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## Allograft Rejection and Tubulointerstitial Fibrosis in Human Kidney Allografts: Interrogation by Urinary Cell mRNA Profiling

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### Abstract

Because the kidney allograft has the potential to function as an in-vivo flowcytometer and facilitate the access of immune cells and kidney parenchymal cells in to the urinary space, we hypothesized that mRNA profiling of urinary cells offers a noninvasive means of assessing the kidney allograft status. We overcame the inherent challenges of urinary cell mRNA profiling by developing pre-amplification protocols to compensate for low RNA yield from urinary cells and by developing robust protocols for absolute quantification mRNAs using RT-PCR assays. Armed with these tools, we undertook first single-center studies urinary cell mRNA profiling and then embarked on the multicenter Clinical Trials in Organ Transplantation-04 study of kidney transplant recipients. We report here our discovery and validation of diagnostic and prognostic biomarkers of acute cellular rejection and of interstitial fibrosis and tubular atrophy (IF/TA). Our urinary cell mRNA profiling studies, in addition to demonstrating the feasibility of accurate diagnosis of acute cellular rejection and IF/TA in the kidney allograft, advance mechanistic and potentially targetable biomarkers. Interventional trials, guided by urinary cell mRNA profiles, may lead to personalized immunosuppression in recipients of kidney allografts.

### Keywords

Kidney transplantation; Rejection; Gene expression; Polymerase chain reaction

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## Introduction

The number of individuals being treated for end stage kidney disease (ESRD) continues to grow worldwide [1–3]. For those afflicted with ESRD, kidney transplantation results in superior survival compared to maintenance dialysis [4, 5]. The adjusted first-year all-cause mortality rate for the year 2010 was 268.8 per 1000 patient years at risk for patients managed with hemodialysis, 121.4 for patients treated with peritoneal dialysis and only 54.4 for recipients of kidney allografts [1]. The salutary effect of kidney transplantation however is realized by very few since because of the shortage of organs for transplantation. In the US alone, each year, approximately 100,000 patients compete for the 11,000 deceased donor kidneys available for transplantation [6].

There are multiple causes for the organ shortage crisis and the growth of the transplant wait list [7]. It is well documented that acute rejection (AR) is a major contributor to allograft failure and a significant contributor to the escalating wait list is the return of patients with a failed graft to the list [8–12]. Reducing such graft failures would help mitigate the existing crisis in organ availability.

We have focused our research efforts on reducing the impact of allograft failure. We reasoned that better diagnosis of acute cellular rejection (ACR), the most common type of AR, and of interstitial fibrosis and tubular atrophy (IF/TA) is an essential first step. We review here our studies towards the development and validation of noninvasively ascertainable diagnostic and prognostic biomarkers of kidney allograft status. We provide first an overview of AR and chronic rejection, and follow this précis with our findings from interrogating AR and chronic rejection with the use of urinary cell mRNA profiling.

## Biology of Immune Rejection

Kidney allograft rejection is defined as functional and structural deterioration due to an active immune response expressed by the recipient and directed at the transplanted organ [13]. Alloreactivity is primarily but not exclusively directed at the proteins encoded by genes located within the donor's major histocompatibility complex region and involves a highly coordinated action of multiple cell types and mediators with donor antigen-reactive lymphocytes being the principal drivers of the immune repertory [14–16].

Two distinct but not mutually exclusive pathways, T-lymphocyte- based pathway and B-lymphocyte-based pathway contributes to immune rejection of the transplanted organ. T cell-mediated rejection is the commonest type of AR [15, 17–19]. In early 1970s, donor-specific and cytolytically active T lymphocytes were identified within the rejecting experimental or human allografts [20, 21]. These cytolytically active cells kill their target by inducing apoptosis/necrosis via the Fas-Fas ligand pathway and the granule exocytosis pathway in which perforin and granzyme B collaborate [22, 23]. Experiments in a number of laboratories including ours have shown intrarenal expression of mRNA encoding proteins involved in both major lytic pathways, and the differential expression of these molecular executors of cytotoxicity during AR or chronic rejection of the human kidney allograft [24–27].

Robust data exist that antibodies contribute to the three major types of immune rejection; hyperacute, acute or chronic [28–33]. The clinical introduction of highly sensitive assays to detect circulating antibodies have improved our appreciation of the role of antibodies in the pathogenesis of AR—a mechanism recognized as early as the 70s with the use of high-sensitive antibody-dependent cell-mediated cytotoxicity assays in which recipient's sera are tested against <sup>51</sup>chromium labeled donor cells [34]. It is important to recognize however that dichotomization of rejection in to either cellular or antibody based might be simplistic and in reality both arms of immunity contribute to the rejection, albeit with one or the other arm appearing dominant based on the tools used to interrogate the biology of rejection. Indeed, we recently found that a third of the patients diagnosed as acute antibody mediated rejection by the current Banff criteria also fulfilled the criteria for ACR, and that the presence of concomitant ACR was an independent risk factor for kidney allograft failure following biopsy confirmed diagnosis of complement component 4d (C4d) positive acute antibody mediated rejection [35].

Although AR has garnered much attention, chronic rejection/chronic allograft nephropathy (CAN) is the commonest feature of chronically failing allografts [36, 37]. Interstitial fibrosis and tubular atrophy (IF/TA) are histologic features of chronic rejection and likely to be the final common pathway for allograft failure [38–41]. It is highly likely that alloantigen driven mechanisms as well as non-immune mechanisms contribute to the pathogenesis of IF/TA [39, 42–49]. Among the several non-immune mechanisms implicated in chronic allograft injury, the calcineurin inhibitors are prime suspects since cyclosporine as well as tacrolimus induces TGF- $\beta$ 1 hyperexpression in a number of cell types including T-cells and renal tubular cells [50–56]. As TGF- $\beta$ 1 is a potent fibrogenic cytokine and is involved in repair following tissue injury, a TGF- $\beta$ 1-centered hypothesis for integrating immune and non-immune events in the pathogenesis of chronic rejection/CAN (manifested by IF/TA) appears biologically plausible (Figure 1) [57]. Experimental support for this formulation includes: (i) increased intragraft expression of TGF- $\beta$ 1 mRNA and protein in grafts manifesting IF/TA [57–59]; (ii) increased expression of microRNA-21 capable of targeting Smad-7, a negative regulator of TGF- $\beta$ 1-signaling, in grafts manifesting IF/TA [60]; (iii) increased expression of several proteins, induced by TGF- $\beta$ 1 and involved in fibrosis (e.g., vimentin) in kidney grafts showing IF/TA [61, 62]; and (iv) the ability of calcineurin inhibitors to induce TGF- $\beta$ 1 [50–56].

