

# Gene regulation in regeneration after acute kidney injury

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Acute kidney injury (AKI) is a common condition associated with significant morbidity, mortality, and cost. Injured kidney tissue can regenerate after many forms of AKI. However, there are no treatments in routine clinical practice to encourage recovery. In part, this shortcoming is due to an incomplete understanding of the genetic mechanisms that orchestrate kidney recovery. The advent of high-throughput sequencing technologies and genetic mouse models has opened an unprecedented window into the transcriptional dynamics that accompany both successful and maladaptive repair. AKI recovery shares similar cell-state transformations with kidney development, which can suggest common mechanisms of gene regulation. Several powerful bioinformatic strategies have been developed to infer the activity of gene regulatory networks by combining multiple forms of sequencing data at single-cell resolution. These studies highlight not only shared stress responses but also key changes in gene regulatory networks controlling metabolism. Furthermore, chromatin immunoprecipitation studies in injured kidneys have revealed dynamic epigenetic modifications at enhancer elements near target genes. This review will highlight how these studies have enhanced our understanding of gene regulation in injury response and regeneration.

Acute kidney injury (AKI) is a common condition affecting up to 20% of hospitalized patients and contributes to increased morbidity, mortality, and cost (1, 2). Remarkably, the injured kidney can regenerate after many forms of AKI if the degree of injury is sublethal. Unfortunately, there are no treatments to stimulate or enhance regeneration other than supportive care in routine clinical practice, in part owing to an incomplete understanding of the molecular and genetic controls that limit injury or promote regeneration. During repair, genetic cell lineage tracing supports a model where surviving tubular epithelial cells dedifferentiate, proliferate, and eventually reexpress specialized proximal tubule genes required for normal functions (reviewed in Ref. (3)). To accomplish this feat, cells must alter their stable patterns of gene expression in response to the high cellular stress induced by injury. Cells must activate a program of survival and repair while retaining the memory of their original identity. Finally, they must reestablish a stable differentiated expression pattern indicative of functional proximal tubules. The precise genetic and epigenetic mechanisms that regulate these transformations and re-entry into mitosis remain poorly defined. However, recent advances in single-cell molecular methods, tractable genetic mouse models, and integrated bioinformatic analyses have opened an unprecedented window into the genetic controls that regulate tubular regeneration. Defining these molecular and genetic mechanisms may identify novel kidneyspecific targets to promote successful regeneration or limit the degree of injury for patients suffering from AKI. This review will highlight recent advances in our understanding of how transcription factors drive the injury response and impact regeneration.

### **Overview of ischemic injury**

Kidney injury can occur from multiple hemodynamic, toxic, and obstructive insults. A common cause of severe kidney injury in hospitalized patients is transient ischemia leading to injury and death of tubular epithelial cells (reviewed in Refs. (4, 5)). Of the nephron segments, the proximal tubule is most sensitive to this type of injury, though injury to other segments also occurs (6). The proximal tubule uses highly specialized metabolism that relies on oxidation of fatty acids to fuel the energy-intensive resorption of fluid and electrolytes from the glomerular ultrafiltrate, which is predominantly performed by this nephron segment. Concurrently, the microvascular anatomy of the kidney produces a gradient of oxygen availability from the cortex to medulla (7). Thus, in the setting of kidney hypoperfusion, a mismatch between oxygen delivery and demand results in oxidative stress, injury, and cell death via several pathways. These processes occur predominantly in the S3 segment of the proximal tubule, which sits at the border of the cortex and medulla (8) (Fig. 1). Remarkably, the damaged tubular epithelium can regenerate, restoring kidney function for some patients. However, we now appreciate that this regeneration is rarely complete such that patients who develop AKI have a greater chance of developing chronic kidney disease and progressing to end-stage kidney disease (9-11).

Over the last 2 decades, a more comprehensive understanding of proximal tubule epithelial cell regeneration has emerged. Much of this work has been performed in genetically modified mouse models of AKI. Among the most widely used

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**Figure 1. Patterns of injury after ischemic kidney injury.** *A*, the nephron segments of the proximal tubule (*red outline*) involved in acute kidney injury and their position in the gross structure of the kidney. For clarity, distal segments including the loop of Henle, distal tubule, and collecting ducts are not labeled. *B*, H&E-stained mouse kidney section 2 days after ischemia-reperfusion injury (IRI) showing injured tubules in the S3 segment. Note tubular dilation, simplification of the epithelium, and intratubular debris (examples: *black arrowheads*) and casts (example: *yellow arrowhead*). *C*, immunofluorescence staining 2 days after IRI for kidney injury marker 1 (KIM-1, purple) and Ki67 (*light blue*), which mark injured epithelium and proliferating cells, respectively. Note that KIM-1 staining is highly localized to the S3 segment at the border between cortex and medulla. *D*, H&E staining of a mouse kidney 28 days after IRI. Note the focal area of fibrosis and tubular atrophy with inflammatory infiltrate (*white arrow*) surrounded by normal tubules. Scale bars represent 1 mm (*whole section*) and 100 μm (*regions of interest*).

