



Leveraging previous GWAS to identify high-risk chronic kidney disease in the electronic medical record

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Introduction

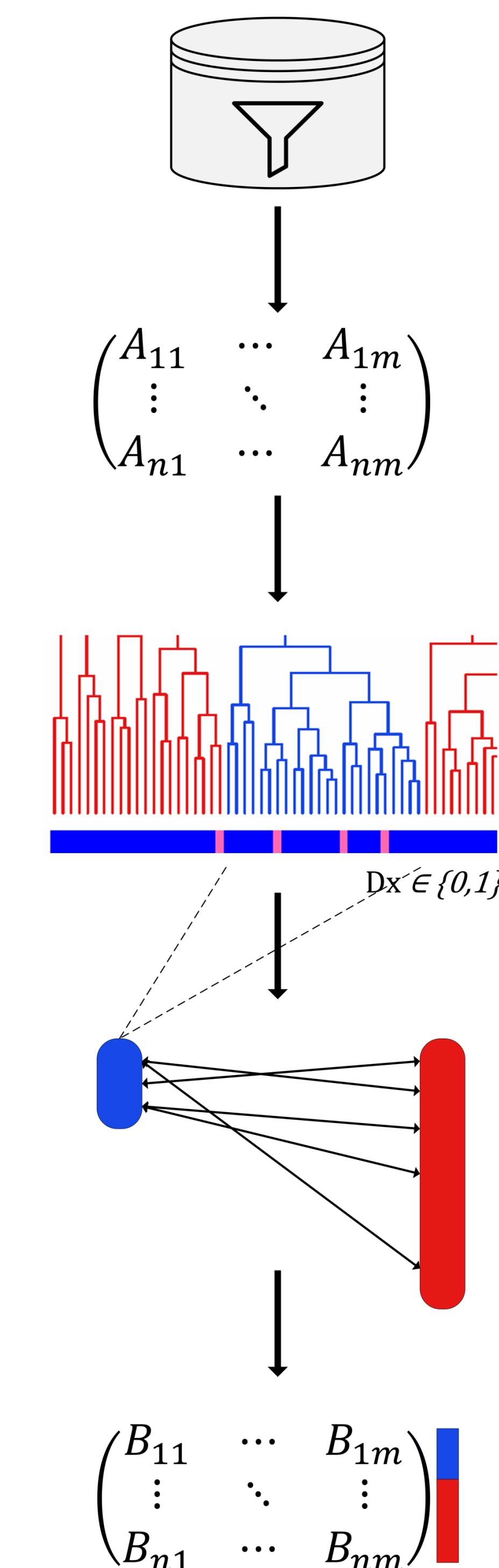
Twenty-six million Americans are currently living with chronic kidney disease (CKD)¹. Amongst those affected, Blacks are approximately twice as likely as Whites to progress to end-stage renal disease (ESRD)².

The results of recent GWAS and subsequent follow-up studies show that:

- Blacks homozygous for a missense mutation at rs73885318 in exon 5 of the apolipoprotein L, 1 (ApoL1) gene have a 10- to 29-fold greater risk for CKD;
- ApoL1-associated CKD is of a spectrum of three hypertension-related subtypes, with shared, distinct phenotypes³;
- The variant explains most of the increased rate of ESRD in Blacks⁴;
- The variant is found almost exclusively in those of recent West African ancestry;
- ApoL1-associated CKD is often diagnosed vaguely (and, as is becoming apparent, erroneously) as hypertensive nephropathy

Methods

Figure 1. Creating a matrix of putative ApoL1 high- and low-risk chronic kidney disease patients using the top-rank cluster method



(1.) **Inclusion criteria** Black race (as reported in the EMR); baseline estimated glomerular filtration rate (eGFR) ≤ 75 ml/min/1.73m²; absence of diabetes diagnoses code(s) in EMR; ≥ 1 value across a vector of 10 lab measures; ≥ 4 years of eGFR follow-up data.

