# UCSF

# UC San Francisco Previously Published Works

# Title

Genotypes associated with tacrolimus pharmacokinetics impact clinical outcomes in lung transplant recipients

Permalink https://escholarship.org/uc/item/40x0h2n1

Journal Clinical Transplantation, 32(8)

ISSN

0902-0063

Authors

Calabrese, Daniel R Florez, Rebecca Dewey, Katherine <u>et al.</u>

Publication Date 2018-08-01

DOI

10.1111/ctr.13332

Peer reviewed



# **HHS Public Access**

Author manuscript *Clin Transplant.* Author manuscript; available in PMC 2021 May 07.

Published in final edited form as: *Clin Transplant.* 2018 August ; 32(8): e13332. doi:10.1111/ctr.13332.

# Genotypes associated with tacrolimus pharmacokinetics impact clinical outcomes in lung transplant recipients

Daniel R. Calabrese<sup>1</sup>, Rebecca Boettger<sup>2</sup>, Katherine Dewey<sup>2</sup>, Christine Hui<sup>2</sup>, Dara Torgerson<sup>1</sup>, Tiffany Chong<sup>1</sup>, Hilary Faust<sup>3</sup>, Raja Rajalingam<sup>4</sup>, Steven R. Hays<sup>1</sup>, Jeff A. Golden<sup>1</sup>, Jasleen Kukreja<sup>5</sup>, Jonathan P. Singer<sup>1</sup>, John R. Greenland<sup>1,6</sup>

<sup>1</sup>Department of Medicine, University of California, San Francisco, CA

<sup>2</sup>Department of Clinical Pharmacy, University of California, San Francisco, CA

<sup>3</sup>Pulmonary and Critical Care Medicine, University of Pennsylvania, Philadelphia, PA

<sup>4</sup>Immunogenetics and Transplantation Laboratory, Department of Surgery, University of California, San Francisco, CA

<sup>5</sup>Department of Surgery, University of California, San Francisco, CA

<sup>6</sup>Medical Service, Veterans Affairs Health Care System, San Francisco, CA.

# Abstract

Most lung transplantation immunosuppression regimens include tacrolimus. Single nucleotide polymorphisms (SNPs) in genes important to tacrolimus bioavailability (ABCB1) and clearance (CYP3A4 and CYP3A5) are associated with differences in tacrolimus pharmacokinetics. We hypothesized that polymorphisms in these genes would impact immunosuppression-related clinical outcomes. We categorized ABCB1, CYP3A4, and CYP3A5 SNPs for 321 lung allograft recipients. Genotype effects on time to therapeutic tacrolimus level, interactions with antifungal medications, concentration to dose  $(C_0/D)$ , acute kidney injury, and rejection were assessed using linear models adjusted for subject characteristics and repeat measures. Compared with CYP3A poor metabolizers (PM), time to therapeutic tacrolimus trough was increased by  $5.1 \pm 1.6$  days for CYP3A extensive metabolizers (EM, p < 0.001). In the post-operative period, CYP3A intermediate metabolizers spent 1.2  $\pm$  0.5 days less (p=0.01) and EM spent 2.1  $\pm$  0.5 days less (p<0.001) in goal tacrolimus range than CYP3A PM. Azole antifungals interacted with CYP3A genotype in predicting  $C_0/D$  (p<0.001). Increased acute kidney injury rates were observed in subjects with high ABCB1 function (OR 3.0, 95% CI 1.1-8.6, p=0.01). Lower rates of acute cellular rejection were observed in subjects with low ABCB1 function (OR 0.36, 95% CI 0.07–0.94, p=0.02). Recipient genotyping may help inform tacrolimus dosing decisions and risk of adverse clinical outcomes.

Correspondence and reprint requests to Dr. John R. Greenland, San Francisco VA Medical Center, 4150 Clement St, San Francisco, CA 94121, USA; 415-221-4810x22962, john.greenland@ucsf.edu.

DISCLOSURES

The authors of this manuscript have a conflict of interest to disclose. J.R.G. received an unrelated investigator-initiated study grant from Astellas Scientific and Medical Affairs. The authors have no other conflicts of interest to disclose.

#### Keywords

Lung Transplantation; Genetics; Pharmacokinetics; Tacrolimus

#### INTRODUCTION

The majority of lung transplant recipients are maintained on an immunosuppressant regimen consisting of a calcineurin inhibitor, a cell-cycle inhibitor, and a corticosteroid. In 2015, 97% of all lung transplant recipients in the United States received an immunosuppression regimen that included the calcineurin inhibitor tacrolimus (1). Importantly, tacrolimus has highly variable pharmacokinetics and a narrow therapeutic window (2–4). Erratic tacrolimus blood levels have been negatively associated with chronic lung allograft dysfunction (CLAD)-free survival suggesting that minimizing time outside of a therapeutic tacrolimus window may improve outcomes (5).

Polymorphisms in ABCB1, CYP3A5, and CYP3A4 genes may explain much of the interindividual variability in tacrolimus pharmacokinetics in solid organ transplant settings (6, 7). The permeability-glycoprotein (P-gp) efflux pump, which is encoded by the ABCB1 gene, and two cytochrome P450 enzymes, encoded by the CYP3A4 and CYP3A5 genes, are integral to the bioavailability and clearance of tacrolimus. P-gp efflux pumps actively transport exogenous compounds to the intestinal lumen, bile ducts, and renal proximal tubules (8, 9), while cytochrome P450 isoenzymes expressed in the liver, gut, and kidney oxidatively metabolize compounds (10).

Lung allograft recipients may be particularly vulnerable to variability in tacrolimus dosing because of relatively high immunosuppressive medication targets and frequent changes in interacting medications, such as azole-antifungals. There are limited data on the genetic determinants of tacrolimus clearance and bioavailability and resulting clinical outcomes in the lung transplant population (11–14). Moreover, pharmacokinetic profiles among lung transplant recipients differ from other transplant groups, making extrapolation from other clinical contexts difficult (6, 15, 16). We hypothesized that polymorphisms in ABCB1, CYP3A5, and CYP3A4 would impact immunosuppression-related clinical outcomes in lung transplant recipients.

