cd treatments that were common to the ones that we previously identified in iron deficiency conditions [22]. These genes mainly encoded components of the endosome and ESCRT I, II and III complexes and are mainly involved in intracellular transport. Consistent with iron deficiency conditions, genes associated with iron metabolism *FTR1*, *FET3*, and *FRE1* were essential in Cd. Increased Cd accumulation in tissues has been shown in mice with induced iron deficiency [23, 24]. Therefore, these results indicate that Cd alters iron metabolism. In the presence of Pb and Zn, components of the iron and copper metabolic pathways were essential for optimal growth. In addition to *AFT1*, the transcription factor gene *MAC1* involved in regulation of copper metabolism and activated under copper deficiency conditions was identified [19]. In support of an iron deficiency state in lead-exposed cells, *FET4* was also essential.

Based on the requirement of marker genes, one common mechanism of Cd, Pb and Zn appears to be their ability to affect iron metabolism. Thus, some of the cytotoxic effects associated with these metals could result from disruption of metal homeostasis. Because copper is required for high affinity iron uptake and MAC1 was essential in Pb and Zn, iron deficiency may be a secondary effect of copper deficiency. Cadmium downregulates copper intake through Mac1p, which in turn decreases Fet3p activity and iron uptake resulting in iron and copper deficiency [20]. These findings are consistent with the genetic requirements observed in this study for Pb and Zn. However, it is unclear why *MAC1* was not identified in the Cd treatments.

The yeast transcription factor Zap1p responds to intracellular Zn levels by inducing the expression of target genes. Interestingly, $zap1\Delta$ was resistant to both Cd and Zn, indicating that ZAP1 confers a growth disadvantage when these metals are in excess. Zap1p regulates the high affinity Zn transporter Zrt1p, which is constitutively expressed by virtue of Zap1p. Thus, Zap1p may be detrimental by inducing expression of metal transporters which in turn permit access of toxic metals into the cell. In contrast, the presence of ZAP1 adversely affected fitness as the deletion mutant grew better in Zn overload conditions. Zap1p induces the expression of the zinc transporter ZRT1 under low zinc conditions [21]. Thus, deletion of ZAP1 may be beneficial at toxic Zn concentrations by eliminating basal expression of Zrt1p leading to Zn entry into the cell.

Oxidative stress

One of the mechanisms by which Cd is thought to be toxic is through the induction of reactive oxygen species (ROS). Based on the mutant sensitivity profile, oxidative stress did not appear to be a major contributor to Cd toxicity in yeast. Only few oxidative response genes, gamma glutamylcysteine synthetase, *GSH1*, and glutaredoxin, *GRX3*, became essential after 15G of exposure and were confirmed by individual strain growth assays (**Fig. 2.2**). Thus, Cd-induced oxidative stress did not induce a marked phenotypic effect until after several generations of exposure or may be a result of chronic exposure. Similarly, oxidative stress may only play a significant role in chronic exposure to Pb based on moderate sensitivity in *GRX3* mutants and the identification of glutathione metabolism (KEGG pathway map00480) only after 15G (Fig. 2.6). In contrast, *GSH1* and the glutathione reductase gene *GLR1* are highly essential for fitness after 5G and 15G exposure to monomethylarsonous acid (a methylated arsenic form) [22]. Further, genes required for yeast resistance against Cd and oxidative stress agents such as hydrogen peroxide were mainly distinct and suggest that Cd generates a different ROS type [25]. These results suggest differences in the mechanisms and type of oxidative stress between methylated

arsenic and Cd.

CONCLUSIONS

Functional profiling of the yeast genome at toxic concentrations of Cd, Pb and Zn revealed that deletions associated with intracellular trafficking pathways, vacuolar function and protein catabolism resulted in sensitivity to these metals. Intracellular trafficking pathways and the vacuole appear to play an important role and are consistent with the vacuole's prominence in metal detoxification. Known genes involved in iron, copper and Zn metabolism were also identified, providing evidence of the disruption of metal homeostasis. Although Cd, Pb and Zn produce a variety of adverse human health effects probably through different mechanisms, the pathways of yeast resistance were similar.

MATERIALS AND METHODS

Yeast strains and chemical exposures

All yeast strains used in this study were of the BY4743 background (MATa/MATa $his3\Delta 1/his3\Delta 1$, $ura3\Delta 0/ura3\Delta 0$, $leu2\Delta 0/leu2\Delta 0$, $lys2\Delta 0/+$, $met15\Delta 0/+$). Pool growth was conducted in either liquid rich (1% yeast extract-2% peptone-2% dextrose, YPD) media, at 30°C with shaking at 200 rpm. Stock solutions of Cd, Pb and Zn chloride (Sigma-Aldrich, Saint Louis, MO) were freshly prepared in sterile MilliQ-water and added to the sterile media to the desired final concentrations.

Parallel Analysis of Yeast Deletion Mutants

Pool growth, genomic DNA extraction, barcode amplification and hybridization were performed as previously described [27], with minor modifications. Briefly, homozygous diploid deletion mutants (n = 4612) were grown in YPD at different metal concentrations for 5G and 15G. Mutant strains that failed the original PCR quality control [11], were not included in the pools. Cells were collected and genomic DNA was extracted using the YDER kit (Pierce Biotechnology). The strain-specific barcodes in the yeast DNA were amplified by PCR using a set of biotinylated primers, and reactions hybridized to TAG4 arrays (Affymetrix Inc., Santa Clara, CA). Arrays were incubated overnight and then stained and scanned at an emission wavelength of 560 nm using a GeneChip scanner (Affymetrix Inc.).

Differential Strain Sensitivity Analysis

Raw TAG4 array data were log₂-transformed, corrected for signal saturation as previously described [27], and corrected for mean chip background using robust location and scale estimators for log₂-transformed intensities of null features (total of 18,000 equally distributed on the array). To account for variability in strain growth, data from each treatment array were paired to data from twelve controls (5G or 15G) for analysis. Treatment-control pairs were normalized with LOWESS (global normalization), and the differentially growing strains identified using an *alpha*-outlier approach [28, 29]. Data from three biological replicates were combined, resulting in 36 treatment-control data pairs per treatment group. Residual variances (with a robust scale estimator) of log₂ (treatment/control) for each 36 pairs were inspected using box plots, and pairs with relatively high variance or suspected serial correlation (regular patterns in the box plots) were removed from the analysis. These "effective pairs" were therefore based on 36 treatment-control pairs excluding ones with abnormally high residual variance based on a robust scale

estimator or suspected to serial correlation in variability. Significant genes (strains) were then statistically inferred using an exact binomial test, assuming that the outcomes for each gene in all effective treatment-control pairs, were independent binary variables with the same probability of success (p = 0.5) for all trials (Bernoulli trials). For a particular gene *n*, outcomes were considered as "successful" if they were significant in the outlier analysis with q-values ≤ 0.05 in each of all effective pairs with \log_2 ratios of the same sign, simultaneously. The corresponding raw p-values based on the exact binomial test were then corrected for multiplicity of comparisons using q-value approach and only the genes with q-value ≤ 0.05 were considered for further analysis. This approach does not apply a scale estimator and, as a result, it does not require between-chip pair normalization for the statistical inference.

Growth Curve Assays

Yeast strains were pre grown to mid-log phase, diluted to an optical density at 595 nm (OD₅₉₅) of 0.0165, and dispensed into different wells of a 48-well plate. Metal stock solutions were added to the desired final concentrations with at least three replicates per dose. Plates were incubated in a Tecan Genios spectrophotometer set to 30°C with intermittent shaking. OD₅₉₅ measurements were taken at 15-minute intervals for a period of 24 hours. Raw absorbance data were averaged for all replicates, background corrected and plotted as a function of time. The area under the curve (AUC) was calculated with Prism version 5.01 (GraphPad Software), as a measure of growth, and expressed as a percentage of the untreated control.

Gene Ontology Scoring

Data sets were verified for enrichment of any particular biological attribute by identifying significantly enriched Gene Ontology (GO) categories by a hypergeometric distribution using the Functional Specification resource, FunSpec (http://funspec.med.utoronto.ca/), with a P-value cutoff of 0.01. Yeast fitness data was mapped onto the extended Wi-Phi yeast interactome [30], consisting of more than 10,000 protein-protein interactions, and onto the regulatory network (www.yeastract.com) [31] (accessed July 2007) using Cytoscape versions 2.4.1 and 2.5.1 (www.cytoscape.org).

Pathway Enrichment and Hierarchical Clustering

Data sets were analyzed as outlined in North *et al* [41]. Briefly, the normalized data for each metal was used in a pathway enrichment method called Structurally Enhanced Pathway Enrichment Analysis (SEPEA). The biochemical pathways chosen were from the *S. cerevisiae* KEGG pathway database. This resulted in 43 pathways whose associated p-values were negative log10 transformed and hierarchically clustered using Spearman rank correlation as a measure of distance and average linkage for forming clustering.

Network Clustering

As described in [41], an overall system-wide interaction network was utilized as a basis for the analyses. In this analysis, the protein interaction network from the STRING database is used. For the analysis across the metals, deletion strains sensitive to at least one of the metals were selected and data for the different generation points (5 g and 15 g) were considered independently. The metal specific data sets were mapped onto the system-wide interaction network with the goal of finding sub-networks in this system-wide network that are enriched with targets of different combinations of the heavy metals. The significance of different clusters is based on the overall

neighborhood characteristics of the nodes of the interaction network. Clusters were analyzed for enrichment of Gene Ontology (GO) Biological Processes within each sub-network. The edges between the clusters represent the interactions between the clusters. Cluster 0 represents the hub of proteins connecting all other sub-networks.

Table 2.1. Metal treatments used in the functional profiling experiments. IC_{20} = concentration resulting in 20% growth inhibition of the wild type strain. Each metal treatment was performed in triplicate for a total of 18 pools of homozygous mutants and compared to 12 control cultures grown in rich media in order to identify the strains that exhibit a significant change in growth.

Growth inhibitory concentration	Cadmium chloride (Cd ²⁺)	Lead chloride (Pb ²⁺)	Zinc chloride (Zn ²⁺)	
25% IC ₂₀	1 µM	0.25 mM	0.625 mM	
50% IC ₂₀	2 μΜ	0.5 mM	1.25 mM	
IC ₂₀	4 μΜ	1 mM	2.5 mM	

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Cana	5 generations			15 generations		
Name	25% IC ₂₀	50% IC ₂₀	IC ₂₀	25% IC ₂₀	50% IC ₂₀	IC ₂₀
Ivanic	1 µM	2 µM	4 μΜ	1 µM	2 μΜ	4 μΜ
VPS8	-0.80	-1.80	-2.50	-3.60	-5.10	-3.70
VPS24	-1.00	-1.15	-1.50	-2.05	-3.80	-4.15
VPS27	-1.15	-1.30	-1.80	-2.80	-4.45	-4.05
VPS4	-1.00	-1.10	-1.55	-2.50	-4.00	-3.90
BST1	0.60	1.35	1.30	ns	1.70	5.50
VPS45	-1.60	-1.60	-2.10	-2.80	-3.10	Ns
SRN2	ns	-0.70	-1.30	-1.60	-4.10	-5.10
YNR005C	ns	-0.70	-1.15	-0.70	-3.30	-4.70
PEP12	-1.40	-1.50	-2.40	-2.70	-3.10	ns
VPS21	ns	-1.30	-1.50	-3.25	-3.75	-4.70
VPS28	ns	-0.90	-1.35	-2.10	-3.25	-2.90
BRO1	ns	-1.70	-2.10	-1.80	-3.80	-3.80
STP22	ns	-1.00	-1.60	-2.30	-2.70	ns
PEP7	-1.20	-1.50	-1.70	-2.10	ns	ns
NHX1	ns	-0.80	-1.60	1.80	-1.70	ns
VPS3	-1.30	-1.35	-2.05	ns	-1.90	ns
BRP1	ns	-1.10	Ns	-1.30	-2.05	-3.20
YGR272C	0.80	1.00	1.20	ns	ns	4.70
GGA2	ns	ns	-1.00	-1.00	-2.75	-2.65
RPL34B	ns	0.90	1.20	ns	1.75	3.80
IMP2'	ns	0.90	0.90	ns	1.45	3.20
PEP8	ns	-0.85	-1.40	ns	-3.35	-3.80
ZAP1	1.10	1.55	1.30	ns	ns	6.40
VPS35	ns	-1.40	-1.90	ns	-3.80	-3.25
VPS25	ns	ns	-1.40	-2.05	-2.85	-3.20
OPI8	ns	-1.30	-1.70	-1.30	-2.45	ns
SNF7	ns	ns	-0.80	-2.85	-3.40	-2.75
VPS38	ns	-1.10	-2.05	ns	-3.15	-4.00
VPS9	ns	-2.40	-2.20	-3.70	-3.20	ns
VANI	ns	1.00	ns	1.05	3.00	4.45
BUL1	ns	-1.20	-2.10	-1.50	-4.50	ns
VAM10	ns	-1.00	-1.15	ns	-2.00	-2.40
LDB19	ns	ns	-0.90	-2.10	-3.55	-3.45
SUR1	ns	-1.00	ns	-2.15	-4.70	-4.75
VPS30	ns	-1.10	-1.50	ns	-4.10	-5.60
ROX1	ns	-1.15	ns	-1.85	-4.05	-4.30

Table 2.2. Fitness scores of significant genes identified in at least four of the six Cd treatments. A total of 36 of the identified genes were important for fitness in at least 4 of the 6 Cd treatments. See Appendix 1 for the list of all identified genes.

Fitness score = log_2 treatment - log_2 control; ns = not significant

	5 generations		15 generations			
	25%			25%		
Gene	2570 IC-0		IC			IC
Name	0.25	1020	1020	10^{20}	1020	1020
	mM	0.5 mM	1 mM	mM	0.5 mM	1 mM
YCR050C	ns	-1.00	-1.65	-3.00	-3.50	-2.75
GCS1	ns	-1.10	-1.60	-4.90	-3.90	-4.50
YDR186C	ns	-0.70	-1.45	-3.10	-2.60	-2.90
RCY1	ns	-1.10	-1.45	-4.50	-5.90	-4.00
SEL1	ns	-1.00	-1.10	-5.00	-4.00	-3.60
CBC2	ns	-1.50	-1.10	-4.20	-3.10	-3.90
YCR049C	ns	ns	-1.00	-2.00	-2.35	-3.20
ATG15	ns	ns	-0.80	-2.60	-2.15	-3.25
SOL2	ns	-1.40	ns	2.50	3.20	3.30
ARF1	ns	ns	-1.40	-3.40	-2.30	-3.80
MRPL11	ns	ns	1.20	2.40	2.60	4.55
HBT1	ns	-1.20	ns	2.10	2.15	3.00
SWF1	ns	ns	-1.60	-3.00	-2.90	-2.60
ENT5	ns	-1.60	ns	3.60	4.00	4.20
ERD1	ns	ns	1.30	4.00	3.55	4.25
YDR455C	ns	ns	-1.25	-2.30	-2.05	-3.55
RSM18	ns	ns	0.90	3.00	3.00	4.65
IES5	ns	ns	0.80	1.40	1.90	2.40
ERG4	-1.20	-1.20	-1.70	-3.90	ns	ns
ARO2	ns	ns	-0.90	-4.90	-3.75	-3.00
MRPL9	ns	ns	0.70	1.90	1.80	2.75
RPL2B	ns	ns	0.85	2.60	2.10	4.30
RSM25	ns	ns	1.10	2.15	2.35	3.65
PEP8	ns	ns	-1.50	-2.70	-2.70	-3.10
VPS35	ns	ns	-1.50	-2.95	-2.45	-2.65
MRPL31	ns	ns	1.20	2.20	2.20	3.60
MMM1	ns	ns	1.30	1.70	2.95	4.60
SNF7	-0.70	ns	-0.70	-2.30	-2.45	ns
SSQ1	ns	ns	0.80	1.20	2.10	2.55
VPS36	-0.90	-0.80	-1.35	-1.70	ns	ns
FET3	ns	ns	1.00	1.60	1.90	1.90
MRPS17	ns	ns	0.80	1.35	1.45	2.30
AVT4	ns	-1.70	ns	2.70	2.60	3.10
LEM3	-1.00	-1.00	-1.50	-3.10	ns	ns
TLG2	ns	ns	-1.60	-3.10	-3.40	-3.40
HAL9	ns	ns	-1.65	-4.70	-4.10	-2.10
VAMIO	ns	ns	-0.80	-2.40	-2.35	-3.50
LEOI	ns	ns	0.80	1.95	2.05	3.05
	ns	ns	-0.90	-1.80	-1.60	-2.40
EFTI	ns	-1.2	ns	2.30	3.70	3.50
YUR246C	ns	ns	-1.05	-2.20	-2.55	-2.65
AEP3	ns	ns	1.20	2.90	2.60	4.45

Table 2.3. Fitness scores of significant genes identified in at least four of the six Pb treatments A total of 42 of the identified genes were important for fitness in at least 4 of the 6 Pb^{2+} treatments. See Appendix 2 for the list of all identified genes.

Fitness score = log_2 treatment - log_2 control; ns = not significant

Table 2.4. Fitness scores of genes identified in at least four of the six Zn treatments. A total of 11 of the identified genes were important for fitness in at least 4 of the 6 Zn treatments. See Appendix 3 for the list of all identified genes.

	5 generations			15 generations		
Cono	25%	50%		25%	50%	
Nome	IC_{20}	IC_{20}	IC_{20}	IC_{20}	IC_{20}	IC ₂₀
Iname	0.625	1.25		0.625	1.25	
	mM	mM	2.5 mM	mM	mM	2.5 mM
ZAP1	1.55	1.80	1.40	5.10	4.90	4.60
VPS9	-2.30	-2.75	-2.40	-2.80	-2.15	-3.30
PER1	ns	1.80	1.40	3.40	3.90	4.85
FLC2	ns	-1.60	-2.80	ns	-1.70	-4.50
MRPL16	ns	ns	1.20	1.35	2.15	4.40
VPS3	-2.15	-2.35	-1.65	-2.00	ns	ns
VPS24	-1.10	ns	-2.80	ns	-1.35	-4.80
DFG5	ns	-2.65	-2.50	ns	-1.75	-4.25
PEP12	-2.70	-2.50	ns	-2.40	-2.60	ns
VPS21	ns	-2.00	-1.80	ns	-2.50	-3.65
VPH1	-2.90	-2.90	-3.80	ns	-1.90	ns

Fitness score = log_2 treatment - log_2 control; ns = not significant
Biological process ^a	p-value	K ^b	F ^c		
Cadmium					
late endosome to vacuole transport	2.92e-14	8	20		
[GO:0045324]					
protein targeting to vacuole	3.306e-13	9	41		
[GO:0006623]	0.720.12	17	270		
protein transport [GO:0015031]	9.729e-13	1/	3/9		
ubiquitin-dependent protein catabolic	0.83/e-11	0	15		
sorting pathway [GO:0043162]					
vacuole inheritance [GO:0000011]	2 507e-10	6	18		
transport [GO:0006810]	2.153e-08	18	815		
protein retention in Golgi apparatus	2.1330-08	4	11		
[GO:0045053]	2.12/0-07				
intralumenal vesicle formation	1.355e-06	3	5		
[GO:0070676]					
Lead	_	_			
protein transport [GO:0015031]	1.641e-05	11	379		
protein retention in Golgi apparatus	3.812e-05	3	11		
[GO:0045053]					
retrograde transport, endosome to Golgi	0.0001828	3	18		
[GO:0042147]					
mitochondrial translation [GO:0032543]	0.0002163	5	88		
transport [GO:0006810]	0.000321	14	815		
early endosome to Golgi transport 0.00209		2			
[GO:0034498]	0.002026		1.5		
process via the multivesionlar body	0.003936	2	15		
sorting pathway [GO:0043162]					
multivesicular body membrane	0.006361	1	1		
disassembly [GO:0034496]	0.000501		1		
cell surface receptor linked signaling	0.006361	1	1		
pathway [GO:0007166]	01000201		-		
membrane disassembly [GO:0030397]	0.006361	1	1		
Zinc					
vacuole inheritance [GO:0000011]	1.261e-08	4	18		
protein targeting to vacuole	3.543e-05	3	41		
[GO:0006623]					
fungal-type cell wall biogenesis	0.0001377	2	11		
[GO:0009272]					
vacuolar acidification [GO:0007035]	0.0008024	2	26		
carbohydrate catabolic process 0.003329		1	2		
[GO:0016052]					
FAD transport [GO:0015883]	0.006649	1	4		
intralumenal vesicle formation	0.008304	1	5		
[GO:0070676]					

Table 2.5. Genes required for growth in the presence of each metal and their associated gene ontology categories.

^aA list of strains exhibiting sensitivity in 4 of the 6 Cd treatments was entered into the FunSpec tool and analyzed for overrepresented biological attributes (see Materials and Methods section). ^b Number of genes from the input cluster in given category. ^c Number of genes total in given category.



Figure 2.1. The number of identified strains (genes) increased with concentration and number of generations of exposure to Cd, Pb, or Zn and ranged from only a few genes after 5G to several hundred after 15G.



Figure 2.2. Confirmatory growth curve assays for selected deletion mutants. Treatment concentrations used were IC_{20} and twice this concentration, $2*IC_{20}$. For each strain tested, growth was calculated as the area under the OD_{595} -time curve (AUC) for a period of 24 hours and expressed as a percentage of the metal treatment relative to the untreated control. Cadmium and Zn treatments inhibited growth in a dose dependent manner. Lead was poorly soluble and inhibited growth similarly at the two concentrations tested.



Figure 2.3. Cd resistance genes following exposure to 4 μ M CdCl₂ for 5G. **A.** The ESCRT complexes I, II and III mediate resistance to cadmium. **B.** Cadmium resistance is associated with intracellular trafficking through endosomal intermediates that target the vacuole. The transcription factor Aft1p regulates iron homeostasis and its presence suggests that some of the genes identified in the network such as Ypt7p and Pep7p may be required to regulate iron levels in the presence of cadmium. Only subunits that were identified by network analysis are shown. Solid lines connecting nodes indicate protein-protein interactions while broken lines protein-DNA interactions.



Figure 2.4. Pb resistance genes following exposure to $1000 \ \mu\text{M}$ PbCl₂ for 5G. **A.** The retromer complex functions in Pb resistance. This complex is involved in endosome-to-Golgi retrograde protein transport. **B.** The ESCRT complexes are essential for growth in Pb. Deletion of SNF7, component of the ESCRT-III, resulted in sensitivity to Cd. SNF7 is not shown in the network. Solid lines connecting nodes indicate protein-protein interactions.

Α.



Figure 2.5. Zn resistance genes following exposure to 2500 μ M ZnCl₂ for 5G. **A.** The ESCRT complexes are involved in yeast resistance to Zn. **B.** The vacuolar H+-ATPase is necessary for yeast resistance to Zn. The H+-ATPase is involved in vacuolar acidification, supporting the fact that vacuoles play an important role in zinc detoxification. Solid lines connecting nodes indicate protein-protein interactions while broken lines protein-DNA interactions.



Figure 2.6. Clustergram of KEGG pathways significantly affected by heavy metal treatment.



Figure 2.7. Clusters (sub-networks) of proteins enriched for targets of Zn, Cd, and Pb that are identified by mapping fitness data to the STRING yeast interaction data set using the statistical approach detailed in [41]. The nodes of the sub-networks represent yeast proteins and are colored according to whether the corresponding protein is a target of a particular combination of Zn, Pb, and Cd.

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Chapter III

Functional profiling in yeast identifies DNA repair pathways required in response to the TCE metabolite dichlorovinyl cysteine (DCVC)

ABSTRACT

Trichloroethylene (TCE) is a common environmental contaminant, particularly at Superfund waste sites. Considered a human carcinogen, there remains a need for molecular evidence linking TCE and renal cancer. Studies have identified the metabolite dichlorovinyl cysteine (DCVC) as the penultimate mediator of TCE renal toxicity and ultimately, renal cancer. Using a functional genomics approach in yeast we aim to identify cellular processes that mediate the renal toxicity of DCVC. Genome profiling revealed genotoxicity as an important contributor in DCVC toxicity and implicates DCVC as a DNA cross-linking agent. Specifically, mutagenic translesion synthesis (TLS), nucleotide excision repair (NER) and homologous recombination pathways were required for tolerance to DCVC. Furthermore, we find that DCVC damage elicits repair predominately by the low fidelity (error-prone) polymerase *Rev3* (Pol ζ). These findings are the first to provide molecular and genetic evidence supporting DCVC genotoxicity as a contributor to TCE toxicity.

INTRODUCTION

The Superfund contaminant trichloroethylene (TCE) is a common environmental contaminant introduced at the beginning of the 20th century as a replacement for chloroform and ether in many industries (1). TCE is a common contaminant at abandoned military sites, spacecraft/aircraft sites and Superfund sites throughout the US. Consumption of drinking water sources contaminated with leached TCE is the main route of exposure for the general population (1). It is estimated between 9-34% of drinking water sources are contaminated with TCE (1).

TCE undergoes a complex metabolism resulting in bioactive intermediates via the glutathione conjugation pathway (**Fig. 3.1**) (2). The glutathione conjugation pathway is a common mechanism for eliminating electrophilic molecules, but can yield toxic metabolites (3,4). In the case of TCE, glutathione conjugation results in the formation of dichlorovinyl cysteine (DCVC), which has been shown to cause renal toxicity in rodents (5-7). In several studies DCVC caused single and double strand breaks in DNA and tested positive as a mutagen (8,9). Moreover, epidemiological studies revealed an increased incidence of kidney and blood cancers in TCE exposed workers(1). Genetic analysis showed exposed workers had unique mutations in the von Hippel Lindau (VHL) gene, a tumor suppressor gene commonly associated with renal cell carcinomas (10-13) This data suggests a mutagenic mode of action for TCE induced renal cancer, mediated predominately by the metabolite DCVC. The majority of studies have focused on the use of animal models for mechanistic insight, but have led to controversial and inconsistent results (14). This is attributed to several factors including, complex metabolism, species susceptibility, and sex differences.