(2.) **Standardized matrix** The median value was found for each patient across each lab measure, and standardized by finding the z-score:

$$z = \frac{x - \mu}{\sigma}$$

where μ is the mean of each lab measure, and σ the standard deviation. The median was used as this value is less susceptible to outliers.

(3.) **Hierarchical clustering** Agglomerative hierarchical clustering with Euclidean distance (1.1) and complete linkage (1.2) was performed on the matrix from (2.):

$$d_{i,i'} = \sqrt{\sum_{j=1}^J (i_j - i'_j)^2} \quad d_{CL}(G, H) = \max_{\substack{i \in G \\ i' \in H}} d_{ii'} \quad (1.1) \quad (1.2)$$

(4.) **Putative ApoL1 high- and low-risk** Putative ApoL1 high-risk patients were identified by ranking number of mentions of ICD-9 code 403* (HTN nephropathy) in each cluster. Patients were matched with all others in the dataset on gender and time since CKD diagnosis to create a putative ApoL1 low-risk cohort.

Results: renal events during follow-up

Figure 2. Change in eGFR during follow-up

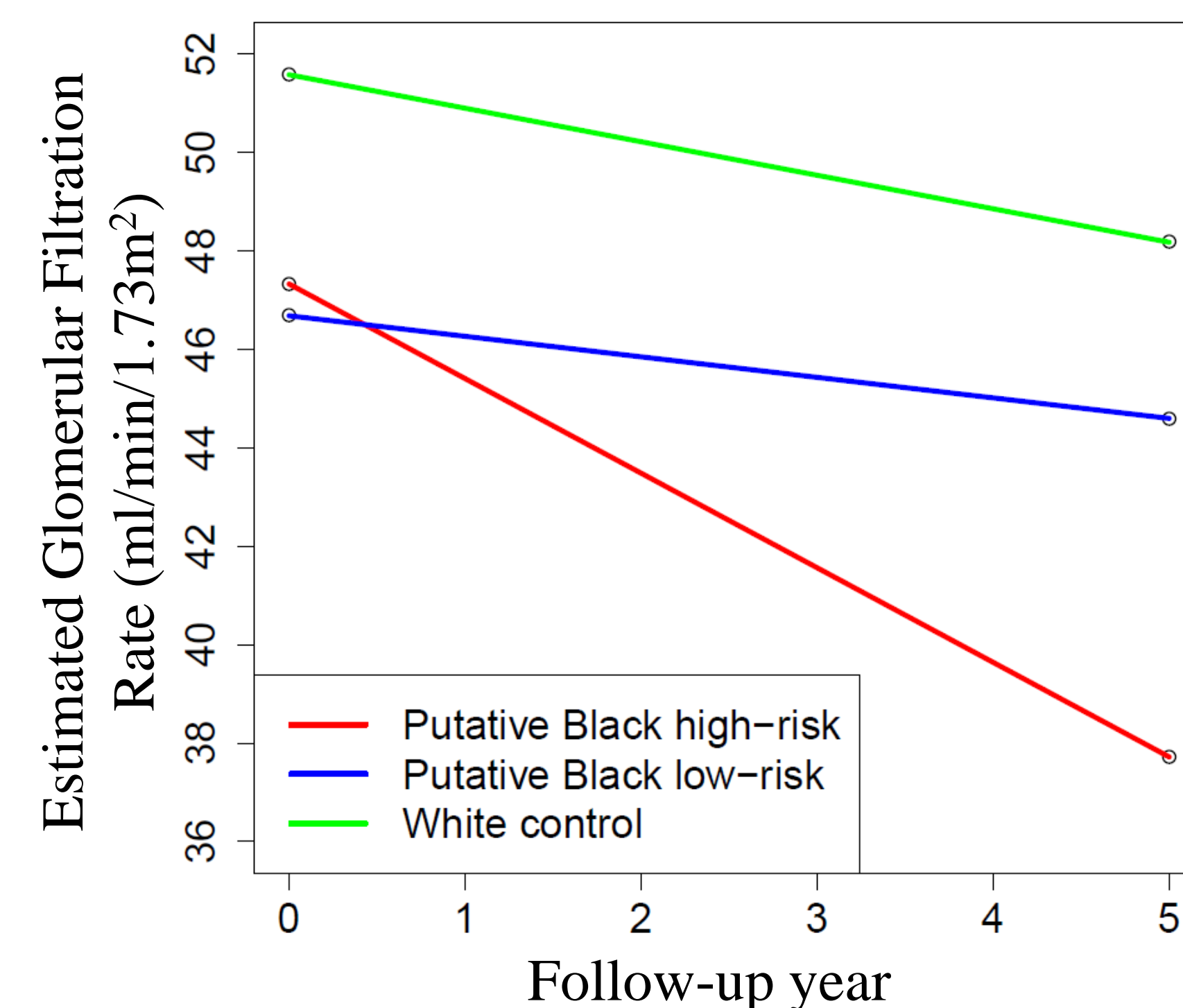


Table 1. Renal events during follow-up for combined data and Chronic Renal Insufficiency Cohort

	Combined dataset (primary study + validation sites)			Chronic Renal Insufficiency Cohort (CRIC) ⁴		
