

Supplemental Materials

1		
2	Table of Contents	1
3	Supplementary methods	3
4	Supplementary results	10
5	Supplementary figures	11
6	Figure S1: Allograft survival for high vs. low CADI-12.....	11
7	Figure S2: Workflow for bioinformatic data analysis.....	12
8	Figure S3a-c: Identification of differentially expressed genes significantly associated with high 3-	
9	month or 12-month CADI using Spearman correlation analysis.....	13
10	Figure S4a-b: Gene Ontology and immune cell type analysis of genes associated with CADI-m3 and	
11	CAD-m12.....	16
12	Figure S5: Geneset Enrichment Analysis (GSEA) identified significant GO biological processes	
13	associated with high CADI-3 and CADI-12.....	18
14	Figure S6: Cross-validation and permutation validation of the 13 geneset	19
15	Figure S7: ROC curves for high/low CADI-12 prediction at higher CADI-12 cutoffs.....	20
16	Figure S8: ROC curves of prediction for fibrosis by Banff criteria (Ci+Ct scores), IFTA and on	
17	patients without ACR using the 13 geneset.....	21
18	Figure S9: Prediction of kidney function with the 13 geneset	22
19	Figure S10: Prediction of progressor and non-progressor with 13 geneset.....	23
20	Figure S11: Allograft survival for progressors and non-progressors.....	24
21	Supplementary tables	25
22	Table S1: Demographic and clinical characteristics for GoCAR qPCR validation cohorts.....	25
23	Table S2: The 84 focus geneset.....	26
24	Table S3: Multivariate analysis of clinical variable and geneset prediction of CADI-12.....	29
25	Table S4: CADI subscore comparisons between progressor /non-progressor.....	30
26	Table S5: Multivariate analysis of m12 and m24 progressor/non-progressor prediction with clinical	
27	parameters and geneset.....	31
28	Table S6: Association of 10 principle components of 13 geneset with graft loss in Cox proportional	
29	hazard model.....	33
30	Table S7: Association of demographic or clinical variables with graft loss in Cox proportional hazard	
31	mode.....	34
32	Table S8: Validation of the GoCAR geneset in other kidney transplant cohort.....	35
33	References	36
34		

35 **Supplementary methods:**

36 **Clinical Data Collection**

37 Donor and recipient data were collected at baseline. Donor information included age, race, gender,
38 HLA genotype, cause of death, and graft status (i.e. SCD, ECD, or DCD). Recipient data included age,
39 gender, race, cause of ESRD, HLA genotype, PRA, presence and type of anti-HLA antibodies, cross
40 match status, cold ischemia time (CIT), delayed graft function (DGF), immunosuppression regimen,
41 CMV status, HCV and HBV status, dialysis vintage, dialysis modality, transfusion history, pregnancy
42 history, and previous transplants **We have adhered to the STROBE checklist throughout the manuscript.**
43 **The clinical data from 5 different clinical centers were deposited into a central clinical eRAP database**
44 **developed at Mount Sinai.**

45

46 **Histopathology:**

47 2 tissue cores were taken from each of the 3-month and 1 year protocol renal biopsies of the
48 Genomics of Chronic Allograft Rejection (GoCAR) cohort. One core was processed for histology and the
49 other core was processed for mRNA. When only one core could be obtained priority was given to mRNA
50 at 3-months and to histology at 12-months. Renal biopsies were processed and read centrally. Formalin-
51 fixed, paraffin-embedded sections were processed for histologic stains (hematoxylin and eosin, periodic
52 acid Schiff, trichrome and Weigerts elastic stains). Immunohistochemistry for C4d was done on an
53 automated stainer on paraffin sections stained with a rabbit polyclonal antibody (American Research
54 Products, Inc.). All slides were scanned with a whole slide scanner (Aperio CS) and high-resolution
55 digital images and archived in an image database.

56 Biopsies were evaluated and scored separately by 2 renal pathologists, without knowledge of the
57 clinical data, using the Revised Banff 2007 Classification for Renal Allograft Pathology¹ (SIS reference).
58 Where diagnoses were discordant, a meeting was held with a third pathologist for a consensus diagnosis.

59 Scoring was done on the whole slide images for all cases. Scores were entered into a custom Filemaker
60 Pro database that calculated the Banff categories and Chronic Allograft Damage Index (CADI). The
61 CADI-score is a composite score that includes six histologic components – vascular intimal sclerosis (cv),
62 tubular atrophy (ct), interstitial fibrosis (ci), interstitial inflammation (i), mesangial matrix increase (mm)
63 and glomerulosclerosis (g). Each component is scored between 0 & 3, giving a maximum possible score of
64 18. CADI-scores in protocol biopsies has been validated to directly correlate with outcomes by several
65 authors²⁻³.

66 Definition of "protocol biopsy" is that the biopsy is performed for the study or as part of a
67 standard protocol at a given site in which a biopsy is performed based on time post-transplant and not
68 based on an increase in creatinine or change in clinical status.

69 *Treatment of Censored data:* For analysis for histological outcomes, patients without 12-month
70 biopsies were excluded from analysis. For analysis of functional outcomes or eGFR - we imputed a GFR
71 of 10 ml/min for all death-censored graft losses. For analysis of graft survival via Kaplan-Meier, we
72 censored patients whose follow up data became unavailable at respective time points, whereas patients
73 who had "events" (ie graft-loss) were censored at the time of the event.

74 **Microarray experiments**

75 The graft biopsies from 5 participating centers were sent to Mount Sinai and were stabilized with
76 RNA-later(Qiagen, Inc). Total RNA was extracted from percutaneous graft biopsy samples obtained at 3
77 month after transplantation using All prep kit (QIAGEN-ALLprep kit, Valencia, CA USA) by one
78 technician at Mount Sinai. RNA quality was assessed using Bioanalyzer 2100 (Agilent Technologies).
79 Samples with an RNA Integrity Number greater than eight were used in subsequent microarray
80 experiments. Affymetrix humanexon 1.0 ST arrays were used following standard protocol provided by
81 the manufacturer (Affymetrix Inc.). In brief, ENCORE amplification and labeling kit (NuGen, San Carlos,
82 CA) was applied to the first batch of samples starting with approximately 100ng of total RNA to generate

83 biotin-labeled RNA fragments for hybridization to the chip. For samples with a low RNA concentration,
84 the Nugen Ovation PICO amplification kit (NuGen, San Carlos, CA) was applied. The chips were
85 scanned using GeneChip Scanner 7G (Affymetrix Inc.). The Affymetrix genechip experiments were
86 performed at Mount Sinai Microarray Core.

87 **Microarray data processing**

88 The intensity data of microarray experiments at the gene level were extracted and summarized
89 with the RMA algorithm⁴. Data quality was assessed using the Affymetrix Expression Console
90 (Affymetrix Inc). The Affymetrix control probesets and probesets with a low intensity (less than 20%
91 quantile among all the data points) across all samples were excluded from downstream analysis. Batch
92 effects were adjusted using the ComBat R package⁵.

93 **Bioinformatic analyses**

94 The workflow of bioinformatic analysis is depicted in Suppl. Fig 3. and the analysis was
95 performed with statistical R packages. The goal of analyses was to derive a relatively robust set of genes
96 (~10-20) that predicts the development of chronic graft nephropathy.

97 *Identification of the graft transcriptional signature:* Spearman correlation analyses were performed on the
98 3-month graft gene expression data for 3-month graft CADI score (CADI-3) as well as 12-month CADI
99 score (CADI-12). The correlation coefficient and the p-value for the relationship between the level of
100 expression and CADI score were calculated for each gene. The slope of gene expression against the
101 CADI score was also computed using a linear regression model. Genes with a p value of < 0.05 were
102 selected. Two lists of genes with p<0.05 were generated corresponding to either the 3 month or 12 month
103 CADI scores. Annotated functional and molecular mechanisms of these 2lists of genes were determined
104 by Gene Ontology (GO) enrichment analysis based on Fisher-exact test. **To investigate which immune**
105 **cell type genes are associated with CADI-3 or CADI-12, we downloaded the public expression data of**
106 **various immune cell types (<https://www.immgen.org/>) and identified highly expressed genes for each**
107 **immune cell type by the rank of gene expression across cell types. We then checked which immune cell**
108 **types are correlated with CADI-3 or CADI-12 based on the enrichment of immune cell type genes.**

109 Alternatively, the gene expression dataset was analyzed to determine biological functions that are
110 enriched in biopsies with higher CADI scores. To accomplish this, we applied Geneset Enrichment
111 Analysis (GSEA)⁶⁻⁷ to the entire microarray dataset and determined gene functions that are enriched in
112 samples with a high CADI score ($CADI \geq 2$) versus those with a low CADI score ($CADI < 2$). Top GO
113 terms associated with both the high and low CADI groups were determined, and compared to the results
114 of GO enrichment analysis derived from the analyses of correlation between gene expression level and
115 CADI score described above.