## MATERIALS AND METHODS

#### Study population and standard therapies

This retrospective cohort study included 321 subjects who received single lung, bilateral lung, or heart-lung allografts at University of California, San Francisco (UCSF) between 2000 and 2016. Adults surviving to hospital discharge were included if they had tacrolimus troughs, blood chemistries, and DNA available for genotyping. All subjects provided informed consent. The UCSF institutional review board approved this study under protocols 10–00721 and 13–10738.

Per standard clinical protocols, post-transplant induction regimens included methylprednisolone, and either 20 mg intravenous basiliximab post-operative day (POD) 0

and 4 for single- and double- lung transplant recipients or 1 mg/kg intravenous antithymocyte globulin on POD 0 for heart-lung transplant recipients and for approximately 20% of the lung transplant recipients based on surgeons' preferences (17). Maintenance immunosuppressant therapy included tacrolimus, prednisone, and mycophenolate mofetil. Tacrolimus was started on POD 1 and titrated to a target trough level of 10-14 ng/ml over the first 3 months following transplant. All subjects, with the exception of those with significant renal injury, were started at an equivalent dose of tacrolimus of 1 mg by mouth twice daily. We used a steady stepwise dose increase to avoid side effects that are associated with acute increases in tacrolimus levels. Tacrolimus trough targets were lowered after this initial period to 6-10 ng/ml. All subjects were maintained on 20 mg daily of prednisone following induction therapy. Prednisone was reduced starting at 3 months, if surveillance bronchoscopies were negative for acute rejection, to a target dose of 0.1 mg/kg by 1 year. All subjects were initiated on mycophenolic acid with goal dose of 1000 mg twice daily. Lower doses, alternate formulations, or azathioprine were used if not tolerated due to side effects. Prior to 2006, inhaled amphotericin was used for antifungal prophylaxis for the first 30 days following lung transplantation. After 2006, antifungal prophylaxis with posaconazole or voriconazole was initiated on post-operative day 1 and stopped after 90 days of treatment if bronchoalveolar lavage (BAL) surveillance fungal cultures were negative.

#### Genotyping and haplotype inference

Single nucleotide polymorphisms (SNPs) were assayed using an Affymetrix gene array designed by the iGeneTRAiN consortium to target HLA, KIR, pharmacogenomics, and metabolic loci (18). Less than 2% of samples were excluded based on 95% call rates, unexpected genetic identity, consistency between genetic and reported sex, levels of heterozygosity, or HLA matching between imputed versus direct HLA typing. Most SNPs in our study were directly sequenced but some unobserved genotypes were imputed through statistical inference using IMPUTE2. These SNPs were in Hardy-Weinberg equilibrium and had a minimum info score of 0.99, indicating high-accuracy imputation.

We grouped ABCB1 polymorphisms into diplotypes based on copies of wild-type (CGC, high efflux capacity) or loss of function (TTT, low efflux capacity) alleles, resulting in the four categories: CGC-CGC, CGC-TTT, TTT-TTT, and a group termed "other," which contained the remaining groupings (19). Consistent with recent studies, we categorized CYP3A genotypes into three different clusters based on functional defects: CYP3A poor metabolizers (CYP3A4\*22 carriers and CYP3A5\*3/\*3), CYP3A intermediate metabolizers (CYP3A4\*1/\*1 and CYP3A5 \*3/\*3 or CYP3A4\*22 carriers and CYP3A5\*1 carriers), and CYP3A extensive metabolizers (CYP3A4 \*1/\*1 and CYP3A5 \*1 carriers) (7).

#### **Clinical data and outcomes**

Clinical data including tacrolimus trough, creatinine, estimated glomerular filtration rate, transbronchial biopsy findings, spirometry, and survival metrics were abstracted from electronic medical records for all subjects. Because information on route, dose, and timing of immunosuppressant and antifungals required manual chart abstraction, we assessed these in a randomly-sampled subcohort of 142 subjects. This sample size provided 80% power to

detect a 10% increase in C<sub>0</sub>/D for CYP3A extensive metabolizers with a two-tailed  $\alpha$  of 0.05, as determined by Monte Carlo methods (20).

Our pharmacokinetic outcomes of interest were time to therapeutic tacrolimus trough, time within therapeutic tacrolimus range, and tacrolimus  $C_0/D$ . Time to therapeutic tacrolimus trough was calculated as time between post-operative day 2 and the latter of two consecutive troughs at or above the target blood drug level of 10 ng/ml. To account for overexposure as well as underexposure, we counted the number of days subjects were within the range of 10 to 14 ng/ml tacrolimus troughs during the first 14 days following transplant, as time in therapeutic range. Tacrolimus troughs throughout the study period were measured by micro particle enzyme-linked immunoassay (MEIA) in CLIA-certified laboratories. The highest 5% of tacrolimus  $C_0/D$  values were excluded from analysis to avoid incorrectly timed medication dosing or laboratory draws.

Our clinical outcomes of interest were acute kidney injury (AKI), chronic kidney disease (CKD), acute and chronic allograft rejection, and survival. We defined acute kidney injury (AKI) as serum creatinine 2 times baseline, based on stage 2 of the Kidney Disease Improving Global Outcomes (KIDGO) guidelines, occurring between the transplant surgery and initial hospital discharge (21). Genotype effects on chronic renal disease over time were estimated using the slope of decline in estimated glomerular filtration rate (eGFR), and chronic kidney disease (CKD) was defined as eGFR <90 ml/min/1.73m<sup>2</sup> based on stage 2 of the KDIGO guidelines (22). Bronchoscopy with lavage and transbronchial biopsies were performed as part of routine surveillance at 0.5, 1, 2, 3, 6, 12, 18, and 24 months after transplantation and then annually. Surveillance after the second year was stopped during the study period due to a change in protocol. Additional bronchoscopy procedures were performed when clinically indicated for suspicion of acute infection or rejection. Acute cellular rejection was assessed and graded in clinical transbronchial biopsies by one of two experienced thoracic pathologists using standard nomenclature (23). Chronic lung allograft dysfunction (CLAD) was defined according to established criteria as an unresolving 20% decline in FEV<sub>1</sub> or FVC lasting over 30 days (24) and determined from clinical records as previously described (25, 26). CLAD-free survival was quantified as years of freedom from CLAD or death.