injury models is ischemia—reperfusion in which the renal artery and vein are temporarily clamped and then released. Alternatively, toxin models include cisplatin, glycerol-induced rhabdomyolysis, aristolochic acid, folic acid, and lipopolysaccharides. The rodent ischemia–reperfusion clamp model most closely resembles the most common forms of human AKI and will be the focus of this review. While rodent and human AKI are not equivalent, work with human kidney organoids and human AKI samples from the Kidney Precision Medicine Project (6, 12, 13) confirms homology among many transcriptional programs. Thus, genetically engineered mice can yield important insights into the transcriptional responses to AKI in humans where such manipulations are not possible. The studies addressing the origin of cells that repopulate the injured nephron have led to multiple interpretations, including designated populations of renal stem cells, bone marrow– derived mesenchymal cells, or resident surviving epithelia. However, sophisticated genetic lineage tracing now supports a model where mature proximal tubule cells that survive the initial injury can dedifferentiate and re-enter mitosis. Although some cells in the nephron may disproportionately contribute to repair (14), most mature tubular epithelia appear to retain regenerative potential. Thus, there is neither evidence of a fixed nephron progenitor pool in the mature kidney nor evidence of cells of nonkidney origin contributing to repair (15–17). Rather, irreversibly tagged proximal tubule cells can

generate clones within regenerated tubules to strongly support the idea that most of any surviving epithelial cell can proliferate to repair a damaged tubule. Therefore, the widespread and robust activation of proliferation markers after injury (18, 19) likely represents intrinsic nephron repair (14, 15, 20). Furthermore, single-cell RNA-Seq datasets also identified a novel population of cells after AKI that reflect incomplete or failed repair and are associated with areas of fibrosis and ongoing inflammation (5, 21–23) (Fig. 1*D*).

## Mechanisms controlling cell state in regeneration

Dedifferentiation, proliferation, and the expression of developmental regulatory genes and pathways all suggest similarities between nephron development and regeneration after AKI (24, 25). For a more complete discussion of renal development and the genes and pathways involved, see the study by Schnell *et al.*, 2022 (26). After gastrulation, the kidney develops from a region of mesoderm called intermediate, as it is located between the axial mesoderm and the lateral plate (Fig. 2). Two simple epithelial tubes called the nephric or Wolffian ducts run bilaterally from the midthoracic region to the posterior cloaca. At the posterior end, the ureteric bud grows out of the nephric duct and invades the metanephric mesenchyme to initiate metanephric kidney development. The ureteric bud begins to branch, ultimately forming much of the collecting duct system, whereas the mesenchyme aggregates at

the tips of the branching ureteric buds in response to WNT signaling and begins the process of mesenchyme-to-epithelial transition (MET) that will generate most of the epithelia cells of the nephron. Also termed cap mesenchyme, these progenitor cells express unique combinations of markers including Pax2, Six2, and Cited1.

The cap mesenchyme aggregates and forms a primitive epithelial renal vesicle that first forms a comma-shaped and subsequently an s-shaped body patterned along the proximal–distal axis in part by Notch signaling (Fig. 2*C*). The distal end of the s-shaped body connects to the branching ureteric bud epithelia to form a continuous tubule from glomerular progenitor cells at the proximal end to collecting tubules at the distal end. Multiple transcription factors have been identified that drive the process of mesenchyme-to-epithelial conversion, proliferation, elongation, and renal epithelial cell–type specification. Among the most essential are Pax2/8, WT1, Six2, Eya1, HNF1b, HNF4a, and NOTCH intracellular domains.

Prior to induction by the ureteric bud, the metanephric mesenchyme already is predisposed toward the renal epithelial lineage fate and expresses a unique combination of transcription factors such as WT1 and Pax2, both of which are essential for responding to inductive signals and whose deletion results in complete renal agenesis (27–29). The related protein Pax8 has an identical DNA-binding domain to Pax2 but is only expressed in renal progenitor cells after induction and remains on in most all the adult renal epithelia, whereas



**Figure 2. Overview of kidney development.** *A*, the kidney derives from a region of mesoderm termed intermediate, lying between the somites and lateral plate, as seen on a cross section of embryonic day 8.5 mouse or 3 weeks human. *B*, two bilateral epithelial ducts run longitudinally with a rudimentary pronephros at the most anterior end. In time (*left-to-right*), an outgrowth of the nephric duct, termed ureteric bud, invades surrounding mesenchyme and induces the adult or metanephric kidney. Cap mesenchyme (*green*) surrounds the ureteric bud tips in preparation for MET. *C*, the MET generates much of the nephron through a series of morphological stages as outlined from *left to right*. Continued branching of the ureteric bud induces more nephrons along the radial axis of the developing kidney. MET, mesenchyme-to-epithelial transition.

