

RESEARCH ARTICLE

# Functional Genomic Analysis Identifies Indoxyl Sulfate as a Major, Poorly Dialyzable Uremic Toxin in End-Stage Renal Disease

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## Abstract

### Background

Chronic renal failure is characterized by progressive renal scarring and accelerated arteriosclerotic cardiovascular disease despite what is considered to be adequate hemodialysis or peritoneal dialysis. In rodents with reduced renal mass, renal scarring has been attributed to poorly filtered, small protein-bound molecules. The best studied of these is indoxyl sulfate (IS).

### Methods

We have attempted to establish whether there are uremic toxins that are not effectively removed by hemodialysis. We examined plasma from patients undergoing hemodialysis, employing global gene expression in normal human renal cortical cells incubated in pre- and post-dialysis plasma as a reporter system. Responses in cells incubated with pre- and post-dialysis uremic plasma (n = 10) were compared with responses elicited by plasma from control subjects (n = 5). The effects of adding IS to control plasma and of adding probenecid to uremic plasma were examined. Plasma concentrations of IS were measured by HPLC (high pressure liquid chromatography).

### Results

Gene expression in our reporter system revealed dysregulation of 1912 genes in cells incubated with pre-dialysis uremic plasma. In cells incubated in post-dialysis plasma, the expression of 537 of those genes returned to baseline but the majority of them (1375) remained dysregulated. IS concentration was markedly elevated in pre- and post-dialysis plasma. Addition of IS to control plasma simulated more than 80% of the effects of uremic

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plasma on gene expression; the addition of probenecid, an organic anion transport (OAT) inhibitor, to uremic plasma reversed the changes in gene expression.

## Conclusion

These findings provide evidence that hemodialysis fails to effectively clear one or more solutes that effect gene expression, in our reporter system, from the plasma of patients with uremia. The finding that gene dysregulation was simulated by the addition of IS to control plasma and inhibited by addition of an OAT inhibitor to uremic plasma identifies IS as a major, poorly dialyzable, uremic toxin. The signaling pathways initiated by IS and possibly other solutes not effectively removed by dialysis may participate in the pathogenesis of renal scarring and uremic vasculopathy.

## Introduction

The dramatic improvement in uremic symptoms following hemodialysis treatment in patients with acute renal failure [1] and the demonstration that patients with chronic renal failure could be maintained by chronic hemodialysis [2], contributed greatly to the assumption that uremia was attributable to a small, water soluble substance or substances that could be removed by diffusion across a synthetic dialysis membrane. Urea and creatinine were seen as surrogate markers for filterable uremic toxins and hemodialysis was termed “renal replacement therapy”, (RRT). However, major features of chronic renal failure are largely unaffected by hemodialysis [3–6]. Patients undergoing hemodialysis or peritoneal dialysis have accelerated cardiovascular disease and progressive scarring of the diseased kidney with loss of residual renal function and, ultimately, anuria. Only 52 percent of dialysis patients are still alive three years after the start of treatment by hemodialysis or peritoneal dialysis, with deaths largely secondary to accelerated cardiovascular disease [6,7].

Varying the porosity of dialysis membranes, techniques of hemodialysis, dialysis time and dialysis frequency, while resulting in improved urea and creatinine removal, have resulted in only modest improvements in survival [8–10]. These observations have led to a reevaluation of the contribution of protein-bound or “middle molecules” not effectively removed by conventional dialysis [11]. The European Uremic Toxin (EUTox) Work Group cataloged 88 substances found at higher concentrations in the plasma of uremic patients than in normal individuals, including common solutes such as creatinine and urea [12]. Of these, 46% are free water-soluble low molecular weight compounds, 28% represent “middle” molecules too large to be dialyzed with “conventional techniques”, and 25% represent poorly-dialyzable protein-bound solutes [12–15]. Indoxyl sulfate, an aryl amine, has been identified as a potential uremic toxin responsible for accelerated renal scarring in the rodent remnant kidney model [16–19]. Elevated concentrations of IS have been found in patients with chronic renal failure [19]. It is highly bound to Sudlow site II of albumin which greatly limits filtration across the glomerular capillary membrane and diffusion across conventional synthetic dialysis membranes. The major mechanism responsible for renal excretion of protein-bound solutes is secretion by proximal renal tubular cells [20]. Marquez et al. reported the renal clearance of IS to average 40–51% of the clearance of urea in normal subjects despite 90% binding of IS, indicating renal tubular secretion as the major mechanism responsible for IS excretion [21].

To examine the efficiency of hemodialysis in the clearance of poorly filtered protein-bound uremic solutes, indoxyl sulfate and possibly others, we compared gene expression in

cultured normal human renal cortical cells incubated in pre- and post-dialysis uremic plasma as a reporter system. Renal cortical cells were chosen as a reporter system because the renal tubule, known to be rich in OATs, is both the site of renal excretion of indoxyl sulfate and possibly a target for the toxic effects of IS [22,23].

### Materials and Methods

Heparinized plasma samples were obtained from 10 uremic patients undergoing thrice weekly hemodialysis (Table 1) and 5 control subjects without known renal disease. In uremic patients, blood was drawn from the afferent dialysis access line immediately pre- and post-dialysis.

The effects of uremic plasma on gene expression were assessed in cultured human renal cortical cells. Plasma IS concentration was measured by MS-HPLC.

The study was approved by the New York University Institutional Review Board. Patients were recruited from the Lower Manhattan Dialysis Center in NYC. All participants provided witnessed, written informed consent to participate in this study. The consent forms, which were approved by the NYU IRB, were maintained in the files of the Principal Investigator.

### Cells and Incubation

Non-immortalized human renal cortical cells were purchased from Innovative BioTherapies (Ann Arbor, MI). These human cells, were isolated and cultured in the same manner as porcine cells, previously described [24], which were reported to retain transport properties typical for proximal tubular cells. Bicarbonate transport was decreased with acetazolamide, active glucose transport was suppressed with phlorizin, Na<sup>+</sup>/K ATPase activity was inhibited by ouabain, and para-aminohippurate (PAH) secretion was diminished with the transport inhibitor, probenecid. Porcine and human renal cortical cells, isolated by the technique employed by Innovative BioTherapies, were observed grow to confluence as a homogeneous layer [25]. While the possibility that the cell preparation we employed contained non-epithelial cells, mesangial or vascular smooth muscle cells, was not excluded by immunofluorescence staining, the homogeneous

Table 1. Characteristics of subjects with ESRD.