Our TGF- $\beta$ 1 centric hypothesis has received support from a number of interventional studies including the recent findings in a preclinical model. In the male Fischer rat to male Lewis rat kidney transplants, neutralizing activities of TGF- $\beta$  using an anti-TGF- $\beta$  antibody successfully reduced the severity of chronic rejection of kidney allografts. Compared with a control antibody-treated group, administration of anti-TGF- $\beta$  monoclonal antibody was associated with a significant reduction of proteinuria, serum creatinine, and prevented decline of creatinine clearance. Moreover there was reduction of the severity of cellular infiltration, tubular injury, and graft tissue fibrosis as well as the expression of fibrosis-associated genes in renal allografts [63].

## Interrogation of Immune Rejection by Urinary Cell mRNA Profiling

Acute rejection is diagnosed using the invasive needle core biopsy procedure. While the procedure has become safer over the years, challenges and complications still exist including sampling error, inter-observer variability, patient being on anticoagulant therapy, bleeding, arteriovenous fistula, graft loss, and even death [64–66]. The financial costs of the procedure are substantial as well and reported to average about \$3,000 [67]. With an estimated incidence of 0.4 biopsies/patient during the first year of transplantation, about 7,000 biopsies at a cost of \$21 million are estimated to have been done during the first year of transplantation in the 17,671 patients who received their kidney grafts in 2011 [1, 68].

## Development of urinary cell mRNA profiling as a noninvasive predictive and diagnostic tool

Because ACR is distinguished by interstitial inflammation and tubulitis and given that graft infiltrating cells gain entry into the kidney tubular space, we reasoned that the allograft may function as an “in-vivo flow cytometer” and sort cells involved in rejection into the urine (Figure 2) [69]. We therefore hypothesized that mRNA profiling of urinary cells could provide a noninvasive means of diagnosing ACR. We developed quantitative polymerase chain reaction (PCR) assays and mRNA profiling protocols and demonstrated in a series of single center studies that urinary cell levels of mRNA encoding proteins implicated in allograft rejection are predictive and/or diagnostic of ACR in human renal allografts [70–75]. Our original observations and those of others [76] served as the stimuli for the Clinical Trials in Organ Transplantation-04 (CTOT-04) multicenter study.

## Weill Cornell Studies of Urinary Cell mRNA Profiling

We developed highly reproducible methods for urinary cell mRNA profiling [77, 78] and quantification of mRNA abundance [79] and examined whether levels of mRNA encoding cytotoxic attack molecules – perforin and granzyme B – are informative of human kidney allograft status. With the use of competitive quantitative PCR assays and gene specific novel DNA competitors designed and developed in our laboratory we found that urinary cell levels of mRNA for perforin predicted ACR with a sensitivity of 83% and a specificity of 83% while granzyme B mRNA levels predicted ACR with a sensitivity of 79% and a specificity of 77% [70].

In our subsequent studies, we modified the real time quantitative PCR assay to quantify absolute levels of mRNA [80]. We developed a “universal” standard curve (i.e., a single standard curve for multiple mRNAs of interest) using a synthetic amplicon for absolute quantification of transcripts in the urinary cells. With the use of real time quantitative PCR assays, we found that not only levels of perforin and granzyme B are higher in urinary cells from patients with AR compared to those without AR but also the levels of serine proteinase inhibitor-9 (PI-9), an endogenous antagonist of granzyme B [72].

Intraepithelial homing of T cells is contingent upon the cell surface expression of CD103 protein [81, 82]. Since acute cellular rejection is exemplified by tubulitis with intraepithelial

homing of alloreactive T cells [83], we reasoned that urinary cell levels of CD103 would be diagnostic of ACR in the kidney allograft. This hypothesis was validated by the finding that urinary cell levels of CD103 mRNA are higher in patients with ACR compared to those without ACR [71].

Chemokines and their receptors play a primary role in the trafficking of cells to inflammatory sites [84]. We hypothesized that urinary cell level of IP-10 and its receptor CXCR3 would help capture intragraft inflammation. Our research hypothesis was also based on elegant pre-clinical experimental studies implicating IP-10 and CXCR3 in inflammatory diseases including allograft rejection [85, 86]. We found that AR is indeed predicted with a sensitivity of 100% and a specificity of 78% using urinary cell levels of IP-10 mRNA, and with a sensitivity of 63% and a specificity of 83% using urinary cell levels of CXCR3 mRNA [73].

In view of the dominant role of regulatory T cells (Treg) cells in the maintenance of self-tolerance [87], and in view of the suppressive role of Treg in experimental models of transplantation tolerance [88, 89], we reasoned that measurement of mRNA for FoxP3, a specification factor of Treg, in urinary cells might provide insight into the outcome of an episode of AR. Due to low abundance of RNA present in urinary cells, we further modified the standard quantitative real time (RT)-PCR assay to a two-step PCR assay involving an initial pre-amplification step that enables measurement of multiple mRNA species from very small quantities of total RNA. With the use of pre-amplification enhanced PCR assays, we identified that FoxP3 mRNA levels are not only increased in patients with AR but also predicted reversal of AR with 90% sensitivity and 73% specificity as well as graft failure within 6-months after the incident episode of AR [74].

Co-stimulatory receptors and negative regulatory receptors on immune cells play a critical role in allograft rejection and tolerance. The OX40/OX40L proteins have also been implicated in regulating the emergence of Tregs and modulating their suppressive activity. A novel T-cell inhibitory pathway involves PD-1 and its ligands, PD-L1 and PD-L2 [90, 91]. In studies designed to characterize the expression patterns of co-stimulatory/inhibitory molecules in urinary cells during an episode of ACR, we found that urinary cell mRNA levels of OX40, OX40L, PD-1 but not the levels of PD ligand 1 or PD ligand 2 are significantly higher in the urinary cells from the AR group than the stable group. Within the AR group, levels of mRNA for OX40, OX40L and Foxp3 predicted AR reversal, while OX40 mRNA levels predicted graft failure after AR [75].