	White cohort (control) (N = 582)	Putative low-risk cohort (N = 78)	Putative high-risk cohort (N = 20)	White cohort (control) (N = 920)	APOL1 low-risk cohort (N = 531)	APOL1 high-risk cohort (N = 158)
Mean annual rate of change in eGFR (ml/min/1.73 m ²)	-0.7±2.6	-0.4±2.8 [¶]	-3.0±5.8 ^T	-0.7±3.1	-1.0±4.0	-2.9±4.5
Patients free from renal outcome after 7 yr. f/u (%) [*]	90	81 [§]	65 ^T	84	75	60

baseline: any patient with earliest eGFR in data set ≤ 75
^{*} $\geq 50\%$ decline in eGFR or diagnosis of end-stage renal disease (ESRD)
 Significance tests (not shown for CRIC study):
^T $p < 0.05$ (T-test comparing rate of decline in eGFR in Black putative high-risk and White control cohorts)
[¶] $p < 0.05$ (T-test comparing rate of decline in eGFR in Black putative high-risk and Black putative low-risk cohorts)
[§] $p < 0.05$ (Mantel-Cox test comparing Black putative low-risk and White control cohorts)
^T $p < 0.0001$ (Mantel-Cox test comparing Black putative high-risk and White control cohorts)

Results: method validation

Figure 3. Relative size of high-risk (red) and low-risk (blue) cohorts in each study: (L) putative ApoL1 risk; (R) confirmed ApoL1 risk