116 *Prediction analysis:*

117 To derive a more significant and focused geneset from the large list of genes that have
118 statistically significant association with CADI-3 or CADI-12 scores, we filtered the gene list by applying
119 various statistical prediction models. First, the whole cohort of patients was randomly assigned to 2
120 groups in a 1:1 ratio. Spearman correlation analysis was applied to determine the genes with expressions
121 levels that correlated with the severity of CADI score at 3 and 12 months. The 1:1 randomization was
122 repeated 100 times and correlation analysis of gene expression with CADI score at 3 and 12 month was
123 performed for each of the 100 iterations. We considered genes that occurred more than twice in the 100
124 iterations of randomization with a correlation at a $P < 0.05$ with CADI in both groups as a focused geneset
125 from which a minimal prediction set was identified for predicting kidney fibrosis. Genes that were
126 exclusive to the CADI-12 focus geneset (i.e. genes not shared with the CADI-3 focus geneset) were
127 derived and further filtered by correction for clinical confounders (donor age, living vs deceased donor,
128 donor gender and race, cold ischemia time(CIT, minutes), induction therapy, anti HLA class I, and II
129 antibodies) using multiple linear regression analysis, as well as exclusion of genes with a low median
130 \log_2 intensity of less than 5.

131 Finally, we performed iterative logistic model fitting (5000 iterations) in order to identify an
132 optimal and minimal geneset for prediction of future kidney fibrosis. We started by randomly selecting 20
133 genes from the filtered CADI-12 focus geneset. The expression data of the 20-gene group was fitted into

134 | **Firth-type bias-reduced logistic regression model which panelizes the maximum likelihood^{8 9} in logistf** |

135 R package for prediction of high (CADI-12 ≥ 2) and low (CADI-12 < 2) CADI-12. We used a CADI-12 cutoff
136 of ≥ 2.0 to derive our prediction geneset. The paper we referenced by Yilmaz² also evaluated protocol
137 biopsies at 1 year and divided their biopsies into 3 groups < 2 , 2-3.9 and > 4 . Whilst a CADI score > 4 had
138 the strongest association with graft loss, those with a CADI score of 2-3.9, were also associated with graft
139 loss where as those with a score < 2 did not. We selected a CADI-12 ≥ 2 based on this prior publication³.
140 The genes with significant association with high/low CADI-12 ($p < 0.05$) were identified from the
141 regression model for each of the 20-gene group. The steps above were repeated 5000 times. Statistically
142 significant genes ($P < 0.05$) were identified from each iterative operation. The occurrence of significant
143 genes from the 5000 iterations was calculated. Finally, the top 40 genes ranked by the number of
144 occurrences were applied back to the penalized logistic regression model for high vs. low CADI-12
145 prediction. Statistically significant genes ($P < 0.05$) using this model were considered the final optimal
146 geneset. The AUC score and sensitivity and specificity were calculated from logistic regression model
147 using the final optimal geneset. To investigate the overfitting issues of prediction of training set with the
148 geneset, cross-validated prediction AUC was also calculated using a 3-fold cross-validation method.
149 Briefly, the patients were randomly divided into 3 groups of equal size and equal number of high and low
150 CADI-12 patients and the data for any 2 groups were used as the training set with the third as the
151 prediction set. The penalized logistic regression model that was built on the training set was applied on
152 the prediction set to predict the outcome and the true and false positive rates. Prediction accuracy was
153 calculated from the prediction data set and then averaged from three possible permutations. We repeated
154 the steps over 100 times. The overall true or false positive rates and prediction accuracy were computed.
155 The distribution of AUCs on the testing set based on the model derived using the training set for 100
156 iterations was plotted.

157 To assess if the geneset we identified was an optimal geneset for high/low CADI-12 prediction,
158 we compared the original prediction AUC with prediction AUCs from the genesets that were identified
159 from high/low CADI-12 groups after 2000-time random re-shuffling of CADI-12 scores. Briefly, CADI-
160 12 scores were randomly re-assigned to the patients, the prediction geneset from re-shuffled high/low

161 CAD-12 groups was identified in the same approach as for original CADI-12 groups and the AUC was
162 therefore calculated. These steps were repeated 2000 times and the original AUC was compared to the
163 1000 AUCs from randomly-assigned CADI-12 groups.

164 Our geneset identification and prediction approach was further fully cross-validated with leave-
165 one-out cross-validation algorithm. Briefly, we took one patient as validation set and the remaining
166 patients as training set and identified new geneset from training set in the same approach as for original
167 cohort. The logistic model built on training set with new geneset was then applied to the patient that was
168 left out and the prediction probability was calculated. These steps were repeated in all the possible ways
169 of selecting training and testing sets and ROC curve was drawn based on the probabilities of testing sets
170 from all iterations.

171 Prediction of high/low CADI-12 at a different threshold (high CADI-12 \geq 3 or high CADI-12 \geq 4)
172 was also performed to assess the robustness of 13 geneset prediction. To check if the inflammation was
173 the driver of the 13 geneset, we evaluated the prediction of Banff criteria (Ci+Ct scores), IFTA and high
174 CADI-12 on the patients without acute rejection. Lastly we investigated if the geneset can predict the
175 kidney function and we calculated prediction AUC of eGFR at 12 month or 24 month with geneset.

176 To investigate whether prediction by the geneset is superior to prediction by clinical variables, we
177 performed the multivariate logistic regression for prediction of high/low CADI-12 by including the
178 following demographic/clinical variables: donor age, recipient race and gender, deceased donor status,
179 extended-criteria donor kidney, cold ischemia time (CIT, minutes), induction therapy, presence of Anti-
180 HLA antibodies, delayed graft function and HLA mismatch. After step-wise selection, the variables that
181 remained significant were used in final model. The AUC for the ROC curve of the final model was then
182 calculated and compared to CADI-12 prediction with the geneset.

183 We also applied our optimal geneset to predict the progressors and non-progressors using the
184 same approach described above. Patients who had CADI-3 \leq 3 and demonstrated a Δ CADI \geq 2 by 12 month
185 were considered as progressors, and those who had Δ CADI \leq 1 were considered non-progressors. A

186 similar assessments were done for those with CADI score at 24 months and also for the patients with
187 CADI-3 \leq 2.

188 To test if our geneset could predict early graft loss post-transplant for the original 159 patients,
189 we applied logistic regression prediction model with our geneset among only those patients who either
190 had graft loss within 3yr or had been followed-up for at least three years without graft loss and calculated
191 the AUC. Secondly, survival analysis on all 159 patients was performed to examine if our geneset was
192 associated with graft loss: to assess the association of the whole geneset with clinical outcome, the major
193 principle components of the expression data of the geneset rather than individual genes can be used to fit
194 an association statistic model along with clinical parameters, especially in the case where the geneset
195 contains many genes¹⁰⁻¹¹. In this study, we initially performed Principle Components Analysis (PCA) on
196 expression data for the 13 genes and the top 10 principle components (PC) were applied to Cox
197 proportional hazard model of time to graft loss. The principle components (PC) that were significantly
198 associated with graft loss were selected ($p<0.05$) and the linear combination of eigenvalues of significant
199 components multiplied by the coefficients of corresponding PCs from Cox model was used as the
200 geneset risk score (GR-score). The patients were then stratified into 2populations based on geneset risk
201 score (GR-score) for Kaplan-Meier survival analysis. Finally the time-dependent ROC for graft loss
202 prediction within 2 or 3 yrs post-transplant was plotted and the AUCs calculated. The demographic and
203 clinical variables, including 3-month estimated glomerular filtration rate (m3_eGFR), acute cellular
204 rejection at- or before 3-months (pre_or_m3_ACR), CADI-3, cold ischemia time (CIT, minutes),
205 deceased donor status, the presence of Anti-HLA antibodies, induction therapy, recipient race,donor age,
206 **delayed graft function and HLA mismatch** were also fitted in Cox proportional hazard model of time to
207 graft loss to investigate if the demographic or clinical variables were associated with graft loss.