### **Clinical Trials in Organ Transplantation-04 (CTOT-04) study**

CTOT-04 is a National Institutes of health (NIH) sponsored prospective observational multicenter study designed to investigate whether urinary cell levels of mRNA encoding for the CD3 $\epsilon$ , perforin, granzyme B, PI9, CD103, IP-10 and CXCR3, ascertained at the time of biopsy, are diagnostic of AR and to determine whether mRNA profiles of sequential urine specimens obtained at clinically stable time points predict the development of AR. We measured two additional transcripts (TGF- $\beta$ 1 mRNA and 18S rRNA) for quality control. In CTOT-04, 497 kidney transplant recipients were enrolled at 5 clinical sites and 485 of the

497 provided 4300 urine specimens for urinary cell mRNA profiling. Among the 485 patients, 220 had at least one renal allograft biopsy for clinical (for-cause) or surveillance reason. We designed CTOT-04 as an observational study with each of the 5 participating sites being able to use site-specific immunosuppression and infection protocols with the rationale that urine mRNA profiling results should be generalizable to the kidney transplant population and not be restricted by the immunosuppressive regimen used in any one clinic. We used WCMC protocol to obtain urine samples (~50 ml) sequentially with a pre-specified schedule for collection (post-transplant days 3, 7, 15 and 30 and months 2, 3, 4, 5, 6, 9 and 12, and at the time of any kidney allograft biopsy- before treatment and at 2 weeks after biopsy). Urine cell pellets were prepared at the clinical sites, stored at  $-80^{\circ}\text{C}$  and shipped in batches to our Gene Expression Monitoring Core at Weill Cornell.

### RNA yield from urinary sediments

We isolated total RNA from the urinary cell pellets using a commercial kit (PureLink™ Micro-to-Midi total RNA purification system, Invitrogen) and measured the RNA quantity (absorbance at 260 nm) by NanoDrop® ND-1000 UV spectrophotometer. We examined whether the amount of RNA isolated from the urinary sediment varied by allograft diagnosis and/or clinical status of the graft recipient. In the CTOT-04 study, urine collection, urine sediment preparation and RNA isolation were all performed using the protocol developed in our laboratory and all RNA quantification was carried out using NanoDrop® ND-1000 UV spectrophotometer. Our data analysis showed that the total amount of RNA isolated from the urine sediment does not vary by allograft diagnosis and/or clinical status. The amount of total RNA isolated from the urine sediment (median and 25th percentile and 75th percentile) was 582 ng (381 ng and 973 ng) in the 43 biopsy-matched urine specimens collected from 34 kidney graft recipients with biopsies showing ACR (ACR Biopsy group), 476 ng (309 ng and 760 ng) in the 163 biopsy-matched urine specimens collected from 126 kidney graft recipients with biopsies showing no rejection (No Rejection Biopsy group), and 534 ng (307 ng and 918 ng) in the 1540 urine specimens from the 202 kidney graft recipients with stable graft function (Stable Function group) ( $P=0.662$ , one-way ANOVA).

### Reverse transcription to cDNA

Prior to reverse transcription of the RNA to cDNA, and irrespective of the amount of RNA isolated from an individual urine specimen, the RNA isolated from all urine specimens were adjusted to a concentration of  $1\mu\text{g}$  in  $100\mu\text{l}$  volume. This adjustment of RNA to a consistent concentration prior to reverse transcription nullifies any differences in urinary sediment size or RNA yield contributing to differences in mRNA copy number ascertained in the PCR assays. On the other hand, the type of cells (immune cells vs. renal parenchymal cells), the activation status of the cells and their state of differentiation could contribute to the differences in mRNA copy number in the urine of patients with ACR compared to stable graft function group. Transcripts were then quantified by quantitative RT-PCR assay and expressed as copies/ $\mu\text{g}$  total RNA. Urine samples were considered quality control passed if in a given sample the 18S rRNA copy number was  $5\times 10^7$  and TGF- $\beta$ 1 mRNA copy number was  $1\times 10^2$  copies/ $\mu\text{g}$  RNA. With these parameters, 3559 (83%) of the 4300 urine samples were classified as quality control passed.

## Urinary cell mRNA levels diagnostic of ACR

We investigated the hypothesis that urinary cell levels of mRNA are diagnostic of ACR. We tested this by measuring the 8 pre-specified mRNAs in 43 urine samples matched to 43 ACR biopsies from 34 patients and comparing the levels to those found in 163 samples matched to 163 biopsies without rejection (No Rejection Biopsy group, 126 patients) and 1540 samples from the Stable (no Biopsy) group (201 patients with urine specimens). In this aspect of CTOT-04 study, our objective was to examine whether the urine sample would serve as a surrogate for the invasive biopsy procedure. Thus, we used matched urine samples in those who underwent a biopsy. In those who did not undergo a biopsy (Stable [no biopsy] group), all QC-passed samples were analyzed. In accord with the research hypothesis, 18S-normalized levels of mRNA for CD3 $\epsilon$ , perforin, granzyme B and IP-10 in urinary cells differed significantly among the ACR, No Rejection Biopsy, and Stable (no biopsy) groups ( $P < 0.0001$  for all 4 mRNAs). Pairwise group comparisons showed that the levels of mRNA for CD3 $\epsilon$ , perforin, granzyme B and IP-10 in the ACR group were higher than the levels in the No Rejection Biopsy group ( $P < 0.0001$  for all 4 mRNAs) and the Stable (no biopsy) group ( $P < 0.0001$  for all 4 mRNAs). The 18s rRNA normalized levels of mRNA for CXCR3 ( $P = 0.06$ ), CD103 ( $P = 0.13$ ) and PI-9 ( $P = 0.38$ ) were not associated with ACR, in contrast to our single center studies. The reasons may include analysis of levels of mRNA for association with ACR without 18S rRNA normalization in our earlier single center studies versus analysis of levels of mRNA for association with ACR after 18S rRNA normalization in the CTOT-04 study. This is critical as non-normalized urinary cell levels of mRNA for CD103 ( $P < 0.0001$ ), CXCR3 ( $P < 0.0001$ ) and PI-9 ( $P = 0.002$ ) were all significantly associated with ACR in the CTOT-04 study in accord with our previous studies.

