

# UC Berkeley

## UC Berkeley Previously Published Works

### Title

A Genome-wide ER-phagy Screen Highlights Key Roles of Mitochondrial Metabolism and ER-Resident UFMylation

### Permalink

<https://escholarship.org/uc/item/5qc761x5>

### Journal

Cell, 180(6)

### ISSN

0092-8674

### Authors

Liang, Jin Rui  
Lingeman, Emily  
Luong, Thao  
[et al.](#)

### Publication Date

2020-03-01

### DOI

10.1016/j.cell.2020.02.017

Peer reviewed



Published in final edited form as:

Cell. 2020 March 19; 180(6): 1160–1177.e20. doi:10.1016/j.cell.2020.02.017.

## A Genome-wide ER-Phagy Screen Highlights Key Roles of Mitochondrial Metabolism and ER-Resident UFMylation

Jin Rui Liang<sup>1,2,4,6</sup>, Emily Lingeman<sup>1,2,6</sup>, Thao Luong<sup>1,2</sup>, Saba Ahmed<sup>1,2</sup>, Matthias Muhar<sup>4</sup>, Truc Nguyen<sup>3</sup>, James Olzmann<sup>3,5</sup>, Jacob E. Corn<sup>1,2,4,7,\*</sup>

<sup>1</sup>Innovative Genomics Institute, University of California, Berkeley, Berkeley, CA 94720, USA

<sup>2</sup>Department of Molecular and Cell Biology, University of California, Berkeley, Berkeley, CA

94720, USA <sup>3</sup>Department of Nutritional Sciences and Toxicology, University of California,

Berkeley, Berkeley, CA 94720, USA <sup>4</sup>Department of Biology, ETH Zürich, 8093 Zürich,

Switzerland <sup>5</sup>Chan Zuckerberg Biohub, San Francisco, CA 94158, USA <sup>6</sup>These authors

contributed equally <sup>7</sup>Lead Contact

### SUMMARY

Selective autophagy of organelles is critical for cellular differentiation, homeostasis, and organismal health. Autophagy of the ER (ER-phagy) is implicated in human neuropathy but is poorly understood beyond a few autophagosomal receptors and remodelers. By using an ER-phagy reporter and genome-wide CRISPRi screening, we identified 200 high-confidence human ER-phagy factors. Two pathways were unexpectedly required for ER-phagy. First, reduced mitochondrial metabolism represses ER-phagy, which is opposite of general autophagy and is independent of AMPK. Second, ER-localized UFMylation is required for ER-phagy to repress the unfolded protein response via IRE1a. The UFL1 ligase is brought to the ER surface by DDRGK1 to UFMylate RPN1 and RPL26 and preferentially targets ER sheets for degradation, analogous to PINK1-Parkin regulation during mitophagy. Our data provide insight into the cellular logic of ER-phagy, reveal parallels between organelle autophagies, and provide an entry point to the relatively unexplored process of degrading the ER network.

### Graphical Abstract

\*Correspondence: jacob.corn@biol.ethz.ch.

#### AUTHOR CONTRIBUTIONS

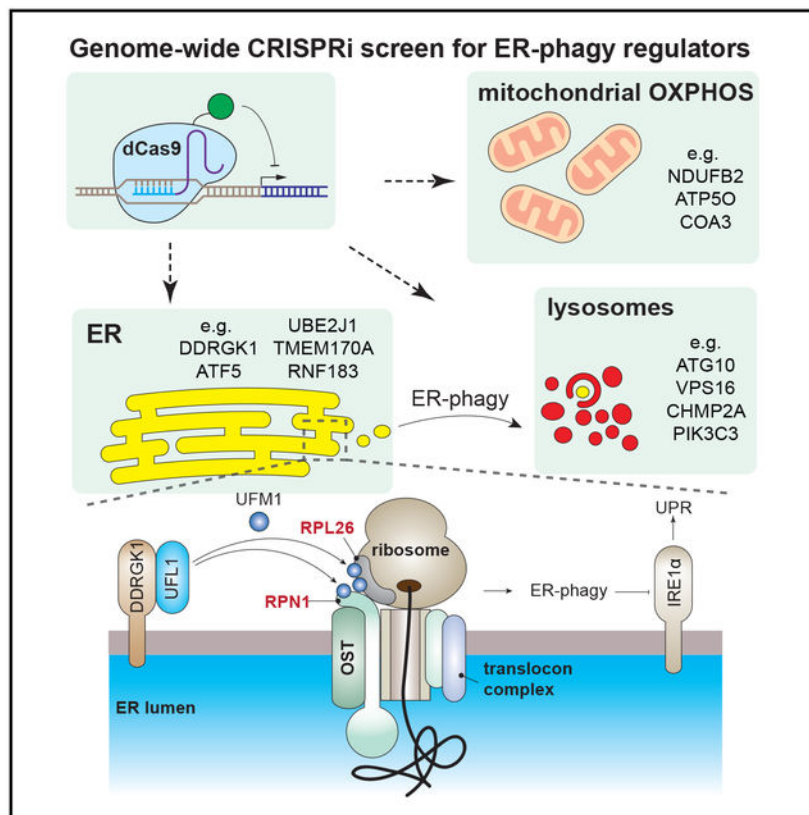
J.R.L., E.L., and J.E.C. designed the experiments. J.R.L., E.L., T.L., S.A., M.M., T.N., and J.O. performed experiments. J.R.L., E.L., and J.E.C. analyzed data and wrote the manuscript. All authors contributed feedback for the manuscript.

#### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at <https://doi.org/10.1016/j.cell.2020.02.017>.

#### DECLARATION OF INTERESTS

The authors declare no competing interests.



## In Brief

An unbiased, genome-wide screen implicates mitochondrial oxidative phosphorylation and ER surface UFMylation as regulators of starvation-induced ER-phagy.

## INTRODUCTION

Macroautophagy (herein referred to as autophagy) mediates the delivery of cellular cargo to the lysosome for degradation. Once thought to be a non-specific process, it has become clear that autophagy is complexly regulated and induced by various stresses to remove damaged or excessive cellular components. Targeted removal of entire organelles by autophagy is necessary for cellular homeostasis, and, during selective autophagy of mitochondria (mitophagy), the surface proteins of damaged mitochondria are marked by phosphorylation and ubiquitylation to recruit autophagic machinery (Nguyen et al., 2016; Youle and Narendra, 2011). Dysregulation of selective organelle autophagy negatively impacts cellular fitness and is linked to degenerative diseases, particularly in non-regenerative cell types such as neurons. For example, mutations of key mitophagy genes, such as PINK1 and Parkin, are strongly associated with disorders such as Parkinson's disease (Deas et al., 2011; Dodson and Guo, 2007; Geisler et al., 2010; Pickrell and Youle, 2015; Pilsel and Winklhofer, 2012).

The endoplasmic reticulum (ER) plays a critical role in numerous cellular functions, such as the storage of calcium, the biosynthesis of lipids, and the maturation and transport of secretory and membrane proteins (Schwarz and Blower, 2016). The ER is tightly regulated

by multiple quality-control mechanisms, such as ER-associated degradation (ERAD) and ER to Lysosome Associated Degradation (ERLAD) (Fregno et al., 2018; Ruggiano et al., 2014). The ER-autophagy (ER-phagy) pathway intersects with the selective autophagy machinery to send portions of the ER for wholesale lysosomal degradation. While ER-phagy has long been observed in yeast (Hamasaki et al., 2005), it has only recently been described in mammalian cells (Khaminets et al., 2015).

During ER-phagy, several ER surface proteins, including FAM134B, RTN3L, TEX264, and ATL3, act as specific receptors through LC3/GABARAP-interacting regions (LIRs/GIMs) to recruit autophagy machinery (An et al., 2019; Chino et al., 2019; Grumati et al., 2017; Khaminets et al., 2015; Chen et al., 2019). ER expansion can also be reversed via ER-phagy that is mediated by the SEC62 and CCPG1 LIR-containing ER-phagy receptors (Fumagalli et al., 2016; Smith et al., 2018). The reticular ER network is remodeled for delivery to the lysosome by Atlastin GTPases that are also involved in basal ER morphology maintenance (Liang et al., 2018; Rismanchi et al., 2008; Wang et al., 2016; Zhao et al., 2016). But beyond the few receptors and remodelers most proximal to autophagosomal function, relatively little is known about the signals that regulate ER-phagy.

We performed a genome-wide CRISPR interference (CRISPRi) reporter-based screen to discover new players in ER-phagy, identifying both activators and inhibitors in a variety of cellular compartments. We deeply interrogated two pathways that positively regulate ER-phagy: (1) mitochondrial oxidative phosphorylation (OXPHOS) and (2) ER-resident UFMylation. While inhibition of OXPHOS reduces cellular energy levels and stimulates general autophagy, genetic or chemical inhibition of OXPHOS instead represses ER-phagy. Surprisingly, OXPHOS-dependent ER-phagy bypasses the canonical energy-sensing AMP-dependent protein kinase (AMPK). We furthermore found that UFMylation, a ubiquitin-like post-translational modification, is required for ER-phagy. The protein DDRGK1 recruits UFMylation machinery to the ER surface in a striking parallel to the mitophagic recruitment of Parkin by PINK1. DDRGK1 is specifically required for the ER-phagy of ER sheets, including ER-phagy mediated by LIR/GIM receptors located on these subdomains. Unbiased proteomics identified Ribophorin 1 (RPN1), an ER-localized quality control factor, as an ER sheet-localized target of DDRGK1-dependent UFMylation. Interfering with UFMylation-dependent ER-phagy leads to the accumulation of misfolded proteins and induces the unfolded protein response (UPR) via IRE1a signaling. Overall, our data provide a detailed map of ER-phagy regulators and highlight how organelle cross-talk and ER-resident factors mediate this emerging process of quality control.

## RESULTS

### A Genome-wide Flow Cytometry CRISPRi Screen for ER-Phagy

To develop a genome-wide screen for ER-phagy, we employed the previously-developed ER-autophagy tandem reporter (EATR) system (Figure 1A) (Liang et al., 2018). We first exposed HCT116 colon cancer cells stably expressing either the EATR construct or a general autophagy reporter (mCherry-eGFP-LC3B) to several stresses that could induce general autophagy and/or ER stress. Only prolonged amino acid starvation (16 h) using Earl's buffered saline solution (EBSS) robustly induced both ER-phagy and general

Author Manuscript

autophagy (Figures S1A–S1C). Torin1, which induces general autophagy via inactivation of mTORC1 and mTORC2 complexes, triggered general autophagy but did not induce ER-phagy (Figures S1A–S1C) (Thoreen et al., 2009). Rapamycin, which partially inhibits mTORC1 but spares mTORC2, induced neither general autophagy nor ER-autophagy in HCT116 cells (Figures S1A–S1C) (Jacinto et al., 2004; Thoreen and Sabatini, 2009). Direct activation of the unfolded protein response (UPR) using tunicamycin or thapsigargin also failed to stimulate general autophagy or ER-phagy (Figures S1A–S1C). By quantifying the ratio of eGFP/mCherry reporter fluorescence, we found that EBSS starvation induces ER-phagy in up to 80% of cells, with an average of 8% of the ER present in an acidified compartment at any given time (Figures S1B and S1D).

Author Manuscript

Having established amino acid starvation (using EBSS) as a robust ER-phagy stimulus, we coupled EATR-based fluorescence-activated cell sorting (FACS) screening with genome-wide CRISPR transcriptional inhibition (CRISPRi) to identify novel pathways involved in ER-phagy (Figures 1A and 1B) (Gilbert et al., 2014; Horlbeck et al., 2016; Liang et al., 2018). Since autophagy is influenced by the availability of cellular energy, we reasoned that complete knockout of ER-phagy regulators via CRISPR cutting could be detrimental to cells and mask interesting players. Indeed, mTOR is an essential gene and so cannot be queried using CRISPR screens beyond cell survival. The variability in sgRNA efficiencies of CRISPRi leads to different knockdown efficiencies, allowing for allelic series and residual function of essential genes involved in cellular energy regulation (Horlbeck et al., 2016).

Author Manuscript

As a proof of concept, we first assessed the suitability of EATR for CRISPRi screening by conducting a pilot screen with a custom CRISPRi library targeting known autophagy genes (Table S1). We used EATR-based FACS to isolate the top 25% of cells with the most ER-phagy (“enhanced” sort gate), and the bottom 25% of cells with the least ER-phagy (“inhibited” sort gate) (Figure S1E). This pilot screen successfully identified gRNAs targeting core autophagy genes as required for ER-phagy and correctly assigned their role in promoting ER-phagy such that knockdown of autophagy components was enriched in the inhibited gate (Figure S1F) and depleted in the enhanced sort gate (Figure S1G).

Author Manuscript

We scaled up to perform an unbiased, genome-wide CRISPRi-v2 screen for ER-phagy regulators using EATR-FACS (Gilbert et al., 2014; Horlbeck et al., 2016). We developed a very stringent list of ER-phagy genes by first performing a cutoff at  $p < 0.01$  and then requiring that true hits have opposite phenotypes in the enhanced and inhibited sort gate. For example, gRNAs that knockdown a bona fide ER-phagy gene should be depleted in a population undergoing more ER-phagy but enriched in one undergoing less ER-phagy. We quantified involvement in ER-phagy by ratiometrically comparing gRNA distributions in the enhanced gate to those in the inhibited gate (Figure 1B), so that a positive  $\log_2$  fold change indicates a gene whose knockdown increases ER-phagy and a negative  $\log_2$  fold change indicates a gene whose knockdown inhibits ER-phagy. The resulting high-confidence hit list includes 200 genes, with gene-level  $\log_2$  fold change phenotypes ranging from 3.62 to  $-5.37$  (Table S2).

Author Manuscript

As expected, genes involved in multiple stages of general autophagy and membrane trafficking were high-confidence hits in our screen (Figure 1C; Figure S1H). Individual

stable knockdown of these factors and testing using EATR, and mCherry-Cleaved ER-phagy Reporter (CCER) western blot assay, and other measures of autophagy verified their requirement for ER-phagy (Figures S1I–S1K). Our stringent criteria for calling a high-confidence hit narrowly exclude some known players in core autophagic pathways (e.g., multiple components of the V-ATPase complex), which have large  $\log_2$  fold changes but moderate p values. Since our goal was to identify new and bona fide regulators in the relatively unexplored process of ER-phagy, we opted to maintain very strict statistical cutoffs and thus bias toward false negatives rather than introduce false positives. Overall, the presence of many known autophagic components in the screen indicate that the EATR assay and hence the genome-wide screen reports on ER-phagy pathways rather than ERAD or ERLAD, since the latter do not depend on autophagic components (Fregno et al., 2018; Ruggiano et al., 2014).

Consistent with recent reports of functional redundancy between ER-phagy receptors, we found that knockdown of SEC62, TEX264, and FAM134A (paralog of FAM134B) showed consistent but only moderate ER-phagy inhibition upon knockdown (Figure S1H) (Chino et al., 2019). We also examined the performance of individual FAM134B gRNAs by qRT-PCR and found that none of the CRISPRi gRNAs in the genome-wide library successfully knocks down FAM134B (Figure S1L). This highlights a tradeoff in current CRISPRi screening technology, where allelic series enable interrogation of otherwise essential genes but may introduce false negatives. Genetic redundancy and potential underperformance of CRISPRi guide RNAs means that failure to observe a gene in the ER-phagy screen dataset does not exclude potential role in ER-phagy. However, positive membership in the high-confidence set of 200 genes strongly indicates a role in ER-phagy.

As expected, unbiased gene ontology (GO) analysis, shows enrichment of GO related to autophagy (Figure 1C) (Huang et al., 2009). However, multiple aspects of mitochondrial metabolism were unexpectedly prominent. We integrated the high-confidence genetic hits against physical interaction databases to create a putative physical network of ER-phagy (Chatr-Aryamontri et al., 2017; Szklarczyk et al., 2015) (Figure 1D). This network falls into several major classes: autophagic execution, such as ATG10 and WIPI1 (Phillips et al., 2008; Wartosch et al., 2015; Yuan et al., 2013); ubiquitylation, such as the ER-localized UBE2J1 ubiquitin-conjugating enzyme involved in recovery from ER stress (Elangovan et al., 2017); mitochondrial metabolism and OXPHOS genes; and post-translational modification by the ubiquitin-like protein UFM1, including CDK5RAP3 and DDRGK1 (Cai et al., 2015; Wei and Xu, 2016; Wu et al., 2010). Finally, we manually annotated and subdivided all 200 high-confidence hits into those associated with the lysosome/endosome, ER-associated factors, and nuclear-encoded mitochondrial proteins (Table S2; Figure 1E) (Binder et al., 2014).

### **Mitochondrial Oxidative Phosphorylation Promotes ER-Phagy**

We were surprised to find that the largest set of genes required for ER-phagy are involved in OXPHOS (Figure 2A), since cross-talk between ER-phagy and mitochondrial processes has not yet been described. While interference with mitochondrial energy metabolism induces general cytoplasmic autophagy, loss of mitochondrial factors instead repressed ER-phagy.

Mitochondrial factors required for ER-phagy are directly involved in multiple aspects of the electron transport chain (ETC) and OXPHOS: complex I (NDUFA8, NDUFB2, NDUFB4, NDUFS2, NDUFS5), complex III (UQCRC2), and the ATP synthase/complex V (ATP5O and ATP5J) (Figure 1E). We also found a large number of factors indirectly required for OXPHOS through either ETC maturation or the synthesis of mitochondrially encoded ETC components (Taanman, 1999): mitochondrial chaperones (BCS1L, COA3, COA4, and OXA1L), mitochondrial ribosome subunits (MRPL17, MRPL16, MRPL22, MRPL24, MRPL30, MRPL33, MRPL34, MRPL41, and MRPL55), mitochondrial tRNAs (AARS2, VARS2, and TARS2), mitochondrial tRNA maturation (PTCD1), and mitochondrial RNase P (KIAA0391, TRMT10C, and HSD17B10). To further interrogate the link between mitochondrial metabolism and ER-phagy, we focused on further investigation of three factors that are involved in different parts of OXPHOS: NDUFB2, NDUFB4, and ATP5O (Figure S2A).