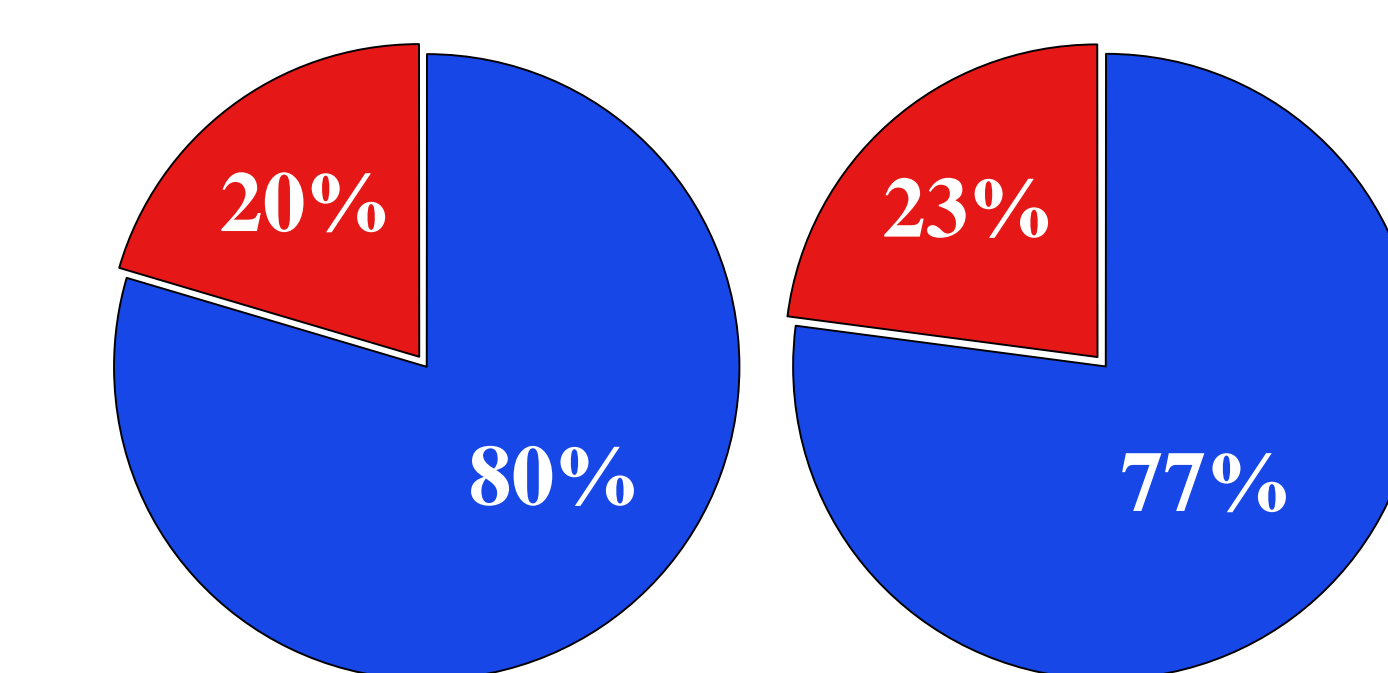


Table 2. Rate of change in eGFR in cohorts defined by: (1.) race (White controls); (2.) blood pressure; (3.) diagnostic history; (4.) cluster rank

	Mean annual rate of change in eGFR (ml/min/1.73 m ²)			
	Cohort 1		Cohort 2	
	N	mean±SD	N	mean±SD
White control	81	-1.2±2.8	28	-1.6±2.5
Blood pressure	54	-0.9±2.8	17	-1.4±2.6
Diagnosis history	21	-1.3±2.5	7	-1.2±2.1
Cluster rank	116	-0.8±2.6	36	0.0±3.7

Figure 4. Comparison of change in eGFR during follow-up for dx cluster rank method (solid lines) and blood pressure (dashed lines)