## Development of a model for the diagnosis of ACR

We next developed a prediction model comprised of linear combination of mRNAs to accurately diagnose ACR. A 3-gene model of 18S-normalized CD3 $\epsilon$  mRNA, 18S-normalized IP-10 mRNA and 18S rRNA (all log<sub>10</sub>-transformed) emerged as the best-fitting parsimonious model, yielding a diagnostic signature ( $-6.1487 + 0.8534 \log_{10}(\text{CD3}\epsilon/18\text{S}) + 0.6376 \log_{10}(\text{IP-10}/18\text{S}) + 1.6464 \log_{10}(18\text{S})$ ). This 3-gene signature had an area under the curve (AUC) of 0.85 (95% CI 0.78 to 0.91,  $P < 0.0001$ ). Our 3-gene formula incorporated 18S-normalized CD3 $\epsilon$  mRNA and IP-10 mRNA and 18S rRNA. The rationale for incorporating both 18S-normalized mRNAs measures and 18S rRNA in the equation were (i) normalization ensures that the levels of target mRNAs (e.g., IP-10 mRNA) are altered above and beyond the alteration observed with the reference gene in a given sample; (ii) normalization is a recommended guideline for reporting PCR assay results [92]; and (iii) the formula for reporting the levels of mRNA measured using real time PCR assays incorporates delta C<sub>T</sub> that is derived by subtracting the C<sub>T</sub> of reference mRNA from the C<sub>T</sub> of the target mRNA [93]. In view of these considerations, we normalized each of the mRNAs measured using the reference gene, 18S rRNA, and examined for differences in the normalized measures among the three diagnostic groups: ACR Biopsy group, the No Rejection Biopsy group and the Stable Function group (Figure 2 and Table S6A in [17]). The absolute quantification protocol used in our study enabled the discovery that the levels of 18S rRNA, reported to vary less than most genes recommended as reference genes [94], are also significantly different between the ACR Biopsy group and the No Rejection Biopsy Group

or the Stable Function group (Table S6B in [17]). We entered all normalized mRNA measures and the 18S rRNA in a full linear logistic regression model and found that following backward elimination ACR is best predicted by the parsimonious model of normalized measures of CD3 $\epsilon$  mRNA and IP-10 mRNA and 18S rRNA. In an internal cross validation using bootstrap resampling, we also found that 18S rRNA enters the model 99% of the time. We were cognizant that the incorporation of 18S normalized measures and 18S rRNA in the same equation mostly cancels out normalization of target mRNA with 18S rRNA. Nevertheless, we retained 18S rRNA in the 3-gene formula since normalized mRNA measures were used in our comparisons of three diagnostic groups and because a non-normalized, 2-gene formula of CD3 $\epsilon$  mRNA and IP-10 mRNA performed in an identical fashion to the 3-gene formula containing normalized measures of CD3 $\epsilon$  mRNA and IP-10 mRNA and 18S rRNA (AUC 0.8447 vs. 0.8454).

### Performance characteristics of the model

Using the cutpoint of  $-1.213$ , which maximized Youden's index, our diagnostic signature was 79% sensitive and 78% specific to distinguish ACR biopsies from No Rejection biopsies. Besides the good discrimination, the model was well calibrated as well (Hosmer-Lemeshow  $\chi^2=4.84$ ,  $p=0.77$ ). The inclusion of granzyme B or perforin did not significantly improve the diagnostic signature based on IP-10, CD3 $\epsilon$  and 18s. This should not detract from the fact that when considered alone, 18S-normalized levels of granzyme B and perforin are strongly associated with ACR in CTOT-04. Similarly the AUC for the combination of 18S-normalized mRNAs of perforin, IP-10 and 18S rRNA was 0.84 (95% CI: 0.78 to 0.90;  $P<0.0001$ ), only slightly lower than that of our best diagnostic signature, and this combination discriminated ACR biopsies with a sensitivity of 77% and a specificity of 76%. This signature correlated very highly ( $r=0.93$ ) with our 3-gene diagnostic signature.

### Validation of the model

We used bootstrap validation to internally validate our model. In an initial set of 500 bootstrap samples, 18S-normalized CD3 $\epsilon$ , 18S-normalized IP-10 and 18S remained in the final backwards elimination models more often than any of the other 6 mRNA measures. Bootstrap validation of this 3-gene model yielded an optimism-corrected estimate of the AUC of 0.83, an estimate of the expected value of the AUC in independent samples not used to derive the diagnostic signature. Thus, the diagnostic model was generalizable and did not show overfitting.

### Urinary Cell 3-Gene Signature Predicts Future Development of ACR

The CTOT-04 study was also designed to determine whether mRNA profiles of sequential urine specimens obtained at clinically stable time points predict (anticipate) the development of AR. This analysis showed that the 3-gene signature predicted the future development of AR as well. Figure 3 shows the average within-person trajectories of the diagnostic signature, looking backwards from the time of biopsy (time=0), for the ACR biopsy group and the No Rejection Biopsy group. The trajectories between the two groups were statistically significant ( $P<0.0001$ ). In the group of patients in whom the biopsy findings showed no rejection, the score of the diagnostic signature remained relatively flat and well below the diagnostic threshold prior to the biopsy. It did not increase at the time of biopsy or



at anytime during the 270 days preceding the biopsy. However in the group of patients in whom the first biopsy specimen showed ACR, the score of the diagnostic signature started to increase around 130 days prior to the biopsy with further marked increase during the 20-day period prior to the biopsy diagnosis of ACR.