Pax2 is downregulated in the nephron but remains expressed in the collecting duct system. Genetic studies suggest some redundancy in Pax2/8 functions, both in development and in the adult kidney (30, 31). Recent data suggest a Pax-dependent core transcriptional program driving the MET in cooperation with HNF1b (32). After induction, Six2 expression in the cap mesenchyme helps to maintain the undifferentiated state and allows for continued progenitor cell proliferation, as deletion of Six2 results in precocious differentiation and progenitor cell exhaustion (33). Inactivation of HNF1b in nephron progenitors results in rudimentary nephrons with mostly distal epithelial cell fates, suggesting a need for this protein in correct proximal-distal patterning (34). Proximal-distal nephron patterning is also affected by NOTCH ligands, which generate the DNA-binding Notch intracellular domain through proteolytic cleavage (35, 36). The Sry-box containing protein Sox9 is needed for branching of the ureteric bud epithelia and is also reactivated and necessary for regeneration after AKI (37-39). An HNF4a gene regulatory network has also been described in mice and human kidney organoids that appears essential for proximal tubule cell development (40, 41). While multiple developmental genes and pathways are re-expressed or upregulated in response to AKI (for more details, see the study by Little and Kairath, 2016 (24)), whether these are essential or are merely markers for a dedifferentiated state remains to be fully explored.

#### Analysis of transcriptional control

At the transcriptional level, gene expression is regulated by cis-acting DNA elements at promoters and enhancers and trans-acting factors that bind to such elements and recruit RNA polymerase and other cofactors necessary for initiation and elongation. Yet, enhancers and promoters function within the context of intact chromatin, which consists of DNA, associated histones, and other proteins. The histones within the nucleosome can be modified post-translationally by epigenetic imprints, including methylation or acetylation at lysine residues, which can determine the accessibility of chromatin to the transcription machinery. Indeed, cell- and tissue-specific enhancer modules can be identified solely by their specific patterns of histone methylation (42), which are imprinted by the histone methyltransferases of the Trithorax and Polycomb family of proteins. Originally identified in Drosophila as activators of embryonic gene expression, the Trithorax family of proteins includes the histone H3K4 methyltransferases, whereas the Polycomb family is thought to silence gene expression in part through methylation at H3K27 and H3K9. Thus, transcription factors that upregulate or downregulate specific genes generally act upon the accessible part of the genome, or epigenome, much of which is determined during embryonic development as individual cell fates are specified.

The ability to quantify the entire transcriptome of a cell has revolutionized how we think about cell identity, cell stress, and plasticity. Hybridization of RNA to microarrays was first used to quantify gene expression changes at genome-wide scale. Next-generation bulk RNA-Seq has refined such methods to enable quantification of mRNA and splice variants with precision and economy. Moreover, single-cell RNA-Seq has become the standard for identifying not only new cell types and gene expression changes but also for following cellular differentiation and lineage tracing in pseudotime. Building on decades of work that has mapped the targets of many key transcription factors associated with human physiology and disease, such advanced technologies and bioinformatics are beginning to deconvolve the activity of complex gene regulatory networks from such high-resolution transcriptional data (reviewed in detail in Ref. (43)).

In addition to gene expression measurements, the direct mapping of transcription factor localization to specific DNA sequences at genome-wide scale has progressed rapidly. Using specific antibodies against transcription factors coupled with chromatin immunoprecipitation and next-generation sequencing (ChIP-Seq), the binding profile of a transcription factor or the pattern of histone modifications can be mapped across the entire genome. Novel methods for mapping protein binding to chromatin, which require much less input material, include cleavage under targets and release using nuclease (CUT&RUN) or tagmentation (CUT&Tag). An extensive library of these data is publicly available via the ENCODE project (44) and is becoming available in murine (45) and human (13) injured kidney samples. These data complement experimental and computational approaches (46) to identify sequence motifs associated with transcription factor-binding sites that may regulate the response to renal injury.

Independently, high-throughput techniques to measure genome-wide chromatin accessibility have become widely available and include transposase-accessible chromatin with sequencing (ATAC-Seq) and DNAse sensitivity or hypersensitivity assays. These methods not only show which genes are accessible but more importantly, indicate which gene regulatory elements are open and accessible to other factors. Open gene regulatory regions that contain transcription factorbinding motifs can be combined with transcription factor expression and target gene activation to infer gene regulatory networks. As with RNA-Seq, these technologies can be scaled to single-cell resolution.