|                            | Patient | Patient Characteristics |             |                      |                           |                               | Plasma Markers                |                   |                    |                               |                   |
|----------------------------|---------|-------------------------|-------------|----------------------|---------------------------|-------------------------------|-------------------------------|-------------------|--------------------|-------------------------------|-------------------|
|                            |         | Gender                  | Age (Years) | Etiology             | Time on Dialysis (Months) | 24 Hour Urine Output (Ounces) | Pre-D Cr <sup>1</sup> (mg/ml) | Pre-D BUN (mg/dl) | Post-D BUN (mg/dl) | Pre-D IS <sup>2</sup> (µg/ml) | Post-D IS (µg/ml) |
| Residual Renal Function    | 1       | M                       | 47          | DM <sup>3</sup>      | 36                        | 12–18                         | 9.38                          | 63                | 20                 | 70.21                         | 44.14             |
|                            | 2       | M                       | 70          | DM                   | 108                       | 18–24                         | 6.1                           | 55                | 14                 | 42.67                         | 26.7              |
|                            | 3       | F                       | 64          | DM                   | 3                         | 18                            | 4.45                          | 42                | 7                  | 12.32                         | 5.71              |
|                            | 4       | M                       | 59          | DM                   | 60                        | 12                            | 4.27                          | 38                | 11                 | 28.55                         | 18.63             |
|                            | 5       | M                       | 42          | DM                   | 7                         | 9                             | 7.25                          | 63                | 21                 | 28.33                         | 19.41             |
| No Residual Renal Function | 6       | M                       | 28          | Transplant Rejection | 36                        | 0                             | 13.28                         | 47                | 12                 | 79.56                         | 40.2              |
|                            | 7       | M                       | 39          | FSGS <sup>4</sup>    | 36                        | 1                             | 16.86                         | 71                | 19                 | 46.49                         | 34.15             |
|                            | 8       | M                       | 53          | DM                   | 84                        | 1                             | 7.98                          | 63                | 15                 | 65.09                         | 44.29             |
|                            | 9       | F                       | 32          | DM                   | 48                        | 0                             | 7.6                           | 45                | 10                 | 68.56                         | 30.23             |
|                            | 10      | M                       | 50          | HTN <sup>5</sup>     | 180                       | 0                             | 8.58                          | 73                | 18                 | 27.89                         | 13.07             |

The preponderance of patients with diabetic glomerulosclerosis reflects the exclusion of patients with active glomerulonephritis or other inflammatory processes and the predominance of diabetic glomerulosclerosis in our dialysis population. Abbreviations: 1 = Creatinine, 2 = indoxyl sulfate, 3 = diabetes mellitus, 4 = focal segmental glomerulosclerosis, 5 = hypertensive nephropathy.

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confluent layer demonstrated previously [25] suggests that epithelial cells made up the major component of the renal cortical cells. Further, since we were employing the cells as a general reporter system and did not intend to study the particular responses of renal cortical epithelial cells, a possible admixture of non-epithelial cells should not confound our findings. Nevertheless, recognizing that the cell culture may possibly contain non-epithelial cells, we refer to these cultured cells as “renal cortical cells” rather than “renal tubular cells”

Cells were maintained in a freeze medium consisting of UltraMDCK medium (12-749Q, Lonza, Basel, Switzerland) with 10% (v/v) dimethylsulfoxide (DMSO) (D-2650, Sigma, St. Louis, MO) and stored in liquid nitrogen prior to use. Cells were quickly thawed and suspended in protein-free UltraMDCK medium supplemented with 1 mL/L insulin, transferrin, ethanolamine, and selenium (ITES) (17-839Z, Lonza), 0.7 µg/L triiodothyronine (T3) (T-6397, Sigma), 50 µg/L epidermal growth factor (EGF) (236-EG, R&D Systems, Minneapolis, MN), 30 µg/L retinoic acid (RA) (R-2625, Sigma), and 10 mL/L antibiotic-antimycotic solution (15250, Invitrogen, Carlsbad, CA). Cells were grown on Type IV collagen plates (354233 BD Sciences, Franklin Lakes, NJ). When plated cells were confluent, a 20% concentration of plasma was added as follows: normal control plasma (n = 5), control plasma spiked with 60 µg/ml IS (Sigma) (n = 5), pre-dialysis uremic plasma (n = 10), post-dialysis uremic plasma (n = 10), pre-dialysis uremic plasma with 1 mM probenecid (Sigma) (n = 5), and post-dialysis uremic plasma with 1 mM probenecid (n = 5). Incubations were carried out at 37° C for 24 hours before RNA was harvested.

## Microarray Analysis of mRNA Abundance

Employing the human renal cortical cells as a reporter system, total cellular RNA was isolated using the Qiagen RNeasy Mini Kit (Boston, MA) and checked for integrity, purity and quantity by UV spectroscopy and on the 2100 Agilent Bioanalyzer (Santa Clara, CA). The Affymetrix GeneChip WT Terminal Labeling and Controls Kit (Cleveland, OH), combined with the Ambion WT Expression Kit were used to prepare the labeled target population, following the manufacturer’s protocol. Biotin-labeled and fragmented cRNA hybridized to Affymetrix Genechip Human Gene 1.0 ST arrays and scanned using standard techniques recommended by the manufacturer. Feature intensity was extracted by GeneChip Operating System as CEL files. The probe-level analysis of the CEL files was done by the ExonRMA16 algorithm including quantile normalization using GeneSpring GX11 program. The raw array intensities were normalized using robust multichip average (RMA) using GeneSpring GX11 software (Agilent Technologies, Palo Alto, USA). The raw data is deposited in the NCBI GEO database under the identifier GSE45709.

## NanoString verification of gene array data

Twenty two genes were selected for comparison of gene expression by gene array and Nanostring analysis (Seattle, WA). Genes that were considered prominent in signaling pathways of interest and observed to exhibit varying degrees of dysregulation in gene arrays created following exposure to pre- and post-dialysis plasma were selected. The Nanostring method attaches a unique fluorescent “tag” to selected genes and quantitates the number of genes bearing the tag and is therefore an independent measure of gene expression [26]. The ratio of the log of the abundance (uremic/control, pre- and post-dialysis) for each of the 22 genes selected for comparison of Gene array and Nanostring analyses are displayed in [Table 2](#).