Stable knockdown of OXPHOS components quantitatively inhibited starvation-induced ER-phagy in multiple assays in a manner that paralleled knockdown efficiency (Figures 2B and S2B–S2D). However, knockdown of NDUFB2, NDUFB4, or ATP5O did not grossly affect starvation-induced general autophagy (Figure S2E). Knockdown of NDUFB2 destabilized NDUFB4 and vice versa, presumably because both are integral subunits of complex I (Figure S2B). Consistently, re-expressing the cognate OXPHOS cDNA rescued both the cognate protein and the destabilized partner (Figure S2F). Re-expressing the destabilized partner only rescued the abundance of that partner without affecting the knocked-down gene (e.g., NDUFB2 knockdown depletes both NDUFB2 and NDUFB4, and re-expressing NDUFB4 in this background only rescues NDUFB4 levels). Re-expressing the appropriate OXPHOS cDNA rescued ER-phagy, while cross-expressing a non-cognate OXPHOS cDNA had no effect, indicating that each knockdown was specific and on target (Figure 2C; Figures S2F–S2H).

We further explored the necessity of functional OXPHOS for normal ER-phagy using chemical genetics (Figure S2I). Rotenone is a known inhibitor of both general autophagy and complex I (Mader et al., 2012) and reduced both general autophagy and ER-phagy by multiple assays (Figures 2D and 2E; Figures S2J–S2L). By contrast, inhibiting complex III with antimycin A or ATP synthase with oligomycin A reduced ER-phagy but increased general autophagy at both early (4 h) and late time points (16 h) (Figures 2D and 2E; Figures S2J–S2M). Using Cell-Titer Glo to measure ATP levels (Figure S2N) and Seahorse to measure oxygen consumption (Figure S2O), we confirmed that knockdown of the OXPHOS genes reduced cellular energy levels.

We explored several hypotheses to determine how interfering with OXPHOS reduces ER-phagy. First, we found that increased mitophagic flux is not responsible for reduced ER-phagy by titrating away autophagic machinery. OXPHOS conditions that repressed ER-phagy did not grossly alter mitochondrial abundance or membrane potential and starvation actually increased the amount of Mitotracker accumulation (Figure S3A) (Johnson et al., 2014; Xiao et al., 2016). We also found no evidence of increased mitophagy during knockdown of OXPHOS components, either with or without stable overexpression of Parkin (Figures S3B–S3G).

Second, we found that interfering with OXPHOS reduced levels of the autophagic kinase ULK1 during starvation, but this is not causative of reduced ER-phagy. Knockdown of NDUFB2, NDUFB4, and ATP5O did not affect ULK1 under basal conditions, but during starvation reduced levels of ULK1 almost as much as knockdown of ULK1 itself (Figure S3H). Cognate cDNA re-expression in the appropriate stable knockdown background rescued levels of ULK1, and these same conditions also rescued ER-phagy (Figure S3H; Figure 2C). But overexpression of ULK1 itself in the context of OXPHOS knockdown did not rescue ER-phagy, indicating that reduced ULK1 is not limiting (Figure S3I).

Third, we found that reduced ER-phagy upon knockdown of OXPHOS components is independent of 5' AMP-activated Protein Kinase (AMPK) signaling. This is surprising, since AMPK is a master regulator of general autophagy in response to cellular energy availability (Egan et al., 2011; Kim et al., 2011; Toyama et al., 2016). We generated AMPK $\alpha$  CRISPR-Cas9 knockout cells (Figure S3J) and found that they still mount a robust ER-phagy response (Figures S3K and S3L). The ability to perform ER-phagy in AMPK $\alpha$ -knockout cells was unaffected by stable re-expression of constitutively active or kinase dead AMPK $\alpha$  (Figures S3K and S3L). Overall, while genetically or chemically interfering with mitochondrial OXPHOS potentially reduces ER-phagy, the mechanism of this cross-talk is independent of canonical pathways and remains unclear.

### **DDRGK1-Mediated UFMylation Regulates ER-Specific Autophagy of ER Sheets**

The genome-wide screen for ER-phagy regulators yielded several hits that are localized to the ER and/or involved in ER-related processes (Figures 1E and 3A). We focused on one of these factors, DDRGK1/C20orf116/UFBP1, which has emerging roles in ER homeostasis (Leto et al., 2019; Liu et al., 2017; Walczak et al., 2019; Zhu et al., 2019).

Individual, stable knockdown of DDRGK1 resulted in ER-phagy as measured using both EATR and CCER assays (Figures 3B and 3C; Figure S4A) but had no apparent effect on general autophagy as determined using mCherry-eGFP-LC3B assay and the degradation of endogenous p62 and LC3B (Figures 3C and 3D). Immunofluorescence confirmed that an mCherry-tagged DDRGK1 construct co-localized with the ER (Figure 3E).

DDRGK1 is reported to be post-translationally modified by UFMylation, which is in turn required for further UFMylation of other factors (Cai et al., 2015; Liu et al., 2017; Wei and Xu, 2016; Wu et al., 2010). UFMylation involves the sequential activation, conjugation and ligation of UFM1 to a target substrate via an E1 (UBA5), E2 (UFC1), and E3 (UFL1) cascade that mirrors ubiquitin conjugation (Figure 4A) (Daniel and Liebau, 2014; Komatsu et al., 2004). We found that stable knockdown of UFL1 decreases DDRGK1 protein levels in a proteasome-dependent manner and also inhibited ER-phagy (Figures 4B and 4C; Figure S4B), as did knockdown of UFM1 and UBA5 (Figures 4D and S4C). Double knockdown of both UFL1 and DDRGK1 did not further inhibition of ER-phagy as compared to individual depletion of either factor, suggesting that they act in the same pathway to regulate ER-phagy (Figures S4D and S4E). Stable re-expression of UFL1 in UFL1-depleted cells rescued levels of DDRGK1 and restored ER-phagy (Figures 4E and 4F), but overexpression of DDRGK1 in UFL1-depleted cells led to high levels of DDRGK1 without ER-phagy (Figures 4E and 4F). Knockdown of DDRGK1 and UFL1 impeded lysosomal cleavage of both mCherry-



RAMP4 and mCherry-KDEL, consistent with UFMylation mediating the autophagic turnover of both ER surface and luminal proteins (Figures 4C, S4F, and S4G) (Munro and Pelham, 1987).

We made tandem fluorescent reporters for ER sheets (CLIMP63-mCherry-eGFP) and ER tubules (REEP5-mCherry-eGFP) and found that knockdown of either DDRGK1 or UFL1 specifically impaired the autophagy of ER sheets (Figures 4G, S4H, and S4I). Different ER-phagy receptors are expressed on ER sheets or ER tubules. We found that overexpression of the sheet-localized ER-phagy receptors FAM134B, TEX264, and SEC62 induced ER-phagy, and this was perturbed by the depletion of DDRGK1 in the presence and absence of starvation (Figures 4H and S4J–S4L) (An et al., 2019; Chino et al., 2019; Fumagalli et al., 2016; Khaminets et al., 2015). Far less ER-phagy was induced by overexpression of the tubule-located ER-phagy receptors CCPG1, RTN3L, and ATL3, and loss of DDRGK1 did not have a statistically significant effect in this context (Figure 4H) (Chen et al., 2019; Grumati et al., 2017; Smith et al., 2018). DDRGK1 co-localizes with FAM134B both on the ER and in the lysosome, suggesting that subdomains of the ER containing DDRGK1 are cargos of FAM134B-mediated ER-phagy (Figure 4I).

### **DDRGK1 Acts as an ER Surface Adaptor for UFL1 Rather Than a UFMylation Substrate**

DDRGK1 is reported to be UFMylated by UFL1 on one or more lysines and thereby stabilized (Figure 5A) (Wu et al., 2010). Using immunoprecipitation of DDRGK1 point mutants, we indeed found higher molecular weight species consistent with lysine post-translational modification of DDRGK1 (Figures 5B and S5A). However, this modification was unaffected by CRISPR-Cas9 knockout of UFL1 or CRISPRi knockdown of UFM1 (Figure 5B and S5A). Furthermore, knockdown of UFM1 had no effect on the abundance of DDRGK1 (Figure S5B), and DDRGK1 still stably interacted with UFL1 even when all 12 conserved lysines were mutated (K-less) (Figure 5B). Taken together, these data indicate that the stability of endogenous DDRGK1 is maintained not by UFMylation but by its interaction with UFL1. Along these lines, we found that DDRGK1's ability to promote ER-phagy was independent of its major reported site of UFMylation on Lys267 (Figures 5C and S5C). Eleven other lysine mutants also substantially supported ER-phagy, as could a DDRGK1 mutant with all 12 conserved lysines mutated (Figures S5D and S5E). Overall, these data strongly suggest that DDRGK1 is not a target of UFMylation during ER-phagy, as has been reported for DDRGK1's involvement in the UPR and other signaling pathways (Lemaire et al., 2011; Yoo et al., 2014).

Using immunofluorescence and immunoprecipitation, we found that UFL1's localization to the ER is dependent on DDRGK1. CRISPR-Cas9 knockout of DDRGK1 abrogated ER localization of UFL1, resulting in diffuse, cytosolic UFL1 (Figure 5D). We re-expressed various cDNA constructs of DDRGK1 in the DDRGK1 knockout background to map functional regions of the protein. Deleting DDRGK1's N-terminal ER-targeting transmembrane domain (TM) still supported a DDRGK1-UFL1 interaction but led to cytoplasmic localization of both DDRGK1 and UFL1 without ER-phagy (Figures 5E–5H, S6A, and S6B). Removing DDRGK1's C-terminal PCI domain did not affect normal ER localization of DDRGK1 but abolished its interaction with UFL1 (Figures 5E–5G and S6A).

This led to cytoplasmic localization of UFL1 and abolished the cell's ability to perform ER-phagy (Figures 5E–5G, S5A, and S5B). Re-targeting DDRGK1 to the mitochondria (TOM20- TMDD-HA) or peroxisomes (PMP34- TMDD-HA) was sufficient to re-target GFP-tagged UFL1 to each organelle (Figure 5I). Hence, DDRGK1's interaction with UFL1 via its PCI domain dictates the subcellular localization of UFL1.

During mitophagy, numerous proteins are ubiquitinated on the mitochondrial surface. But current models of mitophagy suggest that overall ubiquitin load is more important than any one substrate (Chan et al., 2011; Heo et al., 2015; Ordureau et al., 2014). Hence, we asked whether directly recruiting UFL1 to the ER surface could bypass the need for DDRGK1 (Figure S6C). However, expression of UFL1-RAMP4 in DDRGK1-depleted cells was not sufficient to rescue ER-phagy despite robust localization to the ER surface (Figures S6C–S6F). Together, these data indicate that DDRGK1 both recruits UFL1 to the ER and plays a role in activation of its ligase activity or recruitment of substrates during ER-phagy. We find that DDRGK1 is not a UFMylation substrate during ER-phagy and is instead analogous to an ubiquitin substrate adaptor (e.g., an F-box protein) that works with Cullin-RING family proteins.

To identify candidate substrates of DDRGK1/UFL1 dependent UFMylation on the ER, we first knocked down previously reported substrates of UFL1 including CDK5RAP3, SOX9, and ASC1 (Cai et al., 2015; Egunsola et al., 2017; Liu et al., 2017; Wu et al., 2010; Yoo et al., 2014), but none of them affected ER-phagy (Figures S6G and S6H).

We therefore performed immunoprecipitation-tandem mass spectrometry (IP-MS/MS) label-free proteomics to identify new interactors of DDRGK1 and DDRGK1-dependent UFMylation substrates during EBSS starvation. To identify DDRGK1 interactors, non-denaturing IP-MS/MS was performed in DDRGK1 knockout HEK293T clones that either did or did not stably re-express HA-tagged DDRGK1 (Figure 6A). To identify DDRGK1-dependent UFMylated proteins, we counteracted the constitutive deconjugation of UFM1 from substrates by UFSP2 (Walczak et al., 2019) by generating CRISPR-Cas9 UFSP2 knockout clones in both wild-type and DDRGK1 knockout HEK293T cells (Figure 6B). In the UFSP2 knockout and DDRGK1/UFSP2 double-knockout cells, we transiently expressed UFM1 lacking the C-terminal Cys-Ser residues (HA-UFM1- CS) to override the need for UFSP2 cleavage prior to conjugation (Figure 6B). UFMylated proteins were isolated using a denaturing HA-tag IP during EBSS starvation and folimycin treatment (to prevent lysosomal degradation).

The top differentially enriched proteins from DDRGK1 immunoprecipitation in cells lacking or expressing DDRGK1 were DDRGK1 itself and UFL1 (Figure 6C; Table S3). We also identified several large ribosomal subunits and ribosome-associated factors, including RPL7A, RPLP0, RPL10A, RPL30, and RPL19. This is consistent with recent reports that the ribosome interacts with and is modified by the UFMylation machinery (Simsek et al., 2017; Walczak et al., 2019).

The top UFMylated proteins in both UFSP2 knockout and DDRGK1/UFSP2 double-knockout cells were UFM1 itself, UBA5, and UFC1; UFL1 and DDRGK1 were not

identified (Figure 6D; Table S4). These data confirm that this experiment monitors UFMylation, since UFM1 forms a covalent bond with UBA5 and UFC1 but non-covalent interactions with UFL1 and DDRGK1 (Table S4) (Komatsu et al., 2004; Tatsumi et al., 2010). Comparing UFMylation in UFSP2 knockout cells to DDRGK1/UFSP2 double-knockout cells, we identified RPL26, which is a recently reported substrate of DDRGK1-mediated UFMylation (Figure 6D) (Walczak et al., 2019; Wang et al., 2020). Several factors involved in membrane trafficking between organelles and endosomes were also UFMylated in a DDRGK1-dependent manner, such as RAB1A/B, RAB5C, ARF4, and Clathrin. We further identified Ribophorin1 (RPN1), which was notable for several reasons. First, RPN1 is an ER-resident quality-control factor present on ER sheets that is part of the oligosaccharyltransferase (OST) complex (Figure S6I) (Kelleher et al., 1992). Second, RPN1 contains a significant cytoplasmic domain that could potentially be accessible for UFMylation during ER-phagy (Figure 6E) (Tsao et al., 1992). Third, RPN1 and the rest of the OST are associated with the SEC61/62/63 translocon complex (Yan and Lennarz, 2005). SEC62 has been identified as an ER-phagy receptor, and we found that that SEC62 is epistatic with DDRGK1 during ER-phagy (Figure 5I) (Fumagalli et al., 2016). And fourth, the SEC61/62/63 translocon complex and OST associate with the ribosome during co-translational folding, where they are structurally located immediately adjacent to RPL26 and large ribosomal subunit proteins that we found to interact with DDRGK1 such as RPL30 (Figure 6E) (Braunger et al., 2018). *RPN1* and *RPL26* are both “common essential” genes, required for the survival of every cell line tested by Dep-Map. The raw guide RNA counts for *RPN1* and *RPL26* are very low in all populations of the CRISPRi ER-phagy screen, explaining why neither appeared in the high-confidence hit list. Using immunoprecipitation and western blotting, we validated that both RPL26 and RPN1 are UFMylated and this UFMylation is abrogated by knockout of DDRGK1 (Figures 6F and 6G).

### **DDRGK1-Dependent UFMylation Facilitates ER-Phagy and Represses UPR**

IRE1 $\alpha$  is an ER stress sensor and was previously reported as a substrate of UFMylation to promote the UPR, but we found no evidence for DDRGK1-mediated UFMylation nor stabilization of IRE1 $\alpha$  during ER-phagy by either IP-MS/MS or IP-western blot (Figure 6B; Table S4; Figure S7A) (Liu et al., 2017). Instead, we conversely found that depletion of DDRGK1, UFL1, or UFM1 (HepG2, MCF7 and HeLa cells) resulted in elevated protein levels of IRE1 $\alpha$  in multiple cell types (Figures 7A and S7B–S7D). These results suggested that an inability to perform UFMylation-dependent ER-phagy could lead to upregulation of an ER stress response through IRE1 $\alpha$ , which senses misfolded proteins in the ER lumen. Indeed, knockdown of UFMylation ER-phagy factors led to elevated levels of several other UPR proteins including PERK, BiP, and CANX (Figures 7A and S7B). We also observed an increase in levels of CLIMP63 (ER sheet marker) and REEP5 (ER tubule marker), suggesting possible ER expansion (Figures 7A and S7B) (Schuck et al., 2009). Consistent with this idea, immunofluorescence of DDRGK1 CRISPR-Cas9 knockout HeLa cells showed increased CANX staining (Figures S7D and S7E). Knockdown of DDRGK1 or UFL1 led to modest but consistent transcriptional upregulation of the UPR transcripts PERK and BiP, increased differential splicing of XBP1, and upregulation of CLIMP63 and REEP5 (Figure 7B). As opposed to the other ER stress markers, IRE1 $\alpha$  showed higher protein levels upon DDRGK1 knockdown but no change in transcript abundance (Figures 7A and 7B),

indicating that IRE1 $\alpha$  protein levels could be post-translationally regulated in response to UFM1 signaling. The transcriptional upregulation of multiple UPR transcripts, differential splicing of XBP1, post-translational upregulation of IRE1 $\alpha$ , and ER expansion are all consistent with increased ER stress and consequent UPR under conditions where UFMylation-dependent ER-phagy cannot be executed. The upregulation of ER stress markers upon DDRGK1 or UFL1 knockdown are weaker than during acutely toxic tunicamycin treatment, suggesting that the disruption of the UFMylation-mediated ER-phagy represents a chronic, survivable ER stress (Figure 7B).

IRE1 $\alpha$  senses unfolded proteins in the ER lumen and so is a good candidate to mediate stress signals caused by defective ER-phagy. While we did not observe direct UFMylation of IRE1 $\alpha$  under either fed or starved conditions (Figure S7A), knockdown of IRE1 $\alpha$  in DDRGK1-depleted cells reversed the high levels of UPR markers downstream of IRE1 $\alpha$  caused by an inability to execute ER-phagy (Figure S7F). BiP, which is an upstream factor of IRE1 $\alpha$  signaling, was upregulated in DDRGK1-depleted cells but was not affected by IRE1 $\alpha$  depletion (Figure S7F) (Amin-Wetzel et al., 2017; Oikawa et al., 2009). Knockdown of IRE1 $\alpha$  had only a modest reciprocal effect upon ER-phagy, and only somewhat reversed the ER-phagy defect induced by loss of DDRGK1 (Figure 7C). Hence, UFMylation-induced ER-phagy is upstream of IRE $\alpha$  signaling.

Overall, our data indicate that DDRGK1-mediated, ER-resident UFMylation is critical for ER-phagy. DDRGK1 recruits UFL1 to promote ER surface UFMylation. We propose that the inability to UFMylate downstream ER substrates such as RPN1 and RPL26 leads to an inability to execute ER-phagy, resulting in the consequent build-up of ER stress, and eventual activation of the unfolded protein response via IRE1 $\alpha$  (Figure 7D).