Several approaches have been deployed in the analysis of the transcriptional response to kidney injury. The first is to use deep sequencing technology to identify the differential expression of transcription factors themselves (47-49). However, transcription factor expression may be necessary but insufficient to infer activity. Post-translational modifications such as phosphorylation can impact transcription factor activity, stability, or nuclear localization to further regulate the response to any given factor. To overcome this limitation, several groups have used single-cell regulatory network inference and clustering (SCENIC) (50) to infer activity based on target gene expression and pathway activation. Briefly, this approach correlates sets of genes with transcription factor expression, then refines these sets by including only genes with nearby cis-regulatory elements (transcription factor motifs, Fig. 3, A-C). The activity of each transcription factor regulon





**Figure 3. Overview of gene regulatory network inference approaches in single cells.** *A*, SCENIC identifies coexpression modules that are correlated with transcription factor (TF) expression. *B*, the subset of genes within these modules likely to be directly regulated by the TF (TF regulons) are defined by the presence of nearby TF-binding motifs. *C*, the activity of each regulon is determined by measuring the ranks of the regulon genes in each cell as an area under the curve (AUC) of the count-rank profile at a specified fraction of genes. The binary (ON/OFF) regulon activity for each cell can be inferred from the distribution of activities for the entire cell population. *D*, chromVAR uses differential chromatin accessibility to define TF activity. Accessibility (ATAC) peaks are mapped to TFs by the presence of a motif within the peak region. This yields a set of peaks associated with each TF motif. *E*, bias-corrected relative accessibility is estimated for the entire TF peak set, which helps mitigate the sparse reads obtained from single-cell ATAC data. *F*, either approach can be then fed into downstream visualization and analysis. Diagrams were based on those in the original publications describing their use (50, 51).

is then measured in each transcriptome. Another strategy uses single-cell ATAC-Seq data (chromVAR (51)). Rather than pooling the expression of transcripts, the approach pools the differential accessibility of transcription factor—binding motifs. This allows for a direct readout of potential transcription factor activity in clusters of cells (Fig. 3, D and E). SCENIC and chromVAR were optimized for sparse single-cell datasets. Therefore, these approaches can be applied across thousands of single-cell transcriptomes to infer transitional cell states.

New strategies refine predictions of transcription factor activity using single-cell multiomic experiments that combine ATAC-Seq with single-cell RNA-Seq data from the same cell. Approaches used to study kidney injury include TRIPOD (13, 52) and RENIN (53). In particular, RENIN was developed and validated specifically with human kidney multiomic data. The regularized regression approach in RENIN uses two steps. First, differentially accessible regions defined by ATAC-Seq are correlated with gene expression in individual cells to identify putative *cis*-regulatory elements driving changes in expression. Second, target gene expression is linked to the expression of transcription factors with binding motifs in these *cis*-regulatory elements to model transcriptional networks. This approach enabled the prediction of several transcription factors driving a chronic injury state in proximal tubule cells that were validated experimentally (53).

However, these approaches are only accurate for transcription factors where binding motifs are known with high sensitivity and specificity. For many transcription factors, motif specificity is quite poor (54). Sequence motifs can have degeneracies leading to both high- and low-affinity sites. Indeed, recent studies on enhancer logic suggest that the highest affinity sites are not always the most biologically significant (55). Even with transcription factors whose motifs are tightly defined 6 to 8 bp sequences, only a fraction of sites on the genome are bound *in vivo*. Furthermore, actual bound sites, as detected with ChIP-Seq, may not represent functional transcription factor activity, since this technique only correlates protein location to specific loci (56). Also, binding targets can overlap considerably between transcription factors of the same family. Many transcription factors can heterodimerize with other family members to further increase the complexity and impact the specificity of binding motifs.

Despite limitations, interactive gene regulatory networks can be modeled based on transcription factor binding sites as determined by ChIP-Seq, the position of consensus motifs in promoters and enhancers, and gene expression changes in response to gain or loss of function. Yet constructing regulatory networks still requires simplified assumptions of transcription factor-target effects, which are often nonlinear and can vary among targets for the same transcription factors. Such regulatory models also do not account for the effects of post-translational modifications that can alter the essential function of many transcription factors. The potential for compounded errors because of each of these limitations increases with complexity, necessitating rigorous validation of predictions. However, validating the vast numbers of gene regulatory network predictions made by approaches such as SCENIC or chromVAR is challenging. The throughput of typical reductionist validation approaches is inadequate to match the vast number of predictions made. Furthermore, in the kidney, there are no tissue culture model systems available that can replicate the transcriptome of proximal tubule *in vivo* (57). As a result, only a few novel predictions have been validated experimentally (13, 47).

# Early injury response

AKI leads to rapid changes in gene expression including many transcription factors that may be involved in regulating the adaptive and maladaptive responses to injury. Multiple studies have examined transcriptomic changes after injury in animal models of AKI (as listed in Table 1). Figure 4 summarizes transcription factors with increased expression and activity in proximal tubule cells early after ischemic injury, identified using the various strategies discussed previously. Only transcription factors identified in two or more studies were included. The strongest and most clearly defined signatures detected include the Fos/Jun and ATF/CREB basic leucine zipper families and the NF-KB family. These highly conserved transcriptional programs are not kidney specific; we will defer additional discussion here. While the results in Figure 4 validate computational approaches in a broad sense, these pathways represent generic cell responses to stress and are unlikely to reflect novel targets to promote kidney regeneration. Most transcription factors identified in these studies appear only once (143 of 198 across all studies, 72%). This inconsistency highlights the limitations of the computational approaches outlined previously as well as the sparse nature of single-cell RNA-Seq and ATAC-Seq data. Furthermore, several transcription factors with clear roles defined by genetic studies such as FOXM1 (47), KLF6 (58), and SOX9 (37, 38) (outlined later) are not robustly detected by these approaches.