**Table 2. Comparison of gene microarray and Nanostring estimates of IS.**

| Gene Symbol | Pre-D/Ctrl Microarray | Post-D/Ctrl Microarray | Pre-D/Ctrl NanoString | Post-D/Ctrl NanoString | Gene Name  |
|-------------|-----------------------|------------------------|-----------------------|------------------------|--|
| MKI67       | 2.03                  | 2.26                   | 1.62                  | 1.8                    | marker of proliferation Ki-67                    |
| KIF11       | 1.69                  | 1.8                    | 1.37                  | 1.48                   | kinesin family member 11                         |
| PLAT        | 1.55                  | 1.78                   | 1.31                  | 1.5                    | tissue plasminogen activator                     |
| SERPINE1    | 1.44                  | 1.68                   | 1.67                  | 2.3                    | plasminogen activator inhibitor                  |
| TNFSF13B    | 1.29                  | 1.43                   | 1.37                  | 1.67                   | tumor necrosis factor (ligand) superfamily       |
| BRCA2       | 1.28                  | 1.48                   | 1.3                   | 1.58                   | breast cancer 2, early onset 1                   |
| IL8         | 1.27                  | 1.31                   | 1.37                  | 1.46                   | IL8_human  |
| CCL2        | 1.25                  | 1.3                    | 1.75                  | 1.57                   | chemokine (C-C motif) ligand 2                   |
| THBS1       | 1.23                  | 1.27                   | 1.32                  | 1.35                   | thrombospondin 1                                 |
| FOSL1       | 1.2                   | 1.35                   | 1.37                  | 1.69                   | FOS-like antigen 1                               |
| CA9         | 1.19                  | 1.02                   | 1.35                  | 1.37                   | carbonic anhydrase IX                            |
| B4GALNT2    | 1.15                  | 1.27                   | 1.23                  | 1.32                   | beta-1,4-N-aetyl-galactosaminy transferase 2     |
| ARHGDIB     | 1.14                  | 1.17                   | 1.12                  | -1.06                  | rho GDP dissociation inhibitor (GDI) beta        |
| FGF1        | 1.14                  | 1.26                   | 1.24                  | 1.31                   | fibroblast growth factor 1 (acidic)              |
| TPM1        | 1.11                  | 1.14                   | 1.1                   | 1.22                   | tropomyosin 1 (alpha)                            |
| RHOQ        | -1.12                 | -1.16                  | -1.2                  | -1.23                  | ras homolog family member Q                      |
| PPARGC1A    | -1.14                 | -1.19                  | -1.33                 | -1.45                  | peroxisome proliferator-activated receptor gamma |
| ME1         | -1.14                 | -1.13                  | -1.23                 | -1.24                  | malic enzyme 1, NADP(+)-dependent, cytosolic 1   |
| ACOX2       | -1.19                 | -1.29                  | -1.42                 | -1.36                  | acyl-CoA oxidase 2, branched chain               |
| GCLC        | -1.24                 | -1.26                  | -1.48                 | -1.6                   | glutamate-cysteine ligase, catalytic subunit     |
| GHR         | -1.33                 | -1.36                  | -1.45                 | -1.33                  | growth hormone receptor                          |
| GPD1        | -1.37                 | -1.64                  | -1.47                 | -1.88                  | glycerol-3-phosphate dehydrogenase 1             |

22 Genes are listed in descending order from greatest up-regulated to greatest down-regulated. The pre-and post dialysis values, used to create [Fig. 2A and 2B](#) are presented. Gene symbols are shown on the left; gene names are shown on the right.

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## Measurement of Indoxyl Sulfate

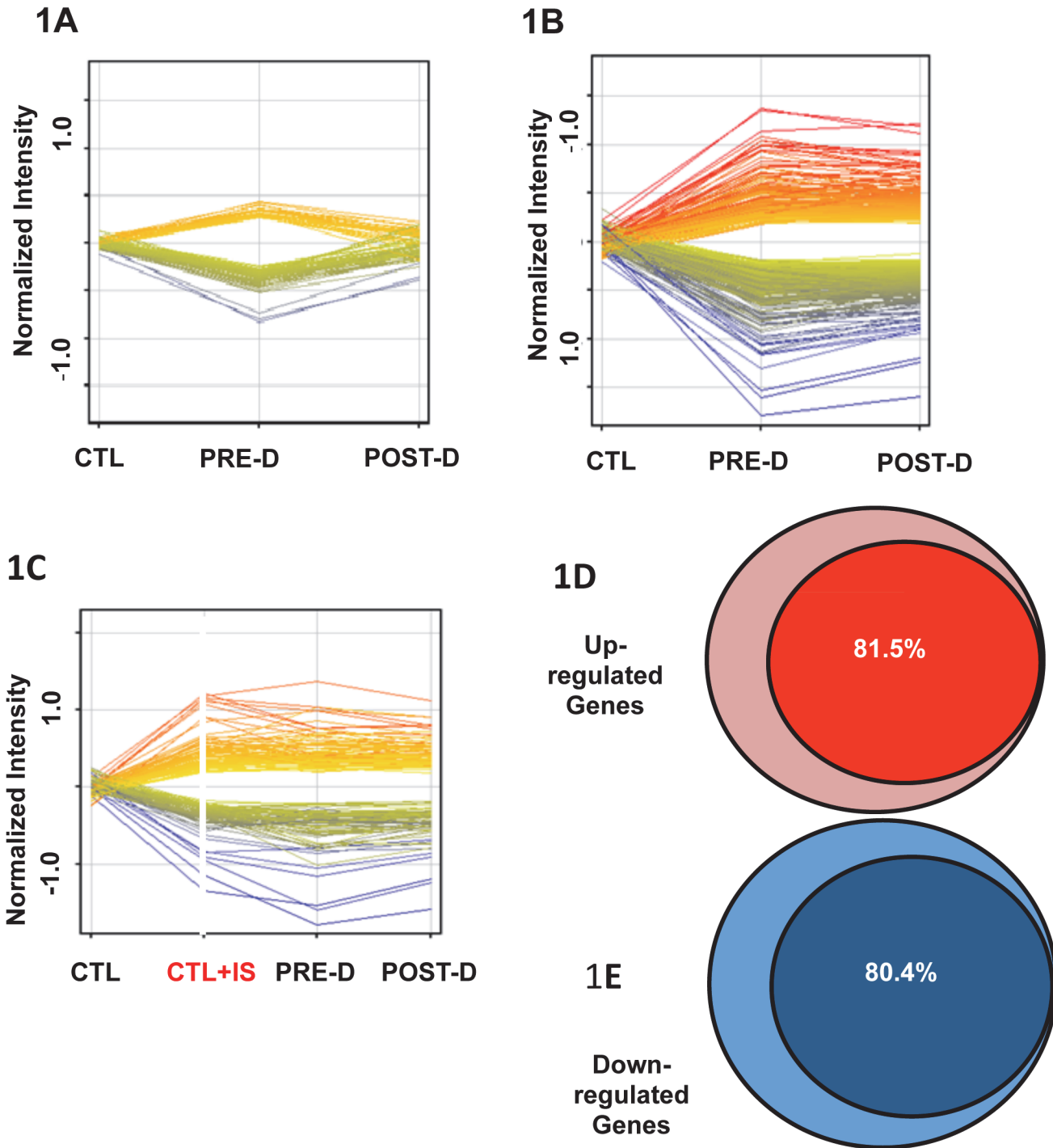
High-performance liquid chromatography with an ABI Kratos 980 Fluorescence detector and Pyramid Axxiom software, was used to measure the concentration of IS in plasma samples. IS was dissolved in methanol to create a standard curve against which to test the plasma samples. Measurement of free IS concentration was performed on plasma ultrafiltrate (Centrifree Ultra-filtration, 10kDA Amicon filter), separated at 1000 rpm).