### **Additional Attributes of the Urinary Cell 3-Gene signature**

The 3-gene diagnostic signature was specific for ACR. The signature had an AUC of 0.78 (95% CI: 0.68 to 0.89,  $P < 0.0001$ ) to distinguish the 43 biopsy confirmed ACR from the 31 biopsy confirmed other rejections (Borderline changes, antibody mediated rejection [AMR] or CAN). We next examined whether the 3-gene signature functions as a response-predictive biomarker. Among 43 ACR biopsies with paired urine samples, 32 had quality control-passed urine samples collect at  $14 \pm 7$  days after the incident ACR biopsy. A comparison of the diagnostic signature values showed a significant decrease from  $-0.37$  at the time of ACR biopsy to  $-0.86$  at  $14 \pm 7$  days post-biopsy ( $P = 0.05$ ). We further compared the decrease in the value for the diagnostic signature according to whether the patient was a “responder”, defined as the follow-up estimated glomerular filtration rate (eGFR) being no higher than it was at the time of the ACR biopsy or a non-responder to the initial anti-rejection therapy. eGFR data were available at the time of biopsy and at the follow-up time for 25 of the 32 samples and among these 25, 21 were responders and the remaining 4 were non-responders based on the above criterion. In the 21 responders, the value for the diagnostic signature decreased significantly from the baseline value of  $-0.43$  to  $-1.08$  at  $14 \pm 7$  days post biopsy ( $P = 0.05$ ); in the small number of non-responders, the decrease in the value from  $+0.12$  to  $-0.80$  was even greater than in the responders ( $0.92$  vs.  $0.65$ ), but was not statistically significant ( $P = 0.20$ ). Of note, the non-responders had higher levels of the diagnostic signature at the time of biopsy and two weeks later, and among the 21 responders, 7 did not show a decrease in the value of the diagnostic signature.

The 3-gene signature was diagnostic in patients who underwent for-cause biopsies as well as in those who underwent surveillance biopsies and was similarly diagnostic across transplantation sites. The score of the diagnostic signature was not associated with the Banff grade for ACR. The urine samples from patients who received induction therapy with interleukin-2 receptor antibodies, as compared with those from patients who received T-cell-depleting antibodies, had a higher diagnostic score ( $P < 0.001$ ) especially during the first month after transplantation, but the signature was diagnostic of ACR with either type of induction therapy. The diagnostic signature was not associated with urinary tract infection, blood infection or CMV infection (all  $P > 0.05$ ) but was associated with BK virus infection ( $P = 0.03$ ). The mean diagnostic score at 4 to 6 months was associated with a decline of 30% or more in renal allograft function from 6 to 12 months (odds ratio, 2.66; 95% CI, 1.45 to 4.87;  $P = 0.002$ ).

### **Urinary Cell mRNA Profiles Predictive of Chronic Rejection/IF/TA**

We have developed a molecular signature based on urinary cell mRNA profile for the noninvasive diagnosis of kidney allograft fibrosis (IF/TA) [95]. We collected 114 urine samples at the time of an allograft biopsy from 114 kidney allograft recipients; 48 biopsies from 48 patients were classified as IF/TA, and 66 biopsies from 66 patients were classified

as normal biopsies. The biopsies classified as IF/TA were clinically indicated biopsies and the normal biopsies were surveillance biopsies. We specifically chose a pristine control group—urine samples from patients with normal biopsy findings in their surveillance biopsies, as the use biopsies with AR, calcineurin toxicity, or BK virus nephropathy as controls, may have compromised the development of a robust biomarker that distinguishes biopsy specimens with IF/TA from biopsy specimens without IF/TA as each of these conditions may be associated with some degree of fibrosis.

The biopsy-matched urine samples were centrifuged and RNA was extracted from the urine cell pellet and reverse-transcribed to cDNA. We designed oligonucleotide primers and fluorogenic probes for the measurement, by preamplification enhanced RT-PCR assay, of absolute levels of 22 mRNAs of genes associated with fibrosis and the endogenous control 18S rRNA. Our urinary cell mRNA panel was designed with due consideration that multiple cell types and an inflammatory milieu contribute to the development of fibrosis and that fibrosis is characterized by the accumulation of extracellular matrix proteins. Our study cohort was portioned in to a discovery cohort and a validation cohort and statistical analysis, in addition to protecting against type I error, involved the use of LOESS (locally weighted scatterplot smoothing) methods to elucidate the potentially non-linear relationship between two variables since it has the advantage of fitting segments of data without pre-specifying a specific, usually linear, global function.

Levels of 12 of the 22 mRNAs (vimentin, HGF,  $\alpha$ -SMA, fibronectin 1, perforin, PAI1, TGF- $\beta$ 1, TIMP1, granzyme B, FSP1, CD103, and collagen 1A1) were significantly associated ( $P<0.05$ ) with the diagnosis of IF/TA. Of the individual mRNAs, vimentin and HGF had the highest AUCs and a multigene prediction model of IF/TA was developed around vimentin because of vimentin's potential to contribute to the pathogenesis of fibrosis. Interestingly, after controlling for vimentin mRNA level and the quadratic relationship of 18S rRNA level, we found that none of the previously significant predictors but two of the previously non-significant predictors, mRNA for tubular transporter NKCC2 and tubular epithelial cell adhesion molecule E-cadherin, became statistically significant. The composite score based on the 4-gene signature of vimentin, NKCC2, E-cadherin and 18S rRNA was highly associated with the diagnosis of IF/TA. The AUC for 4-gene signature was 0.95 (95%CI: 0.90 to 0.99,  $P<0.0001$ ) and with the use of the optimal cutpoint of 4.5, the composite score predicted IF/TA with a sensitivity of 93.8% (95%CI: 85.4 to 99.9%) and a specificity of 84.1% (95%CI: 73.3 to 94.9%).

We then validated the final diagnostic equation predicting IF/TA in an independent validation set of 38 kidney graft recipients, 16 with biopsy-proven IF/TA and 22 with normal allograft biopsy results. This 4-gene signature was accurately diagnostic of IF/TA; the AUC for the diagnosis of fibrosis in the independent validation set was 0.89 (95%CI: 0.78 to 0.99,  $P<0.0001$ ). At the composite score cutpoint of 4.5, derived in the discovery set, IF/TA was diagnosed in the validation set with a sensitivity of 87.5% (95%CI: 71.3 to 99.9%) and a specificity of 77.3% (95%CI: 59.8 to 94.8%). We examined the fit of the prediction model by dividing the discovery and validation sets into sextile of the composite score. Based on the Hosmer-Lemeshow test, the fit between the observed and the predicted number of subjects with IF/TA in each of the sextile was excellent ( $P=0.69$ ) in the discovery

set. For the validation set, the P-value was 0.04, suggesting a good fit, given that this set was not involved in the estimation of the model (Figure 4).