#### Statistical analysis

Subject characteristics and genotypes were compared using Student's t-test and chi-square, as appropriate. Wild-type genotypes were used as the referent groups. We visualized time to therapeutic tacrolimus level by Kaplan-Meier plots and, because no subjects were censored, we used generalized linear models to assess median time to therapeutic tacrolimus level and days within tacrolimus target trough range. We used Cox proportional hazards models to determine CLAD-free survival hazard ratios as a function of genotype. Multivariable models comparing clinical endpoints were controlled for repeat measures within subjects and subject characteristics frequently associated with poor transplant outcomes or genetic variability: age at transplantation, recipient sex, recipient ethnicity, lung allocation score diagnostic group, and transplant type (single, double, or heart-lung transplant).

#### C<sub>0</sub>/D Modeling

We investigated the interactions of genotypes with the presence of azole therapy to determine how these would affect  $C_0/D$ . We also assessed how much of the variability in  $C_0/D$  could be explained by a model including genotype and concomitant azole therapy. Subjects were considered free of azole effects if measured 7 days before or after cessation of azole therapy.  $C_0/D$  values for the 142 subjects were assessed in a generalized linear mixed model, adjusted with generalized estimating equations (GEEs) with an exchangeable covariance matrix to account for repeated observations within subjects. Genotype (CYP3A or ABCB1), the use of azole (voriconazole or posaconazole), and the interaction between these variables were considered as predictors of  $C_0/D$ . Additional models including baseline subject characteristics (type of transplant, lung allocation score transplant group including cystic fibrosis, recipient sex, age at transplant, and recipient ethnicity) were performed to assess the predictive significance of these variables. Since azole antifungals were instituted in 2006, we also included azole era (before 2006 and after 2006) as an additional predictor.

Statistical analyses were performed in Stata (version 14.4; StataCorp LP, College Station, Texas), and select figures were generated with Prism version 7.0b for Macintosh (GraphPad Software, La Jolla, California).

#### RESULTS

#### Study population and polymorphism distributions

Characteristics of the 321 subjects are found in Table 1. Compared with International Society for Heart and Lung Transplantation (ISHLT) registry data (27), our population had a greater proportion of subjects receiving double lung transplantation (89% vs. 76%) and more subjects were transplanted for pulmonary fibrosis (36% vs. 25%). We also transplanted fewer subjects with cystic fibrosis (10% vs. 16%) and chronic obstructive pulmonary disease (COPD) (15% vs. 31%). There were no statistically significant differences between the baseline characteristics of the subjects who were randomly selected for further chart abstraction versus those not selected for chart abstraction.

Frequencies of CYP3A and ABCB1 genotypes in our cohort were similar to other reported studies in transplant populations (7, 11, 19, 28). As shown in Table 2, CYP3A4 and CYP3A5 genotypes were distributed equally ( $\chi^2 = 0.005$ , *p*=0.94). ABCB1 diplotypes were also distributed evenly across CYP3A5 ( $\chi^2 = 2.5$ , *p*=0.87) and CYP3A4 ( $\chi^2 = 9.4$ , *p*=0.15) genotypes.

#### **Tacrolimus trough measurements**

All 321 subjects had tacrolimus troughs available for their initial hospitalization. Figure 1 shows the time to therapeutic tacrolimus concentration for the two genotypes. The median time to therapeutic tacrolimus trough was 8.2 days. For CYP3A genotypes, the time to therapeutic tacrolimus trough was increased by  $5.1 \pm 1.6$  days in extensive metabolizers (*p*<0.001) compared with the reference of  $7.6 \pm 1.6$  days in poor metabolizers. We found no significant difference between CYP3A intermediate metabolizers and CYP3A poor metabolizers in time to therapeutic tacrolimus level. Between the CYP3A genotypes, we

also found significant differences in the number of days within therapeutic tacrolimus range during the first 14 post-operative days. CYP3A intermediate metabolizers had  $1.2 \pm 0.5$  days less (p= 0.01) and extensive metabolizers had  $2.1 \pm 0.5$  days less (p<0.001) than the reference of  $2.6 \pm 0.7$  days in CYP3A poor metabolizers. We found no statistical differences in time to achieve target drug levels or the number of days within therapeutic range between the ABCB1 diplotypes.

#### Predictors of tacrolimus C<sub>0</sub>/D

Subject characteristics for the subcohort undergoing analysis of tacrolimus trough and dose measurements are detailed in supplemental table S1. The antifungal medications posaconazole and voriconazole can increase the tacrolimus  $C_0/D$  by inhibiting the cytochrome P450 isoenzymes. Within our cohort of 142 subjects, there were 36,995 troughs included in the analysis with only 511 (1.4%) from the pre-azole era. We found a significant association between posaconazole or voriconazole use and tacrolimus  $C_0/D$  across CYP3A genotypes, as shown in Figure 2. While the  $C_0/D$  increased in all CYP3A genotypes with concomitant azole antifungal administration, there was also a significant gene-medication interaction (p<0.001). The effect was most marked in CYP3A poor metabolizers increasing from 3.61 ± 0.2 ng/mL per mg with tacrolimus alone to 7.26 ± 0.2 ng/mL per mg with the addition of an antifungal agent (p<0.001). With the addition of these antifungal agents, the  $C_0/D$  in CYP3A extensive and intermediate subjects increased but to a lesser extent. Analysis of dose changes by genotype and specific antifungal are found in supplemental table S2.