## Results

### Gene Expression Pre- and Post-Dialysis

The gene expression data was examined utilizing the Pavlidis Template Matching (PTM) method [27] to compare the gene expression in our cultured human renal cortical cells incubated with either control (n = 5), pre-dialysis plasma (n = 10), post-dialysis plasma (n = 10), control plasma spiked with IS (n = 5), pre-dialysis plasma with added probenecid (n = 5) and post-dialysis plasma with added probenecid (n = 5).

After creating the (PTM) templates, we *arbitrarily* set 10% as the boundary defining *dysregulation* (up-regulation or down-regulation). [Fig. 1A and 1B](#) demonstrate the expression of



**Fig 1. Gene expression in reporter renal tubular cells.** A: Genes that returned to baseline post-dialysis. Each individual line represents the average value in the 10 uremic subjects for each gene that was dysregulated. 282 genes were upregulated (displayed as yellow to red lines) and 255 genes were downregulated (displayed as green to blue lines) in the pre-dialysis samples as compared to normal controls. Post-dialysis these values returned to baseline. B: Genes that remained dysregulated after dialysis treatment. 843 genes were upregulated and 532 genes were downregulated. C: Genes expressed following incubation in normal plasma spiked with indoxyl sulfate compared with their expression levels in cells treated with pre-dialysis and post-dialysis plasma. 908 genes were upregulated and 571 genes were downregulated. D: 81.5% of upregulated genes that were not normalized by dialysis were mimicked by addition of indoxyl sulfate to normal plasma. E: 80.4% of downregulated genes that were not normalized by dialysis were mimicked by addition of indoxyl sulfate to normal plasma.

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1912 genes that exhibited at least a 10% difference, either increased or decreased expression as compared with normal controls, when reporter renal cortical cells were incubated with pre- and post-dialysis uremic plasma. The expression of 537 dysregulated genes returned to baseline when cells were incubated with post-dialysis plasma (Fig. 1A). Many more genes (1375) remained dysregulated when incubated with post-dialysis plasma (Fig. 1B). Using the more rigorous criterion for altered gene expression of at least 20% deviation from control, the findings were not significantly different; 1479 genes exhibited dysregulation that was not corrected by a single dialysis (Fig. 1C). This gene dysregulation, not corrected by dialysis, strongly suggests the presence of one or more poorly-dialyzable solutes affecting gene expression.

To examine the role of indoxyl sulfate on the altered gene expression induced by incubation in uremic plasma in our renal cell reporter system, IS was added to control plasma to a concentration of 60  $\mu\text{g/ml}$  (Fig. 1C). Strikingly, 81.5% of the genes that remained up-regulated (Fig. 1D) and 80.4% of the genes that remained down-regulated with incubation in post-dialysis uremic plasma (Fig. 1E) were mimicked by the addition of IS to control plasma. This finding identifies indoxyl sulfate as a major candidate uremic toxin.

### Comparison of microarray and NanoString quantification

There was a strong concordance between gene expression estimated from gene arrays and measured by quantitative verification experiments using NanoString (Fig. 2) in all 22 genes over a wide range of over- or under- expression. (Table 2, Fig. 2, Pearson correlation coefficient pre-dial/control = 0.98, post dial/control = 0.92).

### Effects of OAT inhibition on the effects of indoxyl sulfate

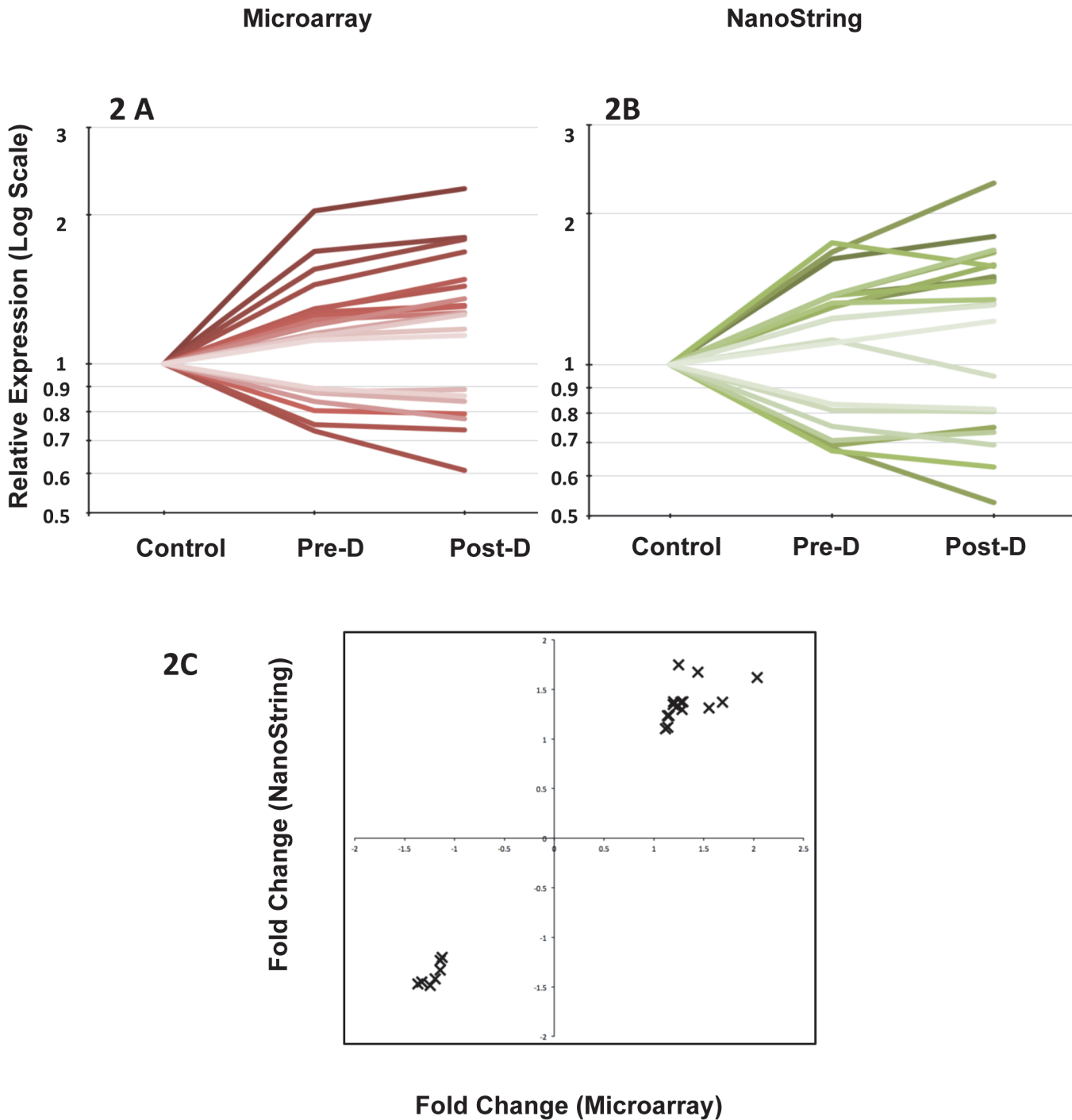
When probenecid, an inhibitor of OATs [22], was added to pre- and post-dialysis uremic plasma, it abolished the gene dysregulation observed when cells were incubated with uremic plasma (Fig. 3). Although the effects of probenecid are not specific for OAT 1 or OAT 3, this finding lends support to the hypothesis that the effects of indoxyl sulfate are mediated through OAT transport.