208

209 **Validation of Geneset:**

210 We also validated our final optimal geneset on 2 independent public datasets. Both public datasets
211 were on the Affymetrix GeneChip platform HU430plus2 (GSE21374¹², GSE25902¹³). The raw data of
212 these public datasets were processed **separately** in Affymetrix Expression Console using the RMA
213 normalization approach. The expression data for each of the genes in our final optimal geneset was
214 extracted and a prediction model with the geneset was built **on each individual dataset**. Predictions of
215 clinical data (graft loss post biopsy at any time for GSE21374, and progressor/non-progressor based on
216 CADI score for GSE25902) was performed using the penalized logistic regression model. AUC scores for
217 each of these 2 datasets were calculated from the ROC curves for prediction specificity over sensitivity.
218 We also performed time to graft loss analysis on dataset1 (GSE21374) using the same approach as that
219 for GOCAR dataset.

220

221 **qPCR experiments**

222 Total RNA was extracted from graft biopsy samples of 45 independent GOCAR patients (N=18:
223 CADI-12 ≥ 2 , and N=27:CADI-12 < 2) using Allprep kit (QIAGEN-ALLprep kit, Valencia, CA USA).
224 cDNA was synthesized using AffinityScript RT kit with oligo DT primers (Agilent Inc. Santa Clara, CA).
225 TaqMan qPCR assays for the 13 geneset, 2 house-keeping genes (ACTB, GAPDH) and 18s were
226 purchased from ABI Life Technology (Grand Island, NY). qPCR experiments were performed on cDNA
227 using TAQMAN universal mix and PCR reaction was monitored and acquired using an ABI7900HT
228 system. Samples were measured in triplicates. Cycle Times (CT) values for the prediction geneset as well
229 as the 3 housing genes were generated. The Δ CT value of each gene was calculated by subtracting the
230 average CT value for the house-keeping genes from the CT value of each gene and penalized logistic
231 regression fitting model was then applied on Δ CT values for prediction of the high and low CADI-12 in
232 45 patients and AUC score was then calculated as described above.

233

234

235 **Supplementary results**

236 **Intragraft molecular phenotype is time dependent.**

237 Gene expression profiles from m3 biopsies were analyzed by correlation analysis and Geneset
238 Enrichment Analysis (GSEA) to understand molecular mechanisms of IF/TA (Figure S2) (n=159). We
239 identified 1127 genes significantly correlated with CADI-3 (716 positively and 411 negatively) and 1,143
240 genes with CADI-12 (914 positively and 229 negatively) at a cutoff unadjusted $p < 0.05$, (Figure S3a, S3b
241 and S3c). Only 230 genes (20.4%) correlated with both CADI-3 and CADI-12 (Figure S3a). Gene
242 Ontology enrichment indicated that the transcripts specifically associated with CADI-3 alone were related
243 to alloimmunity, including T-cell activation; while genes involved in programmed cell death/apoptosis
244 and cell adhesion were associated with CADI-12 alone (Figure S4a). **By enrichment analysis of immune**
245 **cell type genes, we observed that dendritic cell genes were specifically associated with CADI-3; however**
246 **stromal cell genes (mostly fibroblast cells) were the most significantly associated with CADI-12 in**
247 **addition to macrophage, dentritic and CD4 T cell related genes (Figure S4b).** Biological functions were
248 further confirmed by GSEA method in which gene expression data in GO categories were compared
249 between patients with high (≥ 2) and low (< 2) CADI at 3- or 12-months (Figure S5).

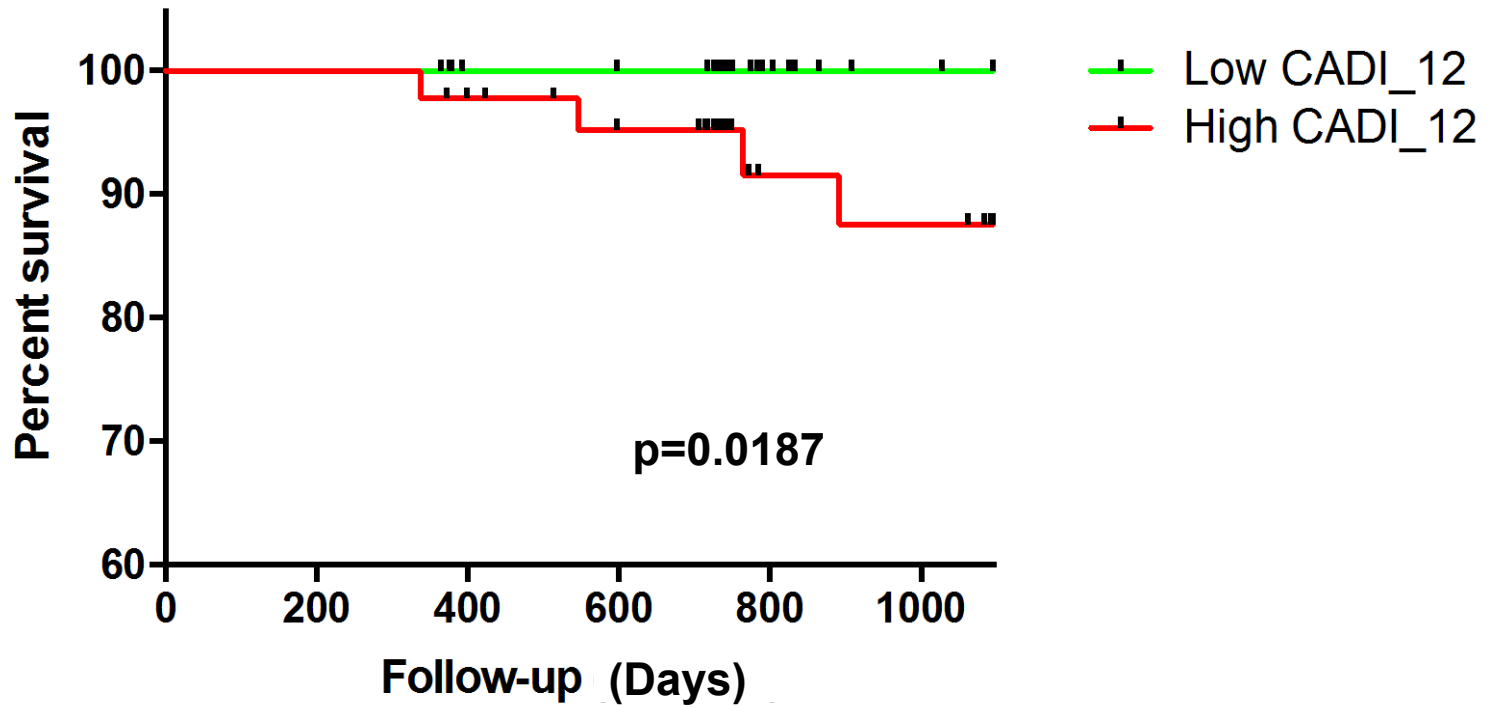
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Figure S1