## DISCUSSION

Our genome-wide ER-phagy screen provides a rich set of genes and pathways that greatly expands our understanding of ER-phagy and provides many starting points for further investigation. Among these, we identified several aspects of the core autophagy machinery, consistent with studies showing that ER-phagy shares effectors with general autophagy (Grumati et al., 2017; Khaminets et al., 2015; Smith et al., 2018).

So far, nutrient starvation is the only stress known to directly induce ER-phagy. We found that ER stress-inducing compounds do not lead to ER-phagy, but repression of ER-phagy by knockdown of DDRGK1 UFMylation induces ER stress and the UPR. UFMylation has previously been linked to ER stress through unclear mechanisms (DeJesus et al., 2016; Leto et al., 2019; Walczak et al., 2019), and our data suggest that this is connected to the regulation of ER-phagy. How is it that ER stress does not induce ER-phagy but an inability to perform ER-phagy induces ER stress? Under nutrient depletion, protein misfolding may increase in the ER, but these signals are repressed as cells catabolize the protein- and lipid-rich organelle. Blocking ER-phagy could then result in the toxic accumulation of excessive ER and misfolded ER-resident proteins that cannot be sufficiently kept in check by ERAD, thus activating the UPR. Under this model, blocking ER-phagy leads to UPR as a byproduct of ER stress that is no longer relieved by eating portions of the ER. This hypothesis and

ordered prioritization of ER stress-relief pathways will require a great deal of investigation but could lead to a molecular rationale for why cells go to the extreme of ER-phagy.

We found extensive interplay between the mitochondria and ER-phagy. The ER and mitochondria are known to crosstalk at membrane contact sites, including transfer and expansion of the lipid bilayer, Ca<sup>2+</sup> homeostasis, and mitochondria division (Friedman et al., 2011; Lombardi and Elrod, 2017). Previous studies indicate a unidirectional regulatory role of ER processes toward mitochondrial homeostasis. We found that impairment of mitochondrial OXPHOS represses ER-phagy, demonstrating that mitochondrial metabolism can also inform decisions in the ER. It still remains to be seen whether this communication is directly orchestrated via mitochondria-ER contacts or indirectly as a result of metabolic products. Alternatively, inhibition of OXPHOS could initiate UPR that takes over to repress last-resort ER-phagy. Consistently, mitochondrial dysfunction was reported to trigger the integrated stress response (ISR) which converges with the UPR pathway, further highlighting the complex cross-talk between the two organelles (Guo et al., 2019). Cellular energy levels are regulated by multiple energy sensing mechanisms that have complex roles during general autophagy (Egan et al., 2011; Herzig and Shaw, 2018; Kim et al., 2011), and the interplay between mitochondrial metabolism and ER homeostasis will no doubt involve a rich set of pathways for future investigation.

UFMylation have been implicated in DNA repair, transcriptional regulation, and ribosomal modification, all of which occur in different subcellular compartments (Egunsola et al., 2017; Qin et al., 2019; Walczak et al., 2019; Wang et al., 2019). It has been unclear how the mostly cytoplasmic UFL1 ligase accesses each compartment. We found that DDRGK1 recruits UFL1 to the ER surface for UFMylation-dependent ER-phagy. Post-translational modifications of organelle surfaces are widely involved in organelle autophagy. For example, ubiquitylation of PEX5 serves as a signal for peroxisomal autophagy (Nordgren et al., 2015; Zhang et al., 2015a), and ubiquitylation of multiple mitochondrial substrates promotes mitophagy (Chan et al., 2011; Karbowski and Youle, 2011). Since DDRGK1 recruits UFL1 to the ER surface and their combined ER-resident activity with UFM1 are required for ER-phagy, we speculate that UFMylation of ER surface protein(s) serves as an effector of ER-phagy, similar to PINK1's recruitment of Parkin to ubiquitylate mitochondrial surface proteins during mitophagy (Chan et al., 2011; Glauser et al., 2011; Karbowski and Youle, 2011; Wang et al., 2011).

We identified RPN1, a subunit of the ER-localized OST complex, as a novel DDRGK1-dependent UFMylation substrate. For several reasons, we propose that RPN1 is part of a UFMylation "hub" that participates in ER-resident quality control. The OST complex associates with ribosomes and the SEC61/62/63 complex for nascent protein translocation and maturation (Braunger et al., 2018; Kelleher et al., 1992; Shibata et al., 2010; Wilson et al., 2005; Yan and Lennarz, 2005). RPL26 is a known UFMylation substrate within the 60S large ribosomal subunit and sits in in close proximity with RPN1 (Figures 6E and 7D) (Walczak et al., 2019). DDRGK1 also physically interacts with multiple components of the large 60S ribosomal subunits that are nearby RPN1.

The downstream parts played by UFMylated RPN1 during ER marking, autophagic engulfment, and degradation remain to be determined. Dysregulation of glycosylation by interfering with the OST complex and inhibition of UFMylation both cause ER stress (Cherepanova et al., 2016; Walczak et al., 2019). The SEC62 ER-stress activated ER-phagy receptor is part of the translocon complex directly adjacent to the OST complex, and we found DDRGK1 to be epistatic to SEC62 during ER-phagy (Fumagalli et al., 2016; Kelleher et al., 1992; Tsao et al., 1992; Walczak et al., 2019; Wilson et al., 2005). Since RPN1 contains an N-terminal cytoplasmic domain and a C-terminal ER lumenal domain, it is possible that RPN1 might relay ER stress signals via ER-surface UFMylation during peptide translocation. Failure to relay and appropriately deal with these signals on the ribosome-rich ER sheets could induce the IRE1 $\alpha$ -mediated UPR induced by blockage of DDRGK1-dependent UFMylation. Nascent proteins trapped in the ribosome induces RPL26 UFMylation and lysosomal degradation of the stalled protein and ribosome *en bloc* (Wang et al., 2020). It is currently unknown whether these UFMylated ribosomes are physically extracted from the ER prior to lysosomal degradation, or if portions of the ER are degraded alongside the UFMylated ribosomes. Importantly, RPN1 and RPL26 might not be the exclusive targets of UFMylation and simultaneous UFMylation of other ER surface proteins could be required to drive ER-phagy in a cooperative manner. Overall, our data unify disparate reports of UFMylation impacting the UPR and provide a mechanistic rationale for how autophagy of ER sheets helps to prevent accumulation of ER stress. This opens up a great deal of further avenues to dissect the subsequent steps by which UFMylation is recognized on the ER surface to mediate ER-phagy.

While defects in ER-phagy have not been explicitly linked to human disease, human mutations in ER-phagy genes such as FAM134B and Atlastins are associated with hereditary neuropathies in OMIM and ClinVar (Abel et al., 2004; Amberger et al., 2015; Kurth et al., 2009). Several ER-phagy genes derived from our screen are also associated with human neurodegenerative phenotypes with previously unclear mechanistic bases, such as Leigh syndrome (mitochondrial OXPHOS, including ETC chaperones) (Lake et al., 2016), spastic paraplegia (ARL6IP1) (Novarino et al., 2014), encephalopathy (TRAPPC12) (Milev et al., 2017), spinocerebellar ataxia and encephalopathy (UBA5) (Daida et al., 2018; Mignon-Ravix et al., 2018), and severe early-onset encephalopathy and progressive microcephaly (UFC1, UFM1) (Nahorski et al., 2018). It is premature to broadly link deficits in ER-phagy to human disease, but the similar phenotypes stemming from mutations in various ER-phagy factors are provocative. Our work lays the foundation for future understanding of ER-phagy and its interplay with the ER stress response, as well as the consequences of ineffective ER-phagy. Further mechanistic dissection of the 200 high-confidence ER-phagy regulators and executors identified here will hopefully shed light on this dramatic process.

## STAR★METHODS

### LEAD CONTACT AND MATERIALS AVAILABILITY

The plasmids generated in this study have been deposited to Addgene (catalog number indicated in Key Resources Table). In the case where the same cDNA with multiple epitope/fluorescence tags are used, only one version is deposited to Addgene. All remaining unique/

stable reagents generated in this study are available from the Lead Contact, Jacob Corn (jacob.corn@biol.ethz.ch) with a complete Materials Transfer Agreement.

## METHOD DETAILS

**Design, Production and titering of sgRNA library lentivirus**—The genome-wide CRISPRi-V2 library was a gift from the Weismann lab (Addgene catalog #1000000093) and contains 5 sgRNAs per gene. For the pilot autophagy screen, we designed a comprehensive sgRNA library that targets all the reported TSS (10 gRNAs per TSS) of 31 genes that are involved in general autophagy. Overall, a total of 3301 gRNAs were designed (Table S1). The protospacer oligos were annealed and ligated to pCRISPRi vector (Addgene 84832) according to the protocol established by the Weissman lab ([https://weissmanlab.ucsf.edu/CRISPR/Pooled\\_CRISPR\\_Library\\_Cloning.pdf](https://weissmanlab.ucsf.edu/CRISPR/Pooled_CRISPR_Library_Cloning.pdf)) (Horlbeck et al., 2016). In addition, we added in 10% of a custom built non-targeting sgRNA library prior to virus production.

The following paragraph describes the transfection protocol for one 15 cm plate of HEK293T cells. On Day 0, 7.5 million HEK293T cells were seeded in a 15 cm plate in 20 mL of DMEM medium with 10% FBS. The following day HEK293T cells were transfected. In a 15 mL tube, 2.8 mL of Opti-MEM was mixed with 90  $\mu$ L of Mirus LT1 transfection reagent and incubated at room temperature for 5 minutes. In an eppendorf tube, 12  $\mu$ g of delta VPR, 3  $\mu$ g of VSVG, and 15  $\mu$ g of library plasmid were combined. The plasmids were then added to the Opti-MEM and Mirus mixture and incubated at room temperature for 20 minutes. The media was changed the following day. On Day 3, the virus was harvested using a 0.45 mm syringe filter, aliquoted into 1 mL tubes, and snap frozen. If more than one 15 cm plate of virus was produced for one library, the virus across those plates were pooled and mixed prior to aliquoting into eppendorf tubes. Virus was harvest on Day 4 as well.

Next, the virus was titered to determine the infectivity of the virus in the HCT116 cells. HCT116 were plated in a series of 6 well plates such that each well had cells and there was one 6 well plate per sub-library per time point (i.e., 48 or 72 hour virus harvest). One well on each plate was not transduced with any virus. The virus was titered such that is diluted 2-fold, 4-fold, 8-fold, 16-fold, and 32-fold. Polybrene was used at a concentration of 8 mg/mL. Fresh media were replaced 24hr post transduction. The cells were harvested 48 hours post viral transduction for flow cytometry and the percentage of BFP positive cells was recorded. The optimal virus dilution is defined as dilution-fold that results in less than 20% of BFP positive cells.

**CRISPRi screen: cell generation, virus transduction, puro selection, and sort**—HCT116 cells stably expressing a dcas9-KRAB and doxycycline-inducible EATR reporter was generated by lentiviral transduction of Addgene constructs 102244 and 109014 (Liang et al., 2018). The library contained seven unique sub-libraries and each sub-library was transduced separately, such that each sgRNA had an average of 500x coverage after transduction (Day 1). Puromycin selection for positively-transduced cells was performed 48 hours post transduction (Day 3). On Day 7, the sub-libraries were pooled proportionally based on the number of sgRNAs and cells were maintained at 500x coverage. On Day 10, cells were treated with doxycycline (4 $\mu$ g/ml) for 16 hours to induce EATR expression and on

Day 11, cells were treated with EBSS for 16 hours. Cells were then collected for sorting - cells were gated into the 25% of cells with most ER-phagy and 25% of cells with the least ER-phagy. A background population of cells was collected for downstream NGS analysis of relative enrichment. The entire CRISPRi screen was performed in two biological replicates.

**NGS Sample Preparation and screen analysis**—Genomic DNA was harvested using the Macherey-Nagel gDNA extraction protocol. The background samples required the XL kit whereas the midi kit was sufficient for sorted cells. After elution, the genomic DNA was treated with SbfI-HI restriction enzyme and incubated overnight at 37°C to liberate the DNA fragment encoding the sgRNA sequences.

Samples were run on an agarose gel and the gel piece around the 500 bp size (region containing the sgRNA sequence) was excised. The gel was melted in 55°C water bath and 1/100 by volume of 3 M NaAc (pH 5.2) was added to each tube and then solution was passed through an MN column. Each column was washed twice with NT3 buffer. The column was incubated for 5 minutes in 20 µL of heated elution buffer (98°C) and then spun. The elution step was repeated so that the final elution volume was 40 µL.

A standard PCR protocol was used with Phusion High Fidelity Enzyme and 3% DMSO final concentration. The forward primer contained a TruSeq Index that would be subsequently used during NGS analysis. Before proceeding with a full scale PCR of the samples, a test PCR for each sample was run to determine the proper number of cycles (21, 23, or 25 cycles). The cycle number was identified individually for each sample that allowed a visible band on a TBE gel after staining with ethidium bromide, but not an oversaturated PCR product that could compromise the representation of gRNAs within the sample.

After the optimal cycle number was determined, a total of twelve 100 µL PCRs were done with 3 µL of template per reaction (from the abovementioned elution). The forward primer contained a TruSeq Index that would be subsequently used during NGS analysis. After completion of the PCR, the twelve reactions were pooled together and mixed. 300 µL of the pooled PCR was taken for subsequent PCR clean-up.

195 µL of SPRI beads was added to the pooled PCR and incubated at room temperature for 10 minutes. The samples were attached to a DynaMag for 5 minutes. The supernatant (which has the sample) was transferred to a new tube. 300 µL of SPRI beads were added and incubated for another 10 minutes. The samples were attached to a DynaMag for 5 minutes and the supernatant was discarded (samples attached to the beads). The beads were washed twice with 80% ethanol. After removal of the last supernatant, the beads were spun down, and excess ethanol was removed. The samples were air-dried for 10 minutes and resuspended in 35 µL of water. DNA concentration was quantified using Qubit Fluorometric Quantitation (Thermo Fisher Scientific) and the samples were pooled proportionally to cell number and sequenced on a HiSeq 2500 such that each sgRNA sequence was covered at least 30 times.

Screening data was analyzed using standard protocols in MaGECK and ScreenProcessing (Horlbeck et al., 2016; Li et al., 2014, 2015). MaGECK was used for the pilot autophagy



library, while ScreenProcessing was used for the genome-wide library. Briefly, gRNAs were quantified in each pool of cells based by matching reads back to the appropriate library reference, each pool was normalized by total number of reads, and gRNA distributions were compared to the background. Non-targeting gRNAs were explicitly used in each software package. MaGECK and ScreenProcessing integrate multiple gRNAs into gene-level phenotypes (e.g.,  $\log_2$ -fold-change) and p values using different approaches (Horlbeck et al., 2016; Li et al., 2014, 2015).

**sgRNA plasmid cloning procedures for individual plasmids**—The sgRNA sequences for genome-wide screening were based on the Weissman CRISPRi-v2 library and contained 5 sgRNAs per gene. The sgRNA sequences for autophagy-related genes used for the pilot-test run were custom-designed to target all reported transcription start site (TSS) of each gene and contained 10 sgRNAs per TSS. sgRNA plasmids were cloned by annealing and ligating sgRNA-containing short oligos to the CRISPRi-v2 vector (addgene 84832) via the previously described protocol (Horlbeck et al., 2016). Briefly, the forward and reverse primers of each sgRNA were annealed by pre-incubation at 37°C for 30min in the presence of T4 polynucleotide kinase (PNK; NEB) followed by incubation at 95°C for 5 min and then ramp down to 25°C at 5°C /min. The annealed sgRNA inserts were then ligated to CRISPRi-v2 plasmid (digested using BstXI and BlnI) using Quick ligation kit (NEB). Knockdown efficiency of each guide was measured either by western blot or qRT-PCR. All sgRNA constructs used in this study are detailed in Table S3.

**shRNA plasmid cloning for DDRGK1 and UFL1**—Short hairpin RNA (shRNA) was used to knockdown DDRGK1 in cell lines that do not express dCas9-KRAB constructs. Non-targeting (5'-CCTAAGGTTAAGTCGCCCTCG-3'), DDRGK1-targeting (5'-GGCTCTGCTAGTCGGCTTTAT-3') and UFL1-targeting (5'-GCTTCTTTACTCTGTGCTTGA-3') shRNAs were cloned into pLKO.1 puro construct (Addgene #8453) according to protocol described in Addgene ([https://www.addgene.org/protocols/plko/?gelid=&equals;Cj0KCQAm5viBRD4ARIsADGUT25ZCGNPeQSFvLqSwvg2tHDkCc9zOZsLdaUffZzNTRYzL\\_YOIKFVQdUaAqbfEALw\\_wcB](https://www.addgene.org/protocols/plko/?gelid=&equals;Cj0KCQAm5viBRD4ARIsADGUT25ZCGNPeQSFvLqSwvg2tHDkCc9zOZsLdaUffZzNTRYzL_YOIKFVQdUaAqbfEALw_wcB)). Briefly, the shRNAs were cloned by standard annealing (same as sgRNA annealing protocol described in the previous section) and ligated to pLKO.1 construct (digested with AgeI-HF and EcoRI-HF).

**cDNA plasmid cloning procedures**—Unless stated otherwise, all ORFs described in this article were obtained from PCR amplification of HCT116 cDNA. The ORFs were cloned into pLenti-XI destination vector with neomycin resistance. Briefly, an original pLenti-X1-Neo-eGFP-LC3B vector was first digested with restriction enzymes BamHI and XbaI to remove the eGFP-LC3B insert. Then, Gibson Assembly was used to insert the gene-of-interest and the desired epitope or fluorescent tag into the pLenti-X1 vector (Gibson et al., 2009). All overexpression constructs used in this study are detailed in Table S4.

**Cell culture**—Cells were cultured at 37°C with 5% CO<sub>2</sub> in a humidified atmosphere. All cells were cultured in DMEM-GlutaMAX medium supplemented with 10% FBS, 0.1 mM non-essential amino acids (GIBCO), 1 mM sodium pyruvate (GIBCO), 100 U/mL penicillin

(GIBCO), and 100 g/mL streptomycin (GIBCO). Cell lines were obtained from the Berkeley Cell Culture Facility and were verified mycoplasma free with MycoAlert Mycoplasma Detection Kit (Lonza).

**Cell Treatments**—ER-phagy was induced with media starvation using EBSS with calcium, magnesium, and phenol red (Invitrogen e10043). For EATR and CCER assays, cells were plated 48 hours prior to EBSS treatment. EATR expression is induced using 4 µg/ml doxycycline 24hr prior to starvation. Unless otherwise stated, starvation treatment was carried out for 16 hours. Cells in fed conditions indicate incubation in complete DMEM described above.