### Indoxyl Sulfate Concentration

Both pre- and post-dialysis plasma IS concentrations were markedly elevated compared to control (0.89  $\mu\text{g/ml}$ ,  $p < 0.001$ ) (Table 1, Fig. 4). The mean total IS concentration was 47.0  $\mu\text{g/ml}$  in pre-dialysis plasma and 27.7  $\mu\text{g/ml}$  in post-dialysis plasma. The difference (pre-vs post-dialysis) was significant ( $p < 0.05$ ). The mean concentration of free (unbound) IS in pre-dialysis plasma was 13.5  $\mu\text{g/ml}$  representing 26.8% of total IS. Reduced binding of indoxyl sulfate in uremic plasma has been reported by others [28,29]. While protein binding renders IS poorly dialyzable, the increased concentration of unbound IS in equilibrium with the markedly elevated concentration of protein-bound IS in uremic plasma and reduced binding affinity in uremic plasma [28] facilitate the removal of IS by filtration during dialysis and could fully account for the observed decrease in total indoxyl sulfate in post-dialysis plasma.

### Residual Renal Function

In this series 5 subjects were judged to have residual renal function (RRF), based on self-reported daily urine output of 2 or more ounces and 5 subjects were anuric (Table 1). Patients with RRF had lower pre- (36.4  $\mu\text{g/ml}$ ) and post-dialysis (22.9  $\mu\text{g/ml}$ ) plasma concentrations of IS (total) than patients without RRF (pre-dialysis 55.9  $\mu\text{g/ml}$ , post-dialysis 32.4  $\mu\text{g/ml}$ ) (Table 1, Fig. 4). While these differences between subjects with and without RRF did not reach



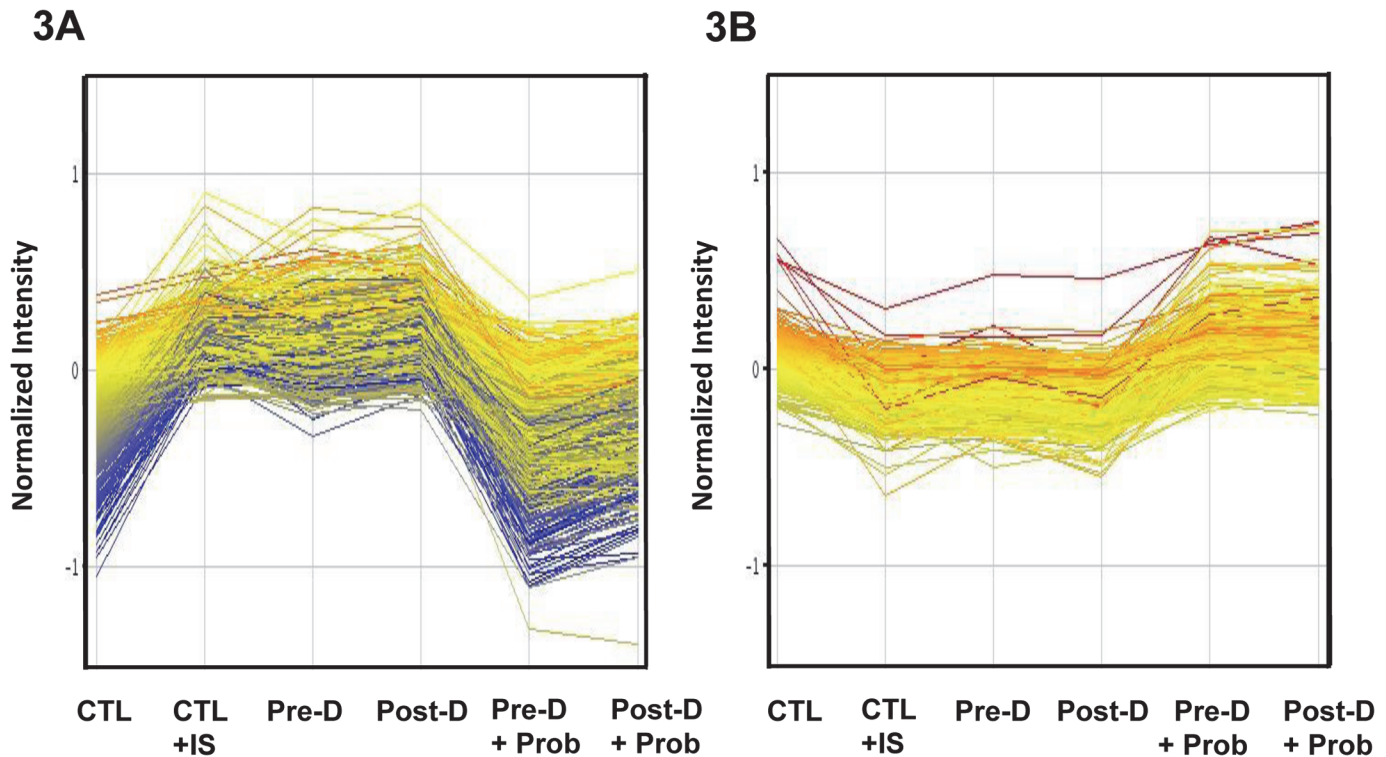
**Fig 2. Comparison of microarray findings with Nanostring assay (22 genes).** 2A: Changes in gene expression estimated by microarray. 2B: Changes in gene expression estimated by Nanostring. 2C: Comparison between microarray estimate and Nanostring shown on a coordinate plot. Pearson correlation coefficient, pre-D/Control = 0.98, post-D/Control = 0.92.

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statistical significance in this small sample, the gene array data shed some light on the importance of RRF in patients undergoing chronic dialysis. The expression of genes prominent in one TGF beta signaling pathway, which has long been thought to be involved in progressive



### Normalization of Gene Expression with Probenecid



**Fig 3. Effects of probenecid on gene expression.** A: Genes up-regulated in cells incubated in pre- and post dialysis plasma returned toward baseline with added probenecid. B: Genes down-regulated in cells incubated in pre- and post dialysis plasma returned toward baseline with added probenecid. Each line represents the average of 5 or 10 gene arrays.