High CADI-12:	44	44	42	38	24	22
Low CADI-12:	57	57	54	52	34	28

Figure S2

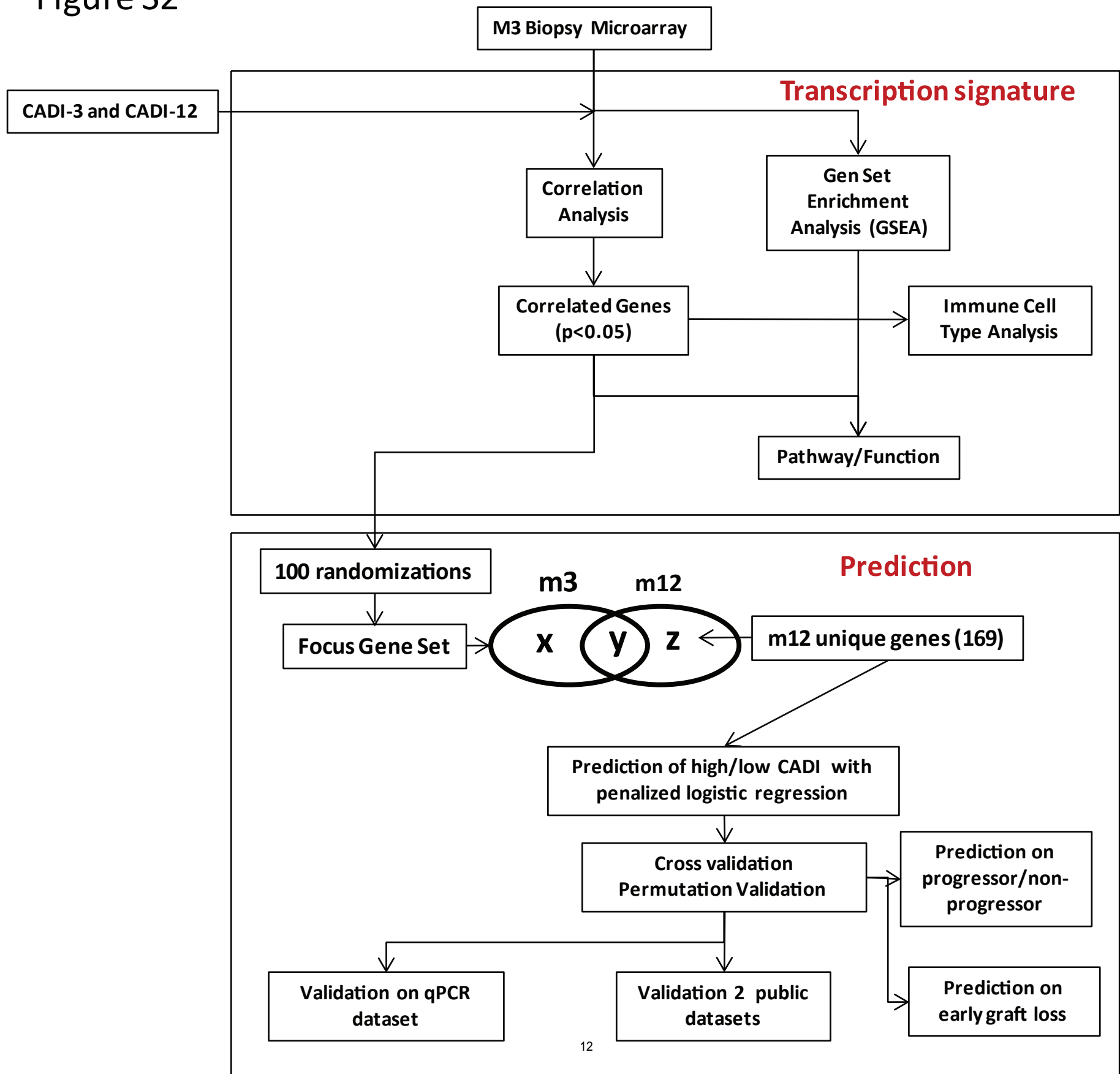


Figure S3a

CADI	Spearman Correlation P<0.05	Genes	Top 25 Genes
3 month CADI	Positive	716	IRF8, ALOX5, GABRP, GAPT, IKZF1, NUF2, PPM1M, ARNTL2, TOR1A, CPA3, BTK, CD180, ARL4C, CD200R1, PTPN22, ABCA12, APBB1IP, ITGB2, IGJ, C17orf87, ARG1, GNA15, GCNT1, AIM2, CLSPN
	Negative	411	USP2, FLJ42875, GAD1, B3GNT9, NAPB, LOC100130232, CA12, EGF, SLC4A9, TTC18, ADHFE1, ZNF793, NCOA6, SERPINA5, F11, PER3, ZNF385B, RALGPS1, FREM1, FRAS1, SALL1, ATXN7L1, WNK1, NEDD4L, CYP4Z1
12 month CADI	Positive	914	MACC1, LAMC2, CHCHD10, CCL2, GABRP, DUSP6, PROM1, CDC42SE2, ARL4C, SLC34A2, ARPC5, GCNT3, DLGAP1, KLHL13, FJX1, LIX1, TES, HS3ST1, SFN, MET, ITGB6, CLU, HPGDS, CYR61, FAM110B
	Negative	229	NHLH1, GPRC6A, TRPM6, LCE2D, SLC22A23, SORCS1, C11orf53, RXRA, PDK4, C7orf53, KANK1, KRT9, IRGC, C9orf84, NCKAP5, GOLGA2B, PCSK2, MGC13053, KREMEN1, TACC2, OR10A5, CCDC90A, PRM1, MT1B, C5orf45