S. cerevisiae has long been a model organism in molecular biology and a useful model for

mechanistic toxicity studies. Advantages of yeast include elimination of compounding factors, as mentioned above, associated with whole animal models, ease of genetic manipulation, the availability of bioinformatics resources and most importantly the high degree of conservation of cellular pathways from yeast to humans. The introduction of the homozygous deletion library allows for functional profiling studies to characterize mechanisms of toxicity and identify toxicant susceptibility genes. Genome wide profiling in yeast has proven successful for investigating toxicity mechanisms for numerous toxicant classes, including heavy metals, pesticides, organic solvents and genotoxicants (15-19). Futhermore, results from yeast studies have informed *in vitro* and epidemiological studies (20). The identification of toxicant susceptibility genes from profiling studies highlights the robustness of this approach and its utility for toxicity and environmental health studies (20).

In this chapter, a genome-wide screen in yeast was utilized to identify cellular processes that mediate the toxicity of the TCE metabolite, dichlorovinyl cysteine (DCVC) and the role these processes may play in mediating TCE renal cancer. The results from profiling studies revealed genotoxicity plays a central role in DCVC toxicity and implicated the metabolite causes damage similar to a DNA cross-linking agent. Additionally, the requirement for mutagenic translesion synthesis repair of DCVC lesions supports a mutagenic mode of action for TCE. This study provides exciting mechanistic evidence for further investigation and new insight on the molecular events that mediate TCE renal toxicity.

RESULTS and DISCUSSION

A genome-wide screen identifies mutants with altered growth in the presence of DCVG and DCVC metabolites

Growth curve assays were performed to determine the toxicity of DCVG and DCVC to yeast. From the growth curves, the IC₂₀, a concentration determined as appropriate for use in the functional screen, was calculated as 18µM for DCVC and 6.7 µM for DCVG (**Fig. 3.2a**). Pools of yeast homozygous diploid deletion mutants (n = 4607) were grown for 5 generations at the IC₂₀ (18µM and 6.7 µM), 50% IC₂₀ (9µM and 3 µM), and 25% IC₂₀ (4.5µM and 1.5µM). A differential strain sensitivity analysis (DSSA) identified 114 mutants as sensitive and 103 mutants as resistant to at least one dose of DCVG for a total of 217 genes identified. For DCVC, 56 mutants were identified as sensitive and 155 mutants as resistant to at least one dose for a total of 211 genes identified (**Appendix 4**). The top thirty sensitive strains at the IC₂₀ of DCVC are shown in **Table 2.1**. Strains sensitive to DCVC were the focus of this study as it has been shown to be penultimate metabolite responsible for toxicity.

Enrichment analysis identifies attributes necessary for DCVC tolerance

A list of mutant strains displaying sensitivity to DCVC treatments (n = 56) was analyzed using FunSpec and the Yeastmine programs to identify significantly overrepresented biological processes. GO categories were enriched for response to DNA damage stimulus, error-free translesion synthesis, and nucleotide excision repair processes. Based on the results from enrichment analyses we focused further experiments on DNA damage and repair (**Table 3.2**).

Loss of putative beta-lyase proteins do not confer resistance to DCVC toxicity

Metabolic activation by the glutathione conjugation pathway plays a central role in TCE renal toxicity (14,15,17). Renal toxicity is dependent on the formation of the cysteine conjugate and

reactive thiolate intermediate, mediated by gamma-glutamyl transpeptidase (GGT) and beta lyase enzyme, respectively. Conservation of metabolic activation of TCE metabolites in yeast was assayed in mutants deficient in the gamma-glutamyl transpeptidase, $ecm38\Delta$ and the putative beta lyases $irc7\Delta$ and $bna3\Delta$ for resistance to metabolite toxicity. $Ecm38\Delta$ mutants were significantly resistant to DCVG toxicity compared to wild-type, likely due to the decrease in cysteine conjugate production (DCVC) (**Fig. 3.1b**). This observation is consistent with *in vitro* studies using chemical GGT inhibitors and further supports DCVC as the penultimate metabolite responsible for toxicity (21,22). In contrast, the $irc7\Delta$ and $bna3\Delta$ mutants did not confer any resistance to DCVC and had similar toxicity to wild-type (**Fig. 3.1c**). This finding could be due to the redundancy of several proteins present in yeast with beta-lyase activity. Nevertheless, these results coincide with *in vitro* and *in vivo* studies attributing TCE renal toxicity to the cysteine conjugate, DCVC (21-23).

Mutants defective in DNA repair are sensitive to TCE metabolite DCVC

Enrichment analysis implicated two distinct repair pathways, translesion synthesis and nucleotide excision repair, as important processes for DCVC tolerance (Table. 3.2). During replication, post-translational modification of the replication factor PCNA (proliferating cell nuclear antigen) in eukarvotes initiates the error-prone translession synthesis repair (TLS) pathway or the error-free, template-switching (TS) pathway (24). These repair mechanisms prevent replication stalling and fork collapse when a DNA lesion is encountered (25). Monoubiquitination of PCNA at the Lys164 residue by the Rad6-Rad18 complex initiates the error prone translesion pathway, recruiting special TLS polymerases such as *Rev3*, *Rad30*, and Rev1 to sites of damage (Fig. 3.3) (25,26). We used competitive growth assays to examine mutants deficient in these pathways (Fig. 3.3). Both DSSA and flow cytometry identified $rad18\Delta$, which lacks a gene encoding for an E3 ubiquitin ligase important for the initiation and stabilization of translesion synthesis repair, as one of the strains most sensitive to DCVC (Fig. **3.4a**). Additional translession synthesis genes were confirmed to be required for DCVC tolerance, including *Rev1*, a deoxycytidyl transferase that preferentially incorporates a cytosine across abasic sites or damaged bases, Rev3, the catalytic subunit of the error prone DNA polymerase zeta, and Rad5 a DNA helicase proposed to promote replication fork regression and error-free repair (Fig. 3.4a). Rad30, another translession polymerase involved in the repair of UV induced damage was not identified by DSSA and was not sensitive to DCVC (Fig. 3.4a), supporting the specificity and sensitivity of PDA to characterize genotoxicity.

Specific components of nucleotide excision repair were identified as necessary in response to DCVC (**Fig. 3.4b**). The nucleases *PSO2* is required for the repair of DNA single and doublestrand breaks and acts at a post-incision step in repair of breaks that result from interstrand crosslinks. *RAD1*, and *RAD10* form a single-strand DNA endonuclease that binds DNA and then nicks the damaged DNA strand on the 5' side of the lesion during nucleotide excision repair (**Fig. 3.3**). Individual growth curve analysis with these TLS, NER and HR mutants were conducted concurrently and showed a dose response supporting flow cytometry results (data not shown). The hypersensitivity of TLS and NER mutants to DCVC suggests DCVC causes direct DNA damage and provides genetic evidence supporting DCVC genotoxicity. As both of these DNA repair pathways are highly conserved in humans (**Table 3.3**), genotoxicity is a likely mechanism for DCVC renal toxicity in humans (24,27).

REV3 polymerase plays a central role in mediating DNA repair and genotoxicity of DCVC After demonstrating a requirement for translesion synthesis (TLS) repair in DCVC tolerance (Fig. 3.4A), we examined the roles of error-prone TLS polymerases such as Rad30 (Poln), Rev1 and Rev3 (Pol ζ) or the error-free pathway of Rad5 in rescuing the DCVC sensitivity of rev3 Δ mutants (Fig 3.5). As expected, the $rev3\Delta$ mutant complemented with REV3p showed increased resistance to DCVC similar to wild-type levels at both 18µM and 30µM DCVC. Overexpression of the TLS polymerases RAD30p or REV1p did not rescue sensitivity of the $rev3\Delta$ mutant nor did overexpression of the helicase RAD5p, which initiates error-free template switching (a form of recombination repair). These results suggest Rev3 is the main polymerase in repairing DCVC DNA damage and is a key factor in moderating DCVC genotoxicity. Rev3 is a B family polymerase and lacks 3'-5' proofreading exonuclease activity, has low processivity and decreased fidelity (25,28). These attributes allow for Rev3 to bypass a variety of lesions, including interstrand crosslinks, bulky adducts and UV damage, in an effort to prevent stalled forks and double strand breaks at the cost of increasing mutagenesis (24,29-31). The extent of mutagenesis is dependent on a combination of the TLS polymerase, characteristics of the lesion, and the surrounding sequence environment (25,28). The specific requirement for Rev3 suggests DCVC lesions are preferentially repaired by TLS and has the potential to increase mutagenesis.

DSSA and flow cytometry experiments identified the DNA helicase, *Rad5*, as required for tolerance to DCVC (**Fig. 3.4a**). *Rad5* is involved in the error-free branch of DNA damage tolerance (DDT) pathway. It is proposed to promote replication fork regression during post-replication repair by template switching (TS), but the intricacies of this pathway remain poorly understood (25). *Rad5* is required for *Rev3* dependent translession synthesis and mediates translession synthesis and mutagenesis through structural interactions with *Rev1* and *Rev3* (32,33). The hypersensitivity of *Rad5* Δ , mutants further supports that DCVC genotoxicity is mediated by mutagenic *Rev3* TLS repair.

Sensitivity profile of DCVC is similar to known interstrand crosslinking (ICL) agents

In a study by Lee et al, a panel of DNA damaging agents were analyzed using parallel deletion analysis in yeast to determine the genetic requirements for the repair of interstrand crosslinks (34). Their findings revealed translession synthesis, nucleotide excision repair and homologous recombination genes were required for resistance to various crosslinking agents in yeast. We compared the gene sensitivity profile of DCVC to the profiles of the 12 agents in the Lee et al study and found almost matching genetic profiles with established interstrand crosslinking agents. Characteristics of these agents include bifunctionality (cisplatin and nitrogen mustards) or two chemically active leaving groups that can react with DNA bases on each strand, usually at the N7 position of guanine or the exocyclic amino groups (35). Interstrand crosslinks are particularly detrimental to the cell as these lesions disrupt replication and transcription by preventing separation of DNA strands, resulting in fork collapse and ultimately double strand breaks (36). While levels of ICLs are low, it has been shown that even a nominal number of ICLs, 1-2 in yeast and 20-40 in mammalian cells can be deterimental and repair of these lesions is critical to genomic viability (35). Similar to DCVC, TLS mutants such as $rev3\Delta$ have exhibited hypersensitivity to cross linking agents such as cisplatin, nitrogen mustards and mitomycin C (MMC) (37-40).

CONCLUSIONS

Functional profiling of the metabolite DCVC identified a specific subset of cellular processes that modulate toxicity. We hypothesize genotoxicity plays a central role in mediating DCVC toxicity. Our results suggest DCVC genotoxicity is consistent with other interstrand crosslinking agents and requires mutagenic DNA repair. These studies provide new and exciting genetic evidence supporting genotoxicity as a mechanism for DCVC renal toxicity. Data generated by this study can direct additional experimentation to determine the implications of DCVC genotoxicity in genome instability and carcinogenesis. Furthermore, we show that a functional genomics approach in yeast is a viable method for examining toxicity mechanisms and more specifically its utility in characterizing genotoxicity mechanisms.

MATERIALS AND METHODS

Chemical Reagents

Dichlorovinyl glutathione (DCVG) and Dichlorovinyl cysteine (DCVC) conjugates were generous gifts from Professor A. Elfarra at the University of Wisconsin, Madison. Stock solutions were prepared in sterile Milli-Q water (Millipore, Billerica, MA) and stored at -20°C until use. All yeast reagents were purchased from commercial suppliers.

Yeast strains, culture, and plasmids

The diploid yeast deletion strains used for functional profiling and confirmation analyses were of $(MATa/MAT\alpha his 3\Delta 1/his 3\Delta 1 leu 2\Delta 0/leu 2\Delta 0 lys 2\Delta 0/LYS2$ background the BY4743 MET15/met15 $\Delta 0$ ura3 $\Delta 0$ /ura3 $\Delta 0$, Invitrogen). For deletion pool growth, cells were grown in liquid rich media (1% yeast extract, 2% peptone, 2% dextrose, YPD). All assays were performed in liquid rich media at 30°C with shaking at 200 rpm, except overexpression experiments, which used liquid rich media containing 2% galactose and 2% raffinose (YPGal+Raf). For overexpression analyses, FlexGene expression vectors were transformed into strains of the BY4743 background. Rad5 strains were on the EMY74.7 background (MATa his3D-1 leu2-3,-112 trp1D ura3-52). Rad5 strains with wild type or its mutant derivatives were carried on a YCplac133-based plasmid, which contains the ARS1 origin of replication, the centromeric CEN4 region, and the LEU2 gene. The plasmid, pR28, expresses the wild-type Rad5 protein (RAD5). Plasmid pR30 carries the mutations D681, E682 in RAD5, which inactivate the ATPase and DNA helicase activities of Rad5 (Rad5 helicase mutant), and plasmid pR19 carries the mutations C914, C917 in the C3HC4 ring-finger motif that abolishes ubiquitin ligase function (Rad5 Ub ligase mutant).

Dose-finding and growth curve assays

Briefly, cells were grown to mid-log phase, diluted to an optical density at 600nm (OD600) of 0.0165, and dispensed into nontreated polystyrene plates. Dichlorovinyl glutathione (DCVG) and dichlorovinyl cysteine (DCVC) stock solutions were prepared in water and added to the desired final concentrations with at least two technical replicates per dose. Plates were incubated in Tecan microplate readers set to 30°C with shaking and OD595 measurements were taken every 15min for 24h. The raw absorbance data were averaged, background corrected, and plotted as a

function of time. The area under the curve was calculated and expressed as a percentage of the untreated control.

Functional profiling of the yeast genome

Growth of the deletion pools, genomic DNA extraction, barcode amplification, Affymetrix TAG4 array hybridization, and differential strain sensitivity analysis (DSSA) were performed as described (Jo *et al.*, 2009b). Briefly, pools of homozygous diploid deletion mutants (n = 4607) were grown in YPD at various DCVC concentrations for 5 generations and genomic DNA was extracted using the YPER kit (Pierce Biotechnology). The DNA sequences unique to each strain (barcodes) were amplified by PCR and hybridized to TAG4 arrays (Affymetrix), which were incubated overnight, stained, and then scanned at an emission wavelength of 560nm with a GeneChip Scanner (Affymetrix). Data files are available at the Gene Expression Omnibus database.

Overenrichment analysis

Significantly overrepresented Gene Ontology (GO) categories within the DSSA data were identified by a hypergeometric distribution using the Functional Specification resource, FunSpec (<u>funspec.med.utoronto.ca</u>) and the YeastMine database (<u>http://yeastmine.yeastgenome.org/</u>) with a *p* value cutoff of 0.001.

Confirmatory Growth Analysis

Yeast strains were pre-grown to mid-log phase, diluted to an optical density at 600 nm (OD600) of 0.0165, and dispensed into a 96-well plate (non-treated polystyrene, Grenier Bio-One, Monroe, NC). TCE metabolite stock solutions were added to the desired final concentrations with at least two replicates per dose. Plates were incubated in a microplate reader (Tecan, Durham, NC) set to 30°C with intermittent shaking. OD600measurements were taken at 15-minute intervals for 24 hrs. Raw absorbance data were averaged for all replicates, background corrected, and plotted as a function of time. The area under the curve (AUC) was calculated as a measure of growth, and expressed as a percentage of the control. AUCs were compared by two-way ANOVA followed by Bonferroni post-tests. Data for each strain is derived from at least 3 independent cultures.

Analysis of relative strain growth by flow cytometry

Briefly, green fluorescent protein (GFP)-tagged wild-type and untagged mutant strains were grown overnight in YPD, diluted to 0.5 OD600, and mixed in approximately equal numbers. Cells were inoculated into YPD at 0.00375 OD600 in microplate format, treated with DCVC, and grown for 24hrs at 30°C with shaking at 200 rpm. Approximately 20,000 cells per culture were analyzed at 0 and 24hrs using a FACSCalibur flow cytometer. GFP-expressing wild-type cells were distinguishable from untagged mutant cells. The percentages of wild-type GFP and untagged mutant cells present in the cultures were used to calculate a ratio of growth for untagged cells in treated versus untreated samples. Statistically significant differences between the means of three independent DCVC treated cultures were determined using *t*-test. Raw p values were corrected for multiplicity of comparisons using Benjamini-Hochberg correction.

Complementation Overexpression Assays

Yeast overexpression strains were pre-grown overnight to stationary phase in SC-ura 2% dextrose, then diluted 1:100 in SC-ura 2% raffinose and grown overnight again to alleviate glucose repression. Cells were then diluted in YPGal+Raf to induce protein overexpression, and grown for 5 hours to mid-log phase. Cells were subsequently diluted to an optical density at 600 nm (OD600) of 0.0165 in YPGal+Raf, and dispensed into a 96-well plate. DCVC treatment, plate measurement and data processing were all carried out in the same manner as the deletion strain growth curve assays.



Figure 3.1. Overview of glutathione conjugation metabolism of TCE and the chemical structure of the DCVG and DCVC metabolites associated predominately with kidney toxicity. TCE is conjugated with glutathione in the liver and forms a cysteine conjugate in the kidney (DCVC). DCVC is further metabolized to highly reactive intermediates such as the thiolate DCVT. NAcDCVC is the major urinary metabolite formed.



Figure 3.2. (A) Dose response of the metabolites DCVG and DCVC and calculated IC_{20} concentrations for functional profiling. (B) Mutants lacking gamma-glutamyl transpeptidase (*ECM38*) are resistant to DCVG likely due to a decrease in DCVC formation (C) Mutants lacking proteins with known cysteine beta-lyase function do not confer resistance to DCVC. Values are mean \pm SEM; n \geq 3 for each measurement. Significance values were calculated by two way ANOVA ***p < 0.001, **p < 0.01, *p < 0.05 for DCVC-treated wild-type versus mutants.

IC ₂₀ Log ₂ value ^a	Yeast Gene	Description
-4	SUC2	Invertase; sucrose hydrolyzing enzyme
-3.05	CDC26	Subunit of the Anaphase-Promoting Complex/Cyclosome
-2.95	IRC2	Dubious open reading frame; partially overlaps verified gene Alt2
-2.7	RAD5	DNA helicase/Ubiquitin ligase; involved in DNA damage tolerance (DDT) pathway
-2.4	RAD18	E3 ubiquitin ligase; required for postreplication repair
-2.4	SEC66	Subunit of Sec63 complex; involved in protein targeting and import into the ER
-2.3	VPS8	Involved in endosome to vacuole protein targeting pathway
-2.2	VPS9	Guanine nucleotide exchange factor; involved in vesicle-mediated vacuolar transport
-2	PXA1	Subunit of a heterodimeric peroxisomal ABC transport complex
-1.95	VPS21	Endosomal Rab family GTPase
-1.8	LYS5	Phosphopantetheinyl transferase involved in lysine biosynthesis
-1.8	RAD10	ssDNA endonuclease; involved in NER and double-strand break repair
-1.75	PSO2	Nuclease required for DNA single- and double-strand break repair
-1.7	YRB30	RanGTP-binding protein
-1.7	LTE1	Protein similar to GDP/GTP exchange factors
-1.7	VHS1	Cytoplasmic serine/threonine protein kinase
-1.7	RAD51	Strand exchange protein; involved in recombination repair of double-strand breaks
-1.65	RAD1	ssDNA endonuclease involved in NER and double-strand break repair
-1.6	RAD4	Protein that recognizes and binds damaged DNA during NER
-1.5	PET10	Protein of unknown function; expression pattern suggests a role in respiratory growth
-1.5	BCH1	Mediates export of specific cargo proteins from the Golgi to the plasma membrane
-1.4	CUP2	Copper-binding transcription factor; activates transcription of metallothionein genes
-1.4	PXA1	Subunit of peroxisomal ABC transport complex;
-1.4	ECM37	Mitochondrial outer membrane protein required to initiate mitophagy
-1.4	MRP49	Mitochondrial ribosomal protein of the large subunit
-1.4	HXK2	Hexokinase isoenzyme 2; catalyzes phosphorylation of glucose in the cytosol
-1.3	PEXI	AAA-peroxin
		Deoxycytidyl transferase; involved in Dna repair via translesion synthesis pathway
-1.3	REVI	(TLS)
-1.3	CLB4	B-type cyclin involved in cell cycle progression
-1.3	PET127	Protein with a role in 5'-end processing of mitochondrial RNAs
-1.3	ERP5	Member of the p24 family involved in ER to Golgi transport

Table 3.1. Fitness Scores for the	Top 30 Mutants Identifie	d as Significantly	Sensitive to the
DCVC IC ₂₀ (18µM) After 5 Genera	ations of Growth		

^aFitness scores quantify the requirement of a gene for growth and are defined as the normalized log2 ratio of the deletion strain's growth in the presence versus absence of DCVC. A total of 56 genes were important for fitness in at least one DCVC treatment. Supplementary table 1 contains a list of all genes identified as significant by DSSA.

GO Biological Process ^a	p-value	Genes Identified	
Response to DNA damage stimulus	1.27E-05	RAD18 HAT2 RAD51 RAD4 RAD5	
		RAD10 PSO2 REV1 RAD1 REV3	
Error-free translesion synthesis	6.30E-05	RAD18 REV1 REV3	
Nucleotide-excision repair, DNA incision, 5'-	6.81E-05	RAD10 RAD1	
to teston	0.0001221		
DNA repair	0.0001221	RAD18 HAT2 RAD51 RAD4 RAD5 RAD10 PSO2 REV1 RAD1 REV3	
Fatty acid transport	0.0002033	PXA2 PXA1	
Eror-prone translesion synthesis	0.0002318	RAD18 REV1 REV3	
Double-strand break repair via single-strand annealing, removal of nonhomologous ends	0.001393	RAD10 RAD1	
Removal of nonhomologous ends	0.002362	RAD10 RAD1	
Meiotic mismatch repair	0.003571	RAD10 RAD1	
DNA metabolic process	0.00501	RAD51 RAD1	
Mitotic recombination	0.00501	RAD10 RAD1	
Positive regulation of cytoplasmic mRNA	0.00833	CAF20	
Processing body assembly			
Regulation of transcription by glucose	0.00833	HXK2	
GO Biological Process*	p-value	Genes Identified	
Response to DNA damage stimulus	3.875E-04	RAD18 RAD5 RAD10 REV1 RAD1 REV3	
Error-prone translesion synthesis	.007438	RAD18 REV1 RAD5 REV3	

Table 3.2. Genes required for growth in the presence of DCVC and their associated gene ontology categories

^aA list of strains exhibiting sensitivity to DCVC was entered into the FunSpec or Yeastmine tools and analyzed for overrepresented biological attributes (see Materials and Methods section).



Figure 3.3 Overview of DNA repair pathways identified by functional profiling of DCVC in yeast. Translesion synthesis (TLS) is a DNA damage tolerance pathway that bypasses lesions during replication to prevent stalling and fork collapse. Bypass is mediated by low fidelity polymerases that are error-prone and results in mutagenesis. Nucleotide excision repair (NER) is an error-free repair mechanism that recognizes helix-distorting lesions. Upon lesion detection, a DNA fragment containing the damage is excised followed by and error-free gap filling.

Yeast Gene	e Description	
RAD5	DNA helicase/Ubiquitin ligase; involved in DNA damage tolerance	SHPRH;
	(DDT) pathway	HLTF
RAD18	E3 ubiquitin ligase; required for postreplication repair	RAD18
RAD10	ssDNA endonuclease; involved in NER and double-strand break repair	ERCC1
PSO2	Nuclease required for DNA single- and double-strand break repair	SNM1B
RAD51	Strand exchange protein; involved in recombination repair of double- strand breaks	RAD51
RADI	ssDNA endonuclease involved in NER and double-strand break repair	ERCC4
RAD4	Protein that recognizes and binds damaged DNA during NER	XPC
REVI	Deoxycytidyl transferase; involved in DNA repair via translesion	REV1
	synthesis pathway (TLS)	
REV3	Catalytic subunit of DNA polymerase zeta; involved in translesion	REV3
	synthesis during post-replication repair	

 Table 3.3.
 Selected yeast genes required for DCVC tolerance and their human homologs



Figure 3.4 Sensitivity of yeast mutants deficient in DNA repair assessed by competitive growth assays. (A) Translesion synthesis repair mutants exposed to DCVC for 24hrs (B) Nucleotide excision repair mutants. Deletion mutants were tested for sensitivity to DCVC (18µM) by flow cytometry. Relative growth of each mutant was compared with a wild-type GFP strain after 24 h. Values of the growth ratios (treatment vs. control—T/NT) to wild-type GFP shown in (A,B) are mean \pm SEM; $n \ge 3$ for each measurement. Significance values were calculated by Student's t-test, where ***p < 0.001, **p < 0.01, *p < 0.05 for DCVC-treated wild-type versus mutant.



Figure 3.5 Complementation studies with overexpression of TLS proteins. Values are mean \pm SEM; $n \ge 3$ for each measurement. Significance values were calculated by two way ANOVA ***p < 0.001, **p < 0.01, *p < 0.05 for DCVC-treated wild-type versus mutants; †††p < 0.001, †p < 0.05 for DCVC treated Rev3 Δ versus complementation mutants.