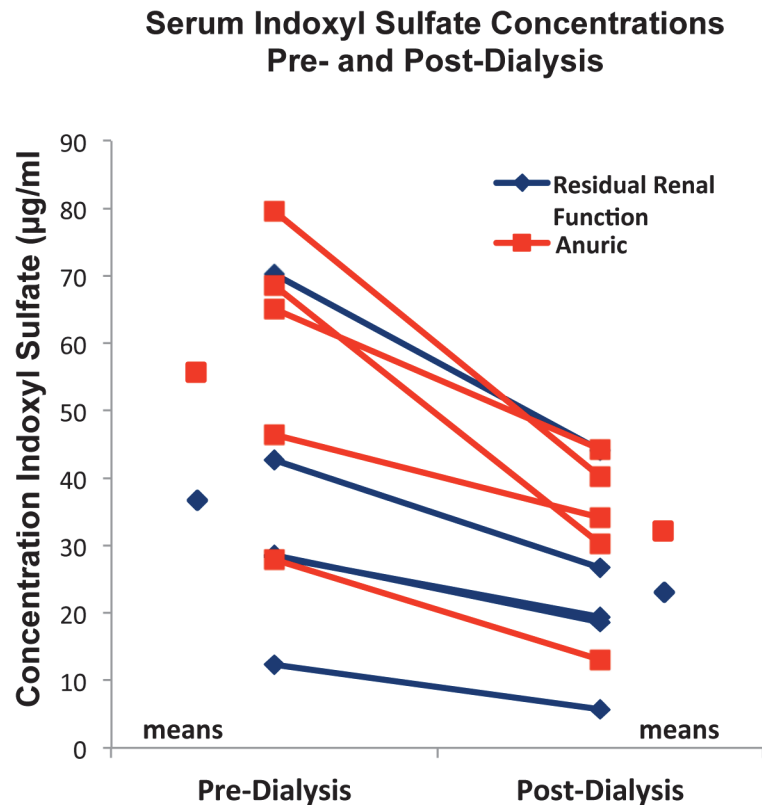
doi:10.1371/journal.pone.0118703.g003

renal disease [30], demonstrated greater activation by pre- and post- dialysis plasma of patients lacking RRF than plasma of patients with RRF (Fig. 5).

### Discussion

Our finding that almost 2000 genes expressed in human renal cortical cells are dysregulated when exposed to uremic plasma is in agreement with the earlier studies of Aoyama, Enomoto, and Niwa, who reported gene dysregulation in renal cortex of 5/6 nephrectomized uremic rats [34].

The most important conclusions of the present study follow from the observation that there are two classes of substances in the plasma of patients with uremia that effect gene expression in normal human renal cortical cells. One class of molecules appears to be effectively removed by conventional hemodialysis. A second class of uremic solutes, not effectively removed during hemodialysis, accounted for approximately three quarters of the altered gene expression observed in our human renal cortical cell reporter system. This strongly suggests the effects of one or many poorly-dialyzable uremic solutes, of which IS has been considered a candidate [11–17]. Elevated plasma indoxyl sulfate concentration in uremia is a well-established fact [12,14,17] and it is known that indoxyl sulfate is poorly-dialyzable [11–13,21]. The present finding that the protein-bound aryl amine, IS, added to control plasma mimicked more than 80% of the dialysis-resistant altered gene expression, constitutes additional strong evidence of a unique and important role for IS as a uremic toxin. Our finding that probenecid blocked the



**Fig 4. Plasma indoxyl sulfate concentration pre- and post—hemodialysis.** Patients with and without residual renal function exhibited a decrease in circulating total indoxyl sulfate levels post-dialysis. Total indoxyl sulfate concentration was greater in both pre- and post-dialysis plasma in subjects without Residual Renal Function (anuric) than in subjects with Residual Renal Function.

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effects of uremia on gene dysregulation, identifies OATs as important for the membrane transport of this uremic toxin.

The role of IS as a *major* uremic solute is supported by the study of Rhee et al [35]. Employing a metabolomics approach, they identified 38 putative polar uremic solutes (i.e., candidate uremic toxins) elevated in the predialysis plasma of patients with ESRD. All but 2 were cleared by a single hemodialysis treatment with an efficiency roughly comparable to the clearance of creatinine, i.e., they were cleared by diffusion across the dialysis membrane. Only IS and choline, fit the definition of a “poorly dialyzable protein-bound” uremic solute; plasma IS concentration declined by only 17% following dialysis in Rhee’s study.

Our finding that a great number of genes are dysregulated by indoxyl sulfate is consistent with other evidence that IS activates one or more transcription factors. Studies of the “downstream” effects of IS [36], the mechanism of gene activation or inactivation and the consequences of gene dysregulation have largely been carried out in cultured cells [11]. IS acts by binding to the cytoplasmic aryl hydrocarbon receptor (AHR) [36,37]. The complex translocates to the nucleus, where it forms a heterodimer with aryl hydrocarbon receptor nuclear translocator (ARNT), a potent transcription factor [37]. Gonduin et al., studying the effects of IS on human umbilical vein endothelial cells, reported that blocking the action of AHR by inhibiting its chaperone protein or silencing AHR expression with small interfering RNA (siRNA) significantly reduced the downstream effects of IS on the endothelial target cells [36].



uremic plasma was added to the bathing medium [40]. He speculated that “under conditions of markedly reduced. . .glomerular filtration, mammalian proximal tubules could secrete. . .some of the potentially toxic products normally excreted by the kidney. . .” which would “serve a useful survival function” [40]. It does not seem far-fetched to speculate that RRF may represent the tubular secretion of IS and osmotically obligated fluid in the proximal renal tubule rather than urine generated by glomerular filtration in residual intact functioning nephrons

Although the studies reported here represent data obtained in only 10 uremic subjects and 5 controls, we believe the findings are sufficiently rigorous and in accord with published findings describing the dialysis of IS and elevated IS concentrations in patients with advanced renal failure, and with observations in the rodent remnant kidney model, to lead us to suggest that indoxyl sulfate is the major poorly-dialyzed uremic solute. As such, these findings dictate a significant paradigm shift in our understanding of the role of protein-bound, poorly dialyzable, uremic solutes in the pathogenesis of vascular disease and renal scarring in chronic renal failure. Our findings open the way to the investigation of new treatments that are radically different from those, focused on the dialytic removal of uremic toxins, which have dominated the field of nephrology for the past 60 years. These might include measures aimed to alter the expression of OAT transporters [41], decrease production of indole by perturbing the gut microbiome with antibiotics or probiotics [42], decrease intestinal absorption of indole [43], or interfere with the protein binding of IS [44]. Further, they suggest a new role for RRF. If RRF contributes significantly to the elimination of IS and related uremic toxins, it would dictate that attention be paid to the avoidance of drugs that might compete for transport by the OAT transporters [45].