For all experiments except the Seahorse assay, rotenone was used at a final concentration of 3 µM, antimycin A was used at a concentration of 0.5 µM, and oligomycin A was used at a concentration of 3 µM. Cells were treated with these drugs in two phases for a total of 40 hours. First, cells were treated for 24 hours with complete DMEM, then immediately treated again for 16 hours in EBSS media or complete DMEM. Unless stated otherwise, epoxomicin and folimycin treatments were co-administered with EBSS starvation at 100 nM final concentration.

**Lentiviral packaging and transduction**—Lentiviral packaging was performed in HEK293T cells using either TransIT-LT1 Transfection Reagent (Mirus) or Lipofectamine 3000 (ThermoFisher Scientific) according to the manufacturer's protocol. Briefly, delta-VPR, VSVG, and the construct of interest were transfected at the ratio of 4:1:5. Lentiviral supernatant was harvested at 48hr post-transfection and HEK293T cells were replenished with fresh media for another harvest at 72hr post-transfection.

**Knockout Cell Line Generation**—AMPK knockout cell lines were generated using Cas9 RNPs and nucleofection as detailed previously (Lingeman et al., 2017). The sgRNA protospacer sequences were validated and used previously by the Shaw lab (Toyama et al., 2016). The protospacer sequences are as follow: AMPK $\alpha$ 1-sgRNA1- GGCTGTCGCCATCTTTCTCC; AMPK $\alpha$ 1-sgRNA2- GAAGATCGGCCACTACATTC; AMPK $\alpha$ 2-sgRNA1- TCAGCCATCTTCGGCGCGCG; AMPK $\alpha$ 2-sgRNA2- GAAGATCGGACACTACGTGC. After nucleofection, HCT116 cells were serially diluted into 96 well plates such that there was on average of 0.7 cells/well. AMPK KO clones were screened by western blotting. DDRGK1, UFL1 and UFSP2 knockout cell lines were using pSpCas9(BB)-2A-GFP (PX458) (Addgene #48138) plasmids carrying sgRNAs that target the respective regions close to the transcription start site. For DDRGK1 and UFL1, two guides were used simultaneously to remove the transcription start sites. The knockout of UFSP2 was performed using only one guide based on reported sequence (Walczak et al., 2019). The protospacer sequences are as follow: DDRGK1-sgRNA1- ATGAGATCCCGGCCT CAGGG; DDRGK1-sgRNA2- TAGGAGATGCCGCTGCACCA; UFL1-sgRNA1- CTGACTCGCAGTAGACGCGG; UFL1-sgRNA2-GCCTAATT TGGGCTCCACAA; UFSP2-sgRNA1- AATAAGAGGAGGCCTTGATT. GFP-positive cells were single-cell sorted 48hr post transfection and knockout clones were screened by western blotting and selected clones were further validated by Sanger sequencing.

**Flow Cytometry Analysis of EATR cells**—Flow cytometry of EATR assay was performed using an Attune NxT Flow Cytometer and subsequent analysis was performed using FlowJo 10.1 (Liang et al., 2018). All EATR experiments were performed using live cells to prevent reversal of eGFP quenching post-fixation. The intensities for both eGFP and mCherry of the EATR cells at fed condition were used as references to define the gate for zero ER-phagy events. Following stimulation, ER-phagy detection is based on the shift of cell population into the ER-phagy gate. On average, 5 to 10,000 cells were analyzed per condition and all statistical analyses were performed using data from at least three biological replicates.

**Quantitative real-time PCR (qRT-PCR)**—RNA extraction was performed using Directzol RNA miniprep kit (Zymo Research) according to manufacturer's instruction. 1 $\mu$ g of RNA per sample were used for reverse transcription using SuperScript III First-Strand Synthesis System (Invitrogen) according to manufacturer's instruction. qRT-PCR reaction was set up using Fast SYBR Green Mastermix (Applied Biosystems) and run in triplicates using StepOne Plus Real-Time PCR system (Applied Biosystems). A complete list of all primers used are compiled in Table S6.

**Western blotting**—To prepare samples for western blot, cells were lysed in Radioimmunoprecipitation assay (RIPA) buffer (0.5M Tris-HCl, pH 7.4, 1.5M NaCl, 2.5% deoxycholic acid, 10% NP-40, 10mM EDTA), supplemented with Halt Protease Inhibitor Cocktail and Phosphatase Inhibitor Cocktail (both ThermoFisher). Cells were lysed on ice for 10 minutes and spun at 14000 rpm for 10 minutes to remove insoluble debris. Protein concentrations were quantified by Bradford assay. Lysates were normalized based on protein concentration and NuPage LDS Sample Buffer (4x) supplemented with B-mercaptoethanol (5% v/v) was added (Invitrogen). Samples were boiled at 98°C for 5 minutes.

Between 20–40mg of samples were run on NuPAGE Bis-Tris 4%–12% gels in NuPage MES SDS Buffer (Invitrogen) for 40 minutes at 200 V and transferred to 0.4- $\mu$ m nitrocellulose membranes using a semi-dry transfer system (Bio-Rad Catalog #1704150) at 1.3 A and 25 V for 15 minutes. After transfer, membranes were blocked with 5% (w/v) milk in Tris buffered saline containing 0.1% Tween 20 (TBS-T) for 30 minutes, and subsequently washed with TBS-T three times. Primary antibodies were diluted at the appropriate concentration in 5% BSA (w/v) in TBS-T. The membrane was incubated in primary antibody for either 1–2 hours at room temperature or overnight at 4°C. The membrane was washed with TBS-T three times for five minutes each. The blots were incubated for 30 minutes in the milk solution with a 1:10,000 dilution of Li-Cor near-infrared fluorescence secondary antibodies. The blots were scanned using Li-Cor's Near-InfraRed fluorescence Odyssey CLx Imaging System, and densitometry quantifications were done using Li-Cor's ImageStudio software complementary of Odyssey.

**Immunoprecipitation**—Unless specified otherwise, all immunoprecipitation experiments were performed in HCT116 cells stably-expressing the different HA-tagged UFMylation protein constructs using the Perice Anti-HA Magnetic beads Kits according to manufacturer's protocol. Briefly, cells were harvested and lysed using the IP-lysis buffer supplemented with Halt Protease Inhibitor Cocktail (ThermoFisher). Equal amount of

lysates (~5mg) for each condition were mixed with pre-washed 50µl of HA-magnetic bead slurry. Immunoprecipitation was performed at 4°C for 2hr. The beads were then washed twice using 'high-salt' IP lysis buffer (IP lysis buffer supplemented with 500mM NaCl), with 5min incubation on a rotor. The final wash was performed using regular IP lysis buffer. Immunoprecipitated proteins were eluted by boiling the samples at 98°C in 1x NuPAGE LDS Sample Buffer (ThermoFisher) for 5min supplemented with NU-PAGE sample reducing agent.

**Denaturing Immunoprecipitation and tandem-mass spectrometry analysis (IP-MS/MS)**—HEK293T cells with either DDRGK1 knockout or DDRGK1 and UFSP2 double knockout were transiently transfected with pRK5-HA-UFM1-dCS for 72hr. Cells were then starved for 4hr in the presence of folimycin (50nM) and lysed using 1X RIPA lysis buffer supplemented with mammalian protease inhibitor for 10min on ice. Insoluble debris and nuclear fractions were removed by centrifugation. The samples were then denatured using final 2% SDS and boiled for 5min at 95°C. After denaturation, the samples were further diluted at 1:20 in 1X RIPA lysis buffer to dilute the SDS concentration to 0.1% prior to immunoprecipitation using anti-HA magnetic beads (Pierce, #88837). Immunoprecipitation was performed at room temperature for 1hr with constant rotation followed by two washes in high-salt RIPA buffer containing 500mM NaCl and a final wash in 1x RIPA buffer.

The immunoprecipitation samples were then processed by the Proteomics group of Functional Genomics Center Zurich (FGCZ) for on-bead tryptic digestion and mass spectrometry analysis. Briefly, beads were washed twice with 50ul of digestion buffer (10 mM Tris/2 mM CaCl<sub>2</sub>, pH 8.2). Then, 45µl of digestion buffer and 5ml trypsin (100 ng/ul in 10 mM HCl) were added and samples were microwaved to assist digestion (30 min at 60°C). The supernatant was collected and peptides were extracted from beads with 150ul of 0.1% TFA/50% acetonitrile. Supernatants were then combined and dried, dissolved in 20µl 0.1% formic acid and further diluted 1:10 in 0.1% formic acid and transferred to autosampler vials for LC/MS/MS. Database searches were performed using the Mascot search engine against SwissProt (all species and only human).

**Immunofluorescence**—Immunofluorescence was conducted as previously described (Liang et al., 2018). Briefly, cells were fixed in 4% (wt/vol) paraformaldehyde for 15 min followed by permeabilization using 0.1% Triton X-100 in PBS for 10 min. Cells were then blocked in 1% BSA in PBS for 20 min. Primary antibodies were incubated for 1hr at room temperature, followed by three PBS washes for 5min each. Alexa Fluor 488/568/660-conjugated goat anti-mouse or anti-rabbit IgG secondary antibodies were incubated for 30 min at room temperature, followed by three PBS washes for 5min each. Coverslips were mounted onto glass slides using ProLong Gold Antifade reagent with or without DAPI addition for nucleus visualization. Images were taken using either Zeiss LSM 710 Axio Observer (in Berkeley) or Leica TCS SP8 confocal microscope (in ETH Zurich) with 63x objective lens and post-processed in Adobe Photoshop for specific inset enlargement and RGB channel separation. Colocalization analysis in Figure 6J was determined by Pearson's Correlation coefficient using ImageJ with colocalization plugin from McMaster

Biophotonics Facility (MBF). The frequency scatterplot in Figure S6A was generated using the same plugin.

**MitoTracker**—The MitoTracker assay was performed according the manufacturer’s protocol (ThermoFisher Catalog #M7512). Cells were plated 48 hours before starvation. Cell starvation and drug concentrations was performed according to protocols described above. The MitoTracker Red CMXRos was dissolved in DMSO for a stock concentration of 1 mM. MitoTracker was added to samples such that the concentration in each well was 50 nM. The cells were incubated for 30 minutes, washed with media, and then fixed in 4% formaldehyde. The cells were stained with calnexin according to the immunofluorescence protocol. For flow cytometry measurement, the experiment was performed the same way as mentioned above but the cells were trypsinized after incubation with MitoTracker dye to measure the fluorescence intensity of the staining.

**ATP Assay**—The assay was performed according to the manufacturer’s protocol for the CellTiter-Glo 2.0 Cell Viability Assay (Promega; Cat #: G9241). Briefly, the cells treated with starvation were starved for 25 hours. The cells treated with rotenone or antimycin A were used as positive controls and cells were treated for 1 hour. Cells were harvested, washed with PBS, and counted and normalized. The cells were spun down again and resuspended such that there were 25,000 cells per 50  $\mu$ L of PBS. 50  $\mu$ L of PBS was added to each well in an opaque-walled 96-well plate. Each sample was done in technical triplicate. Wells with PBS, but no cells, were used as a blank control. 50  $\mu$ L of CellTiter-Glo 2.0 reagent was added to each well. The plate was placed on an orbital shake for 2 minutes, followed by a 10 minute bench-top incubation to stabilize the signal. Sample luminescence was determined by the SpectraMax M2 Microplate Reader (Molecular Devices).

**Mitochondrial Respiration Measurements**—Mitochondrial activity was determined using the Seahorse Flux Analyzer XF24 (Agilent Technology) and the Seahorse XF Cell Mito Stress Test Kit (Agilent; Cat. #:103015–100) according to the manufacturer’s protocol. Briefly,  $4 \times 10^4$  HCT1 16 cells were seeded on XF24-well cell culture microplates. After 24hr, growth medium was exchanged with XF assay base medium supplemented with 1 mM sodium pyruvate (Invitrogen; Cat. #11360–070), 2mM L-glutamine (Invitrogen; Cat. #25030–081), and 10mM D-glucose (pH 7.4) (Invitrogen; Cat. #:D16–500). The microplates were incubated at 37°C without CO<sub>2</sub> for 1hr prior to the assay. Samples were mixed for 3 min, time delayed for 2 min, and measured for 3 min. Oligomycin (1  $\mu$ M), FCCP (1  $\mu$ M), and rotenone / antimycin (0.5  $\mu$ M) were sequentially injected at the indicated time points. OCR data were normalized by protein concentration and the average values were taken for each experiment. Seven replicates were performed for each cell line. The mean  $\pm$  SEM was determined and statistical significance was evaluated using the Student’s *t test* with a P value < 0.05.

**Statistical analysis**—All analysis was performed using data from at least three independent biological replicates (exact number of replicates are stated in the figure legend). Unless stated otherwise, all statistical analyses were performed in PRISM6 software using paired Student’s *t test*. P values are indicated as follow: \* < 0.05, \*\* < 0.01, \*\*\* < 0.001,

\*\*\*\* < 0.0001. The distribution of the data was assumed to be normal, but this was not formally tested.

## DATA AND CODE AVAILABILITY

All sequencing datasets generated as part of this study are publicly available in NCBI-SRA under Bioproject PRJNA599329. Original western blot data for all main and supplemental figures in this paper is available at Mendeley Data (<https://doi.org/10.17632/ztzfkww2jx.2>).

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## ACKNOWLEDGMENTS

J.E.C. and J.R.L. were supported by the National Institutes of Health (DP2-HL-141006), the NOMIS Foundation, the Lotte and Adolf Hotz-Sprenger Stiftung, the Li Ka Shing Foundation, and the Heritage Medical Research Institute. This research was also supported by a grant from the National Institute of Health (R01GM112948 to J.A.O.). J.A.O. is a Chan Zuckerberg Biohub investigator. E.L. was supported by the National Science Foundation. This work used the Vincent J. Coates Genomics Sequencing Laboratory at UC Berkeley, which is supported by NIH Instrumentation grant S10 OD018174. Confocal live-and fixed-cell imaging experiments were conducted at the Cancer Research Laboratory-Molecular Imaging Center Berkeley (supported by the Gordon and Betty Moore Foundation) and the Scientific Center for Optical and Electron Microscopy facility at ETH Zurich. Mass spectrometry experiments were performed by the Functional Genomics Center Zurich (ETH Zurich/University of Zurich).

## REFERENCES

- Abel A, Fonknechten N, Hofer A, Dürr A, Cruaud C, Voit T, Weissenbach J, Brice A, Klimpe S, Auburger G, and Hazan J (2004). Early onset autosomal dominant spastic paraplegia caused by novel mutations in SPG3A. *Neurogenetics* 5, 239–243. [PubMed: 15517445]
- Amberger JS, Bocchini CA, Schiettecatte F, Scott AF, and Hamosh A (2015). OMIM.org: Online Mendelian Inheritance in Man (OMIM®), an online catalog of human genes and genetic disorders. *Nucleic Acids Res.* 43, D789–D798. [PubMed: 25428349]
- Amin-Wetzel N, Saunders RA, Kamphuis MJ, Rato C, Preissler S, Harding HP, and Ron D (2017). A J-Protein Co-chaperone Recruits BiP to Monomerize IRE1 and Repress the Unfolded Protein Response. *Cell* 171, 1625–1637. [PubMed: 29198525]
- An H, Ordureau A, Paulo JA, Shoemaker CJ, Denic V, and Harper JW (2019). TEX264 Is an Endoplasmic Reticulum-Resident ATG8-Interacting Protein Critical for ER Remodeling during Nutrient Stress. *Mol. Cell* 74, 891–908. [PubMed: 31006537]
- Binder JX, Pletscher-Frankild S, Tsafou K, Stolte C, O'Donoghue SI, Schneider R, and Jensen LJ (2014). COMPARTMENTS: unification and visualization of protein subcellular localization evidence. *Database (Oxford)* 2014, bau012.
- Braunger K, Pfeffer S, Shrimal S, Gilmore R, Berninghausen O, Mandon EC, Becker T, Förster F, and Beckmann R (2018). Structural basis for coupling protein transport and N-glycosylation at the mammalian endoplasmic reticulum. *Science* 360, 215–219. [PubMed: 29519914]
- Cai Y, Pi W, Sivaprakasam S, Zhu X, Zhang M, Chen J, Makala L, Lu C, Wu J, Teng Y, et al. (2015). UFBP1, a Key Component of the Ufm1 Conjugation System, Is Essential for Ufmylation-Mediated Regulation of Erythroid Development. *PLoS Genet.* 11, e1005643. [PubMed: 26544067]
- Chan NC, Salazar AM, Pham AH, Sweredoski MJ, Kolawa NJ, Graham RLJ, Hess S, and Chan DC (2011). Broad activation of the ubiquitin-proteasome system by Parkin is critical for mitophagy. *Hum. Mol. Genet* 20, 1726–1737. [PubMed: 21296869]
- Chatr-Aryamontri A, Oughtred R, Boucher L, Rust J, Chang C, Kolas NK, O'Donnell L, Oster S, Theesfeld C, Sellam A, et al. (2017). The Bio-GRID interaction database: 2017 update. *Nucleic Acids Res.* 45 (D1), D369–D379. [PubMed: 27980099]