To assess the proportion of variability in tacrolimus  $C_0/D$  over time that is explained by genotype, azole antifungal medication status, and the genotype-azole interaction, we compared observed versus the predicted  $C_0/D$  using linear modeling. As shown in Figure 3, 45 percent of the variance of  $C_0/D$  ( $R^2$ ) was explained by this model. However, there were differences as high as 8-fold in measured  $C_0/D$  within groups of predicted  $C_0/D$ . Inclusion of baseline subject characteristics explained only an additional 4.8 percent of the  $C_0/D$  variation ( $R^2$ ), with decreased  $C_0/D$  in subjects with cystic fibrosis ( $\beta$  –1.5, *p*=0.03). A model with CYP3A and ABCB1 genotypes without azole antifungals explained only 26 percent of the variance in  $C_0/D$  ( $R^2$ ). Supplemental table S3 shows the comparison of models including the additional covariates. The ABCB1 genotype did not significantly mediate predicted  $C_0/D$  in this model, but we found that within the subset of CYP3A4\*22 genotypes, subjects also expressing the TTT-TTT diplotype (n = 5) had a 50% reduction in  $C_0/D$  from 5.7 ng/mL per mg compared to other ABCB1 genotypes (*p*=0.03).

#### Acute and chronic renal dysfunction

We assessed for associations between genotype and acute and chronic kidney disease. Nineteen percent of the subjects (n=61) developed KDIGO stage II or greater AKI in the immediate post-operative period. As shown in Table 3, between the transplant surgery procedure and first hospital discharge, carriers of the ABCB1 CGC-CGC diplotype manifested three-fold greater odds of developing KDIGO stage II or greater acute kidney injury compared to TTT-TTT subjects (95% CI 1.1–8.6, p=0.01). Other ABCB1 genotypes were not associated with a statistical difference in the odds of early acute kidney injury. We

observed no statistical association between ABCB1 or CYP3A genotype and the slope of estimated glomerular filtration rate from time of transplantation through the remainder of available subject data. We also observed no association between genotype and CKD at 6 months, 2 years, and 5 years.

#### Acute and chronic rejection

Figure 4 shows the odds of rejection in the first year following transplant based on genotype. Our cohort experienced similar rates of overall grade A1 or greater rejection in the first year following transplant as compared with the ISHLT registry data (29% vs. 32%), with the median time to first rejection of 101 days (27). ABCB1 TTT-TTT subjects had reduced odds of developing A1 rejection compared to other ABCB1 genotypes (OR 0.36, 95% CI 0.07– 0.94, p=0.02). Surprisingly, there was no difference in rates of acute allograft rejection across the CYP3A genotypes, although this genotype was the dominant determinant of C<sub>0</sub>/D. There were no significant associations between genotype and B grade rejection or A2 rejection.

CLAD-free survival was assessed using Kaplan-Meier analysis and Cox proportional hazards for all genotypes. Sixty-nine of the subjects died during the study period, surviving a median of five years. Ninety-two subjects had developed CLAD by that time. There were no differences in time to CLAD or death among ABCB1 genotypes (TTT-TTT, HR 0.77, p=0.41; CGC-TTT, HR 0.91, p=0.72; Other, HR 0.75, p=0.26), or CYP3A genotypes (IM, HR 1.2, p=0.44; EM, HR 1.2, p=0.65).

#### DISCUSSION

This is the largest cohort study to date to investigate genotypes affecting tacrolimus in a lung transplant population. Consistent with what has been reported in solid organ transplant populations, we found that recipients with rapid-metabolizing CYP3A genotypes require higher doses of tacrolimus to maintain therapeutic drug levels compared to other genotypes (7, 11, 28–35). Rapid-metabolizing genotypes were associated with increased time to therapeutic tacrolimus level and decreased days in therapeutic range. Additionally, we found decreased rates of acute cellular rejection in lung allograft recipients with ABCB1 poor efflux activity.

In a multivariable model, only CYP3A genotypes had a significant impact on predicted tacrolimus  $C_0/D$ . We found that azole antifungal agents impact tacrolimus concentrations with a significant drug-genotype interaction. The magnitude of this interaction was greater than that reported in a recent study including lung and kidney allograft recipients (12). One potential reason for this difference in outcomes may be that our study was performed solely in lung allograft recipients, reflecting the differences in pharmacokinetics between solid organ transplant groups. Our study also had more statistical power to detect drug-genotype interactions. We found an 8-fold variation in tacrolimus dose-normalized concentration after accounting for genotype and antifungal medications. This wide range of tacrolimus  $C_0/D$  is consistent with other studies and may reflect the non-linear kinetics of tacrolimus and variability in tacrolimus measurement (12, 36, 37).  $C_0/D$  values were also lower in subjects

with cystic fibrosis, consistent with previous literature on decreased bioavailability of tacrolimus in this population (38).

Although effects of ABCB1 polymorphisms on tacrolimus concentrations vary between studies, the low activity, TTT-TTT P-gp genotype has generally been associated with an increased tacrolimus  $C_0/D$  (13, 14, 28, 30, 35, 39, 40). In our cohort, the effect of ABCB1 diplotype on  $C_0/D$  was only seen in the CYP3A\*22 genotypes. Conclusions from this subgroup analysis are limited by the low number of subjects, but another study demonstrated a similar finding in renal allograft recipients (19). Data from liver transplant subjects show that ABCB1 genetic polymorphisms may influence tacrolimus hepatic concentrations but have little impact on blood drug concentrations (35). It seems plausible that ABCB1-encoded P-gp efflux pump activity might become relevant only in the context of poor hepatic clearance of tacrolimus.

Across solid organ transplants, there is strong evidence of genetic variations affecting tacrolimus pharmacokinetics, but the clinical impacts of these polymorphisms have been less clear. Here, we observed an increased incidence of clinically-relevant acute kidney injury during the initial hospitalization in subjects with the high efflux activity ABCB1 CGC-CGC genotype. Healthy volunteers who carry this genotype have been shown to exhibit worse baseline renal function independent of genetic background (41). Subjects with intact P-gp function may be predisposed to renal injury, or intact P-gp function may lead to increased renal tubule drug or toxic metabolite exposure. We controlled for baseline subject characteristics in our models, but uncontrolled confounders including perioperative parameters or other medication effects could also impact renal outcomes.