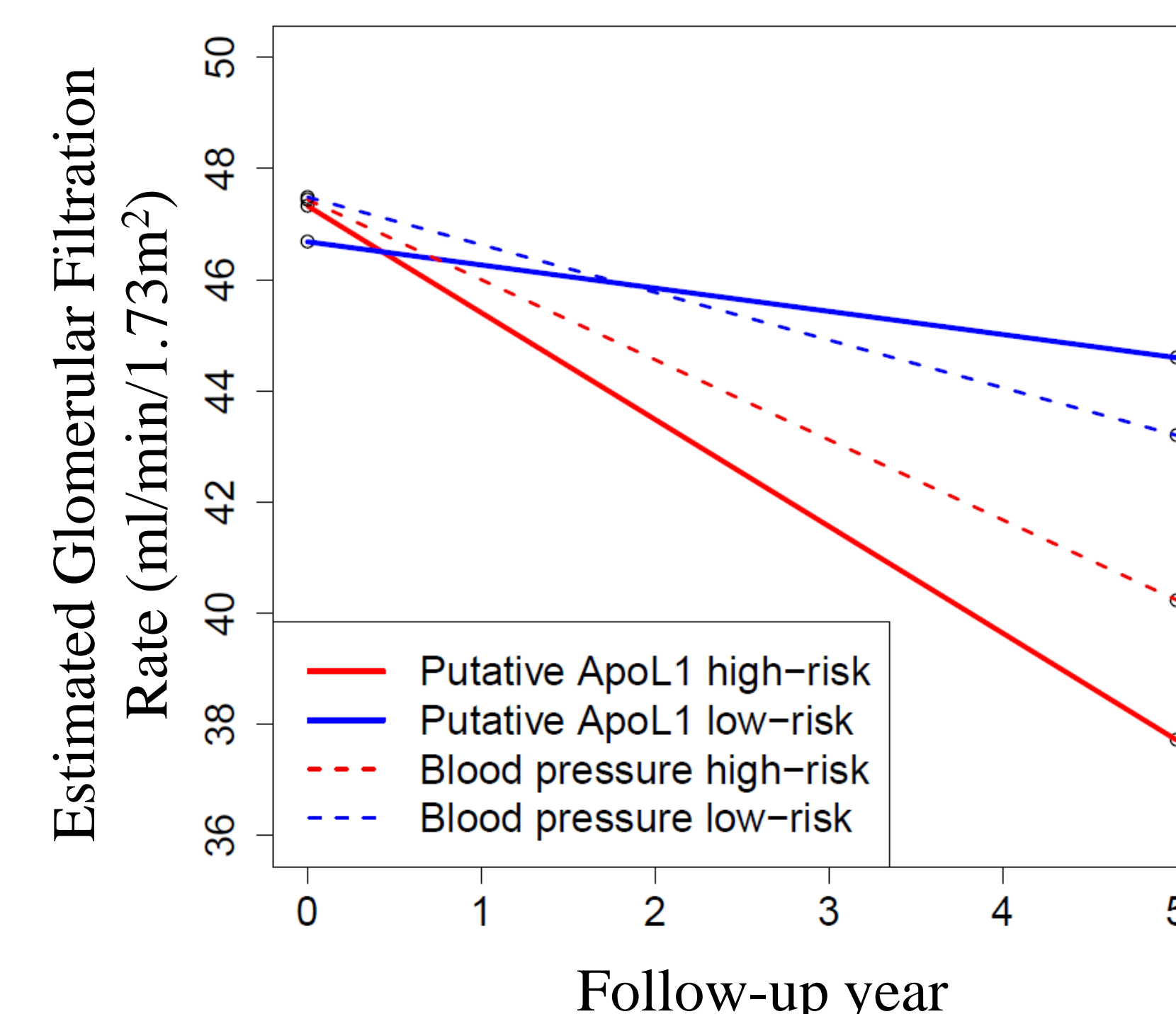


Table 3. Baseline alanine transaminase (ALT) and aspartate transaminase (AST) for Black putative ApoL1 high- and low-risk cohorts

	Putative low-risk cohort (N = 78)	Putative high-risk cohort (N = 20)	P-value
Alanine transaminase (U/L)	30.7±17.4	21.9±6.9	<0.001
Aspartate transaminase (U/L)	21.5±9.7	20.3±4.1	0.29

Discussion

Utility of method Rate of change in eGFR is an important metric of CKD progression; values below 15 ml/min/1.73m² are indicative of irreversible kidney function necessitating dialysis or transplant. In the present study, of the ten most-severe rates of annual decline in eGFR from the combined dataset, sixty percent were observed in putative ApoL1 high-risk patients (including the top one percent of rates), even though the group comprised only twenty percent of the full cohort used in this analysis.

High blood pressure as a secondary effect Mean baseline blood pressure was higher in the putative ApoL1 high-risk cohort than low-risk, possibly confounding results. However, no significant differences were found when segmenting the dataset by blood pressure. In a previous study, it was found that most hypertension-attributed nephropathy seen in those homozygous for the ApoL1 risk variant resulted primarily from kidney disease pathogenesis, with high blood pressure being a secondary effect⁵. The present study is the first to show this distinction using EMR data, albeit putatively.

References

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