- Chen Q, Xiao Y, Chai P, Zheng P, Teng J, and Chen J (2019). ATL3 Is a Tubular ER-Phagy Receptor for GABARAP-Mediated Selective Autophagy. *Curr. Biol* 29, 846–855. [PubMed: 30773365]
- Cherepanova N, Shrimal S, and Gilmore R (2016). N-linked glycosylation and homeostasis of the endoplasmic reticulum. *Curr. Opin. Cell Biol* 41, 57–65. [PubMed: 27085638]
- Chino H, Hatta T, Natsume T, and Mizushima N (2019). Intrinsically Disordered Protein TEX264 Mediates ER-phagy. *Mol. Cell* 74, 909–921. [PubMed: 31006538]
- Daida A, Hamano S-I, Ikemoto S, Matsuura R, Nakashima M, Matsumoto N, and Kato M (2018). Biallelic loss-of-function UBA5 mutations in a patient with intractable West syndrome and profound failure to thrive. *Epileptic Disord.* 20, 313–318. [PubMed: 30078785]
- Daniel J, and Liebau E (2014). The ufm1 cascade. *Cells* 3, 627–638. [PubMed: 24921187]
- Deas E, Wood NW, and Plun-Favreau H (2011). Mitophagy and Parkinson’s disease: the PINK1-parkin link. *Biochim. Biophys. Acta* 1813, 623–633. [PubMed: 20736035]
- DeJesus R, Moretti F, McAllister G, Wang Z, Bergman P, Liu S, Frias E, Alford J, Reece-Hoyes JS, Lindeman A, et al. (2016). Functional CRISPR screening identifies the ufm1ylation pathway as a regulator of SQSTM1/p62. *eLife* 5 Published online June 28, 2016. 10.7554/eLife.17290.
- Dodson MW, and Guo M (2007). Pink1, Parkin, DJ-1 and mitochondrial dysfunction in Parkinson’s disease. *Curr. Opin. Neurobiol* 17, 331–337. [PubMed: 17499497]
- Egan DF, Shackelford DB, Mihaylova MM, Gelino S, Kohnz RA, Mair W, Vasquez DS, Joshi A, Gwinn DM, Taylor R, et al. (2011). Phosphorylation of ULK1 (hATG1) by AMP-activated protein kinase connects energy sensing to mitophagy. *Science* 331, 456–461. [PubMed: 21205641]
- Egunsola AT, Bae Y, Jiang M-M, Liu DS, Chen-Evenson Y, Bertin T, Chen S, Lu JT, Nevarez L, Magal N, et al. (2017). Loss of DDRGK1 modulates SOX9 ubiquitination in spondyloepimetaphyseal dysplasia. *J. Clin. Invest* 127, 1475–1484. [PubMed: 28263186]
- Elangovan M, Chong HK, Park JH, Yeo EJ, and Yoo YJ (2017). The role of ubiquitin-conjugating enzyme Ube2j1 phosphorylation and its degradation by proteasome during endoplasmic stress recovery. *J. Cell Commun. Signal* 11, 265–273. [PubMed: 28321712]
- Fregno I, Fasana E, Bergmann TJ, Raimondi A, Loi M, Soldà T, Galli C, D’Antuono R, Morone D, Danieli A, et al. (2018). ER-to-lysosome-associated degradation of proteasome-resistant ATZ polymers occurs via receptor-mediated vesicular transport. *EMBO J.* 37, 37.
- Friedman JR, Lackner LL, West M, DiBenedetto JR, Nunnari J, and Voeltz GK (2011). ER tubules mark sites of mitochondrial division. *Science* 334, 358–362. [PubMed: 21885730]
- Fumagalli F, Noack J, Bergmann TJ, Cebollero E, Pisoni GB, Fasana E, Fregno I, Galli C, Loi M, Soldà T, et al. (2016). Translocon component Sec62 acts in endoplasmic reticulum turnover during stress recovery. *Nat. Cell Biol* 18, 1173–1184. [PubMed: 27749824]
- Geisler S, Holmström KM, Treis A, Skujat D, Weber SS, Fiesel FC, Kahle PJ, and Springer W (2010). The PINK1/Parkin-mediated mitophagy is compromised by PD-associated mutations. *Autophagy* 6, 871–878. [PubMed: 20798600]
- Gibson DG, Young L, Chuang R-Y, Venter JC, Hutchison CA 3rd, and Smith HO (2009). Enzymatic assembly of DNA molecules up to several hundred kilobases. *Nat. Methods* 6, 343–345. [PubMed: 19363495]
- Gilbert LA, Horlbeck MA, Adamson B, Villalta JE, Chen Y, Whitehead EH, Guimaraes C, Panning B, Ploegh HL, Bassik MC, et al. (2014). Genome-scale CRISPR-mediated control of gene repression and activation. *Cell* 159, 647–661. [PubMed: 25307932]
- Glauser L, Sonnay S, Stafa K, and Moore DJ (2011). Parkin promotes the ubiquitination and degradation of the mitochondrial fusion factor mitofusin 1. *J. Neurochem* 118, 636–645. [PubMed: 21615408]
- Grumati P, Morozzi G, Hölper S, Mari M, Harwardt MI, Yan R, Müller S, Reggiori F, Heilemann M, and Dikic I (2017). Full length RTN3 regulates turnover of tubular endoplasmic reticulum via selective autophagy. *eLife* 6 Published online June 15, 2017. 10.7554/eLife.25555.
- Guo X, Aviles G, Liu Y, Tian R, Unger BA, Lin Y-HT, Wiita AP, Xu K, Correia MA, and Kampmann M (2019). Mitochondrial dysfunction is signaled to the integrated stress response by OMA1, DELE1 and HRI. *bioRxiv*. 10.1101/715896.

- Hamasaki M, Noda T, Baba M, and Ohsumi Y (2005). Starvation triggers the delivery of the endoplasmic reticulum to the vacuole via autophagy in yeast. *Traffic* 6, 56–65. [PubMed: 15569245]
- Heo J-M, Ordureau A, Paulo JA, Rinehart J, and Harper JW (2015). The PINK1-PARKIN Mitochondrial Ubiquitylation Pathway Drives a Program of OPTN/NDP52 Recruitment and TBK1 Activation to Promote Mitophagy. *Mol. Cell* 60, 7–20. [PubMed: 26365381]
- Herzig S, and Shaw RJ (2018). AMPK: guardian of metabolism and mitochondrial homeostasis. *Nat. Rev. Mol. Cell Biol* 19, 121–135. [PubMed: 28974774]
- Horlbeck MA, Gilbert LA, Villalta JE, Adamson B, Pak RA, Chen Y, Fields AP, Park CY, Corn JE, Kampmann M, and Weissman JS (2016). Compact and highly active next-generation libraries for CRISPR-mediated gene repression and activation. *eLife* 5 Published online September 23, 2016. 10.7554/eLife.19760.
- Huang W, Sherman BT, and Lempicki RA (2009). Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. *Nat. Protoc* 4, 44–57. [PubMed: 19131956]
- Jacinto E, Loewith R, Schmidt A, Lin S, Ruegg MA, Hall A, and Hall MN (2004). Mammalian TOR complex 2 controls the actin cytoskeleton and is rapamycin insensitive. *Nat. Cell Biol* 6, 1122–1128. [PubMed: 15467718]
- Johnson MA, Vidoni S, Durigon R, Pearce SF, Rorbach J, He J, Brea-Calvo G, Minczuk M, Reyes A, Holt IJ, and Spinazzola A (2014). Amino acid starvation has opposite effects on mitochondrial and cytosolic protein synthesis. *PLoS ONE* 9, e93597. [PubMed: 24718614]
- Karbowski M, and Youle RJ (2011). Regulating mitochondrial outer membrane proteins by ubiquitination and proteasomal degradation. *Curr. Opin. Cell Biol* 23, 476–482. [PubMed: 21705204]
- Kelleher DJ, Kreibich G, and Gilmore R (1992). Oligosaccharyltransferase activity is associated with a protein complex composed of ribophorins I and II and a 48 kd protein. *Cell* 69, 55–65. [PubMed: 1555242]
- Khaminets A, Heinrich T, Mari M, Grumati P, Huebner AK, Akutsu M, Liebmann L, Stolz A, Nietzsche S, Koch N, et al. (2015). Regulation of endoplasmic reticulum turnover by selective autophagy. *Nature* 522, 354–358. [PubMed: 26040720]
- Kim J, Kundu M, Viollet B, and Guan K-L (2011). AMPK and mTOR regulate autophagy through direct phosphorylation of Ulk1. *Nat. Cell Biol* 13, 132–141. [PubMed: 21258367]
- Komatsu M, Chiba T, Tatsumi K, Iemura S, Tanida I, Okazaki N, Ueno T, Kominami E, Natsume T, and Tanaka K (2004). A novel protein-conjugating system for Ufm1, a ubiquitin-fold modifier. *EMBO J.* 23, 1977–1986. [PubMed: 15071506]
- Kurth I, Pamminger T, Hennings JC, Soehendra D, Huebner AK, Roththier A, Baets J, Senderek J, Topaloglu H, Farrell SA, et al. (2009). Mutations in FAM134B, encoding a newly identified Golgi protein, cause severe sensory and autonomic neuropathy. *Nat. Genet* 41, 1179–1181. [PubMed: 19838196]
- Lake NJ, Compton AG, Rahman S, and Thorburn DR (2016). Leigh syndrome: One disorder, more than 75 monogenic causes. *Ann. Neurol* 79, 190–203. [PubMed: 26506407]
- Lemaire K, Moura RF, Granvik M, Igoillo-Esteve M, Hohmeier HE, Hendrickx N, Newgard CB, Waelkens E, Cnop M, and Schuit F (2011). Ubiquitin fold modifier 1 (UFM1) and its target UFBP1 protect pancreatic beta cells from ER stress-induced apoptosis. *PLoS ONE* 6, e18517. [PubMed: 21494687]
- Leto DE, Morgens DW, Zhang L, Walczak CP, Elias JE, Bassik MC, and Kopito RR (2019). Genome-wide CRISPR Analysis Identifies Substrate-Specific Conjugation Modules in ER-Associated Degradation. *Mol. Cell* 73, 377–389. [PubMed: 30581143]
- Li W, Xu H, Xiao T, Cong L, Love MI, Zhang F, Irizarry RA, Liu JS, Brown M, and Liu XS (2014). MAGECK enables robust identification of essential genes from genome-scale CRISPR/Cas9 knockout screens. *Genome Biol.* 15, 554. [PubMed: 25476604]
- Li W, Köster J, Xu H, Chen C-H, Xiao T, Liu JS, Brown M, and Liu XS (2015). Quality control, modeling, and visualization of CRISPR screens with MAGECK-VISPR. *Genome Biol.* 16, 281. [PubMed: 26673418]



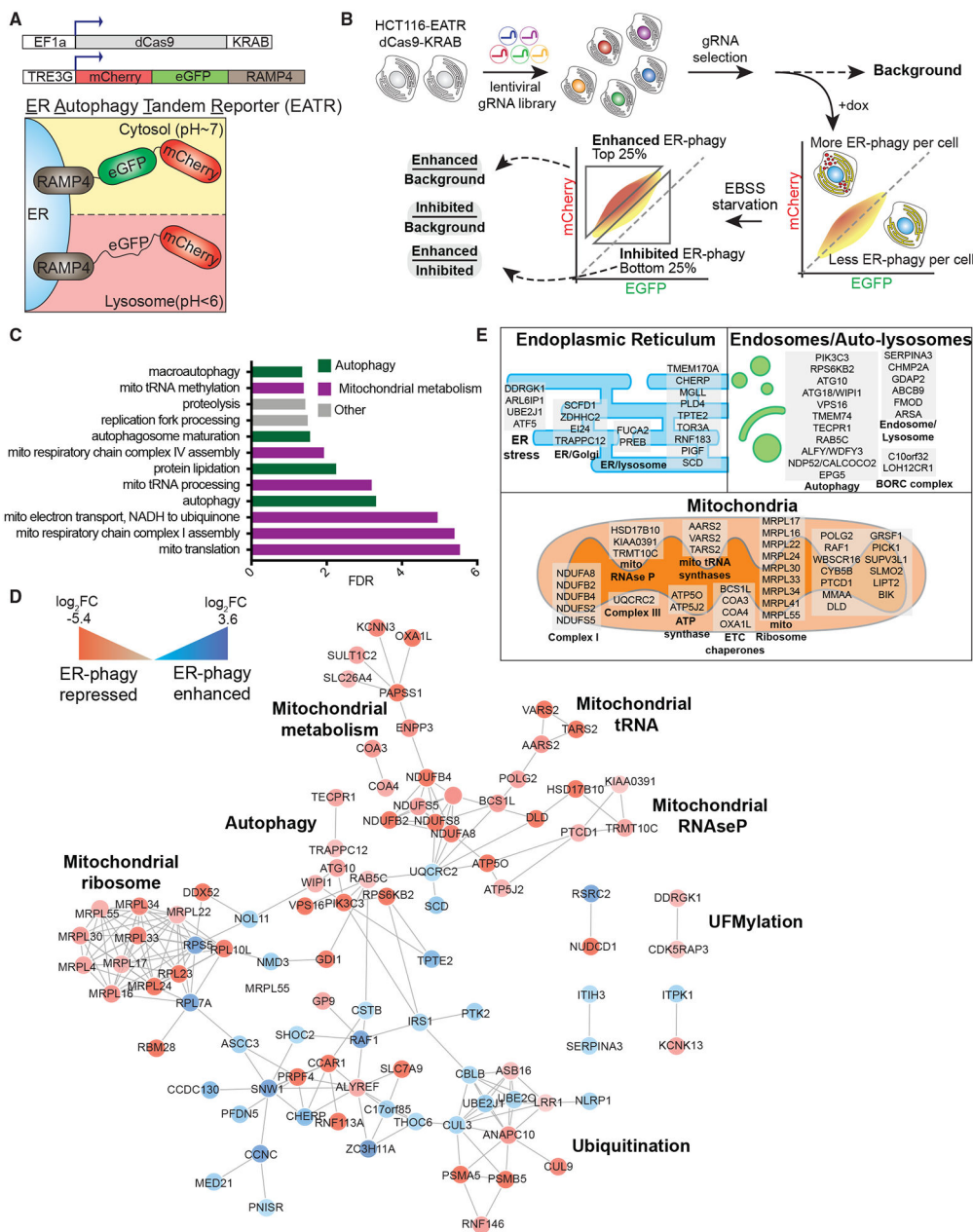
- Liang JR, Lingeman E, Ahmed S, and Corn JE (2018). Atlastins remodel the endoplasmic reticulum for selective autophagy. *J. Cell Biol* 217, 3354–3367. [PubMed: 30143524]
- Lingeman E, Jeans C, and Corn JE (2017). Production of purified casrnps for efficacious genome editing. *Curr. Protoc. Mol. Biol* 120, 31.10.1–31.10.19.
- Liu J, Wang Y, Song L, Zeng L, Yi W, Liu T, Chen H, Wang M, Ju Z, and Cong Y-S (2017). A critical role of DDRGK1 in endoplasmic reticulum homeostasis via regulation of IRE1a stability. *Nat. Commun* 8, 14186. [PubMed: 28128204]
- Lombardi AA, and Elrod JW (2017). Mediating ER-mitochondrial cross-talk. *Science* 358, 591–592. [PubMed: 29097535]
- Mader BJ, Pivtoraiko VN, Flippo HM, Klocke BJ, Roth KA, Mangieri LR, and Shacka JJ (2012). Rotenone inhibits autophagic flux prior to inducing cell death. *ACS Chem. Neurosci* 3, 1063–1072. [PubMed: 23259041]
- Mignon-Ravix C, Milh M, Kaiser CS, Daniel J, Riccardi F, Cacciagli P, Nagara M, Busa T, Liebau E, and Villard L (2018). Abnormal function of the UBA5 protein in a case of early developmental and epileptic encephalopathy with suppression-burst. *Hum. Mutat* 39, 934–938. [PubMed: 29663568]
- Milev MP, Grout ME, Saint-Dic D, Cheng Y-HH, Glass IA, Hale CJ, Hanna DS, Dorschner MO, Prematilake K, Shaag A, et al. (2017). Mutations in TRAPPC12 manifest in progressive childhood encephalopathy and golgi dysfunction. *Am. J. Hum. Genet* 101, 291–299. [PubMed: 28777934]
- Munro S, and Pelham HR (1987). A C-terminal signal prevents secretion of luminal ER proteins. *Cell* 48, 899–907. [PubMed: 3545499]
- Nahorski MS, Maddirevula S, Ishimura R, Alsahli S, Brady AF, Bege-mann A, Mizushima T, Guzmán-Vega FJ, Obata M, Ichimura Y, et al. (2018). Biallelic UFM1 and UFC1 mutations expand the essential role of ufmylation in brain development. *Brain* 141, 1934–1945. [PubMed: 29868776]
- Nguyen TN, Padman BS, and Lazarou M (2016). Deciphering the molecular signals of pink1/parkin mitophagy. *Trends Cell Biol*. 26, 733–744. [PubMed: 27291334]
- Nordgren M, Francisco T, Lismont C, Hennebel L, Brees C, Wang B, Van Veldhoven PP, Azevedo JE, and Fransen M (2015). Export-deficient monoubiquitinated PEX5 triggers peroxisome removal in SV40 large T antigen-transformed mouse embryonic fibroblasts. *Autophagy* 11, 1326–1340. [PubMed: 26086376]
- Novarino G, Fenstermaker AG, Zaki MS, Hofree M, Silhavy JL, Heiberg AD, Abdellateef M, Rosti B, Scott E, Mansour L, et al. (2014). Exome sequencing links corticospinal motor neuron disease to common neurodegenerative disorders. *Science* 343, 506–511. [PubMed: 24482476]
- Oikawa D, Kimata Y, Kohno K, and Iwawaki T (2009). Activation of mammalian IRE1 alpha upon ER stress depends on dissociation of BiP rather than on direct interaction with unfolded proteins. *Exp. Cell Res* 315, 2496–2504. [PubMed: 19538957]
- Olenych SG, Claxton NS, Ottenberg GK, and Davidson MW (2007). The fluorescent protein color palette. *Curr. Protoc. Cell Biol* Chapter 21, Unit 21.5.
- Ordureau A, Sarraf SA, Duda DM, Heo J-M, Jedrychowski MP, Sviderskiy VO, Olszewski JL, Koerber JT, Xie T, Beausoleil SA, et al. (2014). Quantitative proteomics reveal a feedforward mechanism for mitochondrial PARKIN translocation and ubiquitin chain synthesis. *Mol. Cell* 56, 360–375. [PubMed: 25284222]
- Phillips AR, Suttangkakul A, and Vierstra RD (2008). The ATG12-conjugating enzyme ATG10 Is essential for autophagic vesicle formation in *Arabidopsis thaliana*. *Genetics* 178, 1339–1353. [PubMed: 18245858]
- Pickrell AM, and Youle RJ (2015). The roles of PINK1, parkin, and mitochondrial fidelity in Parkinson's disease. *Neuron* 85, 257–273. [PubMed: 25611507]
- Pilsl A, and Winklhofer KF (2012). Parkin, PINK1 and mitochondrial integrity: emerging concepts of mitochondrial dysfunction in Parkinson's disease. *Acta Neuropathol.* 123, 173–188. [PubMed: 22057787]
- Qin B, Yu J, Newshean S, Wang M, Tu X, Liu T, Li H, Wang L, and Lou Z (2019). UFL1 promotes histone H4 ufmylation and ATM activation. *Nat. Commun* 10, 1242. [PubMed: 30886146]