A meta-analysis in liver transplant recipients suggested a higher risk of acute rejection and chronic nephrotoxicity in CYP3A5 high metabolizers, for whom higher tacrolimus doses are required to maintain a given target trough (42). However, we did not observe an effect of CYP3A genotype on rates of acute or chronic rejection. It is possible that higher target tacrolimus troughs that are typical for lung allograft recipients could dampen pharmacogenomic effects on acute rejection rates. At the same time, a reduction in acute rejection was observed in subjects with the ABCB1 TTT-TTT diplotype, for whom less tacrolimus would be needed to achieve a therapeutic trough and concentrations throughout the day could be less variable (43). Similar effects of ABCB1 polymorphisms were observed in a renal transplant cohort (39).

The Clinical Pharmacogenetics Implementation Consortium (CPIC) recently recommended tacrolimus adjustment based on CYP3A5 genotype in transplant recipients if genotyping is already available (44). However, there was no specific recommendation that this genotyping be performed and debate regarding its clinical utility based on two subsequent studies where renal allograft recipients were prospectively randomized to receive tacrolimus dosing based on pretransplant CYP3A5 genotyping. In a study of renal allograft recipients, subjects that were randomized to receive genotype-based dosing had more time in therapeutic tacrolimus range and a shorter time to therapeutic blood troughs compared to subjects randomized to a standard of care protocol (45). Conversely, Shuker and colleagues demonstrated no difference in goal therapeutic tacrolimus troughs or acute rejection between a group

randomized to genotype-based dosing versus a group receiving usual care (46). Our study shows that CYP3A5, CYP3A4, and ABCB1 genotyping in lung transplant recipients may prove useful as an adjunct tool for clinicians surrounding dosing decisions in the initial posttransplant period and during azole antifungal medication adjustments. This information would be less likely to impact long-term outcomes substantially. Genotypic information may also prove helpful in considering potentially non-adherent subjects. However, the substantial observed residual variation in  $C_0/D$  not explained by genotype and antifungal use implies that genotype-based dosing cannot replace trough-based dosing. Further, there is a risk that higher starting doses in extensive metabolizers would result in overshooting therapeutic targets leading to more toxicity without additional protection from rejection.

These data have limitations: results generated from other centers might vary due to differences in pathologic interpretation, medication dosing regimens, and ethnic distributions, when compared with this single center study. Our modeling of genotype effect on CLAD-free survival may be incomplete as we were unable to control for some known confounders such as primary graft dysfunction, gastroesophageal reflux disease, or graft infections. Tacrolimus dose-adjusted concentration is a limited tool for estimating total drug exposure as it has been shown to poorly correlate with more accurate area-under-the-curve assessments of tacrolimus exposure in lung transplant recipients (47). Genotype effects on clinical outcomes may be more meaningfully assessed in a prospective study measuring area-under-the-curve or peak concentrations. We report a population median of 8.2 days to achieve a therapeutic tacrolimus trough, which is representative of our high target of 10 ng/ml and our incremental dosing strategy designed to avoid toxicity from rapid increases. As shown in supplemental table S1, the time to achieve a tacrolimus trough of 6 ng/ml is 2.9 days. Further, our method of calculating time in therapeutic range may underestimate this value as compared to other methods such as by Rosendaal linear interpolation. Finally, although gene-chip based SNP typing was done on a targeted SNP chip yielding very high information scores, there is likely some risk for misclassification, which might bias results towards the null, when compared with some other SNP typing methods.

In conclusion, CYP3A5, CYP3A4, and ABCB1 genotyping may inform clinical management of lung transplant recipients. Tacrolimus dosing by CYP3A genotype in the early post-transplant period has the potential to decrease time to therapeutic level and time outside of therapeutic tacrolimus range. Genotyping for ABCB1 may be of additional utility in identifying subjects like those with ABCB1 TTT-TTT genotypes, for whom  $C_0/D$  are lower. While there was still up to 8-fold variation in  $C_0/D$  after accounting for genotype, a sense of target  $C_0/D$  by genotype may be useful in informing early tacrolimus dosing and in anticipating dosing requirements following changes in interacting medications. Further study is warranted to determine if genotyping could improve lung allograft recipient satisfaction and decrease costs by reducing time to therapeutic tacrolimus level or rates of acute cellular rejection.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

### ACKNOWLEDGEMENTS

We thank Chiyo Uchida, Edelyn Bautista, Linda Nicola, Mary Beier, Daphne Penaflor, Michelle Devaux, Michelle Ramirez, Fredde Foster, David Prince, AnaMarie Goscila, Mary Heindel, Ivy Sparks, Irene Junejo, Bonnie Slater, Cecilia Lemieux, Paul Tan, Nelson Mercado, Anna Volfson, Karen Neun, Blake Young, Juliet Zabel for instrumental aid in collecting study samples. We also thank Paul Blanc for aid in statistical analysis and manuscript review. We are thankful for the cooperation of Donor Network West, and for all of the organ and tissue donors, and their families for giving gifts of life and knowledge with their generous donation.

Project funding came from the UCSF Nina Ireland Program for Lung Health (NIPLH) Innovative Grant program and award number IK2CX001034 from the Clinical Sciences Research & Development Service of the VA Office of Research and Development.