## Author Contributions

Conceived and designed the experiments: SJ PS FRV DT HK TB ID AH JZ JL. Performed the experiments: SJ PS FRV DT ID JZ JL. Analyzed the data: SJ PS FRV DT ID AH JZ JL. Contributed reagents/materials/analysis tools: ID AH JZ. Wrote the paper: SJ PS ID AH JZ JL.

## References

1. Kolff WJ, Berk HT, ter Welle M, van der LA, van Dijk EC, van Noordwijk J. The artificial kidney: a dialyzer with a great area. 1944. *Journal of the American Society of Nephrology: JASN*. Dec 1997; 8(12):1959–1965. PMID: [9402100](#)
2. Scribner BH, Caner JE, Buri R, Quinton W. The technique of continuous hemodialysis. *Transactions—American Society for Artificial Internal Organs*. Apr 10–11 1960; 6:88–103.
3. Go AS, Chertow GM, Fan D, McCulloch CE, Hsu CY. Chronic kidney disease and the risks of death, cardiovascular events, and hospitalization. *The New England journal of medicine*. Sep 23 2004; 351(13):1296–1305. PMID: [15385656](#)
4. Lindner A, Charra B, Sherrard DJ, Scribner BH. Accelerated atherosclerosis in prolonged maintenance hemodialysis. *The New England journal of medicine*. Mar 28 1974; 290(13):697–701. PMID: [4813742](#)
5. Meyer TW, Hostetter TH. Uremia. *The New England journal of medicine*. Sep 27 2007; 357(13):1316–1325. PMID: [17898101](#)
6. System USRD. USRDS 2013 Annual Data Report: Atlas of Chronic Kidney Disease and End-Stage Renal Disease in the United States. In: *Diseases NloDaDaK*, ed. Bethesda, MD2013.
7. Hage FG, Venkataraman R, Zoghbi GJ, Perry GJ, DeMattos AM, Iskandrian AE. The scope of coronary heart disease in patients with chronic kidney disease. *Journal of the American College of Cardiology*. Jun 9 2009; 53(23):2129–2140. doi: [10.1016/j.jacc.2009.02.047](#) PMID: [19497438](#)
8. Chertow GM, Levin NW, Beck GJ, Depner TA, Eggers PW, Gassman JJ, et al. In-center hemodialysis six times per week versus three times per week. *The New England journal of medicine*. Dec 9 2010; 363(24):2287–2300. doi: [10.1056/NEJMoa1001593](#) PMID: [21091062](#)
9. Eknoyan G, Beck GJ, Cheung AK, Daugirdas JT, Greene T, Kusek JW, et al. Effect of dialysis dose and membrane flux in maintenance hemodialysis. *The New England journal of medicine*. Dec 19 2002; 347(25):2010–2019. PMID: [12490682](#)

10. Himmelfarb J. Dialysis at a crossroads: reverse engineering renal replacement therapy. *Clinical journal of the American Society of Nephrology: CJASN*. Jul 2006; 1(4):896–902. PMID: [17699302](#)
11. Masereeuw R, Mutsaers HA, Toyohara T, Abe T, Jhavar S, Sweet DH, et al. The kidney and uremic toxin removal: glomerulus or tubule? *Seminars in nephrology*. Mar 2014; 34(2):191–208. doi: [10.1016/j.semnephrol.2014.02.010](#) PMID: [24780473](#)
12. Vanholder R, De Smet R, Glorieux G, Argiles A, Baurmeister U, Brunet P, et al. Review on uremic toxins: classification, concentration, and interindividual variability. *Kidney international*. May 2003; 63(5):1934–1943. PMID: [12675874](#)
13. Dhondt A, Vanholder R, Van Biesen W, Lameire N. The removal of uremic toxins. *Kidney international. Supplement*. Aug 2000; 76:S47–59. PMID: [10936799](#)
14. Lameire N, Vanholder R, De Smet R. Uremic toxins and peritoneal dialysis. *Kidney international. Supplement*. Feb 2001; 78:S292–297. PMID: [11169029](#)
15. Lowenstein J. The anglerfish and uremic toxins. *FASEB journal: official publication of the Federation of American Societies for Experimental Biology*. Jun 2011; 25(6):1781–1785. doi: [10.1096/fj.11-0602ufm](#) PMID: [21622695](#)
16. Miyazaki T, Ise M, Seo H, Niwa T. Indoxyl sulfate increases the gene expressions of TGF-beta 1, TIMP-1 and pro-alpha 1(I) collagen in uremic rat kidneys. *Kidney international. Supplement*. Nov 1997; 62:S15–22.
17. Niwa T, Nomura T, Sugiyama S, Miyazaki T, Tsukushi S, Tsutsui S. The protein metabolite hypothesis, a model for the progression of renal failure: an oral adsorbent lowers indoxyl sulfate levels in undialyzed uremic patients. *Kidney international. Supplement*. Nov 1997; 62:S23–28. PMID: [9350673](#)
18. Yamamoto H, Tsuruoka S, Ioka T, Ando H, Ito C, Akimoto T, et al. Indoxyl sulfate stimulates proliferation of rat vascular smooth muscle cells. *Kidney international*. May 2006; 69(10):1780–1785. PMID: [16612331](#)
19. Yu M, Kim YJ, Kang DH. Indoxyl sulfate-induced endothelial dysfunction in patients with chronic kidney disease via an induction of oxidative stress. *Clinical journal of the American Society of Nephrology: CJASN*. Jan 2011; 6(1):30–39. doi: [10.2215/CJN.05340610](#) PMID: [20876676](#)
20. Smith HW, Finkelstein N, Aliminoso L, Crawford B, Graber M. The renal clearances of substituted hippuric acid derivatives and other aromatic acids in dog and man. *The Journal of clinical investigation*. May 1945; 24(3):388–404. PMID: [16695228](#)
21. Marquez IO, Tamba S, Luo FY, Li Y, Plummer NS, Hostetter TH, et al. Contribution of residual function to removal of protein-bound solutes in hemodialysis. *Clinical journal of the American Society of Nephrology: CJASN*. Feb 2011; 6(2):290–296. doi: [10.2215/CJN.06100710](#) PMID: [21030575](#)
22. Sekine T, Miyazaki H, Endou H. Molecular physiology of renal organic anion transporters. *American journal of physiology. Renal physiology*. Feb 2006; 290(2):F251–261. PMID: [16403838](#)
23. Enomoto A, Takeda M, Tojo A, Sekine T, Cha SH, Khamdang S, et al. Role of organic anion transporters in the tubular transport of indoxyl sulfate and the induction of its nephrotoxicity. *Journal of the American Society of Nephrology: JASN*. Jul 2002; 13(7):1711–1720. PMID: [12089366](#)
24. Humes HD, MacKay SM, Funke AJ, Buffington DA. Tissue engineering of a bioartificial renal tubule assist device: in vitro transport and metabolic characteristics. *Kidney international*. Jun 1999; 55(6):2502–2514. PMID: [10354300](#)
25. Ferrell N, Desai RR, Fleischman AJ, Roy S, Humes HD, Fissell WH. A microfluidic bioreactor with integrated transepithelial electrical resistance (TEER) measurement electrodes for evaluation of renal epithelial cells. *Biotechnology and bioengineering*. Nov 1 2010; 107(4):707–716. doi: [10.1002/bit.22835](#) PMID: [20552673](#)
26. Geiss GK, Bumgarner RE, Birditt B, Dahl T, Dowidar N, Dunaway DL, et al. Direct multiplexed measurement of gene expression with color-coded probe pairs. *Nature biotechnology*. Mar 2008; 26(3):317–325. doi: [10.1038/nbt1385](#) PMID: [18278033](#)
27. Pavlidis P, Noble WS. Analysis of strain and regional variation in gene expression in mouse brain. *Genome biology*. 2001; 2(10):RESEARCH0042. PMID: [11597340](#)
28. Klammt S, Wojak HJ, Mitzner A, Koball S, Rychly J, Reisinger EC, et al. Albumin-binding capacity (ABIC) is reduced in patients with chronic kidney disease along with an accumulation of protein-bound uraemic toxins. *Nephrology, dialysis, transplantation: official publication of the European Dialysis and Transplant Association—European Renal Association*. Jun 2012; 27(6):2377–2383.
29. Viaene L, Annaert P, de Loor H, Poesen R, Evenepoel P, Meijers B. Albumin is the main plasma binding protein for indoxyl sulfate and p-cresyl sulfate. *Biopharmaceutics & drug disposition*. Apr 2013; 34(3):165–175.
30. Bottinger EP, Bitzer M. TGF-beta signaling in renal disease. *Journal of the American Society of Nephrology: JASN*. Oct 2002; 13(10):2600–2610. PMID: [12239251](#)