In contrast to the bioinformatic strategies, lineage-tagged transcriptional profiling has identified several transcription factors that have some specificity for epithelial injury response in the kidney (59). Among these is SOX9, a transcription factor that is activated during development in proximal and distal tubule epithelia but not in the glomeruli and collecting ducts (37-39). In the adult, some distal tubule cells express SOX9. However, after injury, there is widespread activation of SOX9 throughout the epithelia, colocalizing with markers of cell proliferation. Genetic loss of Sox9 function prior to injury impairs recovery (38, 60, 61), suggesting a critical need for Sox9 in the early epithelial response to AKI. Work by Pabla et al. has identified several critical mechanisms that regulate the function of SOX9. The early expression of SOX9 is induced by Zfp24, which is present in a phosphorylated state in uninjured kidney but is rapidly and robustly dephosphorylated in response to injury and enables binding to the SOX9 promoter (62). SOX9 function is further modulated by Cdkl5mediated phosphorylation, which decreases SOX9 activity

#### Table 1

Selected	transcrip	otional	nrofilina	studies	after	kidnev	iniury
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Study Species Source		Type of data	Cell-type specification	Transcription factor	
Study	opecies				
Liu <i>et al.</i> (49)	Mouse	Whole kidney	Microarray	TRAP for Six2 (nephron), Foxd1 (interstitial), Cdh5 (endothelial), and Lyz2 (myeloid)	Ingenuity canonical pathway analysis
Chang-Panesso <i>et al.</i> , 2019 (47)	Mouse	Whole kidney	RNA-Seq	TRAP for Kim1	Transcription factor expression
Kirita et al., 2020 (21)	Mouse	Whole kidney	snRNA-Seq	Clustering with annotation	SCENIC (50)
Legouis et al., 2020 (98)	Mouse	Whole kidney	snRNA-Seq	Clustering, Six2 enriched	PROGENy (99)
Rudman-Melnick et al., 2020 (100)	Mouse	Whole kidney	scRNA-Seq	Clustering with annotation	Transcription factor expression
Gerhardt et al., 2021 (83)	Mouse	Whole kidney	snRNA-Seq	Clustering, Krt20 and Six2 enriched	SCENIC (50)
Ide et al., 2021 (23)	Mouse	Whole kidney	scRNA-Seq	Clustering with annotation	Not specifically assessed
Balzer et al., 2022 (22)	Mouse	Whole kidney	scRNA-Seq	Clustering with annotation	SCENIC (50)
Ide et al., 2022 (97)	Mouse	Whole kidney	scRNA-Seq	Clustering with annotation	SCENIC (50)
Li et al., 2022 (101)	Mouse	Whole kidney	snRNA-Seq	Clustering with annotation	DoRothEA (102, 103)
Gerhardt et al., 2023 (20)	Mouse	Whole kidney	snRNA-Seq, snATAC-Seq	Clustering, Ki67 enriched	chromVAR (51)
Lake et al., 2023 (6)	Human	Research biopsies	sc/snRNA-Seq, SNARE-Seq, spatial transcriptomics	Clustering with annotation	chromVAR (51)
Li et al., 2024 (104)	Human	Kidney regions	snRNA-Seq, snATAC-Seq (SHARE-Seq)	Clustering with annotation	PROGENy (99), chromVAR (51)

Abbreviation: TRAP, translating ribosome affinity purification.



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	TF exp Mice (Ref. 47)	Mice (Ref. 100)	Mice (Ref. 21)	SCENI Mice (Ref. 83)	C Mice (Ref. 22)	Ch Mice (Ref. 101)	Mice (Ref. 20)	AR H/KPMP (Ref. 6)	Hits		TF Mic (Ref.
Atf2			0					0	2	IrfX	
Atf3		0		0	0			0	4	Jun	
Atf4	0				0				2	Junb	
BachX			0	0					2	Jund	
Bcl3			0	0					2	Kdm5a	
BrcaX	0		0						2	Klf3	
Cebpb			0	0	0				3	Klf4	
Cers6			0	0					2	Mef2a	
Creb5				0			$\bigcirc$	0	3	MeisX	
Ddit3			0		0				2	Myc	
E2f3	0		0						2	Nfat5	
EgrX		0			0			0	3	Nfe2IX	
Ehf		0			0				2	Nfe2I2	
Elf2						0	0		2	Nfib	
Elf3		0						0	2	NfkbX	
Elk4			0	0					2	Nfkb2	
Erf			0	0					2	Rel	
EtsX			0					0	2	Rela	
Ets2			0	0			0		3	Relb	
Ezh2	0	0							2	Smarca4	
Fos		0						0	2	Sox4	
Fosb		0			0				2	StatX	
FosIX	0		0			0			3	Stat3	
Fosl2			0	$\bigcirc$				0	3	TeadX	
HcfcX	0			0					2	TfdpX	
HmgaX	0	0							2	YyX	
Hoxb6		0					0		2		
Hoxb8		0					0		2		
Hoxb9		0			0		0		3		