## REFERENCES

- Valapour M, Skeans MA, Smith JM, Edwards LB, Cherikh WS, Uccellini K et al. OPTN/SRTR 2015 Annual Data Report: Lung. Am J Transplant 2017;17 Suppl 1:357–424. [PubMed: 28052607]
- Parekh K, Trulock E, Patterson GA. Use of cyclosporine in lung transplantation. Transplant Proc 2004;36(2 Suppl):318s–322s. [PubMed: 15041361]
- 3. Venkataramanan R, Swaminathan A, Prasad T, Jain A, Zuckerman S, Warty V et al. Clinical pharmacokinetics of tacrolimus. Clin Pharmacokinet 1995;29(6):404–430. [PubMed: 8787947]
- 4. Spencer CM, Goa KL, Gillis JC. Tacrolimus. An update of its pharmacology and clinical efficacy in the management of organ transplantation. Drugs 1997;54(6):925–975. [PubMed: 9421697]
- 5. Gallagher HM, Sarwar G, Tse T, Sladden TM, Hii E, Yerkovich ST et al. Erratic tacrolimus exposure, assessed using the standard deviation of trough blood levels, predicts chronic lung allograft dysfunction and survival. J Heart Lung Transplant 2015;34(11):1442–1448. [PubMed: 26186804]
- 6. Monchaud C, de Winter BC, Knoop C, Estenne M, Reynaud-Gaubert M, Pison C et al. Population pharmacokinetic modelling and design of a Bayesian estimator for therapeutic drug monitoring of tacrolimus in lung transplantation. Clin Pharmacokinet 2012;51(3):175–186. [PubMed: 22339449]
- Lloberas N, Elens L, Llaudo I, Padulles A, van Gelder T, Hesselink DA et al. The combination of CYP3A4\*22 and CYP3A5\*3 single-nucleotide polymorphisms determines tacrolimus dose requirement after kidney transplantation. Pharmacogenet Genomics 2017;27(9):313–322. [PubMed: 28704257]
- Saeki T, Ueda K, Tanigawara Y, Hori R, Komano T. Human P-glycoprotein transports cyclosporin A and FK506. J Biol Chem 1993;268(9):6077–6080. [PubMed: 7681059]
- 9. Zhang Y, Benet LZ. The gut as a barrier to drug absorption: combined role of cytochrome P450 3A and P-glycoprotein. Clin Pharmacokinet 2001;40(3):159–168. [PubMed: 11327196]
- Kronbach T, Fischer V, Meyer UA. Cyclosporine metabolism in human liver: identification of a cytochrome P-450III gene family as the major cyclosporine-metabolizing enzyme explains interactions of cyclosporine with other drugs. Clin Pharmacol Ther 1988;43(6):630–635. [PubMed: 3378384]
- Zheng H, Zeevi A, Schuetz E, Lamba J, McCurry K, Griffith BP et al. Tacrolimus dosing in adult lung transplant patients is related to cytochrome P4503A5 gene polymorphism. J Clin Pharmacol 2004;44(2):135–140. [PubMed: 14747421]
- Vanhove T, Bouwsma H, Hilbrands L, Swen JJ, Spriet I, Annaert P et al. Determinants of the Magnitude of Interaction Between Tacrolimus and Voriconazole/Posaconazole in Solid Organ Recipients. Am J Transplant 2017;17(9):2372–2380. [PubMed: 28224698]
- Ruiz J, Herrero MJ, Boso V, Megias JE, Hervas D, Poveda JL et al. Impact of Single Nucleotide Polymorphisms (SNPs) on Immunosuppressive Therapy in Lung Transplantation. Int J Mol Sci 2015;16(9):20168–20182. [PubMed: 26307985]
- Wang J, Zeevi A, McCurry K, Schuetz E, Zheng H, Iacono A et al. Impact of ABCB1 (MDR1) haplotypes on tacrolimus dosing in adult lung transplant patients who are CYP3A5\*3/\*3 nonexpressors. Transpl Immunol 2006;15(3):235–240. [PubMed: 16431292]

- Monchaud C, Marquet P. Pharmacokinetic optimization of immunosuppressive therapy in thoracic transplantation: part I. Clin Pharmacokinet 2009;48(7):419–462. [PubMed: 19691367]
- Monchaud C, Marquet P. Pharmacokinetic optimization of immunosuppressive therapy in thoracic transplantation: part II. Clin Pharmacokinet 2009;48(8):489–516. [PubMed: 19705921]
- Greenland JR, Wong CM, Ahuja R, Wang AS, Uchida C, Golden JA et al. Donor-Reactive Regulatory T-Cell Frequency Increases During Acute Cellular Rejection of Lung Allografts. Transplantation 2016.
- Design and Implementation of the International Genetics and Translational Research in Transplantation Network. Transplantation 2015;99(11):2401–2412. [PubMed: 26479416]
- Vanhove T, Annaert P, Lambrechts D, Kuypers DR. Effect of ABCB1 diplotype on tacrolimus disposition in renal recipients depends on CYP3A5 and CYP3A4 genotype. Pharmacogenomics J 2016.
- 20. Kroese DP, Brereton T, Taimre T, Botev ZI. Why the Monte Carlo method is so important today. Wiley Interdisciplinary Reviews: Computational Statistics 2014;6(6):386–392.
- 21. Khwaja A KDIGO clinical practice guidelines for acute kidney injury. Nephron Clin Pract 2012;120(4):c179–184. [PubMed: 22890468]
- 22. Levey AS, Stevens LA, Schmid CH, Zhang YL, Castro AF 3rd, Feldman HI et al. A new equation to estimate glomerular filtration rate. Ann Intern Med 2009;150(9):604–612. [PubMed: 19414839]
- Stewart S, Fishbein MC, Snell GI, Berry GJ, Boehler A, Burke MM et al. Revision of the 1996 working formulation for the standardization of nomenclature in the diagnosis of lung rejection. J Heart Lung Transplant 2007;26(12):1229–1242. [PubMed: 18096473]
- Verleden GM, Raghu G, Meyer KC, Glanville AR, Corris P. A new classification system for chronic lung allograft dysfunction. J Heart Lung Transplant 2014;33(2):127–133. [PubMed: 24374027]
- Greenland JR, Jones KD, Hays SR, Golden JA, Urisman A, Jewell NP et al. Association of largeairway lymphocytic bronchitis with bronchiolitis obliterans syndrome. Am J Respir Crit Care Med 2013;187(4):417–423. [PubMed: 23239157]
- Greenland JR, Jewell NP, Gottschall M, Trivedi NN, Kukreja J, Hays SR et al. Bronchoalveolar lavage cell immunophenotyping facilitates diagnosis of lung allograft rejection. Am J Transplant 2014;14(4):831–840. [PubMed: 24512389]
- 27. Lund LH, Khush KK, Cherikh WS, Goldfarb S, Kucheryavaya AY, Levvey BJ et al. The Registry of the International Society for Heart and Lung Transplantation: Thirty-fourth Adult Heart Transplantation Report-2017; Focus Theme: Allograft ischemic time. J Heart Lung Transplant 2017;36(10):1037–1046. [PubMed: 28779893]
- Haufroid V, Mourad M, Van Kerckhove V, Wawrzyniak J, De Meyer M, Eddour DC et al. The effect of CYP3A5 and MDR1 (ABCB1) polymorphisms on cyclosporine and tacrolimus dose requirements and trough blood levels in stable renal transplant patients. Pharmacogenetics 2004;14(3):147–154. [PubMed: 15167702]
- Argudo A, Gonzalez de Aledo JM, Alia P, Ramirez P, Serrano T, Fabregat J et al. Liver Transplant Patient Carriers of Polymorphism Cyp3a5\*1 Donors May Need More Doses of Tacrolimus From the First Month After Transplantation. Transplant Proc 2015;47(8):2388–2392. [PubMed: 26518936]
- 30. Jordan de Luna C, Herrero Cervera MJ, Sanchez Lazaro I, Almenar Bonet L, Poveda Andres JL, Alino Pellicer SF. Pharmacogenetic study of ABCB1 and CYP3A5 genes during the first year following heart transplantation regarding tacrolimus or cyclosporine levels. Transplant Proc 2011;43(6):2241–2243. [PubMed: 21839244]
- Hesselink DA, van Schaik RH, van der Heiden IP, van der Werf M, Gregoor PJ, Lindemans J et al. Genetic polymorphisms of the CYP3A4, CYP3A5, and MDR-1 genes and pharmacokinetics of the calcineurin inhibitors cyclosporine and tacrolimus. Clin Pharmacol Ther 2003;74(3):245–254. [PubMed: 12966368]
- 32. Rojas L, Neumann I, Herrero MJ, Boso V, Reig J, Poveda JL et al. Effect of CYP3A5\*3 on kidney transplant recipients treated with tacrolimus: a systematic review and meta-analysis of observational studies. Pharmacogenomics J 2015;15(1):38–48. [PubMed: 25201288]