31. Dennis G Jr., Sherman BT, Hosack DA, Yang J, Gao W, Lane HC, et al. DAVID: Database for Annotation, Visualization, and Integrated Discovery. *Genome biology*. 2003; 4(5):P3. PMID: [12734009](#)
32. Mootha VK, Lindgren CM, Eriksson KF, Subramanian A, Sihag S, Lehar J, et al. PGC-1alpha-responsive genes involved in oxidative phosphorylation are coordinately downregulated in human diabetes. *Nature genetics*. Jul 2003; 34(3):267–273. PMID: [12808457](#)
33. Subramanian A, Tamayo P, Mootha VK, Mukherjee S, Ebert BL, Gillette MA, et al. Gene set enrichment analysis: a knowledge-based approach for interpreting genome-wide expression profiles. *Proceedings of the National Academy of Sciences of the United States of America*. Oct 25 2005; 102(43):15545–15550. PMID: [16199517](#)
34. Aoyama I, Enomoto A, Niwa T. Effects of oral adsorbent on gene expression profile in uremic rat kidney: cDNA array analysis. *American journal of kidney diseases: the official journal of the National Kidney Foundation*. Mar 2003; 41(3 Suppl 1):S8–14.
35. Rhee EP, Souza A, Farrell L, Pollak MR, Lewis GD, Steele DJ, et al. Metabolite profiling identifies markers of uremia. *Journal of the American Society of Nephrology: JASN*. Jun 2010; 21(6):1041–1051. doi: [10.1681/ASN.2009111132](#) PMID: [20378825](#)
36. Gondouin B, Cerini C, Dou L, Sallee M, Duval-Sabatier A, Pletinck A, et al. Indolic uremic solutes increase tissue factor production in endothelial cells by the aryl hydrocarbon receptor pathway. *Kidney international*. Oct 2013; 84(4):733–744. doi: [10.1038/ki.2013.133](#) PMID: [23636172](#)
37. Kewley RJ, Whitelaw ML, Chapman-Smith A. The mammalian basic helix-loop-helix/PAS family of transcriptional regulators. *The international journal of biochemistry & cell biology*. Feb 2004; 36(2):189–204.
38. Bargman JM, Thorpe KE, Churchill DN. Relative contribution of residual renal function and peritoneal clearance to adequacy of dialysis: a reanalysis of the CANUSA study. *Journal of the American Society of Nephrology: JASN*. Oct 2001; 12(10):2158–2162. PMID: [11562415](#)
39. Termorshuizen F, Dekker FW, van Manen JG, Korevaar JC, Boeschoten EW, Krediet RT. Relative contribution of residual renal function and different measures of adequacy to survival in hemodialysis patients: an analysis of the Netherlands Cooperative Study on the Adequacy of Dialysis (NECOSAD)-2. *Journal of the American Society of Nephrology: JASN*. Apr 2004; 15(4):1061–1070. PMID: [15034110](#)
40. Grantham JJ, Irwin RL, Qualizza PB, Tucker DR, Whittier FC. Fluid secretion in isolated proximal straight renal tubules. Effect of human uremic serum. *The Journal of clinical investigation*. Oct 1973; 52(10):2441–2450. PMID: [4738063](#)
41. Iwasaki Y, Yamato H, Fukagawa M. Treatment with pravastatin attenuates oxidative stress and protects osteoblast cell viability from indoxyl sulfate. *Therapeutic apheresis and dialysis: official peer-reviewed journal of the International Society for Apheresis, the Japanese Society for Apheresis, the Japanese Society for Dialysis Therapy*. Apr 2011; 15(2):151–155.
42. Swann JR, Tuohy KM, Lindfors P, Brown DT, Gibson GR, Wilson ID, et al. Variation in antibiotic-induced microbial recolonization impacts on the host metabolic phenotypes of rats. *Journal of proteome research*. Aug 5 2011; 10(8):3590–3603. doi: [10.1021/pr200243t](#) PMID: [21591676](#)
43. Schulman G, Agarwal R, Acharya M, Berl T, Blumenthal S, Kopyt N. A multicenter, randomized, double-blind, placebo-controlled, dose-ranging study of AST-120 (Kremezin) in patients with moderate to severe CKD. *American journal of kidney diseases: the official journal of the National Kidney Foundation*. Apr 2006; 47(4):565–577.
44. Bowmer CJ, Lindup WE. Decreased drug binding in uraemia: effect of indoxyl sulphate and other endogenous substances on the binding of drugs and dyes to human albumin. *Biochemical pharmacology*. Feb 1 1982; 31(3):319–323. PMID: [6803808](#)
45. Lowenstein J. Competition for organic anion transporters in chronic renal disease. *Kidney international*. Nov 2012; 82(9):1033; author reply 1033. doi: [10.1038/ki.2012.290](#) PMID: [23064191](#)