chromVAR SCENIC expression Hits H/KPMP Mice Mice H/KPMF (Ref. 101) (Ref. 20) (Ref. 6) Mice Mice Mice e IVIICE 47) (Ref. 100) (Ref. 22) (Ref. 83) (Ref. 21) 0  $\bigcirc$ 2 0 0 6 0 C 0 0 0 4  $\bigcirc$ 0 0 0 4 0 2 0 0 3 0 0 0 0 2 0 0 2 C 0 2 0 3  $\bigcirc$ 0 0 0 0 3 0 0 2 4  $\bigcirc$ 0 0 0 C 0 2 0 0 0 3 0 C 0 0 4 0 0 2 0 0 0 3 0 0 0 0 0 5 0 0 4 2 0 0 0 0 3 0 0 3 C 0 0 0 4 2 0 0 3 0

Figure 4. Transcription factors (TFs) and signatures identified in the early injury response by single-cell sequencing. TFs or gene regulatory networks identified in each study are summarized. About 198 unique TFs were identified across all studies. Only TFs that appear in two or more studies are shown (55 of 198, 27%). Only data available with the article were utilized (including figures, supporting figures, and supporting information) so identified pathways may not be comprehensive. Where statistics were available, only pathways with a  $P_{adj} < 0.05$  were included. TFs are color coded by family. Columns are coded by the approach used to identify gene regulatory networks.

and stability (61, 63). While many SOX9 targets in other organs are well established (64), only some of the kidney-specific targets of SOX9 in AKI are defined, including VGF (65). Thus, SOX9 activity reflects the transcriptional and posttranscriptional mechanisms that can regulate the function of an essential transcription factor for recovery after AKI. These limitations are unaddressed by most computational strategies and may account for the lack of consistent signals in single-cell data despite robust evidence of its central importance. While these findings suggest that SOX9 helps to stabilize injured cells, allowing them to recover, the precise downstream genetic mechanisms remain to be determined.

Chang-Panesso *et al.* (47) recently used a kidney injury molecule 1 lineage tracing strategy with translating ribosome affinity purification to identify transcription factors during early and late repair. This approach identified FOXM1, which like SOX9 is important for regulating early proliferation. FOXM1 expression was localized predominantly to the S3 segment of the proximal tubule, consistent with the site of highest kidney injury molecule 1 expression and proliferation after injury. FOXM1 correlates with proliferation in a variety of cell types (66) and is upregulated by the EGF signaling pathway known to be critical for proximal tubule regeneration (67, 68). However, the genetic mechanisms specifically activating the expression of FOXM1 and the identities of its targets are still poorly defined.

In addition to the generalized stress response and proliferation, the early phase of recovery is also characterized by altered proximal tubule metabolism. This topic was recently reviewed in detail by Piret and Mallipattu (69) and will be summarized briefly here. Under physiologic conditions, the proximal tubule relies on highly efficient oxidation of fatty acids and amino acids to fuel energy-intensive transport. The transcriptional basis for this unique and specialized metabolism depends on a network of transcription factors, including peroxisome proliferator-activated receptor alpha (PPARA) (70) and PPARG (71), estrogen-related receptor alpha (ESRR $\alpha$ ) (72), pregnane X receptor (73), farnesoid X receptor (71), HNF4a (41), Kruppel-like factor 15 (74), and PPAR $\gamma$  coactivator 1 $\alpha$  (75). After injury, these pathways are all downregulated across a range of injury models. The mechanisms that define the interactions and relative importance of these factors and their impact on metabolism is an area of active investigation. In general, loss of any of these factors tends to reduce baseline expression of the genes needed for fatty acid metabolism, which, in turn, correlates with increased severity of injury to the proximal tubule. For example, metabolic switching after injury is regulated in part by a shift in Kruppel-like factor 15, which promotes expression of normal oxidative metabolism, to KLF6, which blocks the expression of genes required for the metabolism of branched-chain amino acids that contribute to oxidative metabolism (58, 74).

Likewise, Dhillon *et al.* (72) showed that ESRR $\alpha$  motifs, together with HNF4A, HNF1B, and PPARA, are enriched in promoters of metabolic and transport genes lost after injury. ESRRa activity contributes to the oxidative capacity of proximal tubule cells. Importantly, the combined expression of ESSRa with other identified transcription factors (HNF4A, HNF1B, and PPARA) can have a synergistic effect on expression of transport genes. Similarly, Clark et al. (76) recently identified cooperative regulation by HNF4a and PPARy coactivator 1a of QPRT, which is critical for NAD+ metabolism in proximal tubules. It is also notable that most of these factors also act as nuclear hormone receptors, which adds an additional ligand-dependent layer to their function (77, 78). Together, these data indicate that proximal tubule transcription factors function in an overlapping fashion to regulate metabolism and differentiation during recovery from injury. While available evidence suggests these metabolic factors are tightly coordinated, the precise mechanisms that govern how these programs are synchronously regulated remain an area of active investigation.