Figure 3.6 Studies with Rad5 mutants support its structural role in mediating DCVC induced repair. Values are mean \pm SEM; $n \geq 3$ for each measurement. Significance values were calculated by two way ANOVA ***p < 0.001, **p < 0.01, *p < 0.05 for DCVC-treated wild-type versus mutants; †††p < 0.001, ††p < 0.01, †p < 0.05 for DCVC treated Rad5 Δ versus mutants.

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CHAPTER IV

Characterizing Genotoxicity Mechanisms of DCVC in Vertebrate Models

ABSTRACT

Functional profiling studies in yeast (Chapter 3) implicate DCVC as a potential direct DNA damaging agent causing lesions similar to that of interstrand crosslinks. A subset of repair pathways, including translesion synthesis, nucleotide excision and homologous recombinaiton were identified as processes required in resposne to DCVC DNA damage. Genetic studies in avian DT40 cell lines were conducted to confirm our findings in yeast and further characterize the DNA repair response to DCVC. DT40 cells defective in error-prone translesion synthesis repair exhibited a significant decrease in viability upon exposure to DCVC, implicating a role for mutagenesis in mediating DCVC toxicity. This was further supported by an increase in mutation frequency in human lymphoblasts exposed to DCVC. Interestingly, DT40 FANCD2^{-/-} mutants and human PD20 cells, both of which are deficient in interstrand crosslink repair, were not sensitive to DCVC, suggesting a mechanism of DNA damage and repair not consistent with known interstrand crosslinking agents. From these studies, we propose that DCVC causes nondistorting DNA lesions that are repaired by mainly by translesion synthesis and to a lesser extent, template switching, a form of error-free recombination. These findings are significant as we provide mechanistic and genetic evidence supporting a mutagenic mode of action mediated by the nephrotoxicant metabolite DCVC in vertebrate systems.

INTRODUCTION

Trichloroethylene (TCE) is a common environmental contaminant and human carcinogen found at Superfund waste sites (1). TCE exposure is associated with increased renal cell carcinoma and genetic analyses have identified unique mutation signatures in the von Hippel Lindau (VHL) gene, a tumor suppressor gene commonly associated with renal cell carcinoma in TCE exposed populations (2-5). These data suggest a mutagenic mode of action for TCE induced renal cancer, but there remains a need for molecular evidence supporting this hypothesis. TCE undergoes a complex metabolism resulting in bioactive intermediates via the glutathione conjugation pathway and studies have identified the metabolite dichlorovinyl cysteine (DCVC) as the penultimate mediator of TCE renal toxicity (6-8). The role of DCVC as a nephrotoxicant implicates it as a likely mediator of renal carcinogenesis. This is supported by yeast profiling studies (Chapter 3), which identified the DCVC metabolite as a genotoxicant. Results in yeast suggest DCVC may cause DNA damage similar to interstrand crosslinking agents, which elicits a mutagenic translesion synthesis (TLS) repair response. Thus, we examined the role of interstrand crosslink (ICL) repair and translesion synthesis in avian DT40 and human cell models to gain further insight into the genotoxicty of DCVC.

The DT40 avian system to study mechanisms of genotoxicity

The availability of isogenic DT40 deletion cell lines with stable deletions allows for functional profiling in a vertebrate system (9). DT40 cells exhibit a shorter doubling time than mammalian cells (11hrs at 39°C) and have a stable phenotype even without a functional *TP53* gene. *TP53*

encodes p53, a G1/S phase cell cycle checkpoint protein that arrests cell growth upon the recognition of DNA damage and activates DNA repair (10). Loss of p53 results in DT40 cells spending 70% of the cell cycle in S phase, allowing for the full extent of DNA damage to be observed due to reduced DNA repair in the G1 phase (10,11). DT40 studies have provided insight on the human DNA damage response for a diverse panel of DNA lesions including interstrand crosslinks, base modifications, abasic sites, bulky adducts, single and double strand breaks caused by a variety of alkylating agents, reactive oxygen species (ROS), crosslinking agents, ionizing radiation and UV rays (12-17). While DNA repair is highly conserved in eukaryotes, the DT40 system allows for the examination of repair genes conserved in humans, but not present in yeast. The genetic advantages and availability of deletion strains deficient in interstrand crosslink repair make the DT40 system an appropriate tool to further characterize the DNA damage response of the TCE metabolite DCVC.

RESULTS & DISCUSSION

Evaluation of DCVC genotoxicity in DT40 cell lines

A panel of isogenic DT40 mutants was examined in response to the TCE metabolite, DCVC (**Table 4.1**). In wild-type cells, a significant decrease in viability was observed and the DCVC IC₅₀ was determined to be 3μ M. A comparison of IC₅₀ values revealed cell lines deficient in translesion synthesis (TLS) exhibited a significant decrease in viability compared to wild-type cells. DCVC was 10X more toxic in TLS mutants, with IC₅₀ values between 300nM and 1.6uM. The viability of mutants deficient in nucleotide excision repair (NER), base excision repair (BER), non-homologous end joining (NHEJ) and DNA checkpoints was unchanged by DCVC exposure (**Table 4.2**). In contrast, DCVC caused a significant increase in the viability of homologous recombination (HR) deficient cell lines compared to wild-type cells and was 10X less toxic in these mutants with IC₅₀ values between 13uM and 36uM. Compared to the chemotherapeutic crosslinking agent cisplatin, DCVC was 10-100X less genotoxic in all cell lines tested, suggesting dissimilar mechanisms of genotoxicity (**Table 4.2**).

Role of translesion synthesis pathway in the repair of DNA damage induced by DCVC

DT40 mutants deficient in translession synthesis have shown sensitivity to various genotoxicants, including crosslinking agents (16). Our studies in yeast showed TLS mutants were hypersensitive to DCVC, similar to DNA crosslinking agents. To confirm the role of TLS repair of DCVC damage in vertebrates, we exposed Rev1-, Rad18-, and PCNAK164R DT40 cells to DCVC. All exhibited extreme sensitivity to DCVC in a dose dependent manner (Fig. 4.2a). During replication, post-translational modifications of the replication factor PCNA (proliferating cell nuclear antigen) in eukaryotes initiates the error-prone translesion synthesis repair (TLS) pathway or the error-free, template-switching (TS) pathway (18). These repair mechanisms prevent replication stalling and fork collapse when a DNA lesion is encountered (19). Monoubiquitination of PCNA at the Lys164 residue by the Rad6-Rad18 complex initiates the error prone translesion pathway and recruits special TLS polymerases such as Rev3, Rad30, and Rev1 to sites of damage (19,20). PCNAK164R cells are defective in PCNA ubiquitination and exhibited the greatest sensitivity to DCVC, along with Rev1^{-/-} cells, suggesting both PCNA ubiquitination signaling and *Rev1* play critical roles in the repair and the mutagenicity of DCVC DNA damage (Fig. 4.2a). Consistent with our results, previous studies have shown that PCNAK164R mutants exhibit sensitivity and altered mutagenesis in response to various DNA

lesions (13,14,21-23). The moderate sensitivity of *Rad18-/-* cells to DCVC could be due to Rad18-independent ubiquitination of PCNA, which has been observed in DT40 cells exposed to DNA damaging agents (13). Furthermore, studies in mouse embryonic fibroblasts show translesion synthesis repair does occur in the absence of *Rad18*, albeit significantly decreased (23,24).

Mutation frequency increased by low levels of DCVC in human lymphoblasts

The role of TLS in the repair of DCVC DNA damage suggests an increase in mutagenesis. To examine this we conducted mutation frequency assays in human lymphoblasts exposed to DCVC. The thymidine kinase assay (TK) is a forward mutation assay capable of detecting DNA major (slow growth) and minor (normal growth) mutagenic events at the TK locus. After exposure to DCVC, we observed an increase in mutation frequency of both normal growth (NG) and slow growth (SG) DNA damage at doses 10X below the IC₅₀ dose (Fig. 4.6). Mutation frequency increased by 2-fold at 1.875µM and 3.75µM DCVC and did not increase at higher concentrations (Table 4.3). The leveling of mutation frequency in doses >5uM may be attributed to the increased cellular toxicity of DCVC, rather than genotoxicity. The frequency of large deletions, translocations and recombination (slow growth) mutations increased by 3-fold compared to controls. This type of damage occurred in greater proportion than normal growth mutations, suggesting mutagenic recombination repair may also play a significant role in response to DCVC damage. It should be noted however, that measurement of slow growth mutations does not exclude small passenger mutations that have accumulated over an extended period of time. Slow growth frequencies are determined as the difference between total mutation frequency and normal growth mutation frequency. Thus, small passenger mutations can accumulate and possibly mediate an increase in these larger mutation events. Sequencing of clones is needed to better understand the contribution of the different types of repair and mutagenesis. Nonetheless, the overall increase in mutation frequency supports the role of mutagenic repair in response to DCVC DNA damage and is consistent with previous studies implicating DCVC as a potential mutagen (25). The increase of large deletions implicates repair mechanisms in addition to TLS may play a role in mediating DCVC damage.

DCVC damage does not require Fanconi Anemia (FA) pathway

Functional profiling studies in yeast (Chapter 3) implicated DCVC as an interstrand crosslinking agent, thus we examined the role of the Fanconi Anemia (FA) pathway in avian DT40 and human cell models. ICL repair in vertabrates consists of a collaboration between several DNA repair pathways, including the Fanconi anemia (FA) complex (**Fig. 4.1**) The involvement of these pathways is highly regulated by cell cycle phase and the type of DNA lesion (26-28). Recombination-dependent ICL repair functions during late S/G2 phases and requires recognition of replication fork stalling by the fanconi anemia complex (FA), "unhooking" of the ICL on one stand by NER endonucleases such as *XPF-ERCC1*, followed by gap filling and bypass of the remaining lesion by TLS polymerases and homologous recombination of the double strand break on the sister chromatid. Recombination-independent repair occurs mainly during the G1 phase and again involves the NER nucleases *XPC-ERCC1* to unhook the ICL on one strand and repair synthesis by TLS polymerases. The involvement of TLS polymerases in the repair of ICLs can reuslt in mutagenesis causing point muations as well as deletions and translocations (26). A disitnct difference in ICL repair between yeast and vertebrate systems is the presence of the Fanconi anemia (FA) complex consisting of 14 genes, 7 of which are know to be critical in ICL

repair (27). The functions of all 14 genes are not known, but mutations in these genes are associated with increased susceptibility to a variety of cancers, highlighting their important role in maintaining genome intergity (26). The FA complex detects ICLs in both recombination dependent and independent repair and signals the recruitment of additional factors such as *FANCD2*, which is critical to the initiation and recruitment of downstream repair factors, such as TLS polymerases.

DT40 FANCD2^{-/}- cell were not sensitive to DCVC in contrast to the known crosslink agent, cisplatin (Fig. 4.2b). Next, we examined the toxicity of DCVC in human PD20 cells. PD20 is a human lymphoblastoid cell line derived from a Fanconi anemia patient. It is deficient in the FANCD2 protein as a consequence of mutations in the FANCD2 gene. PD20 cells did not exhibit sensitivity to DCVC after 72hr exposures (Fig. 4.5). FANCD2 is required for the initiation and progression of ICL repair (29). The lack of sensitivity in *FancD2^{-/-}* DT40 and human cell models suggests DCVC damage differs from canonical crosslinking agents or that DCVC ICL damge is repaired in a homologous recombination independent manner. Monoadducts and intrastrand crosslinks (crosslinks with bases on the same DNA strand) are highly prevalent lesions caused by ICL agents, accounting for 90% of damage (26). DCVC damage may consist mostly of monoadducts or intrastrand crosslinks and very low levels of ICL damage, which does not cause measurable changes in cell viability. Alternatively, DCVC may cause helix distoring ICL lesions that are detected and repaired in G1 by a recombiantion-independent mechanism as depicted in Fig. 4.1. Prior cell-free and *in vitro* studies have shown that ICL repair in G1 is highly dependent on the degree of helix distortion and that not all ICLs are repaired in G1 (26). The extended Sphase and short G0/G1 phase in DT40 cells may not allow for full repair of DCVC damage, which would elicit translesion synthesis and/or template switching repair (a form of recombination repair) during replication, both of which are not dependent on FANCD2 (Fig. 4.7).

DT40 cells deficient in homologous recombination exhibit hyper-resistance to DCVC exposure Homologous recombination plays an important role in preventing replication fork collapse and as mentioned above, in the repair of ICL damage during replication (16,26,27). Interestingly, DT40 cells deficient in homologous recombination showed increased resistance in response to DCVC exposure (Fig. 4.3a). Rad51D^{-/-} cells exhibited the greatest resistance to DCVC, followed by moderate resistance in $Rad54^{-/-}$ and $Rad52^{-/-}$ cells. The resistance of HR mutants suggests a recombination independent repair mechanism is favored in the repair of DCVC DNA damage. Homologous recombination repair is tighly regulated by a variety of factors, including the RecQ helicases which prevent inappropriate HR that can interfere with post replication repair and the formation of undesired intermediates that can lead to cell death (30-33). Wrn-/- cells lack the Werner's Syndrome (WS) gene that encodes for a RecQ helicase involved in the promotion of HR, whereas *BLM*-/- cells lack the Bloom's Syndrome gene, which encodes for a RecQ helicase that promotes and inhibits HR. Both BLM and WRN are involved in overcoming replication blocks and act to resolve complex DNA structures (31). WRN (and BLM) play a role in resolving replication blocks by mediating fork regression, followed by template switching repair, a form of error-free recombination (32). We observed mild sensitivity in Wrn-/- cells exposed to DCVC, suggesting WRN and template switching may contribute a minor role in the repair of DCVC damage encountered during replication. The functional redundancy of WRN and BLM helicases could explain the mild sensitivty to DCVC observed in our studies and is in agreement with
previous findings showing moderate sensitivity to a variety of DNA damaging agents (30-32,34). Cell cycle studies are needed to better characterize DCVC damage and understand the contribution of the different recombination pathways during replication repair.

The differences in sensitivity profiles between yeast and DT40 can be attributed to the role each repair pathway plays in repair. Homologous recombination is preferred in yeast and functions throughout the cell cycle, whereas in vertebrates, HR repair is only active in S/G2. We speculate that our contrasting responses are due to the larger role HR plays in DNA repair in yeast compared to vertebrate cells and the extended S-phase in the DT40 cell system. As expected, non-homologous end joining (NHEJ) mutants $Ku70^{-/-}$, $Lig4^{-/-}$ and $DNA-PK^{-/-}$ were not sensitive to DCVC or cisplatin, consistent with previous findings showing that NHEJ is not required for ICL repair and suggests DCVC does not directly cause DSB (26).

CONCLUSIONS

DNA repair entails complex processes that are tightly regulated by cell cycle and lesion structure. Functional studies in yeast and model vertebrate systems have played central roles in understanding the molecular mechanisms that mediate repair of DNA damage caused by environmental genotoxicants. Our studies utilized the established DT40 avian system to investigate and characterize the genotoxicity of the nephrotoxicant dichlorovinyl cysteine (DCVC), a metabolite of the environmental contaminant trichloroethylene (TCE). We propose a recombination-independent repair mechanism for DCVC DNA damage that is mediated primarily by mutagenic translesion synthesis. DCVC damage may also form intermediates during replication that elicit undesired recombination repair. While recombination repair is predominately error-free, it may be detrimental to the restart of stalled replication and thus unfavored in the repair of DCVC lesions.

Based on our functional studies in DT40 and human cell lines it remains unclear as to the type of damage DCVC causes, but interstrand crosslinks, monoadducts and intrastrand crosslinks are possible lesions. Additional studies are needed to assess the structure of DCVC damage and determine a sensitive mutational "fingerprint" of DCVC exposure. The role of mutagenic repair and increased mutation frequency observed in our studies provides mechanistic and genetic evidence supporting a mutagenic mode of action for TCE. The genotoxicity of DCVC merits further investigation of mutations in important genes associated with RCC to understand the relationship between TCE exposure, mutagenesis and cancer.

MATERIALS AND METHODS

Cell lines and tissue culture. DT40 wild- type cells and a panel of isogenic DNA repair mutant cells were cultured in RPMI 1640 medium with 10% fetal bovine serum and 1% heat inactivated chicken serum at 39.5° C in a humidified atmosphere of 5% CO₂. PD20 is a human lymphoblastoid cell line derived from a Fanconi anemia patient. It is deficient in the FANCD2 protein as a consequence of mutations in the *FANCD2* gene. The PD20D2 cell line was generated from the PD20 cell line to ectopically express the FANCD2 protein. Both cell lines were cultured in RPMI 1640 and 15% fetal bovine serum and 1% PS under standard culture

conditions. The TK6^{+/-} human lymphoblast cell line is heterozygous at the thymidine kinase (TK) locus and was cultured in RPMI 1640 with 10% FBS under standard culture conditions.

Viability Assays. DT40 viability assays were conducted as outlined previously (17) using wildtype and DT40 knockout strains. 2.5×10^2 cells were seeded in 96-well plates and treated for 48rs with DCVC or cisplatin prepared in PBS. For PD20 studies, cells were seeded at 1×10^4 in 96 well plates and treated with DCVC for 3 days. The XTT assay (ATCC) was conducted per kit directions. Viability was measured as a function of absorbance at 450nm and normalized to untreated controls.

Thymidine kinase mutation assay. TK6 human lymphoblastoid cells were seeded at $\sim 2 \times 106$ cells/exposure (n = 2 per level) and treated with DCVC diluted in PBS for 24hrs. Following completion of the exposure, cells were plated in 96-well plates at 40,000 cells per well in medium containing trifluorothymidine (TFT) and 2 cells per well in medium without TFT. The plates were incubated at 37 °C with 5% CO2. After 2 weeks, the presence or absence of normal growth (NG) colonies in each well was measured, followed by measurements at the end of 4 weeks for slow growth colonies (SG). Colony growth was measured per the XTT assay. Mutation frequency was calculated as outlined in (35).



Figure 4.1. Overview of interstrand crosslink (ICL) repair in vertebrates. Recombination dependent ICL repair is replication dependent and occurs during S phase. Recombination independent ICL repair occurs during G0/G1 phases. Both pathways require *FANCD2*, which is responsible for initiation and recruitment of repair factors, such as TLS polymerases.

Gene	Function
RAD18	TLS
REV1	TLS
REV3	TLS
PCNAK164R	TLS
POLQ	TLS
XPG	NER
XPA	NER
FEN1	BER
PARP1	BER
POL B	BER
DNA-PK	NHEJ
KU70	NHEJ
LIG4	NHEJ
WRN	helicase
BLM	helicase
RAD52	HR
RAD51D	HR
RAD54	HR
XRCC3	HR
XRCC2	HR
FANCD2	ICL
BRCA1	ICL/HR
BRCA2	ICL/HR
ATM	DNA damage checkpoint
RAD17	DNA damage sensor
RAD9	DNA damage sensor

 Table 4.1 DT40 mutant cell lines analyzed in this study and their role in DNA repair



Figure 4.2 Sensitivity of DT40 TLS and ICL repair deficient mutants to DCVC (A,B) and cisplatin (C,D) assessed by XTT. Values are mean \pm SEM; $n \geq 3$ for each measurement. Significance values were calculated by two-way ANOVA, where ***p < 0.001, **p < 0.01, *p < 0.05



Figure 4.3. Sensitivity of DT40 homologous recombination (HR) and non-homologous end joining (NHEJ) repair deficient mutants to DCVC (A,B) and cisplatin (C,D) assessed by XTT. Values are mean \pm SEM; n \geq 3 for each measurement. Significance values were calculated by two-way ANOVA, where ***p < 0.001, **p < 0.01, *p < 0.05



Figure 4.4. Sensitivity of DT40 DNA damage checkpoint and nucleotide excision repair (NER) deficient mutants to DCVC (A,B) and cisplatin (C,D) assessed by XTT. Values are mean \pm SEM; n \geq 3 for each measurement. Significance values were calculated by two-way ANOVA, where ***p < 0.001, **p < 0.01, *p < 0.05

	IC50 (M)						
Mutant	DCVC	Cisplatin					
Wild-type	3.1E-06	7.7E-07					
REV1	2.9E-07	ND					
PCNAK164R	3.0E-07	4.2E-08					
RAD18	1.6E-06	7.1E-08					
MSH2	1.7E-06	ND					
WRN	1.8E-06	3.5E-07					
LIG4	2.1E-06	5.1E-07					
RAD17	2.7E-06	7.9E-08					
FANCD2	2.9E-06	4.8E-08					
DNA-PK	3.0E-06	2.9E-07					
XPG	3.0E-06	4.7E-07					
KU70	3.4E-06	5.3E-07					
FEN1	3.4E-06	1.1E-06					
POLB	3.5E-06	6.9E-07					
XRCC3	3.7E-06	1.5E-07					
XPA	3.7E-06	6.8E-07					
POLQ	3.8E-06	4.2E-07					
RAD9	3.9E-06	9.1E-08					
BLM	4.0E-06	ND					
RAD52	4.1E-06	4.4E-07					
XRCC2	4.8E-06	2.8E-07					
PARP1	4.9E-06	4.0E-07					
RAD54	5.3E-06	6.3E-08					
BRCA2	6.2E-06	8.7E-08					
ATM	7.4E-06	6.3E-07					
RAD51D	1.3E-05	3.9E-07					
BRCA1	3.6E-05	1.6E-06					

Table 4.2 Summary of DCVC and Cisplatin IC_{50} values for each DT40 mutant. The ICL agent cisplatin is 10-100X more genotoxic than DCVC.

ND, not determined



Figure 4.5 Sensitivity of ICL repair deficient lymphoblasts (PD20) and FancD2 complemented (PD20D2) cells to DCVC after 72hrs. Values are mean \pm SEM; $n \ge 3$ for each measurement.



Figure 4.6 Mutation frequency analysis at the TK locus in human lymphoblasts with and without DCVC. (A) Dose response of DCVC showing IC_{50} = 10 uM. (B) Mutation frequency of normal growth (NG) mutations and total mutations. (C) Mutation frequency of NG mutations and slow growth (SG) mutations. Point mutations and small indels are classified as NG mutations. Large deletions, translocations and recombination events are considered SG mutations. SG mutation frequency was calculated as *Total mutation frequency-NG mutation frequency*. Values are mean \pm SEM; n = 2 for each measurement in duplicate.

DCVC (µM)	MF x 10 ⁻⁶ cells	Fold change ^b
0	5.76 ± 1.83	
1.875	1.28 ± 1.50	2.2
3.25	1.32 ± 1.60	2.3
7.5	1.03 ± 3.98	1.8
15	1.16 ± 1.65	2.0

Table 4.3. Mutation frequency (mean ± SEM) in human lymphoblasts exposed to DCVC in human lymphoblasts^a

^a Mutagenesis at the TK locus was measured in human lymphoblasts after exposure to DCVC for 4 weeks. Mutation frequency is the number of mutation events per 1 million cells. Values are mean \pm SEM; n = 2 for each measurement. ^b Fold increase over untreated control



Figure 4.7 Working model for DCVC mutagenic mechanism. DCVC causes DNA damage that does not distort the DNA helix, but stalls the replicative polymerase during DNA replication. Upon stalling, DCVC lesions elicit repair by error-prone translesion synthesis and may also cause replication slippage, resulting in mutagenesis at sites of damage. While TLS repair is favored, DCVC lesions may become substrates for a form of recombination known as template switching repair.

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CHAPTER V

Future Directions: Closing the gap in TCE risk assessment

ABSTRACT

TCE toxicity has been studied considerably, yet TCE risk assessment with regards to cancer remains controversial. The last 20 years have relied heavily on *in vivo* rodent models and *in vitro* genotoxicity testing to understand the carcinogenicity of TCE and other environmental contaminants. As described in Chapter 1, genotoxicity testing can prove to be arduous, insensitive and lacking specificity, while rodent studies are costly and time consuming. Current efforts are also biased toward known endpoints, thus overlooking potential molecular processes that are important for mediating toxicity and cancer associated with TCE exposure. The knowledge generated from decades of studies has painted a blurred portrait of the cellular processes that are perturbed by TCE and how these perturbations mediate carcinogenesis. In an effort to improve TCE risk assessment, rapid, biologically based models evaluating molecular mechanisms are needed. It was the goal of the work presented herein, to address mechanistic gaps identified in the risk assessment of TCE-induced renal carcinogenesis using a functional genomics approach across a variety of models systems. Using this powerful unbiased approach in yeast, we identified genotoxicity mechanisms that may play critical roles in mediating TCEinduced renal cancer. We propose a mutagenic mechanism of action where damage caused by reactive TCE metabolites elicts translesion synthesis and recombination-independent DNA repair.. Our functional studies present much needed mechanistic insight on TCE toxicity, but also provide direction for future studies that are imperative for comprehensive TCE risk assessment-(i) determination of a mutational signature of TCE exposure and (ii) identification of TCE susceptibility genes. Below we describe the utility of next-generation sequencing to fill in these important data gaps.

MUTATIONAL SIGNATURE OF EXPOSURE

Environmental carcinogens can interact with DNA structure both directly and indirectly, with heritable change in DNA sequence constituting mutational effects. The specific type of DNA damage and the DNA repair mechanism elicited by specific chemical exposures results in unique mutational signatures. The study of mutational signatures can provide clues on type of DNA damage, extent of damage and mechanisms of carcinogenesis. Typically, mutational signatures of exposure have been determined from the study of mutations in a single gene or a small subset of specific genes. For example, several studies have revealed unique mutational signatures of exposure in *TP53* for a small handful of environmental carcinogens, including aristolochic acid, cigarette smoke and aflatoxin B1 (1-6). While data from these experiments has been insightful, it does not provide information at the genome-wide level.