Figure S3b

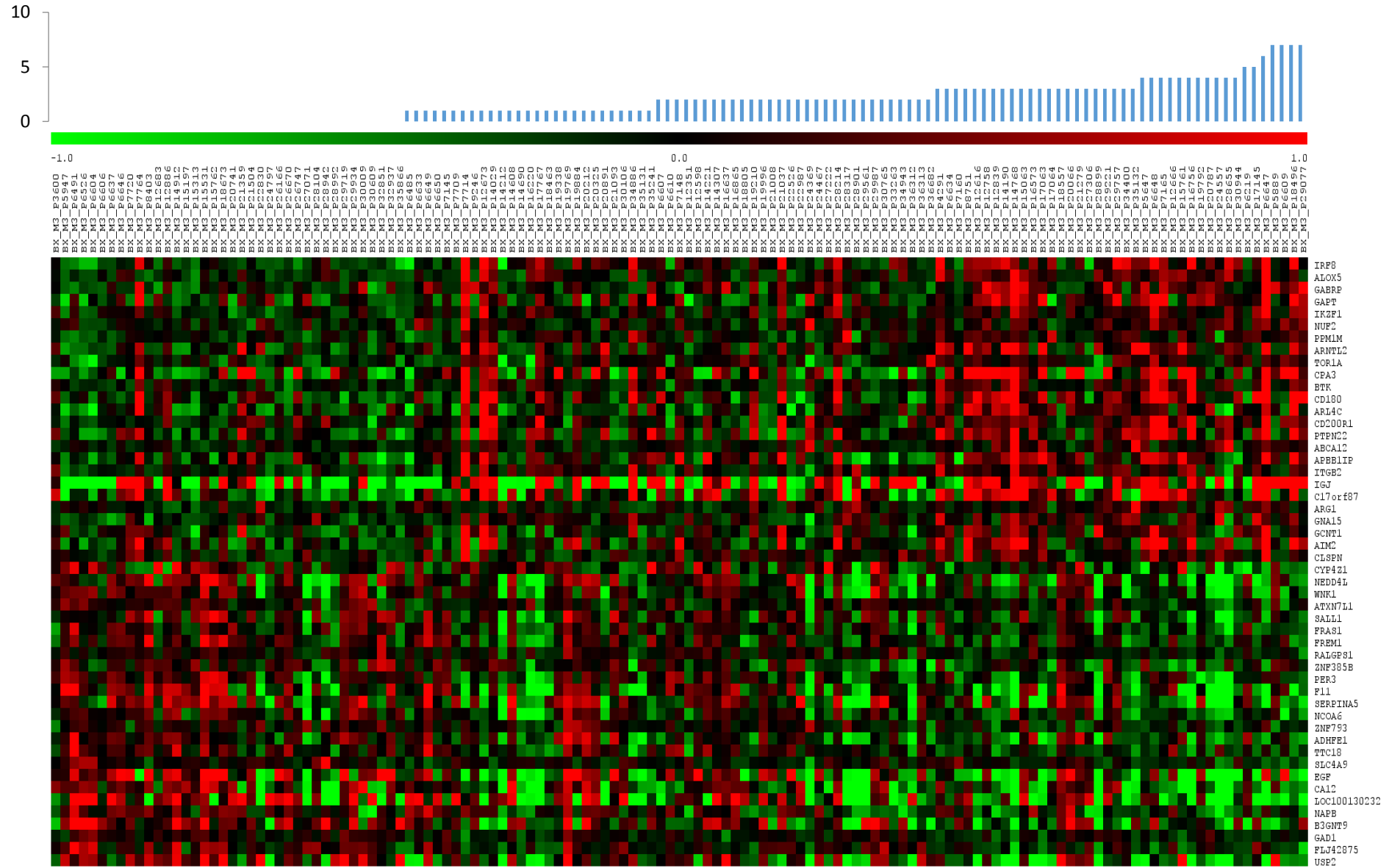


Figure S3c

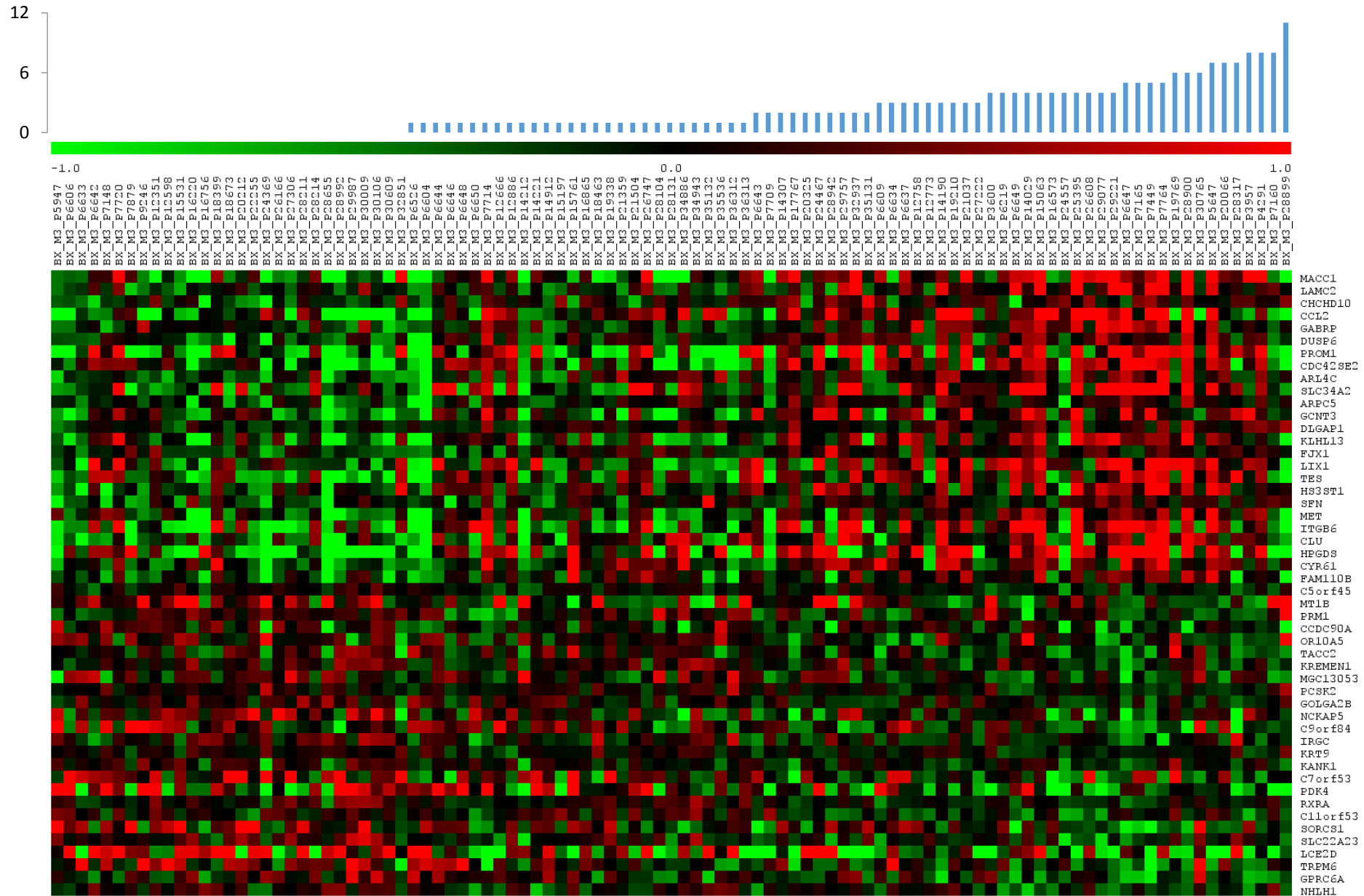


Figure S4a

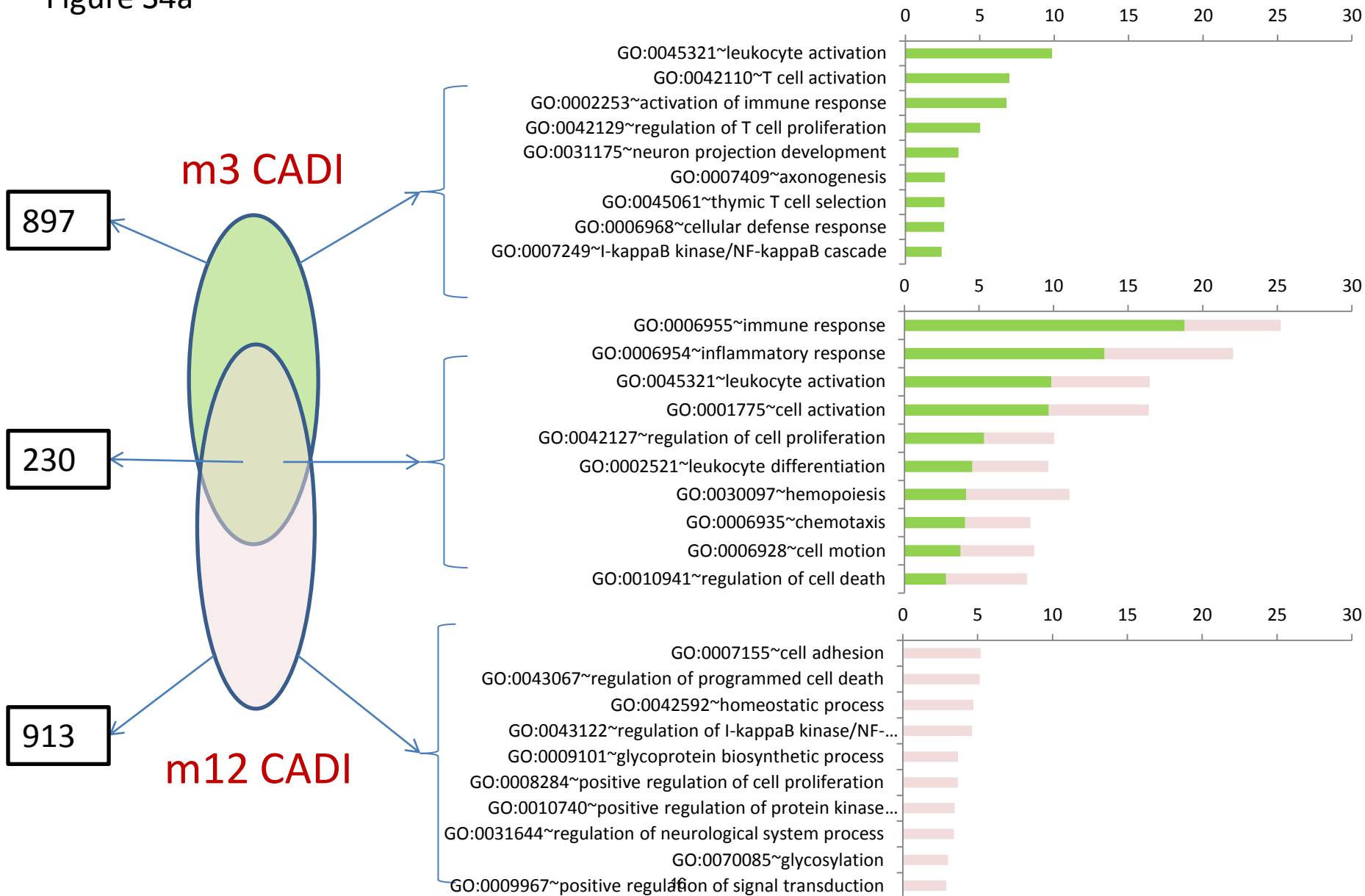