## Concluding Remarks

Our urinary cell mRNA profiling studies have shown considerable robustness in diagnosing AR and IF/TA in the kidney allograft and has the potential to provide mechanistic insights regarding allograft rejection and IF/TA (Figure 5) [69]. It is noteworthy that the multi-center CTOT-04 trial has not only validated the accuracy of urinary cell mRNA profiling for the detection of ACR in single center studies but also the utility of urinary cell mRNA profiles for the prediction of future occurrence of an ACR. It is also noteworthy that the reproducibility of the urinary cell mRNA protocols across laboratories has been examined and the overall, gene expression measurements had a correlation greater than 0.938 for the samples in this independent study [96].

Several challenges remain regarding urinary cell mRNA profiling; can it replace the use of renal biopsy in many instances where a for-cause biopsy or a surveillance biopsy is currently performed; can we utilize a standardized urinary gene mRNA profiling protocol as a monitoring tool to prevent the development of overt AR; can we develop a urinary mRNA gene signature that will predict the response to anti-rejection treatment? Should in-vivo immune status of the kidney allograft be reflected accurately by urinary cell mRNA profiles, transition from the current “one-size fits all” immunosuppressive regimen to a personalized immunosuppressive regimen could be realized [97]. Recent technical advances such as massively parallel sequencing should help identify additional candidate biomarkers informative of diagnosis and prognosis of allograft status and inform gene expression studies performed in our laboratory and elsewhere.

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## Abbreviations

<b>AR</b>	Acute rejection
<b>ACR</b>	Acute cellular rejection
<b>AMR</b>	Acute antibody mediated rejection

<b>AUC</b>	Area under the curve
<b>CAN</b>	Chronic allograft nephropathy
<b>cdNA</b>	Complementary deoxy ribonucleic acid
<b>CTOT-04</b>	Clinical Trials in Organ Transplantation-04
<b>ESRD</b>	End stage kidney disease
<b>IF/TA</b>	Interstitial fibrosis/tubular atrophy
<b>LOESS</b>	Locally weighted scatterplot smoothing
<b>mRNA</b>	messenger ribonucleic acid
<b>NIH</b>	National Institutes of health
<b>RT-PCR</b>	Real-time polymerase chain reaction
<b>TGF-<math>\beta</math>1</b>	Transforming growth factor beta 1

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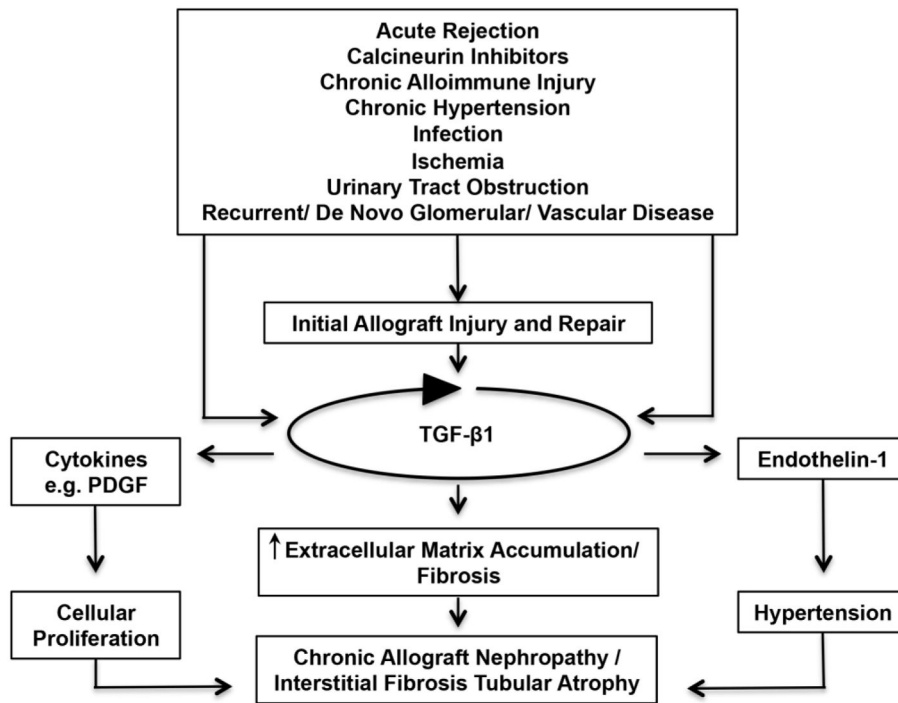
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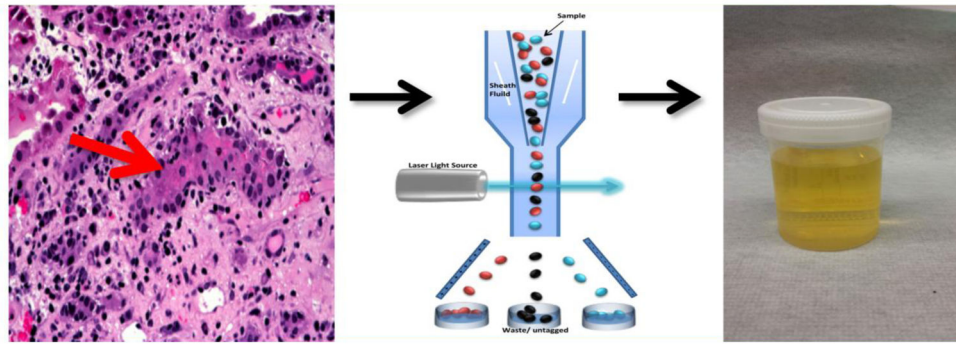