In addition to the mouse models, robust sets of cell-level transcriptional data from human AKI samples are now becoming available (6, 13). While there are many similarities (79), prior work has shown only partial overlap in the transcriptional AKI response between rodents and humans (80). At the level of transcriptional regulatory elements, there may be important cross-species differences between regenerating proximal tubules and the inflammatory responses that accompany injury and regeneration.

#### Late regeneration responses

Compared with the immediate-early response to AKI, far less is known about the gene regulatory networks that drive regeneration and re-establish normal proximal tubule function over time. This knowledge gap is a critical barrier to developing new therapies for AKI since this late phase of injury is when most patients are recognized clinically. However, we now know that recovery diverges to generate at least two distinct populations of cells, as determined by pseudotime trajectory and RNA velocity analyses of single nuclear/cell RNA-Seq data (21, 23). One population of cells reflects successful repair and re-establishment of proximal tubule cell fate. The second population develops chronic injury and has been termed failed repair proximal tubule cells (FR-PTCs) by some authors (20, 21).

Successful recovery is characterized by the re-establishment of a transcriptional profile akin to healthy proximal tubules (21). Genes and motifs associated with unique proximal tubule metabolism are enriched in this transition including HNF4A, HNF1B, PPARA, and ESRRA (21, 22, 72). While these recovered tubules appear normal by histology and overall transcriptomic signature, subtle differences in gene expression do emerge (20). The downregulated genes in recovered but previously injured cells are associated with transport and metabolic processes and have substantial overlap with genes altered by preinjury preconditioning regimens (81). Pathway and motif analyses revealed persistent activity of early injury pathways (FOS/JUN, ATF/CREB, and Stat) and suppression of HNF4a activity (20). This preconditioning phenotype is found in other injury or stress models beyond AKI and includes such phenomena as caloric restriction, hypoxic preconditioning, and sex-dependent resistance to AKI (82).

In contrast, the population of FR-PTCs exhibits increased expression of pathways seen during the early injury response (FOS/JUN) and a strong inflammatory signature associated with NF-kB (20, 21, 83). Newer multiomic methods have implicated NFAT5, HIVEP2, and CREB5 as key contributors as well (53). The failed repair population peaks several weeks after injury and gradually recedes (21). In the mouse, the evolution of this population appears to be segment specific. In the first week after injury, the S3 segment contains most FR-PTCs. By 4 weeks, few S3 FR-PTCs remain, while the cortical population is unchanged (83).

None of the transcriptional analyses to date, which generally pool all segments of the proximal tubule together, suggest a stable undifferentiated population of cells after injury. RNA velocity analysis suggests most cells progress toward either a normal or an inflammatory state (23). These data suggest that once established, FR-PTCs may develop a fixed transcriptional program that is difficult to reset. Therefore, the loss of the population over time is most likely because of cell death rather than recovery of normal function. Turnover appears to be highest in the S3 segment of the proximal tubule (83), but this has yet to be established experimentally.

While the transcriptional networks in both postinjury populations have been characterized by available profiling studies, the transcriptional mechanisms that induce and maintain these fate decisions remain unknown. In severe injury, cells arise that show incomplete or atypical cell-cycle progression (14, 84). Though these cells were identified prior to the advent of single-cell transcriptomics, they are likely a subpopulation of FR-PTCs. While persistent ongoing DNA damage after injury would delay cell cycle progression via wellestablished mechanisms (e.g., p53), how this damage induces the dedifferentiation of proximal tubule cells has only recently been explored. For example, the cyclin D1-cyclin dependent kinase 5 axis can promote cell cycle arrest but simultaneously promotes a FR-PTC-like phenotype independently of effects on cell cycle progression (85). Furthermore, IL-22 is secreted in response to DNA damage in proximal tubules and impacts the DNA-damage response in neighboring cells, which contributes to clustering of FR-PTCs (86). However, the genetic mechanisms by which these signaling pathways induce dedifferentiation remain to be elucidated.

#### **Epigenetics and regeneration**

As discussed briefly in an earlier section, cell fates during development are specified, at least in part, by epigenetic modifications of chromatin such that each lineage contains a unique epigenome, upon which transcription factors act. This epigenome is heritable in development and has inherent stability, also termed cellular memory. In the case of regeneration after injury, surviving dedifferentiated cells that re-enter mitosis must replicate that epigenome to maintain cellular fates. Yet, injury itself can induce epigenetic modifications and impact recovery to affect long-term outcomes after AKI. Global epigenetic changes after injury include histone modifications (87) and DNA methylation (88). The specific mechanisms and the impact on cell recovery are active areas of investigation, as recently reviewed in detail (89).