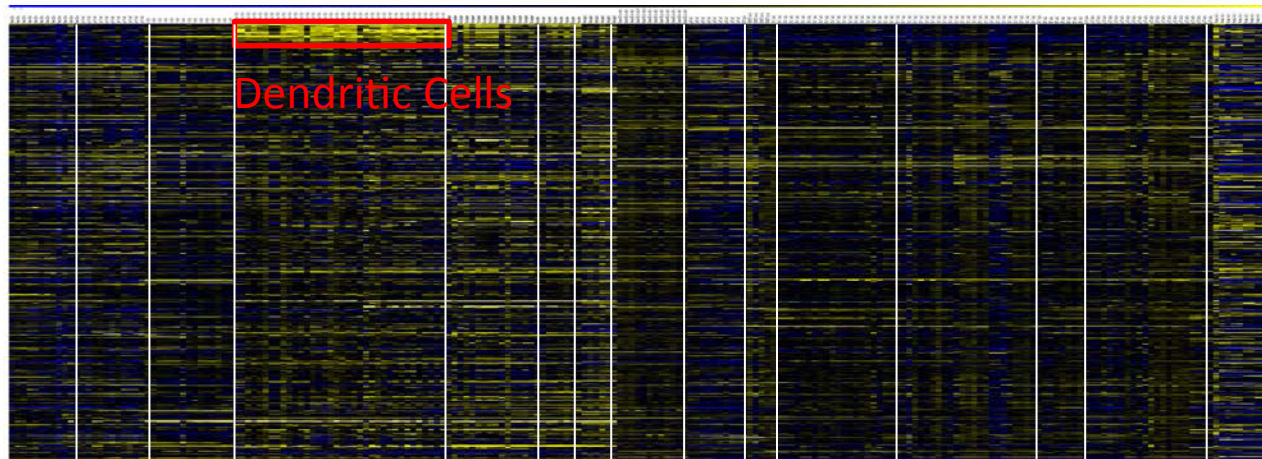
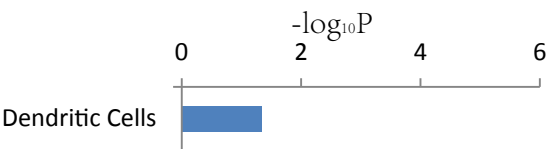
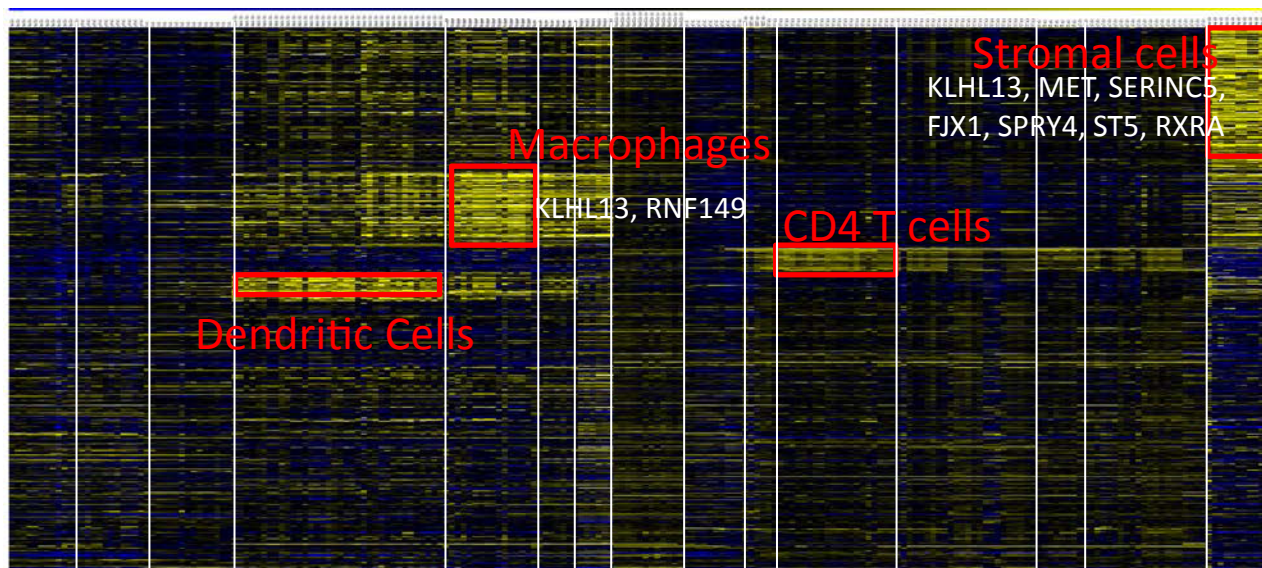
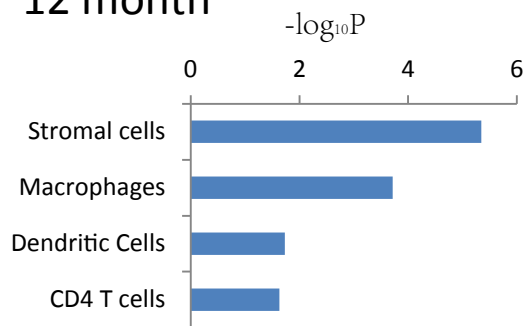