- 33. Khaled SK, Palmer JM, Herzog J, Stiller T, Tsai NC, Senitzer D et al. Influence of Absorption, Distribution, Metabolism, and Excretion Genomic Variants on Tacrolimus/Sirolimus Blood Levels and Graft-versus-Host Disease after Allogeneic Hematopoietic Cell Transplantation. Biol Blood Marrow Transplant 2016;22(2):268–276. [PubMed: 26325438]
- 34. Deininger KM, Vu A, Page RL, 2nd, Ambardekar AV, Lindenfeld J, Aquilante CL. CYP3A pharmacogenetics and tacrolimus disposition in adult heart transplant recipients. Clin Transplant 2016;30(9):1074–1081. [PubMed: 27314545]
- Elens L, Capron A, Kerckhove VV, Lerut J, Mourad M, Lison D et al. 1199G>A and 2677G>T/A polymorphisms of ABCB1 independently affect tacrolimus concentration in hepatic tissue after liver transplantation. Pharmacogenet Genomics 2007;17(10):873–883. [PubMed: 17885626]
- 36. Mori T, Kato J, Yamane A, Sakurai M, Kohashi S, Kikuchi T et al. Drug interaction between voriconazole and tacrolimus and its association with the bioavailability of oral voriconazole in recipients of allogeneic hematopoietic stem cell transplantation. Int J Hematol 2012;95(5):564– 569. [PubMed: 22461034]
- 37. Mori T, Aisa Y, Kato J, Nakamura Y, Ikeda Y, Okamoto S. Drug interaction between voriconazole and calcineurin inhibitors in allogeneic hematopoietic stem cell transplant recipients. Bone Marrow Transplant 2009;44(6):371–374. [PubMed: 19270729]
- Saint-Marcoux F, Knoop C, Debord J, Thiry P, Rousseau A, Estenne M et al. Pharmacokinetic study of tacrolimus in cystic fibrosis and non-cystic fibrosis lung transplant patients and design of Bayesian estimators using limited sampling strategies. Clin Pharmacokinet 2005;44(12):1317– 1328. [PubMed: 16372829]
- 39. Sanchez-Lazaro I, Herrero MJ, Jordan-De Luna C, Boso V, Almenar L, Rojas L et al. Association of SNPs with the efficacy and safety of immunosuppressant therapy after heart transplantation. Pharmacogenomics 2015;16(9):971–979. [PubMed: 26107754]
- Herrero MJ, Sanchez-Plumed J, Galiana M, Bea S, Marques MR, Alino SF. Influence of pharmacogenetic polymorphisms in routine immunosuppression therapy after renal transplantation. Transplant Proc 2010;42(8):3134–3136. [PubMed: 20970628]
- Bochud M, Eap CB, Maillard M, Johnson T, Vollenweider P, Bovet P et al. Association of ABCB1 genetic variants with renal function in Africans and in Caucasians. BMC Med Genomics 2008;1:21. [PubMed: 18518969]
- Rojas LE, Herrero MJ, Boso V, Garcia-Eliz M, Poveda JL, Librero J et al. Meta-analysis and systematic review of the effect of the donor and recipient CYP3A5 6986A>G genotype on tacrolimus dose requirements in liver transplantation. Pharmacogenet Genomics 2013;23(10):509– 517. [PubMed: 23873120]
- Benet LZ, Cummins CL. The drug efflux-metabolism alliance: biochemical aspects. Adv Drug Deliv Rev 2001;50 Suppl 1:S3–11. [PubMed: 11576692]
- 44. Birdwell KA, Decker B, Barbarino JM, Peterson JF, Stein CM, Sadee W et al. Clinical Pharmacogenetics Implementation Consortium (CPIC) Guidelines for CYP3A5 Genotype and Tacrolimus Dosing. Clin Pharmacol Ther 2015;98(1):19–24. [PubMed: 25801146]
- Thervet E, Loriot MA, Barbier S, Buchler M, Ficheux M, Choukroun G et al. Optimization of initial tacrolimus dose using pharmacogenetic testing. Clin Pharmacol Ther 2010;87(6):721–726. [PubMed: 20393454]
- 46. Shuker N, Bouamar R, van Schaik RH, Clahsen-van Groningen MC, Damman J, Baan CC et al. A Randomized Controlled Trial Comparing the Efficacy of Cyp3a5 Genotype-Based With Body-Weight-Based Tacrolimus Dosing After Living Donor Kidney Transplantation. Am J Transplant 2016;16(7):2085–2096. [PubMed: 26714287]
- Ragette R, Kamler M, Weinreich G, Teschler H, Jakob H. Tacrolimus pharmacokinetics in lung transplantation: new strategies for monitoring. J Heart Lung Transplant 2005;24(9):1315–1319. [PubMed: 16143250]