The dynamic changes in epigenetic marks and the need to re-establish a stable epigenome after AKI are starting to be addressed. Recently, Wilflingseder et al. comprehensively mapped the promoter- and enhancer-selective histone marks, H3K4me3 and H3K27ac, respectively, before and 2 days after ischemia-reperfusion injury (IRI) (45). Their data indicated that the H3K27ac mark was highly dynamic in the enhancer elements, relative to promoters, of differentially regulated genes. The DNA-binding motifs identified in differentially marked enhancer elements overlap strongly with those identified by snRNA-Seq and multimodal analyses outlined previously. Enhancers activated with IRI are enriched in AP-1 transcription factors, while those suppressed were associated with metabolic transcription factors, including RXR, ESRRA, and HNF4a, all of which had decreased enhancer binding after IRI. The preferential dynamics of H3K27ac/H3K4me1 marked enhancer regions relative to promoters are also suggested by human data (13). Many of the injury pathways associated with differential chromatin accessibility were common to mice and humans (6, 13). These studies use bulk chromatin samples, which pool a wide range of cell-specific chromatin patterns. This feature tends to attenuate the most dynamic signals and accounts for only modest differences observed in histone marks in most studies (13, 45).

While enhancer elements show dynamic activity after injury, there is also strong evidence that promoter histone modifications play a critical role in the transcriptional response to injury. For example, Ezh2 is a component of the Polycomb repressor complex that catalyzes H3K27me3 at sites of gene repression. Its expression is upregulated early after injury in repairing proximal tubules identified both in snRNA profiles (21) and Kim1 translating ribosome affinity purification (47). However, its depletion reduces the severity of injury in lipopolysaccharide-induced AKI (90). In contrast, PTIP is an essential component of the KMT2C/D histone methyltransferase complex that deposits H3K4me3 at active promoter regions (91). After folic acid injury, the regeneration of proximal tubules that lack PTIP is profoundly impaired because of an inability to re-establish the necessary histone marks (92).

Pax2 and Pax8 are closely related developmental transcription factors necessary for normal kidney development where they are critical for METs (93). Pax2/8 are also upregulated during normal recovery after AKI (15, 37, 94), which partly mimics aspects of development. Pax2/8 can provide locus specificity for both the Polycomb repressor complex and for the PTIP–KMT2C/D complex depending on post-translational modifications and cofactor interactions (95, 96). These

observations suggested that Pax2/8 may be tubule-specific mediators of epigenetic modifications after injury. We recently investigated the role of Pax2/8 in the recovery from AKI using conditional alleles and a proximal tubule-specific driver (82). We anticipated that Pax2/8 mutant mice would not recover from ischemic AKI because of an inability to reset appropriate epigenetic marks during regeneration. Surprisingly, we discovered these mice were more resistant to ischemic injury (82). Uninjured Pax2/8 mutant proximal tubule cells in the S3 segment developed an expression pattern that overlapped with FR-PTCs described previously. We proposed that the loss of Pax2/8 mimics the cellular stresses observed in preconditioning or after injury and alters metabolism to make cells more resistant to ischemia. Interestingly, upregulation of Pax2/8 (21, 97) and increased accessibility of Pax-family binding motifs (20) are prominent in the FR-PTC population. With similar DNAbinding domains, Pax2 and Pax8 may be partially redundant in the proximal tubules. Whether Pax2 and Pax8 have unique or shared target genes in the adult kidney before or after injury remains to be determined.

#### Conclusions

The advent of high-throughput technologies for analyzing transcription at single-cell resolution as well as chromatin accessibility and transcription factor binding has resulted in an unprecedented wealth of new data to understand kidney regeneration. These data have firmly established the roles of stress-response genes both in early and late injury and the paramount importance of metabolic expression signatures with proximal tubule function and regeneration. The tools for integrating these massive and diverse datasets are powerful and everimproving. Yet, the logic of biological phenomena is not easily discerned from large datasets because of the complexity, redundancy, and noise inherent in most systems. While changes in gene expression are easily measured across the genome, it is not obvious whether any specific gene change directly impacts renal cell regeneration. We can measure genome-wide binding of many transcription factors; yet it is not always clear whether these binding sites are functional. Similarly, motif analyses often indicate that only a small percentage of sequence motifs are bound in vivo and do not account for post-translational modifications that can enhance or suppress activity. Yet models and predictions provide many hypotheses that can be tested in genetically tractable animal models and validated in human cohorts. Thus, as the complex transcriptional networks that regulate recovery from AKI become more clear, novel therapeutic approaches to treat this vexing clinical problem may be at hand.

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*Abbreviations*—The abbreviations used are: AKI, acute kidney injury; ATAC, assay for transposase-accessible chromatin; ChIP-Seq, chromatin immunoprecipitation and next-generation sequencing; ESRR $\alpha$ , estrogen-related receptor alpha; FR-PTC, failed repair proximal tubule cell; IRI, ischemia–reperfusion injury; MET, mesenchyme-to-epithelial transition; PPARA, peroxisome proliferator–activated receptor alpha; SCENIC, single-cell regulatory network inference and clustering.

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