Figure s4b

3 month



12 month



Stem Cells
Pro-B Cells
B Cells
Dendritic Cells
Macrophages
Monocytes
Neutrophils
Nature Killer Cell
Pre-T Cells
CD4CD8 T Cells
CD4 T Cells
CD8 T Cells
NK T Cells
gd T Cells
Stromal Cells

Figure S5

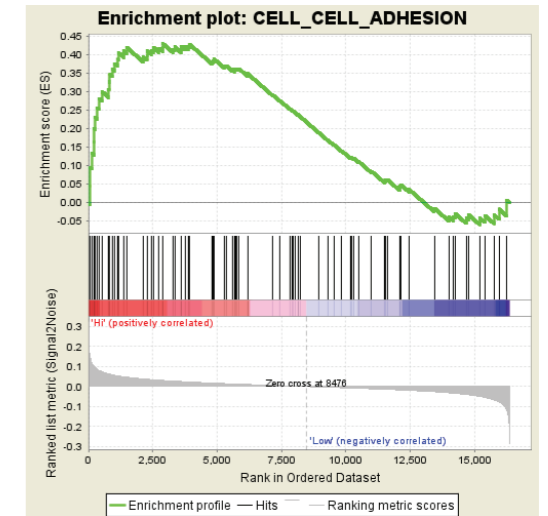
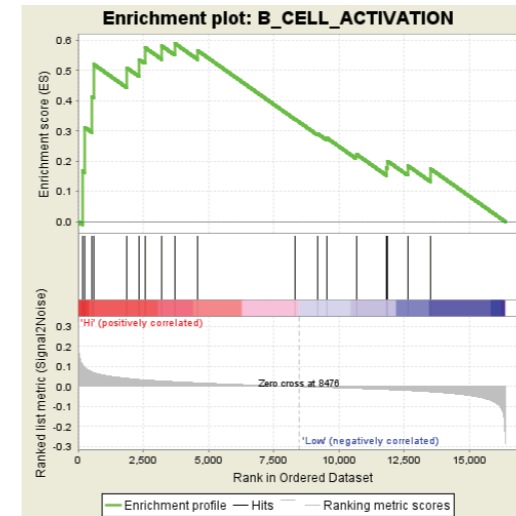
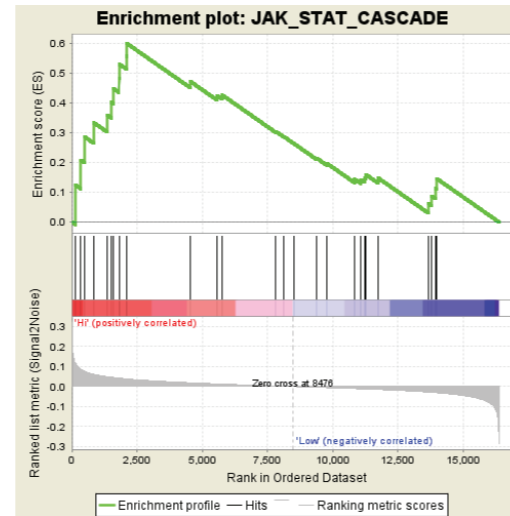
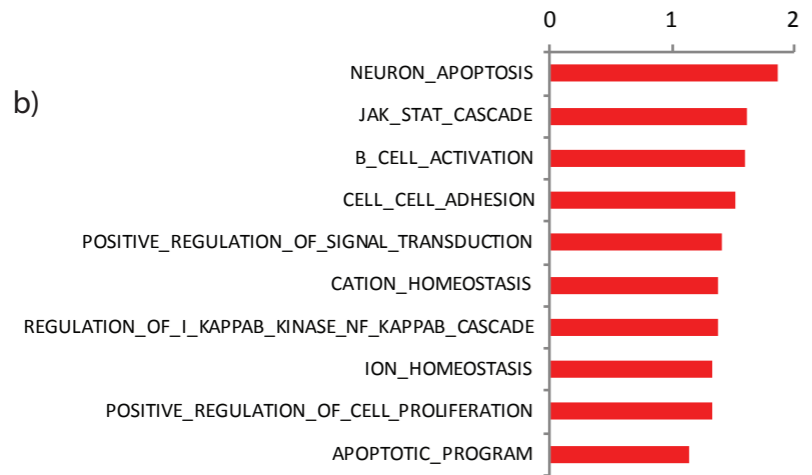
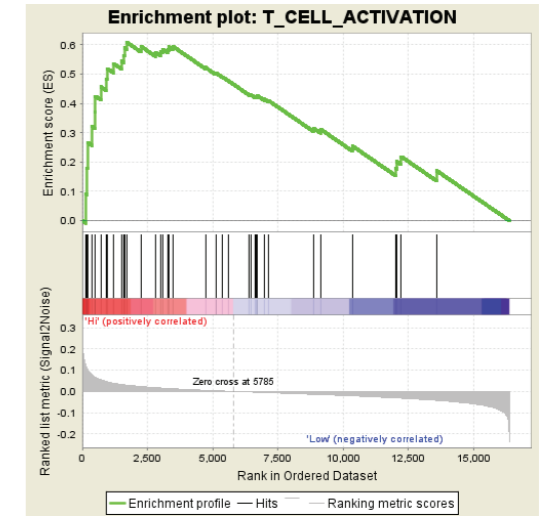
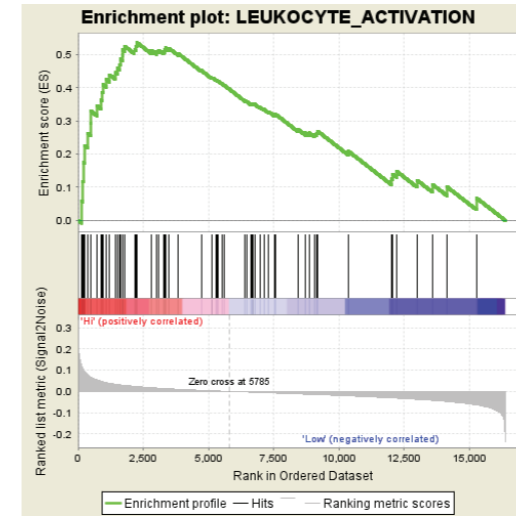
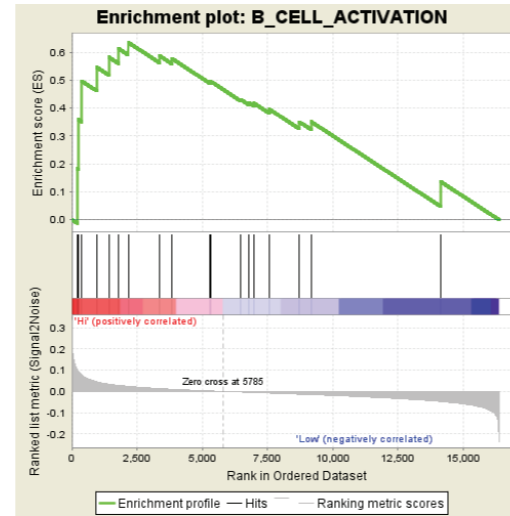
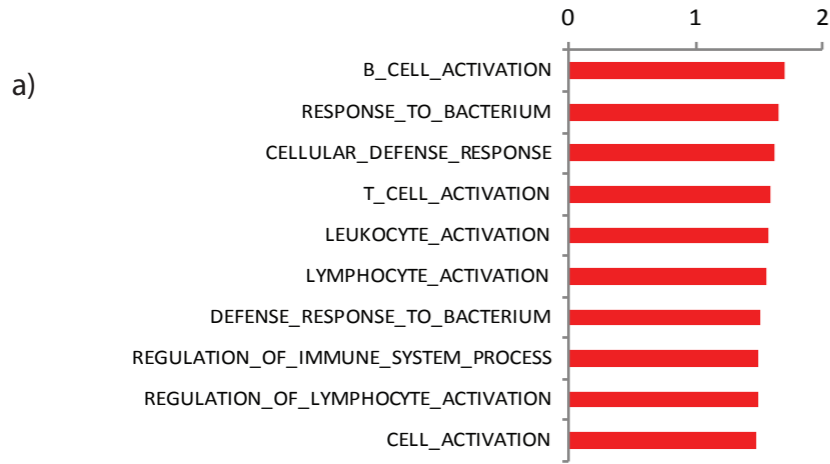
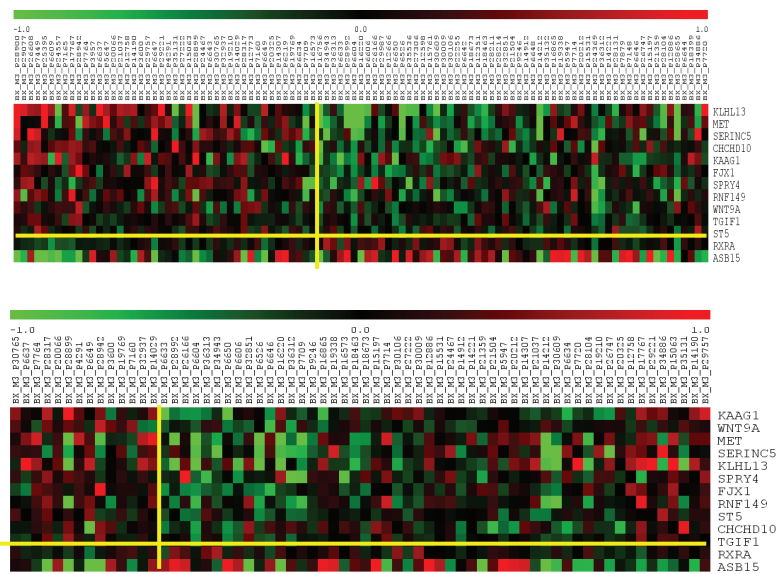
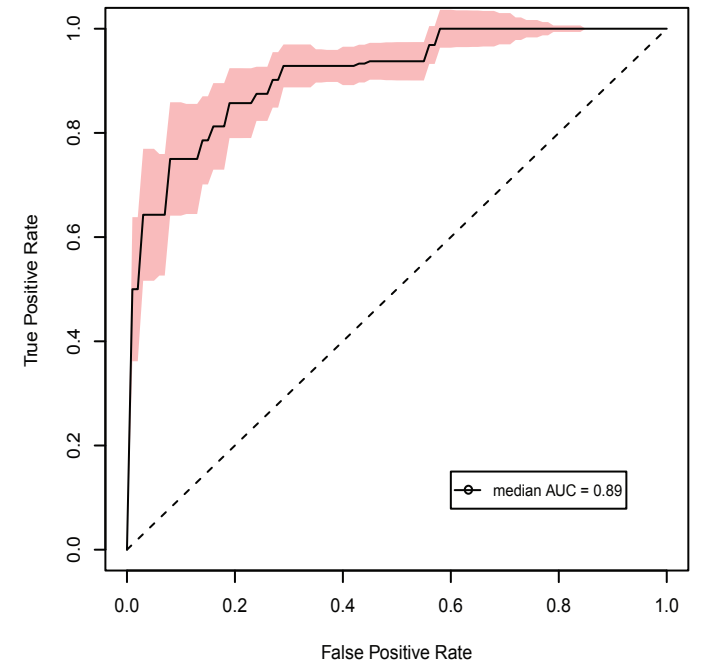


Figure S6

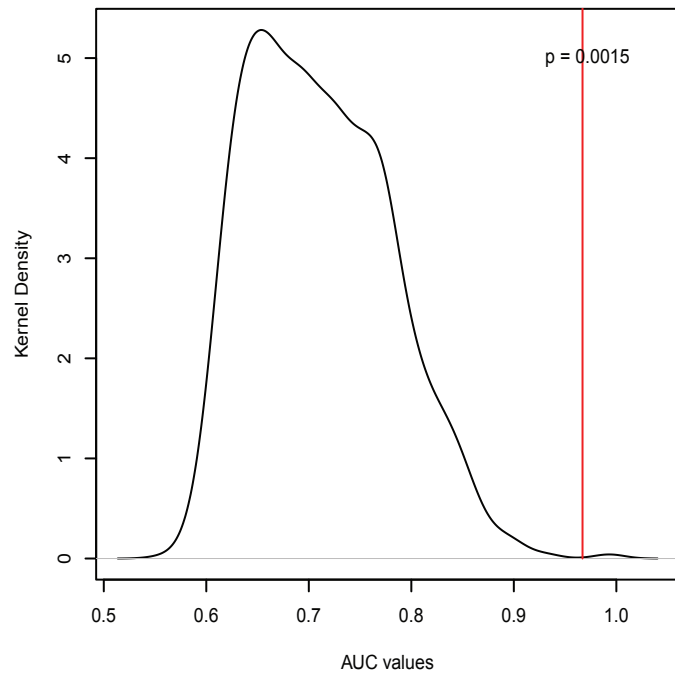
a)



b)



c)



d)