- Rismanchi N, Soderblom C, Stadler J, Zhu P-P, and Blackstone C (2008). Atlastin GTPases are required for Golgi apparatus and ER morphogenesis. *Hum. Mol. Genet* 17, 1591–1604. [PubMed: 18270207]
- Ruggiano A, Foresti O, and Carvalho P (2014). Quality control: ER-associated degradation: protein quality control and beyond. *J. Cell Biol* 204, 869–879. [PubMed: 24637321]
- Schuck S, Prinz WA, Thorn KS, Voss C, and Walter P (2009). Membrane expansion alleviates endoplasmic reticulum stress independently of the unfolded protein response. *J. Cell Biol* 187, 525–536. [PubMed: 19948500]
- Schwarz DS, and Blower MD (2016). The endoplasmic reticulum: structure, function and response to cellular signaling. *Cell. Mol. Life Sci* 73, 79–94. [PubMed: 26433683]
- Shibata Y, Shemesh T, Prinz WA, Palazzo AF, Kozlov MM, and Rapoport TA (2010). Mechanisms determining the morphology of the peripheral ER. *Cell* 143, 774–788. [PubMed: 21111237]
- Simsek D, Tiu GC, Flynn RA, Byeon GW, Leppek K, Xu AF, Chang HY, and Barna M (2017). The Mammalian Ribo-interactome Reveals Ribosome Functional Diversity and Heterogeneity. *Cell* 169, 1051–1065. [PubMed: 28575669]
- Smith MD, Harley ME, Kemp AJ, Wills J, Lee M, Arends M, von Kriegsheim A, Behrends C, and Wilkinson S (2018). CCPG1 Is a Non-canonical Autophagy Cargo Receptor Essential for ER-Phagy and Pancreatic ER Proteostasis. *Dev. Cell* 44, 217–232. [PubMed: 29290589]
- Szklarczyk D, Franceschini A, Wyder S, Forslund K, Heller D, Huerta-Cepas J, Simonovic M, Roth A, Santos A, Tsafou KP, et al. (2015). STRING v10: protein-protein interaction networks, integrated over the tree of life. *Nucleic Acids Res.* 43, D447–D452. [PubMed: 25352553]
- Taanman J-W (1999). The mitochondrial genome: structure, transcription, translation and replication. *Biochim. Biophys. Acta* 1410, 103–123. [PubMed: 10076021]
- Tatsumi K, Sou YS, Tada N, Nakamura E, Iemura S, Natsume T, Kang SH, Chung CH, Kasahara M, Kominami E, et al. (2010). A novel type of E3 ligase for the Ufm1 conjugation system. *J. Biol. Chem* 285, 5417–5427. [PubMed: 20018847]
- Thoreen CC, and Sabatini DM (2009). Rapamycin inhibits mTORC1, but not completely. *Autophagy* 5, 725–726. [PubMed: 19395872]
- Thoreen CC, Kang SA, Chang JW, Liu Q, Zhang J, Gao Y, Reichling LJ, Sim T, Sabatini DM, and Gray NS (2009). An ATP-competitive mammalian target of rapamycin inhibitor reveals rapamycin-resistant functions of mTORC1. *J. Biol. Chem* 284, 8023–8032. [PubMed: 19150980]
- Toyama EQ, Herzig S, Courchet J, Lewis TL, Losón OC, Hellberg K, Young NP, Chen H, Polleux F, Chan DC, et al. (2016). Metabolism. AMP-activated protein kinase mediates mitochondrial fission in response to energy stress. *Science* 351, 275–281. [PubMed: 26816379]
- Tsao YS, Ivessa NE, Adesnik M, Sabatini DD, and Kreibich G (1992). Carboxy terminally truncated forms of ribophorin I are degraded in pre-Golgi compartments by a calcium-dependent process. *J. Cell Biol* 116, 57–67. [PubMed: 1730749]
- Walczak CP, Leto DE, Zhang L, Riepe C, Muller RY, DaRosa PA, Ingolia NT, Elias JE, and Kopito RR (2019). Ribosomal protein RPL26 is the principal target of UFMylation. *Proc. Natl. Acad. Sci. USA* 116, 1299–1308. [PubMed: 30626644]
- Wang X, Winter D, Ashrafi G, Schlehe J, Wong YL, Selkoe D, Rice S, Steen J, LaVoie MJ, and Schwarz TL (2011). PINK1 and Parkin target Miro for phosphorylation and degradation to arrest mitochondrial motility. *Cell* 147, 893–906. [PubMed: 22078885]
- Wang S, Tukachinsky H, Romano FB, and Rapoport TA (2016). Cooperation of the ER-shaping proteins atlastin, lunapark, and reticulons to generate a tubular membrane network. *eLife* 5 Published online September 13, 2016. 10.7554/eLife.18605.
- Wang Z, Gong Y, Peng B, Shi R, Fan D, Zhao H, Zhu M, Zhang H, Lou Z, Zhou J, et al. (2019). MRE11 UFMylation promotes ATM activation. *Nucleic Acids Res.* 47, 4124–4135. [PubMed: 30783677]
- Wang L, Xu Y, Rogers H, Saidi L, Noguchi CT, Li H, Yewdell JW, Guydosh NR, and Ye Y (2020). UFMylation of RPL26 links translocation-associated quality control to endoplasmic reticulum protein homeostasis. *Cell Res.* 30, 5–20. [PubMed: 31595041]

- Wartosch L, Günesdogan U, Graham SC, and Luzio JP (2015). Recruitment of VPS33A to HOPS by VPS16 Is Required for Lysosome Fusion with Endosomes and Autophagosomes. *Traffic* 16, 727–742. [PubMed: 25783203]
- Wei Y, and Xu X (2016). Ufm1ylation: A unique & fashionable modification for life. *Genomics Proteomics Bioinformatics* 14, 140–146. [PubMed: 27212118]
- Wilson CM, Kraft C, Duggan C, Ismail N, Crawshaw SG, and High S (2005). Ribophorin I associates with a subset of membrane proteins after their integration at the sec61 translocon. *J. Biol. Chem* 280, 4195–4206. [PubMed: 15556939]
- Wu J, Lei G, Mei M, Tang Y, and Li H (2010). A novel C53/LZAP-interacting protein regulates stability of C53/LZAP and DDRGK domain-containing Protein 1 (DDRGK1) and modulates NF- $\kappa$ B signaling. *J. Biol. Chem* 285, 15126–15136. [PubMed: 20228063]
- Xiao B, Deng X, Zhou W, and Tan E-K (2016). Flow Cytometry-Based Assessment of Mitophagy Using MitoTracker. *Front. Cell. Neurosci* 10, 76.
- Yamano K, Fogel AI, Wang C, van der Blik AM, and Youle RJ (2014). Mitochondrial Rab GAPs govern autophagosome biogenesis during mitophagy. *eLife* 3 Published online February 25, 2014 10.7554/eLife.01612.
- Yan A, and Lennarz WJ (2005). Two oligosaccharyl transferase complexes exist in yeast and associate with two different translocons. *Glycobiology* 15, 1407–1415. [PubMed: 16096345]
- Yoo HM, Kang SH, Kim JY, Lee JE, Seong MW, Lee SW, Ka SH, Sou Y-S, Komatsu M, Tanaka K, et al. (2014). Modification of ASC1 by UFM1 is crucial for ER $\alpha$  transactivation and breast cancer development. *Mol. Cell* 56, 261–274. [PubMed: 25219498]
- Youle RJ, and Narendra DP (2011). Mechanisms of mitophagy. *Nat. Rev. Mol. Cell Biol* 12, 9–14. [PubMed: 21179058]
- Yuan H-X, Russell RC, and Guan K-L (2013). Regulation of PIK3C3/VPS34 complexes by MTOR in nutrient stress-induced autophagy. *Autophagy* 9, 1983–1995. [PubMed: 24013218]
- Zhang J, Tripathi DN, Jing J, Alexander A, Kim J, Powell RT, Dere R, Tait-Mulder J, Lee J-H, Paull TT, et al. (2015a). ATM functions at the peroxisome to induce pexophagy in response to ROS. *Nat. Cell Biol* 17, 1259–1269. [PubMed: 26344566]
- Zhang M, Zhu X, Zhang Y, Cai Y, Chen J, Sivaprakasam S, Gurav A, Pi W, Makala L, Wu J, et al. (2015b). RCAD/Ufl1, a Ufm1 E3 ligase, is essential for hematopoietic stem cell function and murine hematopoiesis. *Cell Death Differ.* 22, 1922–1934. [PubMed: 25952549]
- Zhao G, Zhu P-P, Renvoisé B, Maldonado-Báez L, Park SH, and Blackstone C (2016). Mammalian knock out cells reveal prominent roles for atlastin GTPases in ER network morphology. *Exp. Cell Res* 349, 32–44. [PubMed: 27669642]
- Zhu H, Bhatt B, Sivaprakasam S, Cai Y, Liu S, Kodeboyina SK, Patel N, Savage NM, Sharma A, Kaufman RJ, et al. (2019). Ufbp1 promotes plasma cell development and ER expansion by modulating distinct branches of UPR. *Nat. Commun* 10, 1084. [PubMed: 30842412]

### Highlights

- Genome-wide CRISPRi screen identifies 200 high-confidence ER-phagy regulators
- Disruption of mitochondrial OXPHOS system inhibits ER-phagy
- ER-resident UFMylation mediates autophagy of the ER sheets



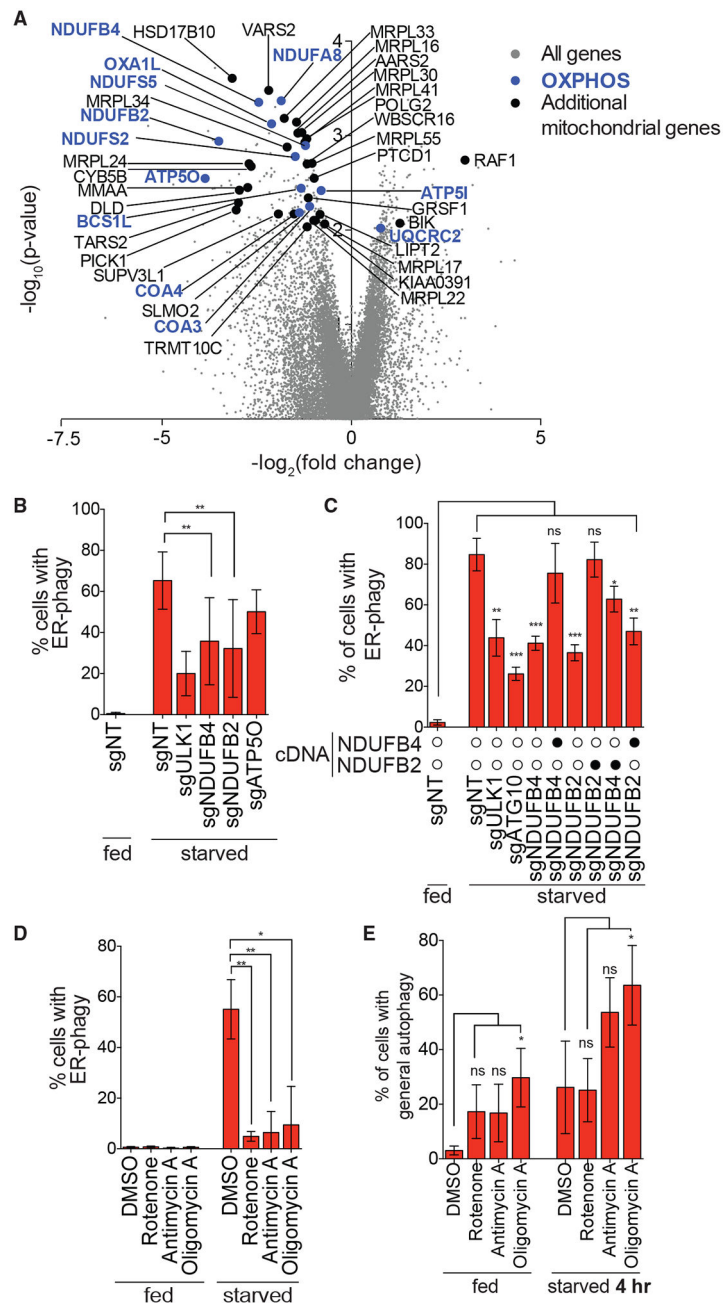
**Figure 1. Unbiased Identification of ER-Phagy Regulators by Genome-wide CRISPRi Screening** (A) Schematic of the ER Autophagy Tandem Reporter (EATR) and CRISPR inhibition (CRISPRi) system used for screening. HCT116 cells stably express a doxycycline-inducible EATR construct that consists of mCherry and eGFP fused to ER localized RAMP4. Cells also stably express dCas9-KRAB for sgRNA-targeted transcriptional repression. (B) FACS screening strategy to identify genes whose knockdown enhances or inhibits ER-phagy. HCT116 cells described in (A) are transduced with a genome-wide lentiviral CRISPRi gRNA library. After selection for gRNA expression and removal of essential genes, doxycycline was added to express EATR. Cells were then starved in EBSS for 16 h to induce ER-phagy. The top and bottom quartiles correspond to enhanced and inhibited ER-

phagy, respectively. Cells were sorted and processed for next-generation sequencing to identify gRNA representation in each sort bin.

(C) Gene ontology analysis identifies autophagy and mitochondrial metabolism as major signatures of ER-phagy. High-confidence ER-phagy genes were defined as having opposite phenotypes in the enhanced and inhibited sort gates and gene level  $p < 0.01$ . Ontologies with Benjamini-Hochberg false discovery rate (FDR)  $< 0.05$  are shown.

(D) Genes involved in ER-phagy form a physical interaction network. For clarity, only interactions between two or more high-confidence hits are shown. Red and blue circles represent genes whose knockdown represses and enhances ER-phagy, respectively.

(E) Subcellular classification of high-confidence ER-phagy genes highlights roles in the ER, auto-lysosomes, and mitochondria. See also Figure S1.



### Figure 2. Intact OXPHOS Promotes ER-phagy

(A) Genes that are components of the OXPHOS pathway were top hits in screen (highlighted in blue). Additional mitochondria-related genes are indicated in black and all other targeting sgRNAs are indicated in gray.

(B) Knockdown of NDUFB4 and NDUFB2 significantly inhibit ER-phagy. HCT116 CRISPRi EATR cells were transduced with sgRNAs targeting ULK1, NDUFB4, NDUFB2, or ATP50 and starved for 16 h before FACS measurement for ER-phagy. Data are presented as mean  $\pm$  SD of eight biological replicates.

(C) Re-expression of cognate cDNA of each OXPHOS gene rescues ER-phagy. HCT116 CRISPRi EATR cells were transduced with NDUFB4 or NDUFB2 cDNA constructs and

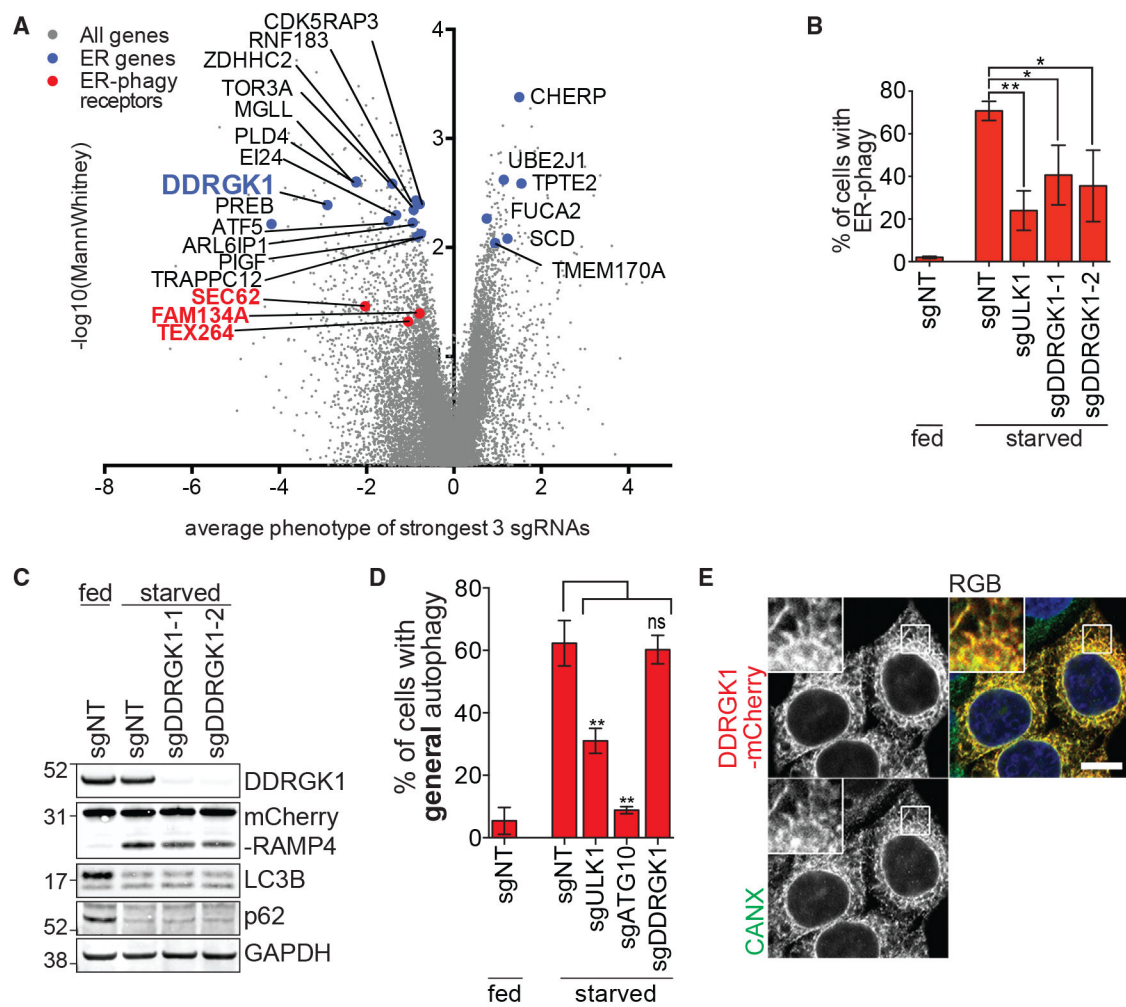
then transduced with the indicated sgRNAs. Cells were starved for 16 h before FACS measurement for ER-phagy. Data are presented as mean  $\pm$  SD of three biological replicates.

(D) Small-molecule inhibitors of the different OXPHOS compartments phenocopy the effect of genetic inhibitions. HCT116 EATR cells were treated with rotenone, antimycin A, or oligomycin A and starved for 16 h before FACS measurement of ER-phagy. Data are presented as mean  $\pm$  SD of three biological replicates.