Bruning *et al.* and Brauch *et al.* published studies identifying a *VHL* mutational hotspot in exon 1 associated with high occupational exposure to TCE (9-11). Occurrence of renal cell carcinoma is associated with mutations in the von Hippel Lindau (*VHL*) tumor suppressor gene. In the majority of cases, there is a propensity of small base changes, such as insertions, point mutations

and deletions that result in loss of *VHL* function, protein truncation or altered expression (12). These initial results suggested a unique mutational signature for TCE exposure, but a series of follow-up analyses concluded the high frequency of mutations was irrespective of TCE exposure (12,13).

Next generation sequencing (NGS): closing the gap in TCE risk assessment

As described in Chapter 1, current genotoxicity testing relies on a handful of mutagenesis assays that provide a *biased* mutational landscape. Mutagenic potential and mutational profiles are determined by *selection* experiments at a single, specific, loci i.e. *TK* or *HPRT* loci in mammalian tests; canavanine or FOA loci in yeast. Other studies have also used PCR-based approaches to determine exposure signatures by sequencing a handful of gene targets (usually oncogenes) in exposed populations with cancer. The power of these approaches are limited by their inherent design. Both approaches provide spectrums biased for driver mutations and limited insight on potentially carcinogenic passenger mutations. Furthermore, interpretation of this mutational data has relied on simple analyses of somatic base substitutions (C·G→A·T, C·G→G·C, C·G→T·A, T·A→A·T, T·A→C·G and T·A→G·C) to determine low resolution mutation patterns. It is known that sequence context affects mutation rates and should be taken into consideration when defining a mutational signature (8). Therefore, in addition to the 6 classes of base substitutions, there are 16 possible sequence contexts for each mutated base (A, C, G or T at the 5' end and A, C, G or T at the 3' end), and thus 96 different mutated trinucleotides are possible.

Aside from the few targeted sequencing studies described above, identifying specific TCE exposure "signatures" at the genome level have not been undertaken. An increase in mutation frequency (Chapter IV) suggests TCE exposure could produce a unique mutational fingerprint of exposure. Efforts to determine mutational signatures of TCE exposure are complicated by (i) poor exposure histories, (ii) lack of *in vitro* models to confirm mutation spectrums and (iii) interpretation of mutational data. Historical studies of TCE-associated kidney cancer have relied primarily on questionnaire data and estimates of occupational exposure based on workplace variables that have been characterized as low, medium or highly exposure. Unfortunately, these assessments often neglect personal information and other risk factors associated with renal cancer such as smoking (7).

With the advancement of NGS technologies, it is becoming more feasible to determine mutation patterns through whole genome, whole exome and whole transcriptome sequencing (See Fig. 5.1) (14). NGS technologies have led to a surge in mutation data available from cancer genomes and the mutational signatures generated can provide important insight on etiology, prevention, and therapy (8,14-21). NGS is a powerful and *unbiased* approach to determine high-resolution, genome-wide mutational signatures of TCE exposure. Hoang *et al* utilized a NGS approach to examine the carcinogen aristolochic acid (AA) (22). Whole exome sequencing of urothelial carcinoma of the upper urinary tract (UTUC) from individuals with documented exposure revealed a distinct mutational signature of A:T>T:A transversions attributable to AA (22,23). Subsequent *in vitro* studies with the Hupki MEF immortalization assay produced an exome-wide mutational signature in concordance with the human tumor mutation profile (24). These results demonstrate the (i) power of NGS to identify unique signatures of exposure and (ii) potential of

the MEF immortalization assay to recapitulate human carcinogen mutation signatures observed from whole-genome analysis of human tumors. Future studies utilizing the Hupki MEF immortalization model could provide much needed information on TCE mutation signatures and facilitate the interpretation of human mutation data.

TCE SUSCEPTIBILLITY GENES

The susceptibility of humans to diseases related to environmental chemical exposure is determined in large part by genetics (25). Given the knowledge of human genetic variants, and the role they play in determining toxicant susceptibility, there have been surprisingly few models allowing for the identification of genes underlying susceptibility. Functional genomic studies in yeast identified a S-adenosylmethionine dependent methyltransferase required for resistance to arsenic toxicity. Follow-up epidemiological studies in Andean women demonstrated that *N6AMT1* (the human homolog) polymorphisms could be used as susceptibility markers for arsenic toxicity (25,26). These studies highlight the utility of genome-wide profiing in yeast for studying TCE susceptibility genes.

Information on TCE genetic susceptibility remains limited. Early studies by Bruning et al. and Moore et al. reported significant associations between polymorphisms in GSTM1, GSTT1 and CCBL1 and renal cell carcinoma susceptibility in workers with long-term high occupational exposure to TCE (27,28). GSTM1, GSTT1, and CCBL1 encode enzymes involved in the metabolism of TCE to nephrotoxic metabolites such as DCVC. These associations further support the role of metabolism in nephrotoxicity and indicate genetic variation in the glutathione conjugation metabolism enzymes could alter cancer susceptibility in TCE exposed populations. The results from studies presented in Chap. III and IV presents a novel list of candidate susceptibility genes for TCE-associated renal cancer (Table 5.1). NGS studies have identified novel hypoxic response and chromatin modifying genes as candidate renal cell carcinoma susceptibility genes, but none have reported DNA repair genes as candidates (20,21,29,30) (reviewed in (8)). We propose that polymorphisms in translession synthesis and recombination repair genes could increase renal cell carcinoma risk in TCE-exposed populations and merits further investigation. In collaboration with the National Cancer Institute (NCI) and IARC, we have preliminary results suggesting significant associations between TCE exposure, renal cell carcinoma risk, and variants in the DNA repair genes WRN, ERCC1, ERCC4, and SNM1B. Given that there are very few examples of established gene-environment interactions in cancer (31), the discovery of four potential susceptibility genes for TCE and renal cancer is tremendous and would have significant implications for TCE risk assessment. Analyses are on going to determine the phenotype of these variants, which will provide important clues on the TCE mode of action.

On-going studies

Studies presented in Chapters III and IV revealed genetic evidence supporting TCE induced mutagenesis mediated by error-prone translession synthesis. Furthermore, our results from *selection* experiments in TK-6 human lymphoblasts suggest TCE exposure could result in a mutational signaure of exposure. Studies are on-going to determine a novel mutational signature of TCE exposure *in vitro* and in renal cell carcinoma cases with documented TCE exposure

using an *unbiased* whole exome sequencing approach. These efforts would be the first to identify and validate a mutational signature for the human carcinogen TCE.

MATERIALS AND METHODS

Cell lines and tissue culture. HK-2 (human kidney 2) is a proximal tubular cell (PTC) line derived from normal kidney immortalized by transduction with human papilloma virus 16 (HPV-16) E6/E7 genes (ATCC). Cells were cultured in Keratinocyte Serum Free Medium (K-SFM), supplemented with 0.05 mg/ml bovine pituitary extract (BPE) and 5 ng/ml human recombinant epidermal growth factor (EGF) (GIBCO) under standard culture conditions.

DNA preparation and whole exome sequencing (WES). 1×10^5 cells were seeded in 24 well plates and treated with 6 different concentrations of DCVC as outlined in Fig. 5.2. Genomic DNA (gDNA) was extracted from cells using DNeasy blood and tissue kit (QIAGEN) and checked for purity, concentration, and integrity by OD260/280 ratio using and agarose gel electrophoresis. Illumina libraries were generated using the Nextera Exome library kit (Illumina), following manufacturer's instructions. The libraries were sequenced in paired-end 100 nucleotide (nt) reads using the Illumina HiSeq 2500 platform according to manufacturer's protocols.

Mutation Identification. Sequencing reads will be analyzed and aligned to human genome hg18 with the Eland algorithm in CASAVA 1.7 software (Illumina). A mismatched base will be determined as a mutation as outlined in (22). For analyses of mutation signatures, mutations will be classified into 96 types determined by the six possible substitutions (C·G→A·T, C·G→G·C, C·G→T·A, T·A→A·T, T·A→C·G and T·A→G·C) and the 16 combinations of flanking (5' and 3') nucleotides.

THE FUTURE OF FUNCTIONAL TOXICOGENOMICS

The new paradigm in toxicity testing continues to evolve from the traditional, whole organism "kill them and count them" approach, an inefficient model for meeting the demands of toxicological risk assessments. High-throughput, mechanistic based, *in vitro* models are strongly needed in toxicological evaluations to fill data gaps for probable carcinogens and chemicals with unknown cancer risk. The need for new methods was echoed in a recent report from the National Academy of Sciences, which described the need to identify common toxicity pathways and develop high throughput predictive screening assays (32). By identifying the key molecular interactions, steps, or processes that mediate toxicity, cost-effective mode-of-action testing approaches would enable rapid data generation to improve risk assessment. The work presented herein exhibits the power of an unbiased approach in yeast and avian cells to evaluate the genotoxicity of environmental carcinogens and chemicals with unknown genotoxicity.

In addition to these models, the newly developed CRISPR-Cas9 system allows for large-scale, loss of function screening in mammalian cells. With lentiviral delivery of a CRISPR-Cas9 knockout library, sgRNAs serve as distinct barcodes that can be counted via high-throughput sequencing to perform selection screening in human cells (26). The new availability of the

CRISPR platform will greatly advance toxicity testing and enable the generation of mechanistic toxicity data most relevant to human health and cancer.

The utility of NGS technology in the field of toxicology is two-fold; first, it allows for the determination of unique mutational signatures associated with exposure and second, it provides mechanistic insight. Mutations that usually go undetected in current testing can provide information on cellular processes that play a role in mediating cancer in populations exposed to environmental carcinogens such as TCE and identify chemicals with unknown genotoxicity. An integrated approach using functional profiling, next generation sequencing and bioinformatics tools presents an opportunity to strengthen TCE risk assessment and has the potential to become a new paradigm in the evaluation of chemical risk assessment. Our results highlight the power of a systems approach to (i) identify mechanisms of action; (ii) define more specific toxicological endpoints for further study; and (iii) identify toxicant susceptibility genes (22,26,33,34).

Human homolog			
REV1			
REV3L			
HLTF			
RAD18			
RAD51			
ERCC1			
ERCC4			
DCLRE1C DCLRE1B			
WRN			

Table 5.1 Candidate TCE susceptibility genes identified by functional profiling studies in yeast.

(a) Exome sequencing (c) Transcriptome sequencing Target capture > 100,000 exons AAAAAAAA Poly-A mRNA pool Poly T + adapter based reverse transcription Adapter modified shotgun library B cDNA library Array capture Solution Adapter based paired-end ybridization sequencing of cDNA library Bead capture (b) Whole genome shotgun sequencing Adaptor modified shotgun library Whole genome shotgun using paired end reads Align reads to human genome reference. Analyze alignments to identify point mutations, focused insertion/deletion changes and large structural rearrangements

Fig. 5.1 Overview of next generation sequencing approaches that can be used to determine mutational signatures of exposure (a) In exome capture, a random library of genomic fragments, each containing platform-specific adapters on each end, is combined with a set of probes that define the human exome. Following hybridization, the probe:genomic library fragment hybrids are captured using magnetic beads and isolated from solution by the application of a magnet, or by solid phase capture. Denaturing conditions are used to elute the captured genomic library fragment population from the hybrids, and prepared for sequencing. (b) In whole genome sequencing, the same random fragment library is constructed as in (a), but the resulting fragments are sequenced directly without a capture step. (c) In transcriptome sequencing, the RNA is converted to cDNA, the resulting cDNAs are fragmented, and the library adapters are ligated to the resulting fragments, followed by sequencing. Adapted from (14).



Figure 5.2. Dose response of the metabolite DCVC in HK-2 cells and overview of treatment protocol. Cells are seeded in 24 well plates and treated with DCVC followed by isolation of gDNA for sequencing studies. Values are mean \pm SEM; $n \ge 3$ for each measurement.

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Appendix 1: Cadmium sensitive and resistant genes identified

		5 generations			15 generations			
ORF	Standard	25% IC20	50% IC20	IC20	25% IC20	50% IC20	IC20	Number of
	Indifie	1 μM	2 μM	4 μM	1 μM	2 μM	4 μM	Significant
YAL002W	VPS8	-0.8	-1.8	-2.5	-3.6	-5.1	-3.7	6
YKL041W	VPS24	-1	-1.15	-1.5	-2.05	-3.8	-4.15	6
YNR006W	VPS27	-1.15	-1.3	-1.8	-2.8	-4.45	-4.05	6
YPR173C	VPS4	-1	-1.1	-1.55	-2.5	-4	-3.9	6
YFL025C	BST1	0.6	1.35	1.3		1.7	5.5	5
YGL095C	VPS45	-1.6	-1.6	-2.1	-2.8	-3.1		5
YLR119W	SRN2		-0.7	-1.3	-1.6	-4.1	-5.1	5
YNR005C	YNR005C		-0.7	-1.15	-0.7	-3.3	-4.7	5
YOR036W	PEP12	-1.4	-1.5	-2.4	-2.7	-3.1		5
YOR089C	VPS21		-1.3	-1.5	-3.25	-3.75	-4.7	5
YPL065W	VPS28		-0.9	-1.35	-2.1	-3.25	-2.9	5
YPL084W	BRO1		-1.7	-2.1	-1.8	-3.8	-3.8	5
YCL008C	STP22		-1	-1.6	-2.3	-2.7		4
YDR323C	PEP7	-1.2	-1.5	-1.7	-2.1			4
YDR456W	NHX1		-0.8	-1.6	1.8	-1.7		4
YDR495C	VPS3	-1.3	-1.35	-2.05		-1.9		4
YGL007W	BRP1		-1.1		-1.3	-2.05	-3.2	4
YGR272C	YGR272C	0.8	1	1.2			4.7	4
YHR108W	GGA2			-1	-1	-2.75	-2.65	4
YIL052C	RPL34B		0.9	1.2		1.75	3.8	4
YIL154C	IMP2'		0.9	0.9		1.45	3.2	4
YJL053W	PEP8		-0.85	-1.4		-3.35	-3.8	4
YJL056C	ZAP1	1.1	1.55	1.3			6.4	4
YJL154C	VPS35		-1.4	-1.9		-3.8	-3.25	4
YJR102C	VPS25			-1.4	-2.05	-2.85	-3.2	4
YKR035C	OPI8		-1.3	-1.7	-1.3	-2.45		4
YLR025W	SNF7			-0.8	-2.85	-3.4	-2.75	4
YLR360W	VPS38		-1.1	-2.05		-3.15	-4	4
YML097C	VPS9		-2.4	-2.2	-3.7	-3.2		4
YML115C	VAN1		1		1.05	3	4.45	4
YMR275C	BUL1		-1.2	-2.1	-1.5	-4.5		4
YOR068C	VAM10		-1	-1.15		-2	-2.4	4
YOR322C	LDB19			-0.9	-2.1	-3.55	-3.45	4
YPL057C	SUR1		-1		-2.15	-4.7	-4.75	4
YPL120W	VPS30		-1.1	-1.5		-4.1	-5.6	4
YPR065W	ROX1		-1.15		-1.85	-4.05	-4.3	4
YAR003W	SWD1				-1.2	-2.6	-3.4	3
YAR014C	BUD14		0.7			1	2.1	3

YAR018C	KIN3		1.6			1.5	3.5	3
YBL024W	NCL1		-0.8			-2.5	-2.5	3
YBR031W	RPL4A		0.7			1	1.85	3
YBR036C	CSG2				-2.6	-4.3	-5.3	3
YBR208C	DUR1,2				-1.2	-1.7	-2.6	3
YCL005W	LDB16				3.2	0.9	3.7	3
YCR008W	SAT4		0.7			1	1.8	3
YDL117W	СҮКЗ		1.1			1.6	3	3
YDL226C	GCS1			-2.1		-1.6	-2.8	3
YDR072C	IPT1				-1.35	-3.05	-4.05	3
YDR098C	GRX3				-1	-3.45	-2.45	3
YDR289C	RTT103			1.3		1.2	3.6	3
YDR290W	YDR290W		0.8	0.9			2.1	3
YDR455C	YDR455C		-0.7	-1.6		-2		3
YDR484W	VPS52		-1.2		-1.7	-2.05		3
YDR516C	EMI2				-1.3	-2.55	-3.15	3
YER017C	AFG3			1.1		2.1	6.15	3
YER092W	IES5				-1.15	-1.9	-2.3	3
YGL071W	AFT1	-1.3	-1	-1.2				3
YGL212W	VAM7			-1.65		-1.95	-3.1	3
YHR013C	ARD1				-2.75	-3.5	-3.5	3
YHR045W	YHR045W				-0.9	-2.3	-2.8	3
YHR111W	UBA4		0.8			1.95	3.55	3
YJR043C	POL32				-1.2	-1.95	-3.2	3
YKL032C	IXR1				-1.6	-2.25	-3.3	3
YKL048C	ELM1		1.2			2.85	5.15	3
YKL113C	RAD27			-1.1	-1.4	-3.3		3
YKR035W-A	DID2			-0.9		-2.35	-3	3
YKR052C	MRS4				-1.8	-3.45	-3.55	3
YLR023C	IZH3				-1	-2.7	-3.8	3
YLR047C	FRE8				-1.1	-5.5	-5.3	3
YLR131C	ACE2				1.3	2.8	4.5	3
YLR148W	PEP3	-1.2	-1.5	-1.7				3
YLR417W	VPS36			-1.5	-2.2	-2.95		3
YMR015C	ERG5				-1.5	-3	-3	3
YMR228W	MTF1			1.8		1.1	3.55	3
YMR258C	YMR258C				-0.8	-2.05	-3	3
YMR263W	SAP30				-1.2	-1.8	-2.4	3
YMR267W	PPA2			0.8		2.1	5.85	3
YMR312W	ELP6		0.9	0.8			2.5	3
YNL119W	NCS2				1.4	2.1	4.65	3
YNL120C	YNL120C			1.5		1.8	4.15	3
YNL325C	FIG4			-1.1		-2.65	-4.05	3
YOL050C	YOL050C				-1	-1.75	-2.6	3

YOL100W	PKH2			-1	-2.3	-3	3
YOR158W	PET123		1.25		2	5.55	3
YOR258W	HNT3			3.2	2.2	4.5	3
YPL002C	SNF8		-1.4	-1.6	-2		3
YPL205C	YPL205C		1.3		1.5	3.9	3
YPL226W	NEW1			-1.1	-2.1	-2.7	3
YPR044C	OPI11	1.4			2.1	4	3
YPR064W	YPR064W			-0.8	-3.1	-4.5	3
YPR106W	ISR1	0.8			1.6	1.7	3
YAL058C-A	YAL058C-A				1.3	3.05	2
YAL058W	CNE1				1.1	2.5	2
YBL013W	FMT1			3.5		4.5	2
YBL017C	PEP1				-1.6	-3.7	2
YBL031W	SHE1				1.3	2.05	2
YBL038W	MRPL16			1.4		5.4	2
YBL057C	PTH2				-1.1	-1.8	2
YBL061C	SKT5				1.6	3.2	2
YBL066C	SEF1				-0.7	-1.7	2
YBL082C	ALG3				1	2	2
YBL083C	YBL083C				1.45	2.25	2
YBR015C	MNN2				1.2	2.85	2
YBR026C	ETR1			1.5		3.4	2
YBR027C	YBR027C				1.1	1.8	2
YBR084C-A	RPL19A			1.5		3.7	2
YBR099C	YBR099C			-1.2	-1.45		2
YBR103W	SIF2		1.2			1.9	2
YBR151W	APD1				-1	-1.9	2
YBR171W	SEC66				2.05	2.8	2
YBR174C	YBR174C				-1.9	-2.7	2
YBR175W	SWD3			-1.1	-2.5		2
YBR187W	GDT1				-2	-4.5	2
YBR275C	RIF1				-2	-2.4	2
YBR298C	MAL31				-1.85	-2.5	2
YBR300C	YBR300C		-1.1			-3.7	2
YCL001W-A	YCL001W- A				-1.65	-2.75	2
YCL010C	SGF29				-1.7	-2.7	2
YCR007C	YCR007C			3.9		4	2
YCR009C	RVS161		-1.1		-3.05		2
YCR025C	YCR025C				-1.5	-3.7	2
YCR026C	NPP1				-2.1	-3.2	2
YCR027C	RHB1				-2.5	-3.5	2
YCR028C	FEN2	0.7			1.4		2
YCR049C	YCR049C				-1.2	-3.3	2
YCR063W	BUD31				1.6	5.4	2

YCR068W	ATG15				-1.7	-4	2
YCR079W	PTC6				-1.45	-2.95	2
YCR087C-A	LUG1				-1.1	-2.85	2
YCR087W	YCR087W				-1.2	-2	2
YDL002C	NHP10				-1.4	-2	2
YDL010W	YDL010W			3.7		3.9	2
YDL025C	YDL025C				-1.6	-2.75	2
YDL061C	RPS29B				-1.6	-3.2	2
YDL066W	IDP1				1.75	3.1	2
YDL070W	BDF2			2.1		3	2
YDL082W	RPL13A			1.2		4.4	2
YDL095W	PMT1				1.45	4.4	2
YDL198C	GGC1		1.1			4.1	2
YDL225W	SHS1				1	1.9	2
YDR028C	REG1		0.8			5.8	2
YDR057W	YOS9				-1.7	-2.4	2
YDR073W	SNF11				-1.3	-3.5	2
YDR079W	PET100			1		2	2
YDR080W	VPS41		-1.85		-1.7		2
YDR146C	SWI5				1.1	2.5	2
YDR149C	YDR149C				1.2	1.85	2
YDR159W	SAC3		0.9			6.1	2
YDR175C	RSM24			2		5.9	2
YDR186C	YDR186C				-1.75	-3	2
YDR241W	BUD26				1.9	5.2	2
YDR245W	MNN10				2.4	5.5	2
YDR253C	MET32				1	1.9	2
YDR291W	HRQ1			4		3.2	2
YDR295C	HDA2				-1.1	-4.5	2
YDR322W	MRPL35			2.9		5.55	2
YDR363W-A	SEM1	1.2			1.5		2
YDR392W	SPT3			-1.9	-3.3		2
YDR395W	SXM1				-2.25	-4.25	2
YDR417C	YDR417C				1.6	5.15	2
YDR418W	RPL12B				1.8	5.7	2
YDR463W	STP1			-1.2	-1.8		2
YDR466W	PKH3				0.8	1.65	2
YDR469W	SDC1				-2.3	-3.7	2
YDR471W	RPL27B				0.9	1.9	2
YDR476C	YDR476C				-1.3	-2.7	2
YDR497C	ITR1				-1.3	-2.65	2
YDR507C	GIN4				1.7	4.4	2
YDR525W	API2				1.55	3.6	2
YEL003W	GIM4				1.4	3.8	2

YEL028W	YEL028W				3.7		4.2	2
YEL036C	ANP1					2	5.25	2
	YER119C-							
YER119C-A	A					1.4	2.7	2
YER120W	SCS2	ļ				1.1	1.7	2
YER122C	GLO3					1.8	5.2	2
YER167W	BCK2					1.6	2.95	2
YGL031C	RPL24A					1.1	1.4	2
YGL148W	ARO2				-1.1	-2.95		2
YGL214W	YGL214W					-1.3	-3.1	2
YGL240W	DOC1					2	6.9	2
YGL250W	YGL250W					-1.85	-3.4	2
YGR056W	RSC1					2.1	5.65	2
YGR085C	RPL11B					1.5	3.1	2
YGR101W	PCP1					1.9	6.4	2
YGR106C	YGR106C					1.1	2.4	2
YGR122W	YGR122W					-1.9	3.3	2
YGR148C	RPL24B					1.6	2.95	2
YGR162W	TIF4631					2.25	4.6	2
YGR206W	MVB12					-1.9	-3.6	2
YGR242W	YGR242W				2.5		2.9	2
YGR285C	ZUO1					1.9	7.6	2
YHL009C	YAP3					1.3	3.35	2
YHL011C	PRS3			1.4			4.85	2
YHR011W	DIA4			1.2			7.15	2
YHR012W	VPS29		-1			-3.3		2
YHR029C	YHI9				3.6		3.9	2
YHR030C	SLT2					-1.9	-5.5	2
YHR034C	PIH1					2.4	4.8	2
YHR039C	MSC7					-1.7	-3.3	2
YHR060W	VMA22	-1.15			-2.1			2
YHR064C	SSZ1					1.6	8.8	2
YHR066W	SSF1					1.55	3.1	2
YHR104W	GRE3					-1.3	-2.2	2
YHR129C	ARP1					1.4	2	2
YHR134W	WSS1					1.1	1.9	2
YHR142W	CHS7					1.5	4.5	2
YHR153C	SPO16				1.9		1.9	2
YIL015C-A	YIL015C-A			1.2			5.75	2
YIL018W	RPL2B			0.8			5.15	2
YIL148W	RPL40A					-2.15	-2.9	2
YJL046W	YJL046W				2.9		3.5	2
YJL062W	LAS21					1.9	4.75	2
YJL080C	SCP160				1	1.95	4.55	2
YJL099W	CHS6					1.4	3.8	2