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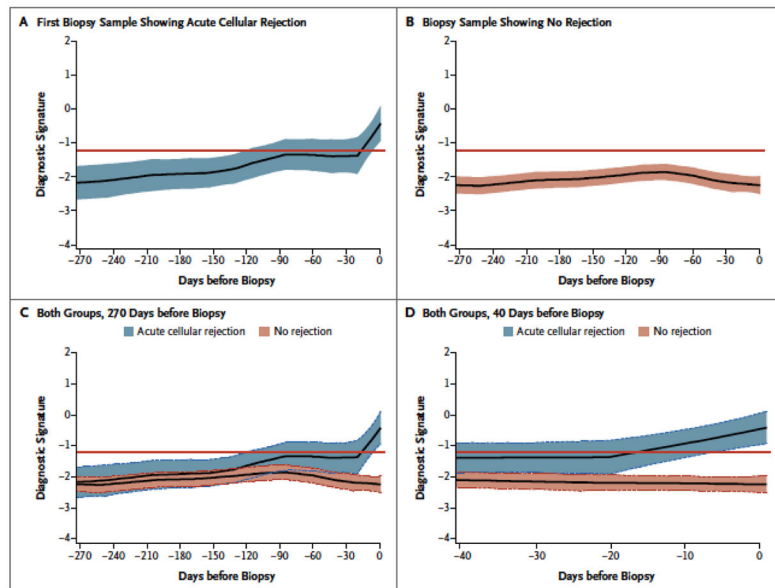
**Figure 1. A TGF-beta1- centric hypothesis for chronic rejection/chronic allograft nephropathy/ chronic allograft damage**

In this formulation, both immune and nonimmune factors are responsible for the allograft damage and the attendant repair, and the relative contributions of immune and nonimmune forces vary based on genetic determinants and clinical interventions. In this TGF- $\beta$ -centric hypothesis, intrarenal over-expression of TGF- $\beta$  represents a critical and self-perpetuating pathogenetic event for the progressive damage to the kidney allograft and attendant decline in graft function. A therapeutic implication of this conceptualization is that TGF-beta1 blockade may be of benefit in minimizing kidney allograft damage. However, TGF-beta1 is also a potent immunosuppressant and likely contributes to allograft graft protection and/or tolerance and TGF-beta blockade could lead to allograft rejection. Selective blockade (i.e., blocking the fibrogenic arm but not the immunoregulatory arm) is desirable but remains an unmet challenge.



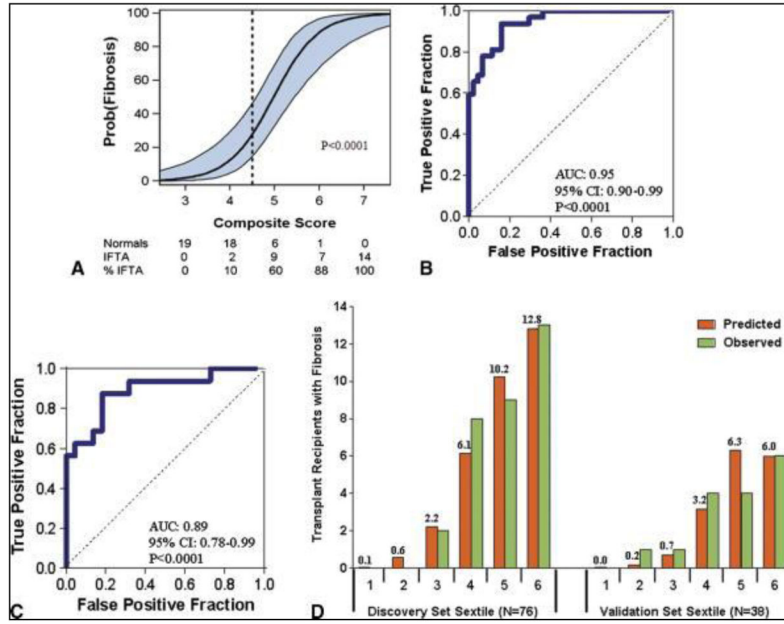
**Figure 2. Conceptualization of the kidney allograft as an in-vivo flow cytometer**

Interstitial inflammation and tubulitis are the histological hallmarks of acute cellular rejection in the kidney allograft (left panel). Since acute cellular rejection involves the exit of T-lymphocytes from the intravascular space and gain of entry into the tubular space, the kidney allograft could be considered to function as an in-vivo flow cytometer (middle panel) facilitating the entry of graft destructive/protective T-lymphocytes, other immune cells and graft parenchymal cells into the urinary space and become available for gene expression profiling.



**Figure 3. Noninvasive Diagnosis of Acute Cellular Rejection: Retrospective Trajectory of Three-Gene Diagnostic Signature as a Function of Time Prior to Biopsy Diagnosis of Acute Cellular Rejection**

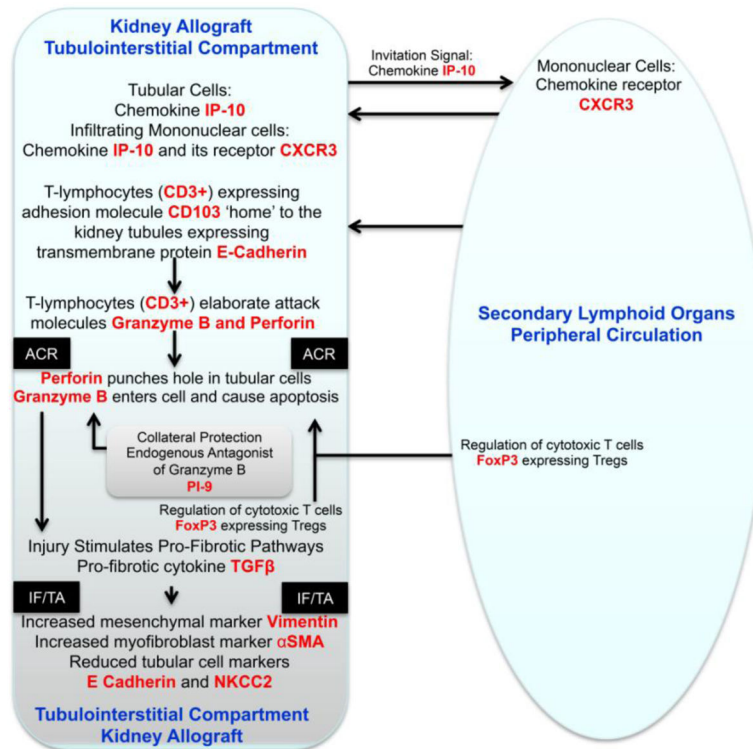
The LOESS-smoothed average within-person retrospective trajectory of the diagnostic signature (i.e., the trajectory as a function of the time before biopsy) in urine samples obtained at or before biopsy that passed quality control are shown for the group of 38 kidney graft recipients with first biopsy specimens showing acute cellular rejection (201 urine samples) (Panel A) and the group of 113 patients with specimens showing no rejection (833 urine samples) (Panel B). The diagnostic signature remained relatively flat and well below the 1.213 threshold that was diagnostic of acute cellular rejection during the 270 days before biopsy in the group of patients with biopsy findings showing no rejection (Panel C). There was a significant difference in the trajectories between the acute cellular rejection group and no rejection biopsy group, with a marked increase in the diagnostic signature during the 20-day period before the first specimen showing acute cellular rejection ( $P < 0.001$ ) (Panel D). The y-axis values are diagnostic-signature scores without intrinsic units of measurement and they were calculated from the logistic-regression equation ( $6.1487 + 0.8534 \log_{10}[\text{CD}3\epsilon / 18\text{S}] + 0.6376 \log_{10}[\text{IP-10}/18\text{S}] + 1.6464 \log_{10}[18\text{S}]$ ). Absolute levels of CD3 $\epsilon$  mRNA, IP-10 mRNA, and 18S rRNA in the cells from each urine sample were measured by polymerase-chain-reaction assay, with the units of measurement being copies per microgram of total RNA for each mRNA measure and copies ( $\times 10^{-6}$ ) per microgram of total RNA for 18S rRNA. The mRNA copy numbers were 18S-normalized by dividing the mRNA copy number by the 18S rRNA copy number in the same sample, and the ratio was  $\log_{10}$ -transformed. In all panels the colored bands represent the 95% confidence interval for the LOESS-smoothed average.