(E) General autophagy proceeds in cells where NDUFB2, NDUFB4, or ATP5O are knocked down. HCT116 CRISPRi cells expressing mCherryGFP-LC3B were transduced with the indicated sgRNAs. Cells were starved for 4 h before FACS measurement for general autophagy. Data represent mean  $\pm$  SD of four biological replicates.

See also Figures S2 and S3.





### Figure 3. DDRGK1 Specifically Regulates ER-phagy

(A) ER-phagy CRISPRi screen identifies genes that are associated with the ER. Previously reported ER-phagy regulators are highlighted in red. DDRGK1 is highlighted in blue.

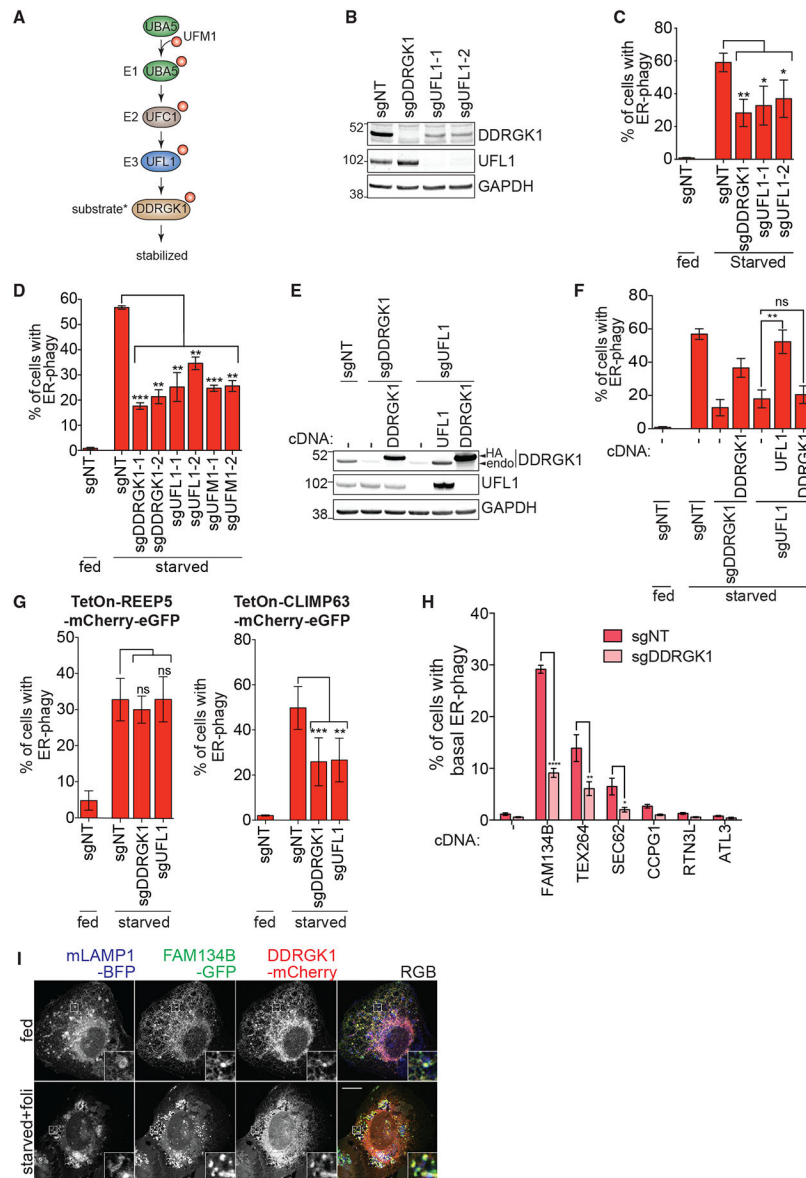
(B) DDRGK1 depletion results in inhibition of ER-phagy. HCT116 CRISPRi EATR cells were transduced with sgRNAs targeting ULK1 or DDRGK1 and starved for 16 h before FACS measurement for ER-phagy. Data are presented as mean  $\pm$  SD of three biological replicates.

(C) DDRGK1 specifically inhibits ER-phagy but not general autophagy. HCT116 CRISPRi CCER cells were transduced with sgRNAs targeting DDRGK1 and starved for 16 h. Cells were lysed for western blotting of the indicated proteins.

(D) HCT116 CRISPRi cells stably expressing mCherry-eGFP-LC3B constructs were transduced with sgRNAs targeting either ULK1, ATG10, or DDRGK1. Cells were starved for 16 h before FACS measurement for general autophagy.

(E) DDRGK1 localizes to the ER. HeLa cells were stably transduced with DDRGK1-mCherry construct and immunostained for calnexin (CANX) as an ER marker. Insets represent a 3-fold enlargement of boxed areas. Scale bar represents 10  $\mu\text{m}$ .

See also Figure S4.



#### Figure 4. DDRGK1-Dependent UFMylation Regulates Autophagy of ER Sheets

(A) Schematic of the three-step enzymatic reaction of the UFMylation cascade. UBA5 (E1) activate UFM1 and UFC1 acts as an E2 enzyme that interacts with the E3 ligase, UFL1. UFL1 recognizes and transfer UFM1 from UFC1 to its target substrate. Asterisk indicates that DDRGK1 is reported as a substrate of UFMylation in the literature.

(B) UFL1 knockdown reduces DDRGK1 protein levels. HCT116 CRISPRi cells were transduced with the indicated sgRNAs and then harvested to immunoblot for UFL1 protein levels.

(C) UFL1 knockdown phenocopies DDRGK1 knockdown during ER-phagy. The cells generated in (B) were starved for 16 h before FACS measurement for ER-phagy.

(D) UFMylation components are required for ER-phagy. HCT116 CRISPRi EATR cells expressing the indicated sgRNAs were starved for 16 h before FACS measurement for ER-phagy.

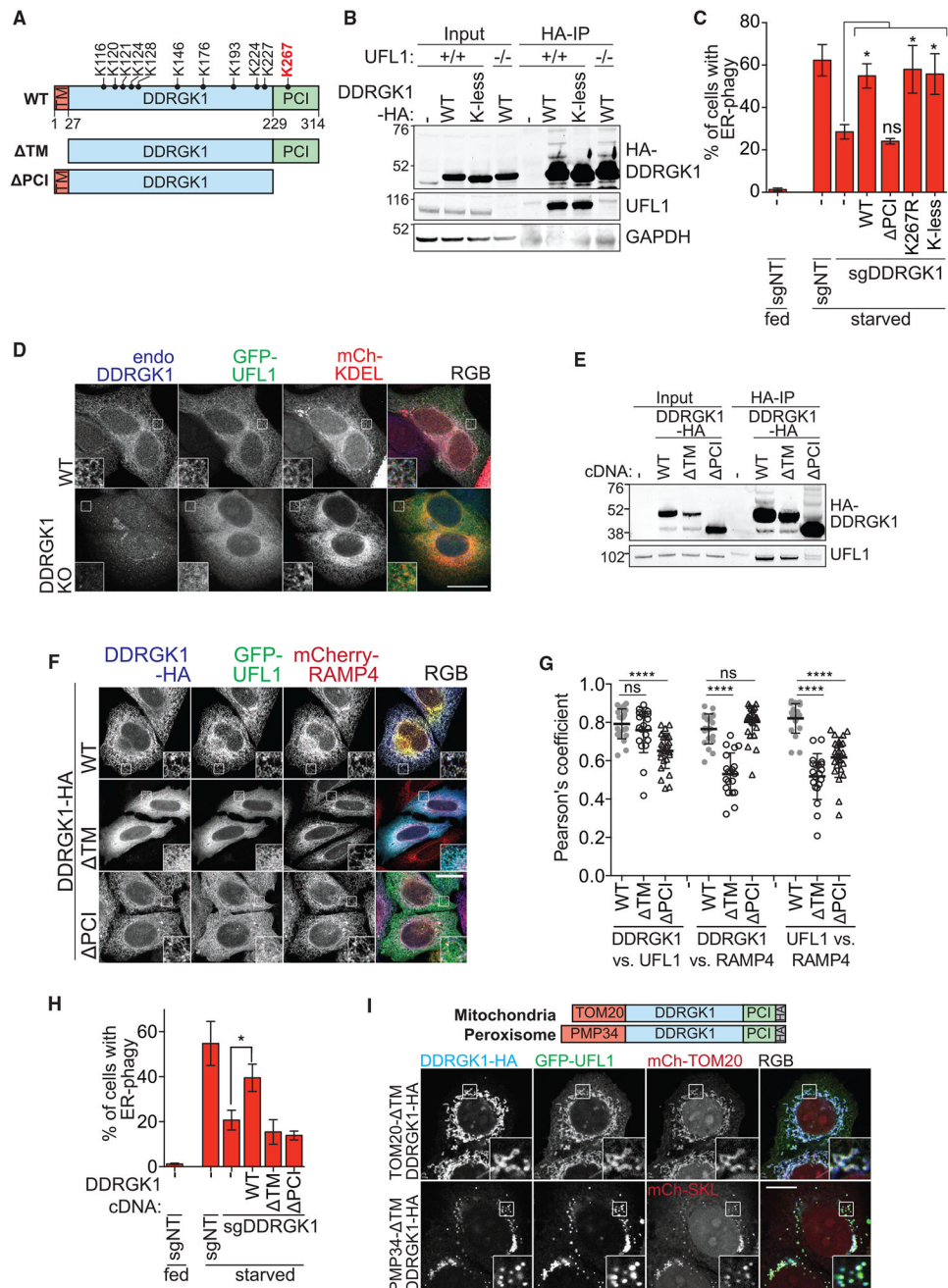
(E) UFL1 controls DDRGK1 protein levels. HCT116 CRISPRi cells were transduced with the indicated sgRNAs and further transduced with either DDRGK1-HA or HA-UFL1. Cell lysates were immunoblotted for DDRGK1 and UFL1.

(F) Re-expression of DDRGK1 in UFL1 knockdown cells does not rescue ER-phagy. The cells generated in (E) were starved for 16 h and then subjected to FACS measurement for ER-phagy. Data represent mean  $\pm$  SD of three biological replicates.

(G) DDRGK1 selectively mediates ER sheets degradation. The RAMP4 in EATR system was replaced with either REEP5 (ER tubule marker) or CLIMP63 (ER sheets). The cells were transduced with the indicated sgRNAs and were starved for 16 h before FACS analysis for ER-phagy progression. Data represent mean  $\pm$  SD of three biological replicates.

(H) DDRGK1 depletion selectively affect FAM134B, TEX264, and SEC62-mediated ER-phagy. HCT116 CRISPRi EATR cells were stably transduced with the cDNA for the indicated ER-phagy receptors. ER-phagy induced by overexpression of the ER-phagy receptors at basal state was measured by FACS analysis. Data represent mean  $\pm$  SD of three biological replicates.

(I) DDRGK1 colocalizes with FAM134B and is co-degraded with FAM134B. U2OS cells stably expressing GFP-FAM134B were transiently transfected with mLAMP1-BFP and DDRGK1-mCherry. Cells were then starved for 4 h in the presence of 50 nM folimycin. Scale bar represents 10  $\mu$ m. Insets represent a 4-fold enlargement of the boxed area. See also Figure S4.



**Figure 5. DDRGK1 Recruits UFL1 to the ER Surface via the PCI Domain**

(A) Schematic of DDRGK1 domains and its conserved lysine residues. The reported major lysine residue for UFMylation (K267) is labeled in red. The two truncated forms of DDRGK1 that either lacks the N-terminal transmembrane domain (  $\Delta$ TM) or the C-terminal proteasome component domain (  $\Delta$ PCI) are also shown.

(B) Post-translational modification of DDRGK1 occurs on lysine residues. Parental or UFL1 knockout HCT116 cells were transfected with either wild-type (WT) or lysine-less (K-less) DDRGK1-HA constructs. Cells were harvested for HA immunoprecipitation.

(C) DDRGK1's role during ER-phagy does not require post-translational modification on any lysine residue. HCT116 CRISPRi EATR cells were transduced with DDRGK1 sgRNA and then rescued using the indicated DDRGK1-HA mutant constructs. Cells were starved for 16 h before FACS ER-phagy measurement. Data represent mean  $\pm$  SD of three biological replicates.

(D) Loss of DDRGK1 relocalizes UFL1 to the cytoplasm. Wild-type or DDRGK1KO HeLa cells were transiently transfected with GFP-UFL1 and mCherry-KDEL for 48 h. Cells were then fixed and immunostained for endogenous DDRGK1. Insets represent a 3-fold enlargement of boxed areas. Scale bar represents 20  $\mu$ m.

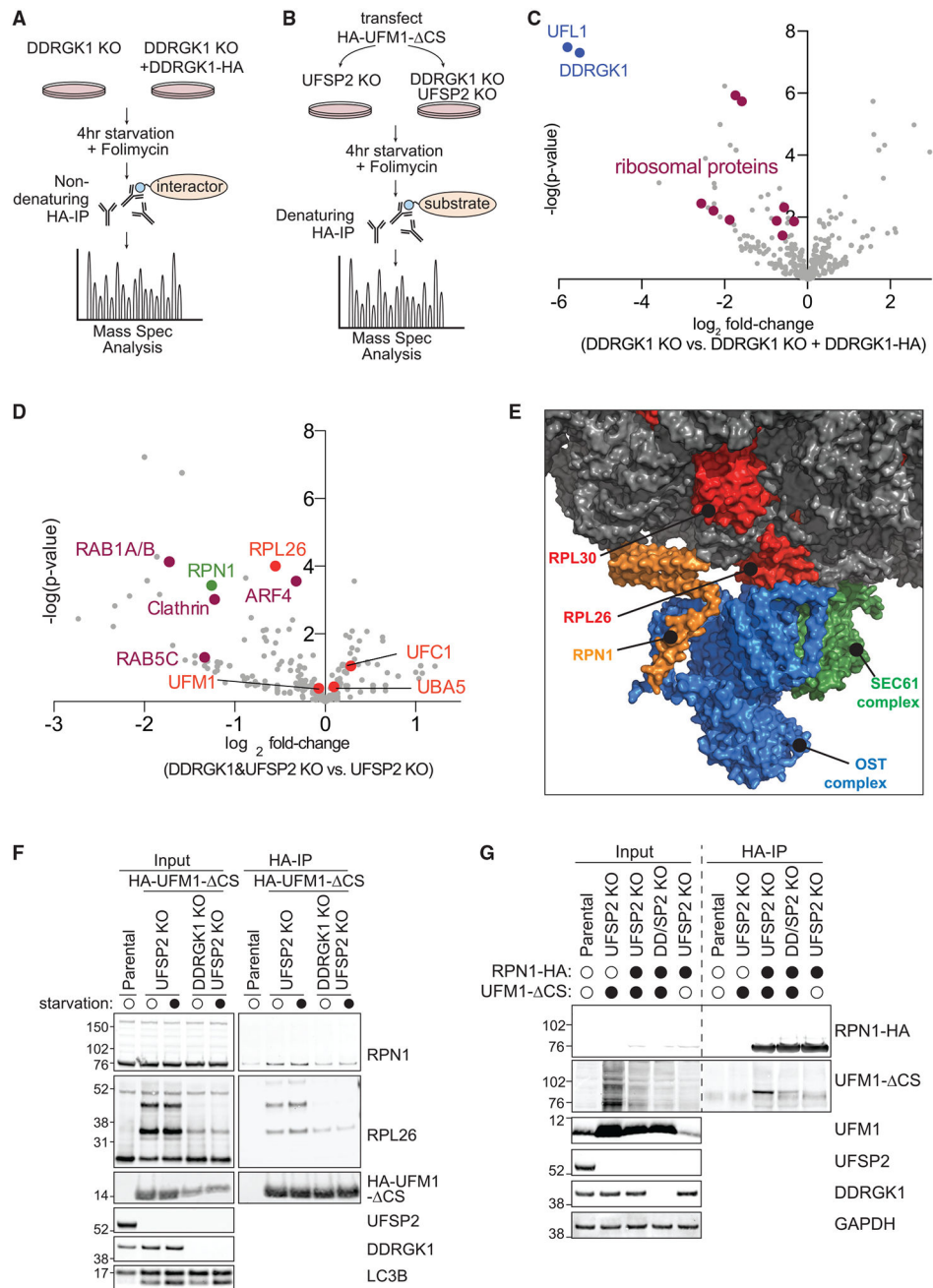
(E) DDRGK1 interacts with UFL1 via its PCI domain. Parental HCT116 cells were stably transfected with the indicated DDRGK1-HA mutant constructs. Cells were then harvested for HA immunoprecipitation.

(F) DDRGK1 recruits UFL1 to the ER. DDRGK1KO HeLa cells were stably transduced with mCherry-RAMP4 (ER marker) and the indicated DDRGK1-HA mutant constructs. Cells were then transiently transfected with GFP-UFL1 for 24 h. Cells were then fixed and immunostained for HA epitope. Representative images are shown. Insets represent a 3-fold enlargement of boxed areas. Scale bar represents 10  $\mu$ m.

(G) Pearson's correlation coefficient for (F) was measured between DDRGK1 versus UFL1, DDRGK1 versus RAMP4, and UFL1 versus RAMP4. Data were generated from one biological experiment, and 20–26 cells were analyzed from each condition.

(H) DDRGK1's role during ER-phagy requires both the SP and PCI domains. HCT116 CRISPRi EATR cells with DDRGK1 knockdown were rescued using the indicated DDRGK1-HA mutant constructs. Cells were then starved for 16 h and ER-phagy was measured by FACS analysis. Data represent mean  $\pm$  SD of three biological replicates.

(I) DDRGK1's determines the subcellular localization of UFL1. DDRGK1 knockout HeLa cells were stably transduced with either TOM20MTS-DDRGK1-dSP-HA (MTS, mitochondrial targeting signal) or PMP34-DDRGK1-dSP-HA and transiently transfected with GFP-UFL1 and the respective mCherry-organelle constructs. Insets represent a 3-fold enlargement of boxed areas. Scale bar represents 10  $\mu$ m. See also Figure S5.



**Figure 6. DDRGK1 Mediates UFMylation of ER Surface Proteins**

(A) Workflow of mass spectrometry identification of DDRGK1 interactome. DDRGK1 KO HEK293T cells ± DDRGK1-HA stable expression were starved for 4 h in the presence of 50 nM folimycin. Cell lysates were harvested for HA immunoprecipitation and mass spectrometry identification of co-immunoprecipitated proteins.