YJL101C	GSH1					-1.2	-2.75	2
YJL149W	YJL149W					-1.4	-3.4	2
YJL168C	SET2					1.2	5.15	2
YJL169W	YJL169W					1.2	3.4	2
YJL175W	YJL175W				-1.9	-2.3		2
YJL177W	RPL17B					1.15	2.25	2
YJL183W	MNN11					2.55	5.1	2
YJL192C	SOP4					1.25	2.35	2
YJL204C	RCY1		-0.9			-1.2		2
YJR032W	CPR7					1.75	2.8	2
YJR044C	VPS55					-0.8	-2.6	2
YJR054W	YJR054W	0.6					2	2
YJR059W	PTK2					-2	-3.2	2
YJR073C	OPI3					1.25	2.55	2
YJR075W	HOC1					1.1	1.6	2
YJR079W	YJR079W	4.1	3					2
YJR083C	ACF4					-1.1	-1.8	2
YJR111C	YJR111C					1.2	1.5	2
YJR117W	STE24					-1.1	-3.25	2
YKL037W	YKL037W					1.8	4.3	2
YKL073W	LHS1					1.7	5.45	2
YKL076C	PSY1					1.5	2.45	2
YKL114C	APN1	0.9					6.05	2
YKL119C	VPH2	-0.9			-3.9			2
YKL121W	YKL121W				-0.9	-1.7		2
YKL133C	YKL133C				2.8		3.2	2
YKL134C	1-Oct					2.7	7.5	2
YKL190W	CNB1					-2.1	-3.2	2
YKR006C	MRPL13					1.2	2.9	2
YKR014C	YPT52					-1.85	-3	2
YKR041W	YKR041W				3.9		3.3	2
YKR047W	YKR047W					1.1	2.45	2
YKR048C	NAP1					1.4	3.7	2
YKR072C	S/S2					1	1.8	2
YLL021W	SPA2					1.3	2.2	2
YLL045C	RPL8B					1.35	3.2	2
YLR020C	YEH2					-1.6	-2.45	2
YLR034C	SMF3					-4.5	-4.3	2
YLR036C	YLR036C				1.7		1.7	2
YLR055C	SPT8				-2.65	-3.6		2
YLR111W	YLR111W					1.45	1.7	2
YLR139C	SLS1			0.9			3.4	2
YLR149C	YLR149C			1.2			7.55	2
YLR203C	MSS51				3.1		4	2

YLR214W	FRE1			-2	-2.75		2
YLR228C	ECM22				-1.3	-2.3	2
YLR319C	BUD6				1.1	2.45	2
YLR334C	YLR334C			0.8		1.6	2
YLR373C	VID22				1.7	3.85	2
YLR374C	YLR374C				1.5	2.3	2
YLR375W	STP3				0.7	1.2	2
YLR380W	CSR1				-1.5	-1.9	2
YLR399C	BDF1	1.2				7.1	2
YLR425W	TUS1				1.65	3.5	2
YML009C	MRPL39			4.2		3	2
	YML010C-						
YML010C-B	В		1			2.4	2
YML014W	TRM9				1.8	3.2	2
YML117W	NAB6				0.9	1.7	2
YML119W	YML119W			2.2		3.4	2
YMR010W	YMR010W				-1	-1.7	2
YMR058W	FET3				-1.5	-4.8	2
YMR072W	ABF2		1.2			2.75	2
	YMR075C-				4.05	0.45	0
YMR075C-A	A VMP103C				1.05	3.15	2
YMR193C-A	A				1.1	2.45	2
YMR204C	INP1			2.4		2.2	2
YMR214W	SCJ1				-1.5	-5.3	2
YMR273C	ZDS1				0.9	1.7	2
YMR284W	YKU70			1.8		2.5	2
YMR294W	JNM1				0.9	2.1	2
YMR299C	DYN3			1.9		1.6	2
YMR304W	UBP15				1.3	4	2
YMR319C	FET4				1.8	4.15	2
YNL047C	SLM2			3.7		4.1	2
YNL054W	VAC7				-3	-5.1	2
YNL070W	TOM7				1.5	4.55	2
YNL079C	TPM1				1.2	2.05	2
YNL091W	NST1				1.7	2.55	2
YNL109W	YNL109W				1.1	1.9	2
YNL197C	WHI3				1.7	3.9	2
YNL231C	PDR16				-2.2	-3.8	2
YNL233W	BNI4				0.7	1.6	2
YNL235C	YNL235C				-1.5	-2.6	2
YNL271C	BNI1				1.8	3.5	2
YNL283C	WSC2				1.1	1.9	2
YNL294C	RIM21				-1.8	2.8	2
YNL300W	YNL300W				1.1	1.85	2

YNL322C	KRE1				1.1	2.95	2
YNR007C	ATG3				0.95	2.1	2
YNR040W	YNR040W				0.95	1.3	2
YNR051C	BRE5				-1.9	-4	2
YOL001W	PHO80				-1.65	-3.3	2
YOL003C	PFA4				1	1.6	2
YOL039W	RPP2A				1.15	1.6	2
YOL060C	МАМЗ				-1.2	-1.8	2
YOL072W	THP1		1.2			5.4	2
YOL089C	HAL9				1.2	3.9	2
YOL118C	YOL118C			3.5		3.6	2
YOR002W	ALG6				1.35	2.2	2
YOR006C	YOR006C				1.6	3.05	2
YOR014W	RTS1				2.1	6.75	2
YOR052C	YOR052C				-0.8	-1.9	2
YOR054C	VHS3			3.3		3.8	2
YOR065W	CYT1				2	5.3	2
YOR067C	ALG8				1	1.6	2
YOR091W	TMA46		0.8			2.8	2
YOR106W	VAM3	-0.9	-1.9				2
YOR132W	VPS17		-1.1			-1.7	2
YOR150W	MRPL23		0.9			3.6	2
YOR191W	RIS1				-2	-3.2	2
YOR234C	RPL33B			3.4		3.9	2
YOR309C	YOR309C				1.8	3.25	2
YOR312C	RPL20B				1.4	3.4	2
YOR327C	SNC2				0.9	2	2
YPL056C	YPL056C				-2.45	-3.2	2
YPL061W	ALD6				1.4	3.5	2
YPL115C	BEM3				0.8	1.95	2
YPL154C	PEP4				-0.9	-2.3	2
YPL158C	YPL158C				1.4	3.45	2
YPL179W	PPQ1				-1.7	-2.5	2
YPL181W	CTI6			-1.3	-1.7		2
YPL182C	YPL182C			-1.5	-2		2
YPL227C	ALG5				1.05	1.95	2
YPL268W	PLC1		1.2			4.85	2
YPR043W	RPL43A				1.3	3.55	2
YPR053C	YPR053C				-1.5	-2.2	2
YPR087W	VPS69				1.75	3.15	2
YPR133W-A	TOM5				2.4	5.55	2
YPR140W	TAZ1			1.4		2.1	2
YPR179C	HDA3				-1.3	-4.4	2
YPR189W	SKI3				-1.3	-2.95	2

YAL011W	SWC3			1			1.6	1
YAL013W	DEP1				-1.2			1
YAL020C	ATS1		0.7					1
YAL026C	DRS2				-1.2			1
YAL040C	CLN3						4.4	1
YAL042W	ERV46						-1.9	1
YBL012C	YBL012C						-2.1	1
YBL019W	APN2				0.9			1
YBL022C	PIM1						4.5	1
YBL027W	RPL19B						1.6	1
YBL046W	PSY4						3.3	1
YBL062W	YBL062W						3.05	1
YBL065W	YBL065W				4.2			1
YBL080C	PET112						1.4	1
YBL087C	RPL23A			1.6				1
YBL089W	AVT5					-1.5		1
YBL090W	MRP21						6.1	1
YBL107C	YBL107C	1.4						1
YBR006W	UGA2						-3.7	1
YBR020W	GAL1						2.2	1
YBR023C	CHS3						3.35	1
YBR057C	MUM2				1.4			1
YBR069C	TAT1						4.35	1
YBR075W					1.8			1
YBR077C	SLM4						2.2	1
YBR106W	PHO88						4.9	1
YBR107C	IML3						2	1
YBR126C	TPS1			1.2				1
YBR134W					1.9			1
YBR138C					3.7			1
YBR149W	ARA1				1.7			1
YBR156C	SLI15	-1.4						1
YBR159W	IFA38						3.2	1
YBR162C	TOS1					-1.9		1
YBR163W	DEM1						3.4	1
YBR216C	YBP1						-1.5	1
YBR231C	SWC5						2.7	1
YBR238C							2	1
YBR251W	MRPS5						4.85	1
YBR255W							-1.9	1
YBR259W					1.1			1
YBR266C	SLM6						4.4	1
YBR267W	REI1						3.65	1
YBR268W	MRPL37						4.9	1

YBR269C	FMP21				-2.1	1		
YBR281C	DUG2				-3.2	1		
YBR284W					-3.3	1		
YBR286W	APE3				-3.8	1		
YBR292C					-3.45	1		
YBR295W	PCA1				-3.1	1		
YBR296C	PHO89				-1.8	1		
YBR297W	MAI 33				-3.3	1		
YCI 037C	SR09				2.4	1		
YCI 057W	PRD1				-1.3	1		
YCL 058C	EYV5				2.6	1		
YCR017C	CWH43				1.8	1		
YCR024C	SLM5				1.4	1		
YCR028C-A	RIM1				27	1		
YCR031C	RPS14A				-2.15	1		
YCR034W	FFN1	11			2.10	1		
YCR036W	RBK1			-1.7		1		
YCR044C	PER1				3.95	1		
YCR050C				-2 75		1		
YCR059C	YIH1			2.1.0	-2 95	1		
YCR065W	HCM1				2.00	1		
YCR066W	RAD18				22	1		
YCR085W	101210				-3	1		
YCR086W	CSM1			-1.1		1		
YCR101C			1.4			1		
YDL006W	PTC1				3.2	1		
YDL032W					2.7	1		
YDL035C	GPR1				2.4	1		
YDL037C	BSC1				-2.4	1		
YDL044C	MTF2				5.1	1		
YDL045W-A	MRP10				5.3	1		
YDL052C	SLC1			1.1		1		
YDL056W	MBP1				4	1		
YDL062W					2.6	1		
YDL074C	BRE1			-1.9		1		
YDL081C	RPP1A				4.1	1		
YDL090C	RAM1			-2.1		1		
YDL096C	OPI6				2	1		
YDL115C	IWR1				4.1	1		
YDL136W	RPL35B				2	1		
YDL142C	CRD1				2.45	1		
YDL146W	LDB17				2.7	1		
YDL151C	BUD30				5.6	1		
YDL160C	DHH1				5.25	1		
YDL162C							1.9	1
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YDL167C	NRP1						-2	1
YDI 175C	AIR2				0.9			1
YDI 188C	PPH22				0.9			1
YDL190C	UFD2						1.7	1
YDL191W	RPL35A						4.9	1
YDI 202W	MRPI 11						4.9	1
YDI 215C	GDH2				0.7			1
YDR004W	RAD57				0.1		21	1
YDR049W	101201						2.5	1
YDR065W							5.6	1
YDR071C	PAA1						-1 75	1
YDR100W	TVP15			2				1
YDR101C	ARX1					1.1		1
YDR105C	TMS1		-1.3					1
YDR108W	GSG1						-1.8	1
YDR112W	IRC2	-0.8					1.0	1
YDR114C		0.0					5.8	1
YDR115W							4.6	1
YDR121W	DPB4					1.1		1
YDR122W	KIN1				4.1			1
YDR124W					1.3			1
YDR126W	SWF1						3.2	1
YDR140W	MTQ2						3	1
YDR144C	MKC7						1.5	1
YDR150W	NUM1					-0.9	_	1
YDR156W	RPA14						2.1	1
YDR162C	NBP2						4.6	1
YDR173C	ARG82						3.75	1
YDR221W	GTB1				1.6			1
YDR226W	ADK1						3.4	1
YDR237W	MRPL7						3.15	1
YDR268W	MSW1						5.8	1
YDR276C	PMP3						-2.4	1
YDR296W	MHR1						7	1
YDR298C	ATP5						5.4	1
YDR310C	SUM1						-2.2	1
YDR314C	RAD34			1	1			1
YDR332W	IRC3			1			3	1
YDR337W	MRPS28			1			3.1	1
YDR347W	MRP1			1			5.75	1
YDR348C				1			2.6	1
YDR349C	YPS7		1.45					1
YDR359C	VID21			1			6.3	1

YDR360W	OPI7				1		2.4	1
YDR363W	ESC2	-					2.9	1
YDR384C	ATO3				2.3			1
YDR388W	RVS167					-1.9		1
YDR400W	URH1				1.6			1
YDR403W	DIT1						1.9	1
YDR405W	MRP20						2.7	1
YDR414C	ERD1		-1.2					1
YDR440W	DOT1				0.7			1
YDR443C	SSN2						-1.7	1
YDR462W	MRPL28						2.4	1
YDR474C							1.6	1
YDR477W	SNF1		-0.9				-	1
YDR486C	VPS60	-				-1.7		1
YDR525W-A	SNA2						-1.5	1
YDR534C	FIT1						-1.2	1
YEL007W							2	1
YEL013W	VAC8						1.9	1
YEL037C	RAD23					-1.3		1
YEL042W	GDA1						2.05	1
YEL043W							1.7	1
YEL048C							1.7	1
YEL050C	RML2						3.65	1
YEL054C	RPL12A						2.3	1
YEL065W	SIT1						-2.2	1
YEL067C				-1.9				1
YER007C-A	TMA20					-1.5		1
YER020W	GPA2						1.7	1
YER040W	GLN3						4.15	1
YER050C	RSM18						5.2	1
YER077C							4.45	1
YER087W							5.1	1
YER095W	RAD51						2.9	1
YER117W	RPL23B						2.4	1
YER139C							2.05	1
YER145C	FTR1						-3.65	1
YER151C	UBP3						-3.8	1
YER153C	PET122						1.7	1
YER154W	OXA1						2.15	1
YER164W	CHD1						-2	1
YER177W	BMH1						2.45	1
YFL014W	HSP12				1.1			1
YFL016C	MDJ1			0.9				1
YFL023W	BUD27						4.8	1

YFL036W	RPO41						6.4	1
YFL041W	FET5				1.9			1
YFR009W	GCN20						-2.2	1
YFR010W	UBP6					-2.4		1
YFR016C					1.2			1
YFR021W	ATG18						-2.6	1
YFR026C					1.3			1
YFR036W	CDC26			-1.4				1
YFR040W	SAP155						3.25	1
YFR048W	RMD8						-3.4	1
YGL003C	CDH1						2.2	1
YGL012W	ERG4						4	1
YGL013C	PDR1						1.9	1
YGL016W	KAP122						2.3	1
YGL019W	CKB1						3.2	1
YGL025C	PGD1					-1.9		1
YGL028C	SCW11						2.8	1
YGL046W							3.2	1
YGL064C	MRH4						3.15	1
YGL066W	SGF73					-1.5		1
YGL076C	RPL7A						4.5	1
YGL084C	GUP1						4.2	1
YGL129C	RSM23						1.6	1
YGL135W	RPL1B						3.9	1
YGL143C	MRF1						2.8	1
YGL147C	RPL9A						3	1
YGL149W		-1.1						1
YGL163C	RAD54					-1.8		1
YGL168W	HUR1		-1.1					1
YGL218W							5.2	1
YGL220W							2.35	1
YGL246C	RAI1						3.8	1
YGL257C	MNT2				1.4			1
YGR023W	MTL1				1.7			1
YGR049W	SCM4				1.2			1
YGR057C	LST7						2.2	1
YGR063C	SPT4						3.75	1
YGR064W							3.75	1
YGR072W	UPF3						-2.3	1
YGR076C	MRPL25						2.95	1
YGR078C	PAC10						3.5	1
YGR081C	SLX9					1.4		1
YGR102C							4.15	1
YGR135W	PRE9					-1.2		1

YGR143W	SKN1	-0.8					1
YGR150C						2.1	1
YGR152C	RSR1					1.4	1
YGR157W	CHO2			2.1			1
YGR163W	GTR2					2.8	1
YGR165W	MRPS35					2.9	1
YGR166W	KRE11					4.7	1
YGR171C	MSM1					1.9	1
YGR200C	ELP2					3	1
YGR209C	TRX2					-1.6	1
YGR215W	RSM27					5.3	1
YGR219W						4.8	1
YGR220C	MRPL9					3.35	1
YGR229C	SMI1					3.2	1
YGR234W	YHB1					1.5	1
YGR257C	MTM1					3.7	1
YGR270W	YTA7					3.05	1
YGR295C	COS6			1.8			1
YHL013C	OTU2					1.65	1
YHL025W	SNF6			-3			1
YHL027W	RIM101					4.9	1
YHL034C	SBP1					1.8	1
YHL041W			-1.5				1
YHL044W						2.85	1
YHR008C	SOD2					6.6	1
YHR010W	RPL27A					3.85	1
YHR032W				1.1			1
YHR079C-B				1.2			1
YHR081W	LRP1					2.5	1
YHR100C						4.8	1
YHR120W	MSH1					3.9	1
YHR132C	ECM14				-1.5		1
YHR143W	DSE2					2.25	1
YHR147C	MRPL6					2.6	1
YHR151C				1.6			1
YHR168W	MTG2					2.2	1
YHR171W	ATG7			1.3			1
YHR200W	RPN10				-1.75		1
YHR206W	SKN7		1				1
YHR207C	SET5					2.3	1
YIL005W	EPS1					-2.55	1
YIL017C	VID28					3.8	1
YIL023C	YKE4					-1.6	1
YIL060W						2.95	1

YIL067C						3.35	1
YIL093C	RSM25					3.65	1
YIL112W	HOS4					1.9	1
YIL140W	AXL2					1.6	1
YIL141W						1.9	1
YIR017C	MET28			2.3			1
YIR026C	YVH1					3.65	1
YJL022W						3.6	1
YJL023C	PET130					3	1
YJL051W	IRC8					2.1	1
YJL063C	MRPL8					3.25	1
YJL092W	HPR5				1.3		1
YJL094C	KHA1					-2.8	1
YJL095W	BCK1		-1.4				1
YJL098W	SAP185				-1.1		1
YJL102W	MEF2					6.25	1
YJL121C	RPE1					-2.8	1
YJL124C	LSM1				-1.6		1
YJL130C	URA2		1				1
YJL150W						-2	1
YJL166W	QCR8		1.7				1
YJL190C	RPS22A					-1.5	1
YJR014W	TMA22				-1.45		1
YJR040W	GEF1					-2.7	1
YJR049C	UTR1					2.7	1
YJR055W	HIT1					4.5	1
YJR082C	EAF6				0.7		1
YJR113C	RSM7					4.05	1
YJR118C	ILM1					5.1	1
YJR121W	ATP2				-1.4		1
YJR126C	VPS70					-2.1	1
YJR144W	MGM101					1.5	1
YJR154W				1.9			1
YKL003C	MRP17					6.45	1
YKL007W	CAP1					1.9	1
YKL023W						-2.95	1
YKL025C	PAN3				-1		1
YKL053C-A	MDM35					2.45	1
YKL053W						-2.6	1
YKL054C	DEF1					7.65	1
YKL056C	TMA19				1.3		1
YKL057C	NUP120					5.2	1
YKL077W	-				-1.2		1
YKL080W	VMA5		-1.7				1

YKL101W	HSL1				1.3	1
YKL106W	AAT1		0.6			1
YKL110C	KTI12				2.5	1
YKL131W			0.9			1
YKL138C	MRPL31				5.3	1
YKL147C			1.6			1
YKL155C	RSM22				2.5	1
YKL169C					4.9	1
YKL170W	MRPL38				5.8	1
YKL174C	TPO5		2.3			1
YKL176C	LST4				2.2	1
YKL208W	CBT1				1.5	1
YKL213C	DOA1			-2.05		1
YKR007W	MEH1				1.6	1
YKR010C	TOF2			-0.8		1
YKR019C	IRS4			-1.25		1
YKR020W	VPS51			-2.25		1
YKR024C	DBP7				3.25	1
YKR028W	SAP190			1.3		1
YKR031C	SPO14				-1.8	1
YKR061W	KTR2		1.7			1
YKR073C				1.05		1
YKR077W			1.2			1
YKR085C	MRPL20				4.65	1
YLL006W	MMM1				3.7	1
YLL033W	IRC19				4.3	1
YLL038C	ENT4				2	1
YLL039C	UBI4				-2.4	1
YLL043W	FPS1	1.3				1
YLR015W	BRE2			-1.95		1
YLR024C	UBR2				1.6	1
YLR053C			0.7			1
YLR061W	RPL22A				4.5	1
YLR062C	BUD28				4.5	1
YLR065C					-1.5	1
YLR067C	PET309				2.55	1
YLR068W	FYV7			1.9		1
YLR069C	MEF1				3.1	1
YLR079W	SIC1				3.2	1
YLR091W					5.5	1
YLR110C	CCW12			1.6		1
YLR176C	RFX1			-1.3		1
YLR177W			1.5			1
YLR178C	TFS1		1.4			1

YLR193C	UPS1					3.7	1
YLR200W	YKE2					2.6	1
YLR205C	HMX1					-3	1
YLR220W	CCC1			1.9			1
YLR232W					-1.7		1
YLR270W	DCS1					2.75	1
YLR286C	CTS1					2.7	1
YLR295C	ATP14					5.7	1
YLR304C	ACO1					3.7	1
YLR312W-A	MRPL15					2.1	1
YLR330W	CHS5					3.9	1
YLR335W	NUP2					-1.9	1
YLR341W	SPO77			1.1			1
YLR349W				1.6			1
YLR357W	RSC2					4.7	1
YLR358C						4.15	1
YLR361C	DCR2					-1.5	1
YLR369W	SSQ1					3.05	1
YLR382C	NAM2					4.1	1
YLR384C	IKI3					2.25	1
YLR386W	VAC14				-2.2		1
YLR402W						3.75	1
YLR407W					-1.2		1
YLR412W						2.4	1
YLR418C	CDC73					4.45	1
YLR426W						2.2	1
YLR436C	ECM30					1.9	1
YLR439W	MRPL4					7.3	1
YLR448W	RPL6B					2.8	1
YLR451W	LEU3				-1		1
YML001W	YPT7		-1.1				1
YML007W	YAP1				-1.9		1
YML008C	ERG6	-0.9					1
YML010W-A			1.2				1
YML013W	SEL1				-1.6		1
YML017W	PSP2					-2	1
YML019W	OST6					1.5	1
YML021C	UNG1					-2.8	1
YML028W	TSA1					-2.8	1
YML061C	PIF1					4.5	1
YML081C-A	ATP18				-1.3		1
YML094W	GIM5					3.5	1
YML103C	NUP188					-3.2	1
YML116W	ATR1					-1.3	1

YML121W	GTR1				2	1
YML124C	TUB3				2.35	1
YMR053C	STB2			0.9		1
YMR057C					-2.7	1
YMR060C	SAM37				6.35	1
YMR063W	RIM9				3.35	1
YMR066W	SOV1				6.05	1
YMR073C	IRC21				2.5	1
YMR075W	RCO1				3.2	1
YMR077C	VPS20		-1.7			1
YMR080C	NAM7				-3.1	1
YMR089C	YTA12				2.55	1
YMR097C	MTG1				5.85	1
YMR098C					3.4	1
YMR100W	MUB1				2.25	1
YMR102C				-1.05		1
YMR110C	HFD1				-2.3	1
YMR114C			2.9			1
YMR116C	ASC1			-1.8		1
YMR119W-						
A			 3.5			1
YMR121C	RPL15B				2.3	1
YMR123W	PKR1	-1.2			4.0	1
YMR138W					1.8	1
YMR139W	RIM11				-1.6	1
YMR142C	RPL13B				3.1	1
YMR152W	YIM1			0.8	0.5	1
YMR154C	RIM13				2.5	1
YMR158W	MRPS8				1.8	1
YMR1/9W	SP121			1.4	0.05	1
YMR188C	MRPS17				2.35	1
YMR193W	MRPL24				4.5	1
YMR194W	RPL36A				1.7	1
YMR219W	ESCI			0.0	2.2	1
YMR238W	DFG5			0.8		1
YMR204W				0.8	1.05	1
YMR287C	0331				1.95	1
YMR293C	0404				5.15	1
YMD2400	GASI				4.95	1
	01.00		4		-1./	1
	GLCO				4.4	1
VNU 0050					-1.4	1
	IVIRE /				2.1 2.65	1
	0071			4.4	2.00	1
YINLUZ/VV	URZI			-1.1		

YNL055C	POR1					5.6	1
YNL066W	SUN4					2.2	1
YNL067W	RPL9B					2.9	1
YNL077W	APJ1					-3.3	1
YNL105W	-			1			1
YNL107W	YAF9					4.9	1
YNL115C						-2.6	1
YNL136W	EAF7					3.4	1
YNL148C	ALF1					2.8	1
YNL170W						2.2	1
YNL175C	NOP13					-3.8	1
YNL177C	MRPL22					2.75	1
YNL179C						-2.6	1
YNL183C	NPR1				1		1
YNL184C						3.05	1
YNL196C						-3.3	1
YNL203C						-2.2	1
YNL205C						-2.6	1
YNL211C						-2.95	1
YNL215W	IES2				-1.8		1
YNL225C	CNM67				1.5		1
YNL226W						3.15	1
YNL227C	JJJ1					3.5	1
YNL228W						3.2	1
YNL246W	VPS75					5.1	1
YNL248C	RPA49					5.6	1
YNL252C	MRPL17					2.3	1
YNL284C	MRPL10					3.6	1
YNL291C	MID1					-1.7	1
YNL293W	MSB3				-0.9		1
YNL299W	TRF5		-1				1
YNL314W	DAL82				0.8		1
YNL315C	ATP11				-2.9		1
YNL324W					-2.7		1
YNL327W	EGT2					1.7	1
YNR036C						1.85	1
YNR037C	RSM19					2.4	1
YNR048W						-2	1
YOL002C	IZH2					-2.2	1
YOL004W	SIN3					-3.15	1
YOL009C	MDM12					3.25	1
YOL012C	HTZ1					2.5	1
YOL023W	IFM1					4.3	1
YOL041C	NOP12					2.55	1