**Figure 4. Noninvasive Diagnosis of IF/TA in the Kidney Allograft: Discovery and Validation of Urinary Cell Four-Gene Composite Score**

To predict IF/TA in the Discovery set, we calculated a composite score based on a logistic model, from levels of vimentin mRNA, NKCC2 mRNA and E cadherin mRNA and the 18S rRNA (4-gene signature) in urine samples obtained from the 32 kidney graft recipients with biopsy-confirmed IF/TA and 44 subjects with stable graft function and with normal allograft biopsy results. The composite score of the 4-gene signature predicted IF/TA with high accuracy. Panel A shows the predicted probability of IF/TA (Y-axis) as a logistic function of the composite score of the 4-gene signature (X-axis). The blue band represents the 95% confidence interval of the composite score. Panel B shows the receiver-operating-characteristic curve for the diagnosis of IF/TA using the composite score. The diagnostic model had an area under the curve of 0.95 (95% CI: 0.90 to 0.99,  $P < 0.0001$ ). At a cutpoint or 4.5, IF/TA was diagnosed with a specificity of 84.1% (95% CI: 73.3 to 94.9%) and a sensitivity of 93.8% (95% CI: 85.4 to 99.9%) in the discovery set. We used the final prediction equation derived from the discovery set to calculate the predicted probability of IF/TA in the validation set of 38 kidney transplant recipients; 16 with biopsy-confirmed IF/TA and 22 with stable graft function and normal allograft biopsy results. Panel C shows the receiver-operating characteristic curve of the composite score (derived from the equation used in the discovery set) applied to the validation set for the diagnosis of IF/TA. The area under the curve for the diagnosis of IF/TA in the validation set was 0.89 (95% CI: 0.78 to 0.99,  $P < 0.0001$ ). At the original composite score cutpoint of 4.5 derived from the discovery set, IF/TA was diagnosed in the validation set with a specificity of 77.3% (95% CI: 59.8 to 94.8%) and a sensitivity of 87.5% (95% CI: 71.3 to 99.9%). Panel D shows the predicted and observed number of kidney graft recipients with IF/TA for each sextile of the composite score within the discovery and validation sets. Based on the Hosmer-Lemeshow test, the fit between the observed and the predicted number of subjects with IF/TA in each of the sextiles was excellent ( $P = 0.69$ ) in the discovery set (left half of Fig. 4D). For the validation

set (right half of Fig. 4D), the P value was 0.04, suggesting a good fit, given that this set was not involved in the estimation of the model.



**Figure 5. Key Molecular Events During Acute Cellular Rejection of the Kidney Allograft**

The immune repertoire contributing to acute cellular rejection involves multiple cell types, cytokines and chemokines and their ligands. T-lymphocytes are the principal effector cells and dendritic cells are the primary antigen presenting cells. In this minimalist model, the chemokine IP-10 and its receptor CXCR3, expressed on T-lymphocytes, facilitate the trafficking of alloreactive T-lymphocytes in to the kidney graft. Intraepithelial homing of the T-lymphocytes is then effected by the physical interaction between CD103 expressed on the T-lymphocytes and E-cadherin displayed on the kidney tubular epithelial cells. The activated/alloreactive T-lymphocytes then employ perforin and granzyme to mediate parenchymal cell damage, which is antagonized in part by the endogenous antagonist proteinase inhibitor-9 (PI-9). Counter-regulatory forces are exerted by FoxP3 expressing regulatory T-lymphocytes (Tregs) and help dampen the anti-allograft response and the ultimate outcome of an episode of acute rejection is determined in part by the balance between the graft destructive cells such as cytotoxic T cells and graft protective Tregs. Although the cells with different functional attributes are depicted here to have distinct pedigrees, transition from one functional type to another (plasticity) is feasible based on the cells versatility and environmental cues. In this T-lymphocyte -centric formulation deterministic of allograft destiny, the antigen-experienced T-lymphocytes provide help to B-lymphocytes and facilitate antibody-mediated rejection. Acute rejection is a precursor of chronic rejection manifested histologically by interstitial fibrosis/tubular atrophy (IF/TA). Acute rejection-associated tissue injury, de-differentiation and repair (epithelial/endothelial-mesenchymal transition) contribute to the pathogenesis of IF/TA and progressive loss of allograft function. The levels of mRNA encoding vimentin,  $\alpha$ SMA, E-cadherin and NKCC2 in urinary cells reflect the cellular events associated with IF/TA quantitatively. The mRNAs,

colored red in the schematic illustration, have all been detected and quantified using urinary cell mRNA profiling and found to be associated with human kidney allograft status.