Calabrese et al.





The proportion of subjects with a therapeutic tacrolimus trough, defined as two consecutive troughs at goal, are shown as a function of days post-transplant using Kaplan-Meier curves for subjects stratified by (A) CYP3A and (B) ABCB1 genotype. Increased times to achieve therapeutic tacrolimus troughs were associated with CYP3A genotypes that promote more rapid tacrolimus metabolism. CYP3A extensive metabolizers took  $5.1 \pm 1.6$  days longer (*p*<0.001) than poor metabolizers to reach therapeutic tacrolimus troughs. We found no differences in time to achieve therapeutic trough in ABCB1 genotypes.



Figure 2: Interaction of CYP3A genotype with the use of tacrolimus in determining  $C_0/D$  ratios. The tacrolimus  $C_0/D$  was calculated for a subcohort of 142 lung transplant subjects at times with and without antifungal medications. Across CYP3A genotypes, azole antifungal administration was associated with an increase in  $C_0/D$  and subjects with poor CYP3A metabolism had higher  $C_0/D$  compared to the other genotypes. The slope of change between genotypes was also different across genotypes, indicating a medication-gene interaction (p<0.001) with a greater magnitude of change observed in the CYP3A poor metabolizers compared to other genotypes.



Figure 3: Genotypes and azole antifungals explain some of the variation in tacrolimus  $C_0/D$ . (A) CYP3A and ABCB1 genotypes and the interaction between azole antifungals and the CYP enzymes were used in a GEE-adjusted linear model to predict tacrolimus  $C_0/D$  ratio. The table displays the ß values and confidence intervals (CI) for the independent variables with statistically significant variables in bold. (B) The predicted tacrolimus  $C_0/D$  is displayed in a scatterplot against the median  $C_0/D$  with a line (thick black) and 95% confidence interval (thin black lines) fitted to these plot points. The R<sup>2</sup> was calculated as 45%.



Figure 4: ABCB1 but not CYP3A genotypes were associated with differential risk of acutecellular rejection in the first year following transplantation.The odds of developing acute rejection are shown in subjects stratified by CYP3A andABCB1 genotype. Rates of acute cellular rejection were reduced in ABCB1 TTT-TTTsubjects (OR 0.36, 95% CI 0.13–0.98). "\*" denotes *p*<0.05.</td>

#### Table 1:

# Study Population Characteristics

	Total Cohort	Co/D	p value
Subjects (n)	321	142	
Age at transplantation, mean years $\pm$ SD	$55\pm12$	$56\pm11$	0.69
Male gender (%)	54	58	0.27
Transplant type: N (%)			0.71
Double	288 (89.4)	126 (88.7)	
Heart and Lung	6 (1.9)	3 (2.1)	
Single	27 (8.4)	13 (9.2)	
Race/Ethnicity: N (%)			0.28
Caucasian	242 (75.2)	112 (78.9)	
African American	22 (6.9)	10 (7.0)	
Hispanic	36 (11.2)	11(7.8)	
Other	21 (6.5)	9 (6.3)	
Transplant indication group: N (%)			0.60
A (COPD)	66 (20.5)	31 (21.8)	
B (Primary Pulmonary Hypertension)	15 (4.7)	5 (3.5)	
C (Cystic Fibrosis)	31 (9.6)	14 (9.7)	
D (Pulmonary Fibrosis)	210 (65.2)	92 (64.8)	0.88
CYP3A genotype: N (%)			0.22
Extensive Metabolizers	61 (19)	16 (11.2)	
Intermediate Metabolizers	240 (74.8)	116 (81.7)	
Poor Metabolizers	20 (6.2)	10 (7)	
ABCB1 diplotype N (%)			0.64
CGC-CGC	51 (15.8)	24 (16.9)	
CGC-TTT	114 (35.5)	55 (38.7)	
TTT-TTT	46 (14.3)	17 (12.0)	
Other	110 (34.3)	46 (32.4)	

#### Table 2:

# Concurrence of Cytochrome Genotypes

	CYP3A4			
		*1/ *1	*22/	Total
CYP3A5	*1/ *1	61	5	66
	*3/ *3	235	20	255
	Total	296	25	321

#### Table 3:

# Acute and Chronic Kidney Injury

	Acute Kidney Injury		Rate of GFR decline	
	N/Total	OR [95% CI]	Slope (ml/min/year)	[95% CI]
CYP3A genotypes				
Poor Metabolizers	2/20	Ref	-22.1	Ref
Intermediate Metabolizers	43/240	1.1 [0.9 – 1.2]	-38.5	[-63.5 - 30.7]
Extensive Metabolizers	16/61	1.1 [0.9 – 1.3]	-46.8	[-76.9 - 27.5]
ABCB1 diplotype				
TTT-TTT	6/46	Ref	-38.4	Ref
CGC-TTT	20/114	$1.4 \ [0.5 - 3.8]$	-38.1	[-84.8 - 25.8]
CGC-CGC	16/51	3.0 [1.1 – 8.6] *	-46.6	[-100 - 24.8]
Other	19/110	1.4 [0.5 – 3.7]	-36.7	[-56.1 - 17.3]