YOL064C	MET22				1.2		1
YOL095C	HMI1					1.95	1
YOL115W	PAP2					3.3	1
YOL116W	MSN1			2.2			1
YOL121C	RPS19A					2.9	1
YOL129W	VPS68					-1.9	1
YOR001W	RRP6					3.4	1
YOR005C	DNI 4					-1.3	1
YOR030W	DEG16					3 25	1
YOR035C	SHF4				2	0.20	1
YOR039W	CKB2					2 75	1
YOR045W						17	1
YOR051C						2.05	1
YOR061W	CKA2					1.7	1
YOR076C	SKI7					-2.3	1
YOR078W	BUD21				1.9		1
YOR085W	OST3				1.3		1
YOR092W	ECM3			2			1
YOR096W	RPS7A					2.9	1
YOR140W	SFL1				-0.9		1
YOR186W				1.2			1
YOR189W	IES4				-1.2		1
YOR201C	MRM1					4	1
YOR205C	FMP38					4.6	1
YOR211C	MGM1					3	1
YOR251C				1			1
YOR266W	PNT1			1.3			1
YOR267C	HRK1					-2.4	1
YOR275C	RIM20					3.2	1
YOR276W	CAF20			2			1
YOR297C	TIM18			-1.2			1
YOR304W	ISW2				-1.3		1
YOR317W	FAA1					-1.4	1
YOR330C	MIP1					1.8	1
YOR355W	GDS1					2.5	1
YOR364W					-2.1		1
YPL005W	AEP3					4.1	1
YPL008W	CHL1					3.25	1
YPL013C	MRPS16					2.65	1
YPL029W	SUV3					2.3	1
YPL040C	ISM1					2.25	1
YPL060W	LPE10		1.4				1
YPL062W						3.05	1
YPL097W	MSY1					3.1	1

YPL101W	ELP4					2.4	1
YPL102C						2.2	1
YPL104W	MSD1					5.2	1
YPL106C	SSE1					3.95	1
YPL110C	GDE1			0.9			1
YPL118W	MRP51					4.05	1
YPL125W	KAP120					5.2	1
YPL135W	ISU1		0.8				1
YPL138C	SPP1					-2.7	1
YPL139C	UME1				-1.2		1
YPL170W	DAP1				-2		1
YPL173W	MRPL40					3.2	1
YPL180W	TCO89					3.3	1
YPL183W-A						3.3	1
YPL213W	LEA1					2.7	1
YPL253C	VIK1					2.1	1
YPL260W						2.2	1
YPL261C						1.7	1
YPL270W	MDL2					1.8	1
YPL271W	ATP15		1.8				1
YPR012W				1.8			1
YPR014C				1.6			1
YPR023C	EAF3					1.95	1
YPR024W	YME1				-2.2		1
YPR028W	YOP1			0.9			1
YPR038W	IRC16					-1.9	1
YPR047W	MSF1					3.2	1
YPR099C						1.85	1
YPR100W	MRPL51					1.8	1
YPR101W	SNT309					5.9	1
YPR114W					-1.4		1
YPR116W			2				1
YPR120C	CLB5					2.65	1
YPR122W	AXL1			1.2			1
YPR166C	MRP2					2.7	1

			5 generations	6	1	5 generation	s	
ORF	Standard Name	25% IC20	50% IC20	IC20	25% IC20	50% IC20	IC20	Number of Significant
	Hamo	0.25 mM	0.5 mM	1 mM	0.25 mM	0.5 mM	1 mM	olgrinourit
YCR050C			-1	-1.65	-3	-3.5	-2.75	5
YDL226C	GCS1		-1.1	-1.6	-4.9	-3.9	-4.5	5
YDR186C			-0.7	-1.45	-3.1	-2.6	-2.9	5
YJL204C	RCY1		-1.1	-1.45	-4.5	-5.9	-4	5
YML013W	SEL1		-1	-1.1	-5	-4	-3.6	5
YPL178W	CBC2		-1.5	-1.1	-4.2	-3.1	-3.9	5
YCR049C				-1	-2	-2.35	-3.2	4
YCR068W	ATG15			-0.8	-2.6	-2.15	-3.25	4
YCR073W-A	SOL2		-1.4		2.5	3.2	3.3	4
YDL192W	ARF1			-1.4	-3.4	-2.3	-3.8	4
YDL202W	MRPL11			1.2	2.4	2.6	4.55	4
YDL223C	HBT1		-1.2		2.1	2.15	3	4
YDR126W	SWF1			-1.6	-3	-2.9	-2.6	4
YDR153C	ENT5		-1.6		3.6	4	4.2	4
YDR414C	ERD1			1.3	4	3.55	4.25	4
YDR455C				-1.25	-2.3	-2.05	-3.55	4
YER050C	RSM18			0.9	3	3	4.65	4
YER092W	IES5			0.8	1.4	1.9	2.4	4
YGL012W	ERG4	-1.2	-1.2	-1.7	-3.9			4
YGL148W	ARO2			-0.9	-4.9	-3.75	-3	4
YGR220C	MRPL9			0.7	1.9	1.8	2.75	4
YIL018W	RPL2B			0.85	2.6	2.1	4.3	4
YIL093C	RSM25			1.1	2.15	2.35	3.65	4
YJL053W	PEP8			-1.5	-2.7	-2.7	-3.1	4
YJL154C	VPS35			-1.5	-2.95	-2.45	-2.65	4
YKL138C	MRPL31			1.2	2.2	2.2	3.6	4
YLL006W	MMM1			1.3	1.7	2.95	4.6	4
YLR025W	SNF7	-0.7		-0.7	-2.3	-2.45		4
YLR369W	SSQ1			0.8	1.2	2.1	2.55	4
YLR417W	VPS36	-0.9	-0.8	-1.35	-1.7			4
YMR058W	FET3			1	1.6	1.9	1.9	4
YMR188C	MRPS17			0.8	1.35	1.45	2.3	4
YNL101W	AVT4		-1.7		2.7	2.6	3.1	4
YNL323W	LEM3	-1	-1	-1.5	-3.1			4
YOL018C	TLG2			-1.6	-3.1	-3.4	-3.4	4
YOL089C	HAL9			-1.65	-4.7	-4.1	-2.1	4
YOR068C	VAM10			-0.8	-2.4	-2.35	-3.5	4
YOR123C	LEO1			0.8	1.95	2.05	3.05	4
YOR132W	VPS17			-0.9	-1.8	-1.6	-2.4	4

Appendix	2:	Lead	sensitive	and	resistant	genes	identified

YOR133W	EFT1	-1.2		2.3	3.7	3.5	4
YOR246C			-1.05	-2.2	-2.55	-2.65	4
YPL005W	AEP3		1.2	2.9	2.6	4.45	4
YBL038W	MRPL16			2.8	3.6	5	3
YBR006W	UGA2		-0.6	-1.8		-2.1	3
YBR044C	TCM62			2.7	2.6	3.1	3
YBR069C	TAT1			2.5	3.25	4.1	3
YBR103W	SIF2			1.9	1.8	2.8	3
YBR171W	SEC66			1.7	2.2	2.9	3
YBR213W	MET8			2.2	2.6	2.9	3
YBR215W	HPC2			-1.6	-2	-2.2	3
YBR238C				1.7	1.7	2.3	3
YBR251W	MRPS5			2.2	2.2	3.3	3
YBR284W				-1.2	-1.6	-2.1	3
YBR286W	APE3			-1.1	-1.2	-2.35	3
YBR291C	CTP1			-3.8	-3.5	-3.2	3
YBR292C				-1.7	-1.9	-2.35	3
YBR298C	MAL31			-1.9	-3.4	-3.5	3
YBR300C				-1.8	-1.9	-2.85	3
YCL001W-A				-2.5	-3.15	-2.95	3
YCL010C	SGF29		-1.2	-3.2	-2.5		3
YCR026C	NPP1			-3.8	-3.3	-3.1	3
YCR036W	RBK1			-2.25	-2.55	-3.4	3
YCR079W	PTC6			-2.3	-2.05	-2.45	3
YCR087C-A	LUG1			-2.1	-1.65	-2.15	3
YCR087W				-1.5	-2.2	-2.4	3
YDL056W	MBP1			2.25	2.4	3.85	3
YDL133W				-3.9	-3.05	-3.5	3
YDL198C	GGC1			1.8	2.2	2.9	3
YDR065W				2.4	2.7	4.5	3
YDR073W	SNF11			-1.4	-2	-3.1	3
YDR115W				2.15	1.95	3.2	3
YDR135C	YCF1			-3.9	-3.6	-5.6	3
YDR136C	VPS61		-1.2	-2.5		-3.1	3
YDR175C	RSM24			3.6	4.2	6.05	3
YDR337W	MRPS28			2.15	2.2	3.6	3
YDR347W	MRP1			1.9	2.2	4	3
YDR363W-A	SEM1			2.6	3	3.65	3
YDR377W	ATP17			2.1	2.8	3.45	3
YDR392W	SPT3			1.8	2.3	3.2	3
YDR458C	HEH2			2.7	3	3	3
YDR484W	VPS52		-1.3	-3.1		-2.7	3
YEL003W	GIM4			1.5	2.6	2.55	3
YEL008W				1.6	1.5	1.6	3

YEL050C	RML2			2.85	3.2	4.15	3
YER077C				2.5	2.4	3.95	3
YER084W				-1.7	-1.8	-1.7	3
YER087W				2.5	2.5	4.25	3
YER122C	GLO3			1.9	3.05	4.15	3
YFL013C	IES1			1.9	2.1	2.5	3
YFL013W-A				2.4	2.7	2.5	3
YFR018C				1.2	3.7	3.4	3
YGL064C	MRH4			2	2.5	3.75	3
YGL133W	ITC1			-2.1	-2.2	-3	3
YGL179C	TOS3			3.6	4.4	4	3
YGL253W	HXK2		-1.2	-1.6	-1.6		3
YGR076C	MRPL25			2.5	2.5	3.3	3
YGR078C	PAC10			3.1	3.6	3.7	3
YGR092W	DBF2			2.8	2.75	3.85	3
YGR102C				2.3	2.2	3.5	3
YGR150C				2	1.9	2.6	3
YGR257C	MTM1			1.6	1.7	2.9	3
YGR289C	MAL11			-2.1	-2.3	-2.2	3
YHR011W	DIA4			2.8	2.6	4.45	3
YHR034C	PIH1			2.4	3.3	4.3	3
YHR037W	PUT2			2.5	3.2	2.9	3
YHR111W	UBA4			1.7	2.05	2.45	3
YHR159W				2.3	2.6	3.4	3
YHR193C	EGD2			1.3	1.8	2.3	3
YHR200W	RPN10			-1.9	-2.7	-2.8	3
YIL015C-A				2.2	3	4.1	3
YIL060W				2.3	2.15	3.25	3
YIL139C	REV7	-1.3		2.2	2.3		3
YIL148W	RPL40A			-2.3	-2.8	-2.9	3
YIL154C	IMP2'			-3.4	-4.95	-3.05	3
YIR023W	DAL81			2.5	2.55	3.25	3
YJL052W	TDH1			2.4	2.3	2.8	3
YJL102W	MEF2			1.9	3	4.3	3
YJR043C	POL32			-2.85	-3.05	-3.9	3
YJR074W	MOG1			-2.65	-2.4	-2.7	3
YJR140C	HIR3			-1.75	-1.6	-2.1	3
YKL077W				2.1	2	2.5	3
YKL113C	RAD27			-3	-2.6	-2.7	3
YKL174C	TPO5	-1.3			5.1	4.6	3
YLR023C	IZH3			1.9	2.3	2.5	3
YLR047C	FRE8			-1.6	-2.25	-2.5	3
YLR055C	SPT8			2.55	2.95	4.15	3
YLR091W				2.35	2.8	3.8	3

YLR121C	YPS3				1.8	2.2	2.3	3
YLR131C	ACE2				2.2	2.25	2.8	3
YLR133W	CKI1				2.7	2.8	3.3	3
YLR149C					2.8	2.7	4.3	3
YLR174W	IDP2				1.2	1.3	1.4	3
YLR200W	YKE2				2.2	3.1	3.85	3
YLR304C	ACO1			1.6		2.3	4	3
YLR315W	NKP2				2.7	2.6	3.6	3
YLR382C	NAM2				2.1	2.9	3.85	3
YLR391W				-1.2	-2	-2.6		3
YLR448W	RPL6B				2.3	2.75	2.2	3
YLR450W	HMG2				2.3	2.6	3.2	3
YML010C-B					2.1	2.2	2.75	3
YML061C	PIF1				2	2.9	4	3
YML095C-A					1.8	2.35	2.5	3
YMR016C	SOK2				1.4	1.5	1.4	3
YMR021C	MAC1	-1.2	-1.5	-1.8				3
YMR022W	QRI8				-1.4	-3.3	-2.7	3
YMR057C					1.3	1.2	1.9	3
YMR097C	MTG1				2.8	2.8	4	3
YMR184W	ADD37		-1.6		1.8	1.9		3
YMR193W	MRPL24				2.65	2.9	4.6	3
YMR244C-A			-1.1			2.2	2.7	3
YMR264W	CUE1				-1.55	-3.1	-2.85	3
YMR267W	PPA2				3.3	3.8	5.15	3
YMR272C	SCS7				1.6	2.55	3.6	3
YMR280C	CAT8				2.6	2.7	2.8	3
YMR286W	MRPL33				2.5	2.2	2.9	3
YMR293C					1.6	2.4	3.5	3
YMR319C	FET4			-1.25	-4.85	-3.8		3
YNL177C	MRPL22			0.9		1.3	2	3
YNL179C					-3	-1.45	-2.35	3
YNL206C	RTT106				-2.3	-2.85	-2.9	3
YNL236W	SIN4				2	2.7	3.5	3
YNL252C	MRPL17				1.8	1.5	2.3	3
YNL284C	MRPL10				1.9	3	4.1	3
YNL294C	RIM21		-0.7	-1.3		-1.4		3
YNR024W					1.3	1.9	1.8	3
YNR051C	BRE5				-1.75	-1.6	-2.7	3
YOL023W	IFM1				2.4	2.4	3.6	3
YOR035C	SHE4				2.5	3.5	3.95	3
YOR065W	CYT1				2.05	2.4	3.7	3
YOR070C	GYP1				-2.2	-3.1	-3.5	3
YOR201C	MRM1				2.5	2.4	3.6	3

YOR205C	FMP38		1.95	2.2	3.2	3
YOR304W	ISW2		-1.9	-2.2	-2.4	3
YOR312C	RPL20B	1.1		3	3.6	3
YOR314W			1.9	2.1	2.1	3
YPL035C			3.1	3.6	3.8	3
YPL097W	MSY1		2	1.6	2.35	3
YPL118W	MRP51		2.95	2.9	4.6	3
YPL259C	APM1		-1.1	-1.1	-1.8	3
YPR065W	ROX1		1.45	1.2	1.7	3
YPR079W	MRL1		-0.8	-1.1	-1.3	3
YPR173C	VPS4	-1.3	-2.9	-2.7		3
YAL002W	VPS8	-1.5	-2.7			2
YAL009W	SPO7		-2.5	-2.4		2
YAL026C	DRS2		-2.5	-2.4		2
YBL013W	FMT1			6	6.6	2
YBL046W	PSY4		-1.9	-2.9		2
YBL061C	SKT5			3	3.6	2
YBL062W			2.3	2.9		2
YBL065W				6.6	6.7	2
YBL082C	ALG3			1.3	1.3	2
YBL090W	MRP21			3	4	2
YBR026C	ETR1			2.2	3	2
YBR037C	SCO1			2.4	3	2
YBR058C	UBP14			1.7	1.7	2
YBR084C-A	RPL19A			2.4	2.4	2
YBR134W				2.4	3	2
YBR138C				4.1	4.5	2
YBR149W	ARA1			2.4	2.4	2
YBR156C	SLI15			2.9	3	2
YBR163W	DEM1		2		2.9	2
YBR170C	NPL4			3.9	3.1	2
YBR187W	GDT1		-2.2		-1.9	2
YBR268W	MRPL37			2.3	4.2	2
YBR281C	DUG2		-1		-2.3	2
YBR290W	BSD2	-0.8	-1.1			2
YBR296C	PHO89		-1.95		-1.7	2
YCL008C	STP22	-1.55	-2.3			2
YCL030C	HIS4			2.7	2.6	2
YCR006C				2.2	2.2	2
YCR007C				2.65	4.3	2
YCR034W	FEN1		-2.5	-2.4		2
YCR063W	BUD31			3.5	4.9	2
YCR094W	CDC50	-2.1			-3.8	2
YDL010W				4.5	4.7	2

YDL032W			1			2.2	2
YDL044C	MTF2			2.5		3.4	2
YDL061C	RPS29B				-1.8	-2.7	2
YDL070W	BDF2				2.1	2.3	2
YDL082W	RPL13A				2.7	2.9	2
YDR072C	IPT1			0.9	1.5		2
YDR105C	TMS1	-1.4		2			2
YDR114C					2.9	3.4	2
YDR122W	KIN1				5.3	4.8	2
YDR237W	MRPL7				3.1	4.05	2
YDR268W	MSW1				3.3	4.7	2
YDR291W	HRQ1				4.6	4.7	2
YDR322W	MRPL35				4.2	5.2	2
YDR336W					2.3	2.2	2
YDR359C	VID21		0.9			4	2
YDR384C	ATO3				2.9	2.8	2
YDR385W	EFT2				2.2	2.6	2
YDR388W	RVS167				3.1	4.4	2
YDR391C					1.9	2.1	2
YDR400W	URH1				1.8	1.7	2
YDR405W	MRP20		0.9			2.3	2
YDR415C					1.2	1.1	2
YDR450W	RPS18A				2.5	3.4	2
YDR495C	VPS3		-1.7	-2.3			2
YDR507C	GIN4			1.2		2.9	2
YEL012W	UBC8				3.7	3.6	2
YEL028W					5.1	5.3	2
YER007C-A	TMA20			-1.7		-2.3	2
YER017C	AFG3				2.3	3.25	2
YER020W	GPA2		-1	-1.6			2
YER072W	VTC1		-1.1			-2.35	2
YER167W	BCK2			1.1		1.4	2
YER169W	RPH1			2.5	3		2
YER177W	BMH1		-1.3	-1.2			2
YFL023W	BUD27		-1.1	-3.2			2
YFL036W	RPO41				3.1	4.5	2
YFR008W	FAR7			-1.4		-1.6	2
YGL071W	AFT1	-0.9	-1.75				2
YGL215W	CLG1				2	2.2	2
YGL220W				2.2		2.4	2
YGR063C	SPT4				2.5	3.3	2
YGR064W					2.7	3.2	2
YGR070W	ROM1				3	2.9	2
YGR130C				-2.2	-1.4		2

YGR162W	TIF4631			2.1		2.85	2
YGR183C	QCR9			2	2		2
YGR215W	RSM27			2.5		3.85	2
YGR263C	SAY1			2.7	2.4		2
YGR282C	BGL2				2.3	2.4	2
YHL025W	SNF6	1.1	1.2				2
YHR012W	VPS29	-1.1	-1.3				2
YHR029C	YHI9				3.5	3.4	2
YHR030C	SLT2			-3.5	-1.9		2
YHR038W	RRF1			3		3.3	2
YHR073W	OSH3			-1.5	-1.7		2
YHR120W	MSH1				2.6	3.9	2
YHR153C	SPO16				2.4	2.3	2
YHR178W	STB5				-2.7	-2.9	2
YHR206W	SKN7		1.1			1.5	2
YIL030C	SSM4				-1.7	-2.3	2
YIL035C	CKA1				1.8	2.5	2
YIL067C				-2.3	-1.7		2
YIL107C	PFK26				1.4	1.7	2
YIL110W	MNI1				2.3	3.2	2
YIL112W	HOS4				1.5	2.15	2
YIR028W	DAL4				4.9	4.1	2
YJL046W					3.4	3.4	2
YJL094C	KHA1			-1.3		-1.4	2
YJL101C	GSH1			-1.75		-1.7	2
YJL128C	PBS2				1.5	2.1	2
YJL179W	PFD1				1.6	1.7	2
YJL183W	MNN11			2.7	2.8		2
YJL197W	UBP12			-1.4		-2.2	2
YJL214W	HXT8				4.6	4	2
YJR040W	GEF1			-1.6		-2.85	2
YJR102C	VPS25		-1.1	-2.2			2
YJR117W	STE24				-1.7	-2.65	2
YKL023W				-1.35		-2.15	2
YKL133C					3.4	3.6	2
YKL135C	APL2			-1.5		-2.4	2
YKL136W				-1.7		-2.65	2
YKL170W	MRPL38		1.1			2.9	2
YKL221W	MCH2				2.6	2.7	2
YKR014C	YPT52		-0.8	-1.2			2
YKR020W	VPS51			-2.65	-2.3		2
YKR031C	SPO14				-1.5	-2.8	2
YKR041W					3.8	3.5	2
YKR061W	KTR2				1.6	1.4	2

YKR078W		-1		1.3			2
YKR082W	NUP133			2.1		2.7	2
YKR085C	MRPL20			1.7		2.6	2
YLL023C					3.5	3.2	2
YLL027W	ISA1		1.35			2.2	2
YLL033W	IRC19			3.1		3.6	2
YLL038C	ENT4				-1	-1.3	2
YLL043W	FPS1	1.1	1.45				2
YLL057C	JLP1				3.1	3.2	2
YLR006C	SSK1				1.1	1.5	2
YLR036C					2.3	2.4	2
YLR052W	IES3				2.5	3.1	2
YLR068W	FYV7				2.4	2.4	2
YLR087C	CSF1				-2.2	-2.5	2
YLR093C	NYV1				2.1	2.3	2
YLR178C	TFS1				1.9	2	2
YLR188W	MDL1				2.7	2.8	2
YLR203C	MSS51				3.8	4.1	2
YLR216C	CPR6			1.1		1.1	2
YLR228C	ECM22				-1.7	-2.1	2
YLR286C	CTS1				1.9	2.1	2
YLR334C					1.3	1.5	2
YLR349W					1.5	1.7	2
YLR370C	ARC18			2.3		2.4	2
YLR380W	CSR1				-1.4	-2	2
YLR402W					3	4.3	2
YLR425W	TUS1				2.1	2.7	2
YLR441C	RPS1A				2.2	2.8	2
YML009C	MRPL39				5	5.2	2
YML010W-A				1.8		2.5	2
YML048W-A				2	1.6		2
YML070W	DAK1				3.6	3.4	2
YML097C	VPS9		-1.95	-2.6			2
YML119W					2.8	2.6	2
YMR052C-A			-1.65	-2.55			2
YMR052W	FAR3		-0.85			-2.1	2
YMR072W	ABF2			2.1		2.9	2
YMR073C	IRC21			1.9		3.3	2
YMR089C	YTA12			2		2.45	2
YMR098C					3.1	4.25	2
YMR116C	ASC1		-1.7		-2.2		2
YMR119W-						~ -	
A					2.8	2.5	2
YMR166C		-1.9			2		2
YMR170C	ALD2			-1.1		-0.9	2

YMR204C	INP1				2.6	2.6	2
YMR228W	MTF1				2.2	1.7	2
YMR262W		-1.3			1.6		2
YMR284W	YKU70				2.2	2.6	2
YMR299C	DYN3				2	2.1	2
YMR304W	UBP15				3.3	3.8	2
YMR312W	ELP6				1.8	2.95	2
YNL016W	PUB1				1.7	2.2	2
YNL047C	SLM2				3.6	3.7	2
YNL070W	TOM7		-1.4	-2.85			2
YNL077W	APJ1				-1.9	-2.4	2
YNL105W					1.35	1.55	2
YNL115C				-1.3		-1.85	2
YNL119W	NCS2				3.4	3.6	2
YNL120C					3	3.55	2
YNL136W	EAF7				2.2	2.7	2
YNL140C					4.6	4.4	2
YNL205C				-1.6		-1.7	2
YNL211C				-1.7		-1.7	2
YNL264C	PDR17	-1.3				-3.2	2
YNL305C					3.8	3.7	2
YOL002C	IZH2				-1.2	-2.25	2
YOL027C	MDM38				2	2.7	2
YOL118C					4	3.8	2
YOR021C				1.8	2.1		2
YOR054C	VHS3				3.5	3.6	2
YOR061W	CKA2			-1.3	-1.5		2
YOR089C	VPS21		-1.6	-1.95			2
YOR092W	ECM3				4.1	4.2	2
YOR137C	SIA1			1.6	1.5		2
YOR164C					-2.2	-3.2	2
YOR352W					2.6	2.3	2
YOR364W		-1.5		2.3			2
YPL018W	CTF19	-1.2	-1.4				2
YPL104W	MSD1			2		4	2
YPL140C	MKK2			1.9	1.4		2
YPL157W	TGS1				3.4	4.1	2
YPL173W	MRPL40				2.3	3.3	2
YPR047W	MSF1			2		3.5	2
YPR064W				1.1		1.1	2
YPR087W	VPS69			-2.3	-3.1		2
YPR099C			0.8			1.4	2
YPR101W	SNT309				3.6	4.2	2
YPR128C	ANT1				2	2.4	2