(B) Workflow of mass spectrometry identification of DDRGK1-dependent UFMylation substrates. UFSP2 KO or DDRGK1 and UFSP2 double-knockout (KO) HEK293T cells were transfected with HA-UFM1-ΔCS for 48 h. Cells were starved for 4 h in the presence of 50

nM folimycin. The cells were then lysed and denatured prior to HA immunoprecipitation and mass spectrometry identification of UFMylated proteins.

(C) DDRGK1 interacts with several ribosomal subunit proteins. The volcano plot depicts the log<sub>2</sub> fold change of the total peptide count of each identified protein between Ctrl (DDRGK1KO) cells and DDRGK1-HA-expressing cells.

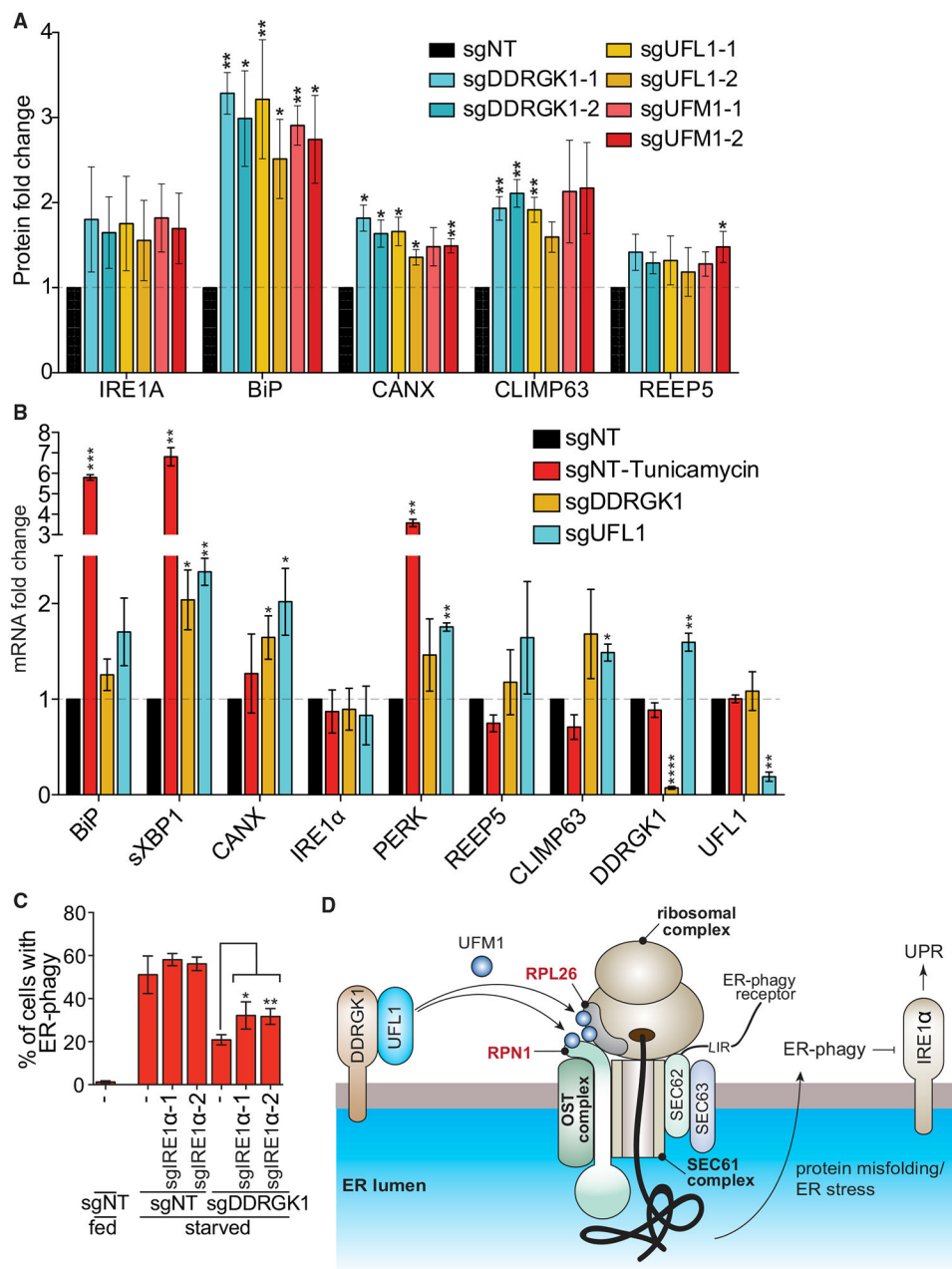
(D) Selective enrichment of UFMylated proteins in UFSP2KO cells relative to DDRGK1 and UFSP2 double-KO cells. The volcano plot depicts the log<sub>2</sub> fold change of the total peptide count of each identified protein between DDRGK1 and UFSP2 KO versus UFSP2KO cells.

(E) RPN1 is structurally in close proximity with RPL26. Structural model of the ribosome, oligosaccharide transferase (OST), and SEC61 complex generated from Protein Data Bank deposition 6FTG using PyMol (Braunger et al., 2018). RPN1 (orange) is part of the ER-localized OST complex (blue), whereas RPL26 (red) is a component of the large 60S ribosomal subunit (gray). The OST complex and the ribosome are also closely associated with the SEC61 translocon complex (green).

(F) RPL26 and RPN1 are both UFMylated in a DDRGK1-dependent manner. The same experimental setup as in (B) was performed to probe for the indicated proteins. Note that the size shift corresponding to UFMylated RPN1 is not obvious due to the use of MES buffer that better resolves smaller molecular weight proteins, in this case, RPL26.

(G) Reverse immunoprecipitation of RPN1-HA showed DDRGK1-dependent UFMylation of RPN1. The same cell lines as in (B) were transfected with the indicated combinations of RPN1-HA and/or UFM1- CS for 24 h. Cells were then lysed for immunoprecipitation of HA epitope. Samples were resolved using MOPS buffer for better molecular weight separation between unmodified and UFMylated RPN1 proteins.

See also Figure S6.



**Figure 7. UFMylation-Mediated ER-phagy Represses IRE1 $\alpha$  UPR**

(A) Dysregulation of UFMylation results in upregulation of UPR. HCT116 cells were transduced with the indicated sgRNAs and harvested for western blotting analysis. The graph represents densitometry measurement of the indicated proteins upon sgRNA knockdown. A representative blot is shown in Figure S7B. Data represent mean  $\pm$  SD of three biological replicates.

(B) Dysregulation of UFMylation transcriptionally upregulates UPR markers except IRE1  $\alpha$ . HCT116 CRISPRi cells were transduced with the indicated sgRNAs. Tunicamycin (0.5  $\mu$ g/mL; 4 h) was used as a positive control for ER stress. Cells were harvested for qRT-PCR



measurement of the indicated ER or UPR genes. Data represent mean  $\pm$  SD of three biological replicates.

(C) Knockdown of IRE1 $\alpha$  partially restores ER-phagy in DDRGK1-depleted cells. HCT116 CRISPRi EATR cells transduced with the indicated sgRNAs and starved for 16 h before FACS measurement for ER-phagy. Data represent mean  $\pm$  SD of three biological replicates.

(D) Proposed model for the role of UFMylation during ER-phagy. DDRGK1 acts as an ER surface adaptor that recruits UFL1. At least two ER surface proteins that are in close proximity, RPN1 and RPL26, are UFMylated during ER-phagy. Dysregulation of UFMylation inhibits ER-phagy, and this potentially results in accumulation of ER stress and subsequently activates the IRE1  $\alpha$ -mediated unfolded protein response pathway.

See also Figure S7.

## KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
ACC (Acetyl-CoA Carboxylase)	Cell Signaling	Cat#: 3676; RRID: AB_2219397
Actin	Cell Signaling	Cat#: 3700; RRID: AB_2242334
AMPKa	Cell Signaling	Cat#: 5831; RRID: AB_10622186
ATG10	MBL International	Cat#: M151-3; RRID: AB_1278755
ATP5O	Abcam	Cat#: ab110276; RRID: AB_10887942
BiP	Cell Signaling	Cat#: 3177; RRID: AB_2119845
Calnexin (CANX)	Cell Signaling	Cat#: 2679; RRID: AB_2228381
Calnexin (CANX)	Santa Cruz	Cat#: sc-46669; RRID: AB_626784
CKAP4/ CLIMP63	Bethyl	Cat#: A302-257A; RRID: AB_1731083
DDRKG1	ProteinTech	Cat#: 21445-1-AP; RRID: AB_2827383
GAPDH	Cell Signaling	Cat#: #97166; RRID: AB_2756824
GFP	Abcam	Cat#: ab6556; RRID: AB_305564
GFP	Santa Cruz	Cat#: sc-9996; RRID: AB_627695
GST	Cell Signaling	Cat#: 2625; RRID: AB_490796
Ha epitope tag	Cell Signaling	Cat#: 3724; RRID: AB_1549585
IRE1a	Cell Signaling	Cat#: 3294; RRID: AB_823545
LC3B	Novus Biologicals	Cat#: NB100-2220
mCherry	Abcam	Cat#: ab183628; RRID: AB_2650480
MFN1	Cell Signaling	Cat#: 14739; RRID: AB_2744531
MFN2	Cell Signaling	Cat#: 11925; RRID: AB_2750893
NDUFB2	Abcam	Cat#: ab186748; RRID: AB_2827382
NDUFB4	Abcam	Cat#: ab110243; RRID: AB_10890994
p62	Santa Cruz	Cat#: sc-28359; RRID: AB_628279
pACC S79	Cell Signaling	Cat#: 11818; RRID: AB_2687505
PERK	Cell Signaling	Cat#: 3192; RRID: AB_2095847
pRaptor S792	Cell Signaling	Cat#: 2083; RRID: AB_2249475
pS6K T389	Cell Signaling	Cat#: 9206; RRID: AB_2285392
pULK1 S555	Cell Signaling	Cat#: 5869; RRID: AB_10707365
Raptor	Cell Signaling	Cat#: 2280; RRID: AB_561245
REEP5	ProteinTech	Cat#: 14643-1-AP; RRID: AB_2178440
S6K (p70 S6 Kinase)	Cell Signaling	Cat#: 9202; RRID: AB_331676
TOM20	Sigma	Cat#: HPA011562; RRID: AB_1080326
UFL1	Novus Biologicals	Cat#: NBP1-90691; RRID: AB_11040102
UFM1	Abcam	Cat#: ab109305; RRID: AB_10864675
ULK1	Cell Signaling	Cat#: #8054; RRID: AB_11178668
UFSP2 (G-11)	Santa Cruz	Cat#: sc-376084; RRID: AB_10989729
RPL26	Abcam	Cat#: ab59567; RRID: AB_945306
Ribophorin1 (RPN1)	ThermoFisher	Cat#: PA5-27562; RRID: AB_2545038
IRDye 800CW Goat anti-Rabbit IgG H <sup>+</sup> L	LI-COR	925-32211; RRID: AB_2651127

REAGENT or RESOURCE	SOURCE	IDENTIFIER
IRDye 680 RD Goat anti-Mouse IgG H <sup>+</sup> L	LI-COR	926-68070; RRID: AB_10956588
Chemicals, Peptides and Recombinant Proteins		
Torin1	CST	Cat#: 14379S
Rapamycin	Sigma	Cat#: R8781
tonicamycin	Sigma	Cat#: T7765
Thapsigargin	Sigma	Cat#: T9033
CCCP	Sigma	Cat#: C2759
Rotenone	Sigma	Cat#: R8875
Oligomycin A	Sigma	Cat#: 75351
antimycin A	Sigma	Cat#: A8674
Folimycin	Milipore	Cat#: 344085
Epoxomycin	Milipore	Cat#: 324800
EBSS	ThermoFisher	Cat#: 24010043
Critical Commercial Assays		
Seahorse XF Cell Mito Stress Test Kit	Agilent	Cat#: 103015-100
Cell Titer-Glo 2.0 Cell Viability Assay	Promega	Cat#: G9241
Pierce anti-HA magnetic beads	ThermoFisher Scientific	Cat#: 88836
Deposited Data		
CRISPRi screen data (pilot autophagy gene screen and genome-wide screen)	NCBI-SRA	PRJNA599329
Experimental Models: Cell Lines		
HCT116 CRISPRi	Liang et al., 2018	N/A
HCT116 CRISPRi mCherry-eGFP-RAMP4 (EATR)	Liang et al., 2018	N/A
HCT116 CRISPRi mcherry-RAMP4 (CCER)	Liang et al., 2018	N/A
HCT116 CRISPRi REEP5-mCherry-eGFP	This study	N/A
HCT116 CRISPRi CLIMP63-mCherry-eGFP	This study	N/A
HCT116 mCherry-KDEL	This study	N/A
HEK293T UFSP2 KO	This study	N/A
HEK293T UFSP2 and DDRGK1 double KO	This study	N/A
HCT116 AMPK KO	This study	N/A
HeLa DDRGK1 KO	This study	N/A
Oligonucleotides		
shNon-targeting sequence- CCTAAGGTTAAGTCGCCCTCG	Liang et al., 2018	N/A
shDDRGK1 sequence - GGCTCTGCTAGTCGGCTTTAT	This study	N/A
shUFL1 sequence - GCTTCTTTACTCTGTGCTTGA	Zhang et al., 2015b	N/A
Protospacer sequences for all CRISPR KO or CRISPRi experiments		See Table S5
qPCR primer sequences		See Table S6
Recombinant DNA		
For more recombinant DNA data, see also Table S6	This study	N/A
pEF1a-dCas9-HA-BFP-KRAB-NLS	Liang et al., 2018	Addgene 102244
TetOn-mCherry-eGFP-RAMP4	Liang et al., 2018	Addgene109014

REAGENT or RESOURCE	SOURCE	IDENTIFIER
pLenti-X1-Hygro-mCherry-RAMP4	Liang et al., 2018	Addgene 118391
mCherry-mito-7	Olenych et al., 2007	Addgene 55102
mCherry-ER-3	Olenych et al., 2007	Addgene 55041
mCherry-Peroxisomes-2	Olenych et al., 2007	Addgene 54520
pRK5-rLAMP1-BFP	This study	LAMP1 from <i>Rattus norvegicus</i> subcloned from Addgene 55073
pLenti-X1-Neo-NDUFB4	This study	Addgene 139840
pLenti-X1-Neo-NDUFB2	This study	Addgene 139841
pLenti-X1-Neo-ATP5O	This study	Addgene139842
pLenti-XI-Neo-GST-Constitutively Active AMPK	Egan et al., 2011	Addgene139843
pLenti-XI-Neo-GST- AMPK- Kinase Dead (K to R)	This study	Addgene 139844
pBMN-YFP-Parkin	Yamano et al., 2014	Addgene 59416
pLenti-X1-Neo-DDRGK1-WT-HA	This study	Addgene 139845
pLenti-X1-Neo-DDRGK1-dTM-HA	This study	Addgene 139846
pLenti-X1-Neo-DDRGK1-dPCI-HA	This study	Addgene 139847
pLenti-X1-Neo-DDRGK1-K267R-HA	This study	Addgene139848
pLenti-X1-Neo-DDRGK1-K-less-HA	This study	Addgene 139849, with K116, K120, K121, K124, K128, K146, K176, K193, K224 & K227 mutated to R
pLenti-X1-Neo-DDRGK1-K116R-HA	This study	Addgene139850
pLenti-X1-Neo-DDRGK1-K120R-HA	This study	Addgene139851
pLenti-X1-Neo-DDRGK1-K121R-HA	This study	Addgene 139852
pLenti-X1-Neo-DDRGK1-K124R-HA	This study	Addgene139853
pLenti-X1-Neo-DDRGK1-K128R-HA	This study	Addgene139854
pLenti-X1-Neo-DDRGK1-K146R-HA	This study	Addgene139855
pLenti-X1-Neo-DDRGK1-K176R-HA	This study	Addgene139856
pLenti-X1-Neo-DDRGK1-K193R-HA	This study	Addgene139857
pLenti-X1-Neo-DDRGK1-K224R-HA	This study	Addgene139858
pLenti-X1-Neo-DDRGK1-K227R-HA	This study	Addgene139859
pLenti-X1-Neo-HA-UFL1	This study	Addgene139860
pQCXIN- myc ULK1 wt	Egan et al., 2011	Addgene 27626
pLenti-X1-Neo-TOM20MTS-DDRGK1-dTM-HA	This study	Addgene 139861
pLenti-X1-Neo-PMP34-DDRGK1-dTM-HA	This study	Addgene 139862
pLenti-X1-Neo-HA-UFL1-RAMP4	This study	Addgene139863
pRK5-HA-UFM1-dCS	This study	Addgene 139869
prk5-UFM1-dCS-no tag	This study	cDNA of HCT116 cells, NM_016617.4, deleted C-terminal a.a.84–85
TetOn-REEP5-mCherry-eGFP	This study	Addgene 139870
TetOn-CLIMP63-mCherry-eGFP	This study	Addgene139871
pLenti-X1-Neo-HA-FAM134B	This study	subcloned from Addgene 109026
pLenti-X1-Neo-HA-RTN3L	This study	Addgene139864
pLenti-X1-Neo-HA-SEC62	This study	Addgene139865
pLenti-X1-Neo-HA-ATL3	This study	subcloned from Addgene 109024
pLenti-X1-Neo-TEX264-HA	This study	Addgene139866

REAGENT or RESOURCE	SOURCE	IDENTIFIER
pLenti-X1-Neo-HA-CCPG1	This study	Addgene139867
pLenti-X1-Neo-mCherry-FAM134B	This study	subcloned from Addgene 109026
pLenti-X1-Neo-mCherry-RTN3L	This study	cDNA of HCT116 cells, NM_001265589.1
pLenti-X1-Neo-mCherry-SEC62	This study	cDNA of HCT116 cells, NM_003262.4
pLenti-X1-Neo-mCherry-ATL3	This study	subcloned from Addgene 109024
pLenti-X1-Neo-TEX264-mCherry	This study	cDNA of HCT116 cells, NM_015926.6
pLenti-X1-Neo-mCherry-CCPG1	This study	cDNA of HCT116 cells, NM_001204450.1
pLenti-X1-Neo-RPN1-HA	This study	cDNA of HCT116 cells, NM_002950.4
pLenti-X1-Neo-RPN1-GFP	This study	cDNA of HCT116 cells, NM_002950.4
Software and Algorithms		
Li-Cor's ImageStudio software V5.2	Li-Cor	■ ■ ■
ImageJ	NIH	■ ■ ■
Adobe Photoshop CS6	Adobe Systems	■ ■ ■
Adobe Illustrator CS6	Adobe Systems	■ ■ ■
Prism 6	GraphPad	■ ■ ■