YPR140W	TAZ1					2.9	2.7	2
YPR196W						1.8	1.8	2
YBL007C	SLA1						3.15	1
YBL010C			-1.2					1
YBL019W	APN2					1.3		1
YBL022C	PIM1				-3.7			1
YBL051C	PIN4	0.8						1
YBL067C	UBP13						-2.9	1
YBL072C	RPS8A				-1.7			1
YBL079W	NUP170						1.7	1
YBL081W						2		1
YBL083C				-1				1
YBR035C	PDX3					-2.8		1
YBR056W					1.4			1
YBR113W					2			1
YBR114W	RAD16				2			1
YBR129C	OPY1					1.4		1
YBR131W	CCZ1			-1.1				1
YBR162C	TOS1						1.9	1
YBR164C	ARL1				-1.6			1
YBR173C	UMP1					1.7		1
YBR216C	YBP1						1.3	1
YBR225W					-1.2			1
YBR246W							-1.4	1
YBR295W	PCA1						-1.8	1
YBR297W	MAL33						-2	1
YBR299W	MAL32					2.6		1
YCL037C	SRO9					2.1		1
YCL045C							-1.4	1
YCR001W					1.6			1
YCR008W	SAT4				-1.3			1
YCR020W-B	HTL1						6.1	1
YCR027C	RHB1						-3.2	1
YCR028C-A	RIM1						2.55	1
YCR045C					-1.5			1
YCR082W	AHC2					1.2		1
YCR085W					-0.9			1
YCR086W	CSM1				-1.5			1
YCR101C						2.5		1
YDL002C	NHP10				1.2			1
YDL006W	PTC1			-2.05				1
YDL020C	RPN4				-1.7			1
YDL040C	NAT1				-3.3			1
YDL073W					1.7			1

YDL090C	RAM1			1.9			1
YDL160C	DHH1			-2.5			1
YDL216C	RRI1				1.9		1
YDR006C	SOK1			-1			1
YDR083W	RRP8				-2.6		1
YDR098C	GRX3				-1.7		1
YDR144C	MKC7					1.5	1
YDR146C	SWI5					1.2	1
YDR159W	SAC3	-14					1
YDR173C	ARG82					2.6	1
YDR194C	MSS116					3.1	1
YDR269C						-1.6	1
YDR276C	PMP3					1.8	1
YDR283C	GCN2				2		1
YDR296W	MHR1				_	3.8	1
YDR298C	ATP5					4.6	1
YDR314C	RAD34				1.8		1
YDR348C						1.3	1
YDR350C	ATP22					2.9	1
YDR354W	TRP4				1.7	2.0	1
YDR389W	SAC7					-2 4	1
YDR393W	SHE9					2.4	1
YDR403W	DIT1				17		1
YDR422C	SIP1	-1.3					1
YDR456W	NHX1		-1.2				1
YDR462W	MRPI 28					2	1
YDR465C	RMT2				2	_	1
YDR512C	FMI1					3.3	1
YEL009C	GCN4		-1.5			0.0	1
YEL023C					2		1
YER031C	YPT31			-1.9			1
YER051W	JHD1				2.2		1
YER059W	PCL6				-2.4		1
YER066C-A					2.3		1
YER120W	SCS2				-1.2		1
YER164W	CHD1			-1.6			1
YFL010C	WWM1			1.1			1
YFL016C	MDJ1					2.4	1
YFL041W	FET5				2.1		1
YFR026C					1.8		1
YFR034C	PHO4				-2.3		1
YGL016W	KAP122					1.5	1
YGL020C	GET1	-1.8				-	1
YGL025C	PGD1					2.8	1

YGL035C	MIG1			-1.5			1
YGL046W			-1.1				1
YGL066W	SGF73					3.3	1
YGL087C	MMS2					2.1	1
YGL127C	SOH1			2			1
YGL136C	MRM2					2.2	1
YGL138C					2.3		1
YGL167C	PMR1	-1.3					1
YGL168W	HUR1	-0.9					1
YGL200C	EMP24	-1.3					1
YGL218W						3.2	1
YGL226C-A	OST5				2.5		1
YGL227W	VID30				1.6		1
YGL229C	SAP4				2.2		1
YGL240W	DOC1					4.2	1
YGL244W	RTF1					2.6	1
YGR007W	MUQ1					-2.4	1
YGR072W	UPF3					-1.3	1
YGR097W	ASK10				2.6		1
YGR101W	PCP1					3.8	1
YGR104C	SRB5					3	1
YGR122W			-1.1				1
YGR143W	SKN1			1.8			1
YGR200C	ELP2					2.4	1
YGR209C	TRX2					-1.2	1
YGR213C	RTA1					-1.3	1
YGR219W						2.9	1
YGR228W				-1.4			1
YGR229C	SMI1			-2.6			1
YGR230W	BNS1			1.8			1
YGR231C	PHB2				2.2		1
YGR233C	PHO81					2.5	1
YGR272C						3.6	1
YGR295C	COS6				1.9		1
YHL007C	STE20				-1.8		1
YHL009C	YAP3			-1.8			1
YHL014C	YLF2			-1.6			1
YHL034C	SBP1			-2			1
YHR001W-A	QCR10					-1.1	1
YHR004C	NEM1			-2.1			1
YHR010W	RPL27A					2.5	1
YHR014W	SPO13			1.5			1
YHR045W					-1.8		1
YHR060W	VMA22		-1.5				1

YHR064C	SSZ1					2.8	1
YHR079C-B					2.4		1
YHR116W	COX23					1.7	1
YHR142W	CHS7				2.2		1
YHR147C	MRPL6					2.15	1
YHR182W			-2				1
YHR194W	MDM31					3.2	1
YIL017C	VID28					3.1	1
YIL032C				1.3			1
YIL036W	CST6					4.5	1
YIL047C	SYG1					3.4	1
YIL052C	RPL34B			-3.05			1
YIL053W	RHR2					1.4	1
YIL098C	FMC1					2	1
YIR005W	IST3			-2.1			1
YIR024C						1.5	1
YJL004C	SYS1			-1.6			1
YJL023C	PET130					2.2	1
YJL062W	LAS21				2.7		1
YJL080C	SCP160				1.3		1
YJL098W	SAP185			0.8			1
YJL099W	CHS6					2.6	1
YJL108C	PRM10			1.4			1
YJL124C	LSM1			-3.65			1
YJL131C			-1.3				1
YJL132W				-1.3			1
YJL149W						-1.9	1
YJL172W	CPS1			-2.7			1
YJL192C	SOP4			-2			1
YJR032W	CPR7					3.2	1
YJR044C	VPS55				2.2		1
YJR055W	HIT1					2.3	1
YJR088C					2.8		1
YJR105W	ADO1				2		1
YJR113C	RSM7					2.7	1
YJR121W	ATP2				-2.1		1
YKL003C	MRP17				2.3		1
YKL016C	ATP7					2.5	1
YKL025C	PAN3			-1.5		-	1
YKL040C	NFU1	1		-1			1
YKL041W	VPS24			-1.8			1
YKL048C	ELM1	1				3.5	1
YKL053W		1				-1.5	1
YKL061W						-1	1

YKL066W						3.4		1
YKL068W	NUP100	1				1.2		1
YKL087C	CYT2	1		-0.9				1
YKL096W-A	CWP2	1	-1.6					1
YKL098W		1					-2.3	1
YKL110C	KTI12						2.6	1
YKL114C	APN1	1			2.3			1
YKL134C	39356						3.1	1
YKL150W	MCR1	1				1.4		1
YKL166C	ТРК3	1				2.1		1
YKL169C							2.7	1
YKL207W		1					-1.4	1
YKR019C	IRS4				-1.6			1
YKR028W	SAP190						2.3	1
YKR052C	MRS4					-1.9		1
YKR077W						1.5		1
YKR095W	MLP1				-1.3			1
YLL021W	SPA2						1.4	1
YLR043C	TRX1					1.1		1
YLR044C	PDC1	1					1.3	1
YLR053C						1.5		1
YLR057W				-1.2				1
YLR059C	REX2						1.3	1
YLR067C	PET309			1				1
YLR069C	MEF1						3.05	1
YLR079W	SIC1				-2.1			1
YLR104W						0.9		1
YLR139C	SLS1						2.9	1
YLR148W	PEP3			-2.3				1
YLR165C	PUS5					1		1
YLR176C	RFX1						1.4	1
YLR180W	SAM1						1.2	1
YLR214W	FRE1				-1.9			1
YLR225C							1.5	1
YLR232W					1			1
YLR257W					1.6			1
YLR262C	YPT6		-1.6					1
YLR268W	SEC22		-1.5					1
YLR270W	DCS1			1.1				1
YLR295C	ATP14						3.6	1
YLR297W		<u> </u>			1.6			1
YLR312W-A	MRPL15	<u> </u>					1.3	1
YLR326W						1.3		1
YLR337C	VRP1					2.6		1

YLR338W	OPI9			2.6			1
YLR357W	RSC2					2.4	1
YLR358C						2.9	1
YLR368W	MDM30					2.3	1
YLR384C	IKI3					2.35	1
YLR418C	CDC73					2.9	1
YLR439W	MRPL4					2.9	1
YML008C	ERG6		-1.4				1
YML013C-A			-1.4				1
YML017W	PSP2			-1.1			1
YML021C	UNG1					-1.8	1
YMR004W	MVP1			-1.3			1
YMR029C	FAR8			-1.1			1
YMR063W	RIM9		-1.1				1
YMR064W	AEP1					3.5	1
YMR066W	SOV1					3.65	1
YMR071C	TVP18					-2.5	1
YMR075W	RCO1	-1.2					1
YMR135W-							
A					1.3		1
YMR155W					0.9		1
YMR158W	MRPS8					1.9	1
YMR175W	SIP18			1.5			1
YMR194W	RPL36A				-1.4		1
YMR205C	PFK2				-2.5		1
YMR214W	SCJ1					-2.1	1
YMR258C						-1.9	1
YMR261C	TPS3			1.8			1
YMR275C	BUL1		-1.4				1
YMR276W	DSK2	-1.1					1
YMR282C	AEP2					2.95	1
YMR287C	DSS1					1.8	1
YMR294W-					27		1
				1.4	2.1		1
VNI 005C	MRP7			1.4		1.0	1
VNI 022C		-0.8				1.5	1
VNI 055C	POR1	-0.0				12	1
VNI 058C				1.8		7.2	1
	PHO23			1.0		21	1
	111025				17	<u> </u>	1
VNI 1210	TOM70				1.7	1.8	1
VNI 1270/				_12		1.0	1
VNI 1200				-1.2		15	1
VNI 1750						27	1
TNL 1750	NUFIS					-2.1	

YNL184C							2.1	1
YNL198C					-1.1			1
YNL204C	SPS18				-1.4			1
YNL229C	URE2				1.4			1
YNR036C							1.5	1
YNR037C	RSM19						1.9	1
YOL009C	MDM12						2.5	1
YOL064C	MET22						-2.6	1
YOL101C	IZH4					1.3		1
YOL115W	PAP2				-2.9			1
YOR009W	TIR4					1		1
YOR014W	RTS1						2.5	1
YOR019W						2		1
YOR030W	DFG16			-1.2				1
YOR036W	PEP12			-2				1
YOR043W	WHI2						1.4	1
YOR044W	IRC23				1.3			1
YOR091W	TMA46						1.7	1
YOR106W	VAM3		-2.2					1
YOR150W	MRPL23			1				1
YOR199W							2.8	1
YOR211C	MGM1						2.6	1
YOR234C	RPL33B					4.2		1
YOR251C							1.5	1
YOR293W	RPS10A	-1.3						1
YOR309C						1.7		1
YOR330C	MIP1			0.8				1
YPL002C	SNF8			-1.3				1
YPL051W	ARL3				-2			1
YPL052W	OAZ1				1.5			1
YPL065W	VPS28			-1.3				1
YPL101W	ELP4						2.55	1
YPL102C						1.8		1
YPL170W	DAP1					-1.6		1
YPL182C							2.2	1
YPL253C	VIK1						1.8	1
YPL261C				-0.6				1
YPL274W	SAM3					3.7		1
YPR012W						1.6		1
YPR014C						1.5		1
YPR067W	ISA2						2.5	1
YPR090W							-1.95	1
YPR131C	NAT3						2.8	1
YPR166C	MRP2						2.3	1

			5 generations	6	1	5 generation	s	
ORF	Standard Name	25% IC20	50% IC20	IC20	25% IC20	50% IC20	IC20	Number of Significant
	Name	0.625 mM	1.25 μM	2.5 mM	0.625 mM	1.25 μM	2.5 mM	olgrinicarit
YJL056C	ZAP1	1.55	1.8	1.4	5.1	4.9	4.6	6
YML097C	VPS9	-2.3	-2.75	-2.4	-2.8	-2.15	-3.3	6
YCR044C	PER1		1.8	1.4	3.4	3.9	4.85	5
YAL053W	FLC2		-1.6	-2.8		-1.7	-4.5	4
YBL038W	MRPL16			1.2	1.35	2.15	4.4	4
YDR495C	VPS3	-2.15	-2.35	-1.65	-2			4
YKL041W	VPS24	-1.1		-2.8		-1.35	-4.8	4
YMR238W	DFG5		-2.65	-2.5		-1.75	-4.25	4
YOR036W	PEP12	-2.7	-2.5		-2.4	-2.6		4
YOR089C	VPS21		-2	-1.8		-2.5	-3.65	4
YOR270C	VPH1	-2.9	-2.9	-3.8		-1.9		4
YAL002W	VPS8			-2.8		-1.1	-3.2	3
YBL061C	SKT5				1.8	1.3	4.7	3
YBR023C	CHS3				1.7	2	2.9	3
YBR069C	TAT1				1.3	2.05	3.8	3
YCL007C		-3.5	-3.5	-2.1				3
YCL010C	SGF29			-1		-1	-2.7	3
YDL226C	GCS1			-1.85		-1.85	-4	3
YDR455C				-2.7		-0.6	-3.8	3
YEL051W	VMA8	-2.95	-3.2	-1.5				3
YGL095C	VPS45	-3.1		-2.2	-2.1			3
YGL148W	ARO2			-1.5		-1.45	-3.1	3
YGR063C	SPT4			1.1		1.45	3.95	3
YHR060W	VMA22	-3.4	-4.15	-2.1				3
YHR142W	CHS7				1.55	2.05	3.55	3
YJL099W	CHS6				0.9	1.2	2.7	3
YJL204C	RCY1			-1.65		-1.05	-3.75	3
YJR059W	PTK2			0.9		1	2.3	3
YKL080W	VMA5	-3.4	-3.8	-3.35				3
YKL119C	VPH2	-3.05	-3.5	-2.2				3
YLL033W	IRC19			1.6		1.4	2.8	3
YMR193W	MRPL24			1		1.4	2.9	3
YMR243C	ZRC1			-3.2		-1.1	-5.5	3
YNL322C	KRE1		-1.7	-1.45		-1.25		3
YNR006W	VPS27			-2.6		-0.7	-3.9	3
YOL001W	PHO80		-1.5	-2.5		-4.35		3
YOR061W	CKA2			1		0.7	1.75	3
YPL118W	MRP51			0.8		1.4	2.65	3
YPL179W	PPQ1			-1.75		-1.25	-4.5	3

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An	nendix	.11	Zanc	sensitive	and	resistant	σenes	identified
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YPL182C				1.2	-1.1	-3.1	3
YPR173C	VPS4			-3.4	-2.4	-3.8	3
YBR036C	CSG2				-1	-2.3	2
YBR068C	BAP2				-0.8	-2.55	2
YBR131W	CCZ1			-3.65	-4.05		2
YBR287W	ZSP1			-4.35		-4.2	2
YBR290W	BSD2				0.75	2	2
YCR028C	FEN2				1.1	2.55	2
YCR049C				-2.1		-1.5	2
YDR065W				1.4		3.2	2
YDR098C	GRX3				-2.1	-3.75	2
YDR202C	RAV2			-1.7		-3	2
YDR203W				-1.55		-3.9	2
YDR241W	BUD26			1.2		2.75	2
YDR245W	MNN10			1.7		3.5	2
YDR323C	PEP7	-2.8	-3.5				2
YDR359C	VID21			1.35		2.9	2
YDR363W-A	SEM1			1.4		3.35	2
YDR377W	ATP17			1.6		3.2	2
YDR484W	VPS52			-2.3		-3.6	2
YDR507C	GIN4				0.9	1.8	2
YEL036C	ANP1			2		3.3	2
YEL050C	RML2				1.4	3.15	2
YER077C				1.2		2.4	2
YER111C	SWI4	-1.4		1.3			2
YER122C	GLO3				1.6	2.4	2
YER123W	ҮСК З			-1.55		-2.1	2
YER145C	FTR1			-1.3		-2.1	2
YER177W	BMH1		-0.8	-0.9			2
YFR010W	UBP6			1.8		-2.5	2
YFR034C	PHO4				1.5	4.2	2
YGL076C	RPL7A	1.1		1.65			2
YGL124C	MON1			-3.1	-2.35		2
YGL167C	PMR1	-2.3	-2.1				2
YGR064W					1.3	3.85	2
YGR215W	RSM27			1.1	1.6		2
YGR220C	MRPL9				0.9	1.6	2
YHL011C	PRS3			1.2		3	2
YHL014C	YLF2			-1.4		-1.6	2
YHR011W	DIA4			1.4		3.45	2
YHR045W					-0.8	-3.6	2
YHR104W	GRE3			-1.1		-2.5	2
YHR111W	UBA4				1.2	1.9	2
YIL015C-A					2	3.35	2

YIL053W	RHR2				0.7	1.6	2
YIL060W					1.1	2.8	2
YIL154C	IMP2'		-1.95			-4	2
YIR023W	DAL81				1.7	3.3	2
YJL095W	BCK1		1.35	1.5			2
YJL128C	PBS2		1.1			2	2
YJR033C	RAV1		-2.55		-2.45		2
YJR040W	GEF1		-1.6			-4.2	2
YJR083C	ACF4		-1			-1.7	2
YJR102C	VPS25		-2.15			-3.4	2
YJR129C			-1.6			-2.2	2
YKL077W					0.7	2.6	2
YKL121W			-1.3			-2.8	2
YKL147C			-1.1			-1.6	2
YKL160W	ELF1				0.6	1.8	2
YKR019C	IRS4		-1.6			-1.5	2
YKR035W-A	DID2		-2.3			-1.4	2
YKR052C	MRS4				-1.25	-4.4	2
YLL006W	MMM1		1.7			3.1	2
YLL045C	RPL8B		0.8			1.95	2
YLR006C	SSK1		1.1			1.4	2
YLR025W	SNF7		-1.05			-4	2
YLR047C	FRE8				-0.95	-3.45	2
YLR111W					1.05	2.25	2
YLR148W	PEP3	-3.1	-2.1				2
YLR174W	IDP2		-1			1.2	2
YLR358C			1.3			2.75	2
YLR369W	SSQ1		1.1			2.15	2
YLR370C	ARC18				0.9	2.85	2
YLR380W	CSR1				-1.05	-2.55	2
YLR382C	NAM2		1.3		1.2		2
YLR417W	VPS36		-1.9			-3.25	2
YLR425W	TUS1				1	3.2	2
YML013W	SEL1				-1.6	-2.8	2
YML115C	VAN1				1.5	2.5	2
YML122C			1.6			3.1	2
YML123C	PHO84				1	3.85	2
YMR016C	SOK2				1	1.7	2
YMR058W	FET3		-0.8			-2.1	2
YMR228W	MTF1				1.1	2.05	2
YMR267W	PPA2				2.3	4.9	2
YNL051W	COG5				-0.8	-2.1	2
YNL236W	SIN4		2.6			2.8	2
YNL259C	ATX1		-1			-3.95	2

YNL323W	LEM3		-2.5	-2.4		2
YNL329C	PEX6			-0.9	-1.6	2
YOR035C	SHE4			1.25	4.15	2
YOR070C	GYP1		-1.65		-2.5	2
YOR201C	MRM1			1.9	2.9	2
YOR205C	FMP38		1	1.5		2
YOR331C		-1.6	-1.9			2
YPL005W	AEP3		1.3	1.5		2
YPL057C	SUR1			-0.85	-1.9	2
YPL065W	VPS28		-1.15		-4.6	2
YPL157W	TGS1		1.7		3.35	2
YPL170W	DAP1			-1.45	-4.85	2
YPL181W	CTI6		1		-2.8	2
YPR065W	ROX1		-1.6		-2.15	2
YPR106W	ISR1			0.8	1.9	2
YPR153W			-1		-1.7	2
YAL009W	SPO7				-2.4	1
YAL019W	FUN30		-1.2			1
YAL022C	FUN26		-0.8			1
YAL026C	DRS2				-4.3	1
YAL040C	CLN3		-1.7			1
YAL047C	SPC72		1.7			1
YAL048C	GEM1				1	1
YAL058C-A			-1.4			1
YAL058W	CNE1		-1.7			1
YBL013W	FMT1				4.7	1
YBL039C	URA7				2.1	1
YBL051C	PIN4				-2.1	1
YBL054W					-1.6	1
YBL062W					3.5	1
YBL065W					6.5	1
YBL071C					1.8	1
YBL082C	ALG3				2	1
YBL083C					1.8	1
YBL087C	RPL23A		1.6			1
YBL090W	MRP21				3.1	1
YBR035C	PDX3			-1.65		1
YBR037C	SCO1				2.2	1
YBR042C					1.2	1
YBR044C	TCM62				1.9	1
YBR075W					1.9	1
YBR114W	RAD16				1.8	1
YBR125C	PTC4				-1.3	1
YBR138C					3.9	1

YBR149W	ARA1				2.3	1
YBR156C	SLI15				1.9	1
YBR163W	DEM1				2.3	1
YBR170C	NPL4				3	1
YBR171W	SEC66				2.55	1
YBR173C	UMP1				1.9	1
YBR175W	SWD3				-1.8	1
YBR187W	GDT1				2.9	1
YBR207W	FTH1				-2	1
YBR208C	DUR1.2				-1.7	1
YBR213W	MET8				2.3	1
YBR216C	YBP1				1.3	1
YBR221C	PDB1			-1		1
YBR229C	ROT2		-1.05			1
YBR238C					1.4	1
YBR251W	MRPS5			1.35		1
YBR260C	RGD1			0.7		1
YBR268W	MRPL37			•	2.5	1
YBR286W	APE3	-12			2.0	1
YBR288C	APM3	1.2	-17			1
YBR291C	CTP1		-1.5			1
VBR202C	0111		-0.7			1
VBR208C	MAI 31		-1.45			1
VBR300C	MALST		-1.45			1
VCL 001W-A			-1.4			1
	I DB16		-1.5		4.2	1
VCL008C	STP22		_2 1		7.2	1
VCL020C	<u>ЗТР 22</u> ШСЛ		-2.1		2.7	1
VCL046W	11134				1.0	1
VCL058C	EV\/5				3.55	1
VCL 062W/	F7V5		1.2		5.55	1
VCP001W			-1.2		17	1
VCR00FW					1.7	1
YCR000C						1
YCR011C					2.0	1
YCROTIC	ADF I MAK21				2	1
VCB024C	NIAR31				1.6	1
			10		1.0	1
	INFFI		-1.3			1
			-1.3			1
			-2.4			
	T A 1 1 4		-1.1			
YCRUBUW			-1.2			1
YCR063W	BUD31				3	1
YCR068W	ATG15		-1.1			1

YCR071C	IMG2	-1.7			1
YCR073W-A	SOL2			3.9	1
YCR079W	PTC6	-1			1
YCR081W	SRB8			-3.3	1
YCR082W	AHC2			1.5	1
YCR086W	CSM1	-1			1
YCR087C-A	LUG1	-1.2			1
YCR087W		-0.9			1
YCR095C	OCA4			2.3	1
YCR101C				2.7	1
YDL006W	PTC1	-1.6			1
YDL010W				4.3	1
YDL041W			-1.3		1
YDL044C	MTF2			2.5	1
YDL065C	PEX19		-0.9		1
YDL066W	IDP1			1.7	1
YDL070W	BDF2			1.8	1
YDL075W	RPL31A	1.6			1
YDL118W				-2.6	1
YDL130W	RPP1B			1.9	1
YDL133W				-2.2	1
YDL151C	BUD30			3.1	1
YDL182W	LYS20			-1.2	1
YDL194W	SNF3			1.8	1
YDL202W	MRPL11			3.4	1
YDL223C	HBT1			2.25	1
YDR006C	SOK1			-1	1
YDR008C		-1.6			1
YDR011W	SNQ2			-1.2	1
YDR025W	RPS11A			3.1	1
YDR028C	REG1	1			1
YDR057W	YOS9			-1.9	1
YDR069C	DOA4	2.25			1
YDR072C	IPT1			-2.55	1
YDR080W	VPS41	-1.75			1
YDR100W	TVP15	2.1			1
YDR101C	ARX1		0.9		1
YDR105C	TMS1			2.4	1
YDR122W	KIN1			3.8	1
YDR138W	HPR1	2.25			1
YDR140W	MTQ2	1.5			1
YDR153C	ENT5			3.3	1
YDR159W	SAC3			2.7	1
YDR161W		1.4			1

YDR162C	NBP2			-2			1
YDR175C	RSM24					4.4	1
YDR186C						-4.45	1
YDR194C	MSS116			1.75			1
YDR258C	HSP78					-1.4	1
YDR269C						-5.35	1
YDR270W	CCC2					-4.2	1
YDR271C						-4.7	1
YDR290W						1.6	1
YDR291W	HRQ1					4.6	1
YDR298C	ATP5					2.2	1
YDR322W	MRPL35					3.7	1
YDR335W	MSN5					-2.2	1
YDR337W	MRPS28			1.1			1
YDR371W	CTS2			-2.8			1
YDR378C	LSM6			1.5			1
YDR384C	ATO3					2.4	1
YDR385W	EFT2					2.9	1
YDR388W	RVS167					3.1	1
YDR393W	SHE9			1.2			1
YDR401W						2.5	1
YDR403W	DIT1					1.9	1
YDR414C	ERD1					2.6	1
YDR417C						3.1	1
YDR435C	PPM1					1.9	1
YDR441C	APT2					1.6	1
YDR443C	SSN2					-1.1	1
YDR447C	RPS17B					1.6	1
YDR450W	RPS18A					2.4	1
YDR456W	NHX1			-2.25			1
YDR457W	TOM1					1.7	1
YDR458C	HEH2					3.3	1
YDR462W	MRPL28					1.4	1
YDR474C						-1.5	1
YDR477W	SNF1				1.3		1
YDR486C	VPS60			-1.5			1
YDR530C	APA2					1	1
YEL003W	GIM4		1			1.7	1
YEL008W						1.6	1
YEL012W	UBC8					3.1	1
YEL027W	CUP5	-2.3	1				1
YEL028W			1			5.2	1
YEL044W	IES6		1	1.6			1
YEL054C	RPL12A					1.4	1

YEL065W	SIT1				-1.6	1
YER020W	GPA2		-1			1
YER041W	YEN1				-1.85	1
YER047C	SAP1				2.6	1
YER050C	RSM18				2.95	1
YER051W	JHD1				2.7	1
YER084W					-2	1
YER092W	IES5				1.85	1
YER098W	UBP9				-1	1
YER110C	KAP123				1.1	1
YER156C			-1.35			1
YER169W	RPH1				2.5	1
YFL010C	WWM1				1.1	1
YFL011W	HXT10				1.8	1
YFL013C	IES1				2.4	1
YFL013W-A					2.3	1
YFL015C					1.2	1
YFL025C	BST1				2.3	1
YFL036W	RPO41				2.9	1
YFL040W					1.3	1
YFR007W					-1.9	1
YFR016C					1.2	1
YFR018C					3.6	1
YFR024C-A	LSB3				1.3	1
YFR026C					2.1	1
YFR033C	QCR6		-0.9			1
YFR036W	CDC26		-1.2			1
YFR044C	DUG1				1.9	1
YFR048W	RMD8				2.4	1
YGL025C	PGD1			1.2		1
YGL038C	OCH1		2.55			1
YGL064C	MRH4			1.3		1
YGL071W	AFT1		-1.9			1
YGL082W					-2.1	1
YGL087C	MMS2				1.95	1
YGL138C					2.3	1
YGL149W			-2.9			1
YGL153W	PEX14				-1.4	1
YGL179C	TOS3				3.1	1
YGL212W	VAM7		-2.25			1
YGL215W	CLG1				2.2	1
YGL220W			-3			1
YGL226C-A	OST5				3	1
YGL229C	SAP4				2	1

YGR041W	BUD9				2.2	1
YGR070W	ROM1				2.7	1
YGR081C	SLX9			1		1
YGR102C					2.55	1
YGR122W			0.8			1
YGR130C					-2	1
YGR133W	PEX4			-1.4		1
YGR162W	TIF4631				2.55	1
YGR181W	TIM13			-1		1
YGR184C	UBR1				-2.8	1
YGR192C	TDH3				2.25	1
YGR200C	ELP2				2.7	1
YGR209C	TRX2				-2.55	1
YGR237C					-1.4	1
YGR240C	PFK1				2.9	1
YGR242W					2.3	1
YGR263C	SAY1				2.2	1
YGR282C	BGL2				2.65	1
YGR284C	ERV29				1.9	1
YGR295C	COS6				1.7	1
YHL020C	OPI1				-2.6	1
YHL039W					2.2	1
YHR010W	RPL27A		0.8			1
YHR013C	ARD1				-3.6	1
YHR014W	SPO13				1.5	1
YHR029C	YHI9				3.4	1
YHR034C	PIH1				3.05	1
YHR037W	PUT2				2.4	1
YHR061C	GIC1			0.7		1
YHR100C			1.65			1
YHR108W	GGA2				-2.5	1
YHR120W	MSH1		1.2			1
YHR151C			-1.4			1
YHR153C	SPO16				1.8	1
YHR179W	OYE2				-2.6	1
YHR200W	RPN10				-2.1	1
YHR206W	SKN7				1.4	1
YIL009C-A	EST3				3.5	1
YIL018W	RPL2B				2.2	1
YIL035C	CKA1				2.3	1
YIL036W	CST6				5.05	1
YIL052C	RPL34B		1			1
YIL067C					2.3	1
YIL069C	RPS24B				1.4	1
YIL090W	ICE2	2.1				1
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YIL092W				1.2		1
YIL093C	RSM25				2.7	1
YIL098C	FMC1				-2.2	1
YIL107C	PFK26				1.7	1
YIL112W	HOS4				1.3	1
YIL139C	REV7				2.5	1
YIL148W	RPL40A		-1.6			1
YIL152W			-1.2			1
YIL153W	RRD1				2.55	1
YIL155C	GUT2		-0.9			1
YIL170W			-1.1			1
YIR028W	DAL4				4.1	1
YIR033W	MGA2		-2.35			1
YIR037W	HYR1				1.35	1
YJL024C	APS3		-1.4			1
YJL027C					-2	1
YJL029C	VPS53		-1.7			1
YJL062W	LAS21				3.1	1
YJL080C	SCP160				2	1
YJL094C	KHA1				-2.7	1
YJL121C	RPE1				3	1
YJL127C	SPT10				3	1
YJL130C	URA2				-1.6	1
YJL132W					-1.9	1
YJL136C	RPS21B				2.1	1
YJL149W					-2.2	1
YJL150W					-1.5	1
YJL154C	VPS35		-0.9			1
YJL155C	FBP26				-3.25	1
YJL168C	SET2				1.75	1
YJL172W	CPS1		2.5			1
YJL175W		2.1				1
YJL183W	MNN11				3.3	1
YJL193W					-2.2	1
YJL214W	HXT8				3.7	1
YJR015W					-1.5	1
YJR032W	CPR7				2.8	1
YJR074W	MOG1				-3.2	1
YJR088C					3.7	1
YJR118C	ILM1		1.2			1
YJR120W					-1.9	1
YJR145C	RPS4A		-1.5		-	1
YKL001C	MET14				2.4	1

YKL016C	ATP7		1.1			1
YKL025C	PAN3				-2.3	1
YKL054C	DEF1		1.6			1
YKL064W	MNR2		-1.4			1
YKL066W					2.8	1
YKL073W	LHS1				3.8	1
YKL074C	MUD2				1.3	1
YKL098W					-3.4	1
YKL113C	RAD27				-3.1	1
YKL133C					3	1
YKL174C	TPO5				4.1	1
YKL190W	CNB1				-1.4	1
YKL191W	DPH2				1.1	1
YKL197C	PEX1				-1.4	1
YKR020W	VPS51		-1.7			1
YKR024C	DBP7		1.9			1
YKR028W	SAP190				1.9	1
YKR031C	SPO14				-1.4	1
YKR035C	OPI8		-2.8			1
YKR040C			-1.1			1
YKR042W	UTH1			0.8		1
YKR046C	PET10				-1.6	1
YKR047W				0.8		1
YKR048C	NAP1			0.9		1
YKR061W	KTR2				1.6	1
YKR072C	SIS2				1.1	1
YKR078W					2.3	1
YKR082W	NUP133				2.5	1
YLL002W	RTT109		1.7			1
YLL007C					1.5	1
YLL014W		2.3				1
YLL023C					3.3	1
YLL027W	ISA1		1.3			1
YLL029W					-4	1
YLL043W	FPS1		2.15			1
YLL048C	YBT1				1	1
YLL051C	FRE6				1.5	1
YLR014C	PPR1		0.9			1
YLR020C	YEH2				-1.3	1
YLR021W	IRC25		1			1
YLR023C	IZH3				-1.5	1
YLR035C	MLH2		1.2			1
YLR036C					2.2	1
YLR041W			1			1

YLR044C	PDC1				2.05	1
YLR048W	RPS0B				3.5	1
YLR052W	IES3				2.9	1
YLR053C					1.5	1
YLR055C	SPT8				1.7	1
YLR061W	RPL22A	1.5				1
YLR062C	BUD28	1.1				1
YLR068W	FYV7				3.25	1
YLR069C	MEF1	1.5				1
YLR072W		0.9				1
YLR085C	ARP6				2.1	1
YLR091W		1.4				1
YLR108C					2.4	1
YLR110C	CCW12			1.1		1
YLR119W	SRN2				-3.45	1
YLR121C	YPS3				1.9	1
YLR126C					-2.1	1
YLR133W	CKI1				3.1	1
YLR146C	SPE4	1.1				1
YLR149C		1.3	5			1
YLR150W	STM1	0.9	5			1
YLR151C	PCD1	1				1
YLR168C		0.9				1
YLR169W					1.5	1
YLR172C	DPH5				1.2	1
YLR180W	SAM1	1.2				1
YLR190W	MMR1	1.3				1
YLR192C	HCR1	1.1				1
YLR193C	UPS1	0.8				1
YLR200W	YKE2				2.45	1
YLR203C	MSS51				3.9	1
YLR214W	FRE1	1				1
YLR225C		1.2				1
YLR226W	BUR2	1.5				1
YLR227C	ADY4	0.8				1
YLR228C	ECM22				-1.6	1
YLR231C	BNA5				1.7	1
YLR232W					-2.4	1
YLR240W	VPS34	2				1
YLR244C	MAP1	1.5				1
YLR261C	VPS63				2.6	1
YLR286C	CTS1				1.9	1
YLR295C	ATP14	1.6				1
YLR297W					1.8	1

YLR315W	NKP2					2.6	1
YLR322W	VPS65			1.6			1
YLR324W	PEX30			1.2			1
YLR330W	CHS5			1.7			1
YLR335W	NUP2	-				2.7	1
YLR349W		-				1.5	1
YLR368W	MDM30	-		1.1			1
YLR384C	IKI3					2.25	1
YLR386W	VAC14	-		1.5			1
YLR396C	VPS33	-	-1.9				1
YLR402W		-				3.6	1
YLR403W	SFP1	-		2.25			1
YLR422W						1.2	1
YLR436C	ECM30					1.2	1
YLR448W	RPL6B			1			1
YLR450W	HMG2					3.7	1
YLR451W	LEU3				-0.9		1
YML001W	YPT7			-2.3			1
YML009C	MRPL39					3.3	1
YML010C-B		-				3	1
YML017W	PSP2					-1.3	1
YML022W	APT1	-				1.4	1
YML028W	TSA1			-1.3			1
YML048W-A		-				2	1
YML051W	GAL80					-1.6	1
YML070W	DAK1					3.3	1
YML100W-A				-0.7			1
YML101C	CUE4			-0.7			1
YML103C	NUP188			-1.2			1
YML106W	URA5					1.65	1
YML107C	PML39					1.5	1
YML119W						3.4	1
YMR010W						-1.6	1
YMR021C	MAC1			-1.9			1
YMR029C	FAR8					-1.8	1
YMR052W	FAR3					-2.3	1
YMR066W	SOV1					2.5	1
YMR073C	IRC21					2.5	1
YMR075W	RCO1					2.5	1
YMR077C	VPS20			-2.05			1
YMR097C	MTG1	1				3.35	1
YMR123W	PKR1			-2.3			1
YMR142C	RPL13B			1.4			1
YMR158W	MRPS8					1.6	1

YMR166C				2.4	1
YMR184W	ADD37			2.1	1
YMR194W	RPL36A			1	1
YMR204C	INP1			2.2	1
YMR209C				-2.65	1
YMR214W	SCJ1	-1.4			1
YMR216C	SKY1	1.6			1
YMR272C	SCS7			2.25	1
YMR275C	BUL1		0.8		1
YMR280C	CAT8			2.6	1
YMR284W	YKU70			2.2	1
YMR286W	MRPL33			2.5	1
YMR293C				2.25	1
YMR294W-					
A				2.2	1
YMR299C	DYN3			1.7	1
YMR304W	UBP15			4.2	1
YMR307W	GAS1	-2.2			1
YMR310C				1.5	1
YMR311C	GLC8	-1.3			1
YMR312W	ELP6			3.1	1
YNL003C	PET8	1.1			1
YNL041C	COG6		-1		1
YNL047C	SLM2			3.5	1
YNL059C	ARP5	2			1
YNL097C	PHO23			-3.6	1
YNL101W	AVT4			2.1	1
YNL105W				1.7	1
YNL107W	YAF9			2.2	1
YNL108C				1.5	1
YNL109W				1.6	1
YNL119W	NCS2			3	1
YNL120C				2.75	1
YNL127W	FAR11			-2	1
YNL138W	SRV2	2.45			1
YNL140C				4.2	1
YNL179C		-0.8			1
YNL183C	NPR1			1.3	1
YNL204C	SPS18	-1.4			1
YNL205C		-0.9			1
YNL215W	IES2	1			1
YNL225C	CNM67	1.1			1
YNL231C	PDR16			-4.6	1
YNL248C	RPA49			2.6	1
YNL271C	BNI1			3.05	1

YNL284C	MRPL10				3.4	1
YNL288W	CAF40				1.1	1
YNL294C	RIM21		1			1
YNL305C					3.4	1
YNL315C	ATP11			-1.3		1
YNR005C					-2.5	1
YNR024W					1.6	1
YNR051C	BRE5				-1.3	1
YOL002C	IZH2				-1.6	1
YOL009C	MDM12		1.25			1
YOL018C	TLG2		-1.6			1
YOL023W	IFM1			1.5		1
YOL050C				0.6		1
YOL114C			-1.4			1
YOL115W	PAP2				3	1
YOL116W	MSN1				1.8	1
YOL118C					3.9	1
YOR006C					2.5	1
YOR030W	DFG16		1.5			1
YOR039W	CKB2		1.3			1
YOR042W	CUE5				-1.3	1
YOR052C					-1.3	1
YOR054C	VHS3				2.5	1
YOR065W	CYT1				2.1	1
YOR072W					-2.1	1
YOR078W	BUD21				2.4	1
YOR085W	OST3		-1.6			1
YOR092W	ECM3				3.2	1
YOR123C	LEO1				2	1
YOR133W	EFT1				3.7	1
YOR140W	SFL1				-1.9	1
YOR141C	ARP8				2.6	1
YOR164C					-2.3	1
YOR183W	FYV12				2.5	1
YOR211C	MGM1		1.1			1
YOR234C	RPL33B				3.7	1
YOR246C					-2.35	1
YOR258W	HNT3				3.6	1
YOR297C	TIM18		0.9			1
YOR309C					2	1
YOR314W					2	1
YOR316C	COT1				-3.6	1
YOR322C	LDB19				-2.3	1
YOR352W					2.3	1

YPL002C	SNF8		-1.6			1
YPL035C					2.8	1
YPL069C	BTS1				2.7	1
YPL084W	BRO1				-3.1	1
YPL097W	MSY1				1.7	1
YPL101W	ELP4				2.55	1
YPL102C					2.45	1
YPL104W	MSD1				2.5	1
YPL115C	BEM3			0.6		1
YPL125W	KAP120				2.5	1
YPL138C	SPP1				-2.3	1
YPL161C	BEM4		1.2			1
YPL205C					2	1
YPL271W	ATP15		2			1
YPL274W	SAM3				2.8	1
YPR012W					1.5	1
YPR014C					1.7	1
YPR052C	NHP6A				-1.9	1
YPR053C					-1.4	1
YPR059C			-1.3			1
YPR064W			-1.2			1
YPR067W	ISA2			1		1
YPR079W	MRL1				-1.6	1
YPR116W			2.1			1
YPR123C			-1.75			1
YPR124W	CTR1		-1.75			1
YPR133W-A	TOM5				2	1
YPR140W	TAZ1				2.1	1

	Otendend		5 generations					
ORF	Standard	25% IC20	50% IC20	IC20	Number of Significant			
	Nume	4.5 μM	9 μM	18 μM	olgrinount			
YIL162W	SUC2	-4.2	-4.1	-4	3			
YFR036W	CDC26	-3.2	-3.8	-3.05	3			
YDR112W	IRC2	-2.7	-4	-2.95	3			
YLR032W	RAD5		-2.2	-2.7	2			
YCR066W	RAD18		-2.1	-2.4	2			
YBR171W	SEC66		-2	-2.4	2			
YAL002W	VPS8		-1.8	-2.3	2			
YOR304C-A		-2	-2.5	-2.2	3			
YML097C	VPS9		-2.3	-2.2	2			
YKL188C	PXA2			-2	1			
YMR141C				-2	1			
YOR089C	VPS21		-1.9	-1.95	2			
YGL154C	LYS5			-1.8	1			
YDR338C				-1.8	1			
YKL199C				-1.8	1			
YML095C	RAD10			-1.8	1			
YMR137C	PSO2		-1.8	-1.75	2			
YGL164C	YRB30	-1.6	-1.5	-1.7	3			
YAL024C	LTE1			-1.7	1			
YDR247W	VHS1			-1.7	1			
YER095W	RAD51			-1.7	1			
YPL022W	RAD1			-1.65	1			
YLR218C			-1.5	-1.6	2			
YER162C	RAD4			-1.6	1			
YKR046C	PET10	-1.4		-1.5	2			
YMR237W	BCH1	-1.2		-1.5	2			
YGL166W	CUP2			-1.4	1			
YPL147W	PXA1			-1.4	1			
YIL146C	ECM37			-1.4	1			
YKL167C	MRP49			-1.4	1			
YGL253W	HXK2			-1.4	1			
YKL215C		-1.3	-1.1	-1.3	3			
YKL197C	PEX1	-1.4		-1.3	2			
YER067W		-1.3		-1.3	2			
YKR033C		-1.3		-1.3	2			
YOR346W	REV1			-1.3	1			
YLR210W	CLB4			-1.3	1			
YOR017W	PET127			-1.3	1			
YHR110W	ERP5			-1.3	1			

Appendix 4: DCVC sensitive and resistant genes identified

YDR291W	HRQ1			-1.3	1
YMR008C	PLB1			-1.2	1
YML109W	ZDS2			-1.2	1
YMR283C	RIT1			-1.2	1
YKL100C				-1.1	1
YDL034W				1.2	1
YJR154W				1.3	1
YDR463W	STP1			1.3	1
YCR082W	AHC2		1.5	1.4	2
YOR006C				1.4	1
YDR333C				1.4	1
YPL123C	RNY1			1.4	1
YCR001W			1.6	1.5	2
YJR051W	OSM1		1.6	1.5	2
YMR238W	DFG5		2.1	1.5	2
YMR124W		1.4		1.5	2
YGL198W	YIP4	1.4		1.5	2
YDR440W	DOT1			1.5	1
YML124C	TUB3			1.55	1
YCR060W	TAH1	1.2	1.4	1.6	3
YOR085W	OST3		1.5	1.6	2
YLR093C	NYV1	2.1	1.6	1.6	3
YBL107C			1.7	1.6	2
YPR201W	ARR3		1.7	1.6	2
YOR183W	FYV12		1.7	1.6	2
YOR137C	SIA1	1.7	1.8	1.6	3
YDR217C	RAD9	1.6		1.6	2
YLR023C	IZH3			1.6	1
YJL208C	NUC1	1.6	1.6	1.7	3
YPL197C		1.6	1.6	1.7	3
YGR192C	TDH3	1.7	1.9	1.7	3
YGR263C	SAY1		2.2	1.7	2
YDR441C	APT2	1.9	1.8	1.8	3
YLR202C		2	1.8	1.8	3
YML073C	RPL6A		1.8	1.8	2
YGL214W			1.8	1.8	2
YMR286W	MRPL33	1.9	2	1.8	3
YHR034C	PIH1		2	1.8	2
YKR035C	OPI8		2.4	1.8	2
YMR244C-A			2.8	1.8	2
YPL178W	CBC2		3	1.8	2
YCR011C	ADP1		1.8	1.9	2
YLR042C		2	1.9	1.9	3
YDR465C	RMT2		1.9	1.9	2

YEL068C			2	1.9	2
YMR294W-					
A			2.6	1.9	2
YGL252C	RTG2			1.9	1
YPL140C	MKK2	2.1	1.6	2	3
YLR057W		2.2	1.6	2	3
YMR272C	SCS7	2.3	1.9	2.1	3
YDR255C	RMD5	2.1	2.2	2.1	3
YJR130C	STR2		2.2	2.1	2
YOR021C		2.3	2.4	2.1	3
YFR018C			3.1	2.1	2
YFL021W	GAT1			2.1	1
YJL131C				2.1	1
YMR289W	ABZ2	2.5	2.4	2.15	3
YCL046W		1.9	1.9	2.2	3
YDR215C		1.8	2.1	2.2	3
YIL032C			2.1	2.2	2
YOR314W		2.5	2.3	2.2	3
YBR272C	HSM3	1.7		2.2	2
YFL025C	BST1			2.2	1
YIL090W	ICE2	2.1	2.6	2.3	3
YLR133W	CKI1		2.7	2.3	2
YHL039W				2.3	1
YML122C			2	2.4	2
YPR116W		2.8	2.2	2.4	3
YHR037W	PUT2		2.4	2.4	2
YOR133W	EFT1		3.1	2.4	2
YBR298C	MAL31	2.2		2.4	2
YDR389W	SAC7			2.4	1
YBR159W	IFA38	2.4	2	2.5	3
YLR262C	YPT6	2.5	2.1	2.5	3
YLR044C	PDC1	2.7	2.3	2.5	3
YMR166C			2.4	2.5	2
YBR113W		2.6	2.6	2.5	3
YER169W	RPH1	2.5	2.9	2.5	3
YDR153C	ENT5		3.1	2.5	2
YGR261C	APL6		3.7	2.5	2
YLR169W		2.6	2.3	2.6	3
YDR105C	TMS1	2.6	2.7	2.6	3
YGL229C	SAP4	2.5	2.4	2.7	3
YGL226C-A	OST5	2.5	2.5	2.7	3
YBR114W	RAD16	2.7	2.7	2.7	3
YCR006C		2.6	2.8	2.7	3
YGL138C		2.8	3	2.7	3
YBR175W	SWD3		3.9	2.7	2

YDL223C	HBT1	1.5	2.25	2.8	3
YDR175C	RSM24	2.8	2.3	2.8	3
YCR073W-A	SOL2	2.5	2.5	2.8	3
YHL011C	PRS3	3	2.6	2.8	3
YDR377W	ATP17	3.1	2.8	2.8	3
YDR456W	NHX1	3.5	2.9	2.8	3
YEL012W	UBC8		3.9	2.8	2
YJR044C	VPS55	2.8	2.8	2.9	3
YER066C-A		2.7	2.9	2.9	3
YLR450W	HMG2	3.3	2.8	3	3
YER002W	NOP16	3	3	3	3
YJR088C		3.2	3.1	3	3
YBR213W	MET8	3.1	3.1	3.1	3
YDR163W	CWC15	3	2.9	3.2	3
YPL157W	TGS1		3.8	3.2	2
YHR157W	REC104	3.2	3.1	3.3	3
YMR304W	UBP15	3.3	2.9	3.4	3
YMR261C	TPS3	3.3	2.9	3.5	3
YDR458C	HEH2	3.6	3.7	3.8	3
YBR187W	GDT1	4	4	4.3	3
YML079W				4.3	1
YEL056W	HAT2	-3.5	-3.1		2
YEL043W		-3.3	-2.8		2
YPL138C	SPP1	-1.9	-2.1		2
YPL167C	REV3		-1.7		1
YKL097C			-1.4		1
YOR253W	NAT5		-1.3		1
YMR326C			1.1		1
YNL010W		1.4	1.2		2
YLR121C	YPS3	1.6	1.4		2
YLR098C	CHA4		1.6		1
YDR314C	RAD34		1.6		1
YDR283C	GCN2		1.6		1
YJL108C	PRM10	1.6	1.7		2
YDR251W	PAM1	1.7	1.7		2
YLR192C	HCR1	1.7	1.7		2
YBL008W	HIR1		1.7		1
YML048W-A		1.7	1.8		2
YHR046C	INM1		1.9		1
YFL013W-A			1.9		1
YDR285W	ZIP1		1.9		1
YHR160C	PEX18		1.9		1
YKL096W-A	CWP2		1.9		1
YGR041W	BUD9		2		1

YOR161C	PNS1		2	1
YOR364W			2	1
YPR044C	OPI11		2	1
YJR010C-A	SPC1		2	1
YBR037C	SCO1		2.1	1
YKL174C	TPO5		2.1	1
YMR280C	CAT8		2.2	1
YMR262W			2.2	1
YBL062W			2.4	1
YLR335W	NUP2	1.6	2.5	2
YFL032W			2.5	1
YPL035C			2.5	1
YGL118C			2.5	1
YNL101W	AVT4		2.5	1
YFL019C			2.7	1
YOR086C	TCB1	3	2.8	2
YGL071W	AFT1	-2.5		1
YOR276W	CAF20	-2.2		1
YFL003C	MSH4	-1.9		1
YOR054C	VHS3	-1.8		1
YIL089W		-1.6		1
YDR057W	YOS9	-1.4		1
YLR131C	ACE2	1.3		1
YNL058C		1.4		1
YLR099C	ICT1	1.4		1
YOR041C		1.4		1
YLR018C	POM34	1.4		1
YLR456W		1.5		1
YLR443W	ECM7	1.5		1
YLR053C		1.6		1
YLR049C		1.7		1
YGR183C	QCR9	1.7		1
YMR175W	SIP18	1.8		1
YLR270W	DCS1	1.8		1
YBR044C	TCM62	1.9		1
YLR257W		2		1
YOR199W		2		1
YIL139C	REV7	2.2		1
YOR201C	MRM1	2.2		1
YLL009C	COX17	2.8		1