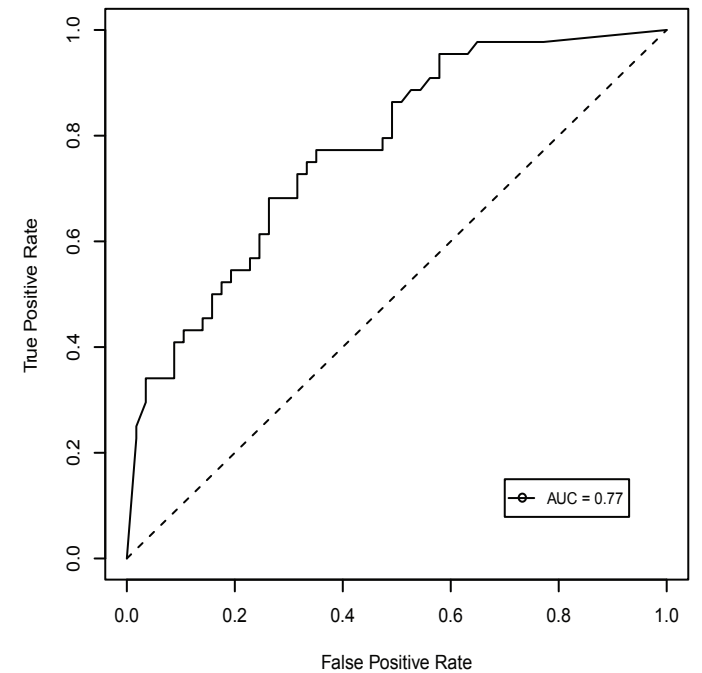


Figure S7

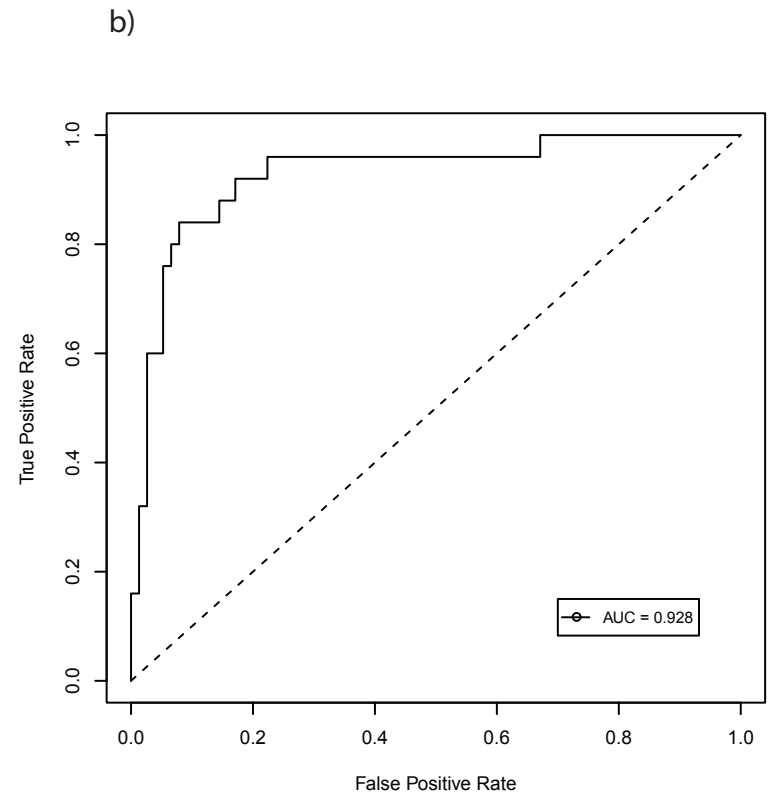
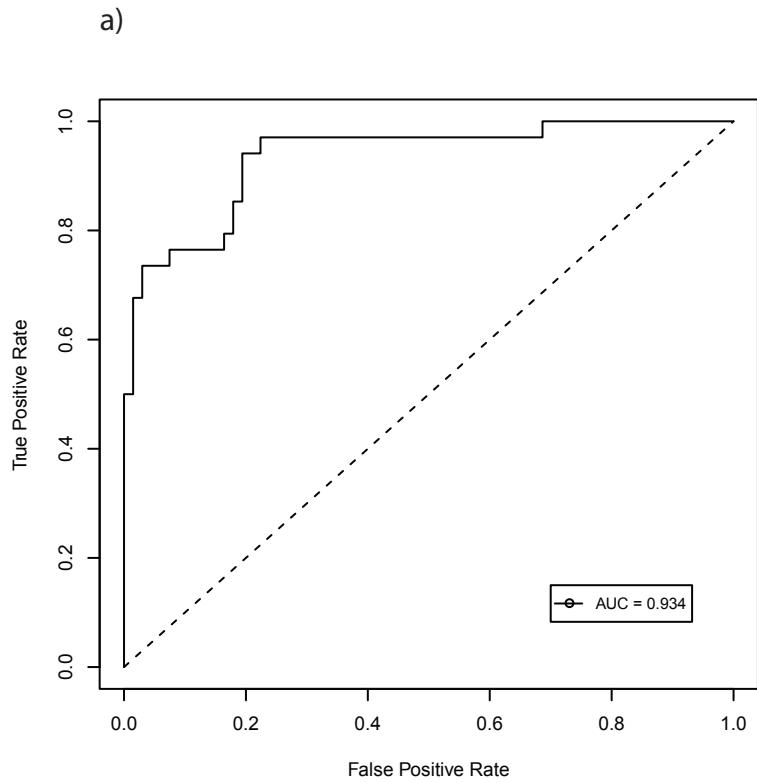
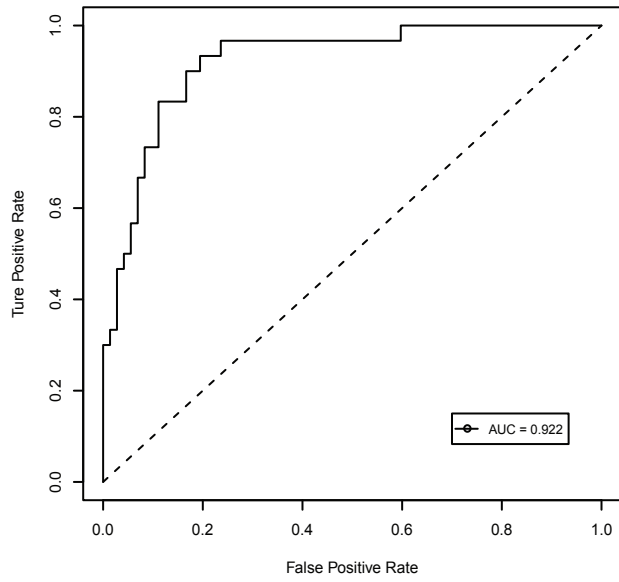
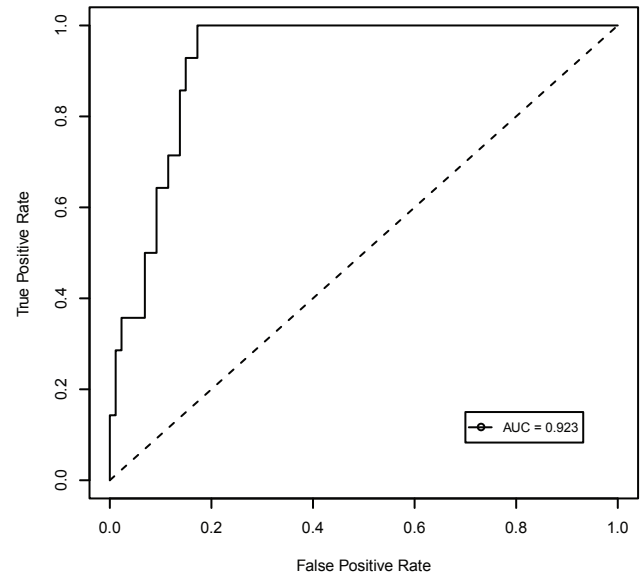


Figure S8

a)



b)



c)

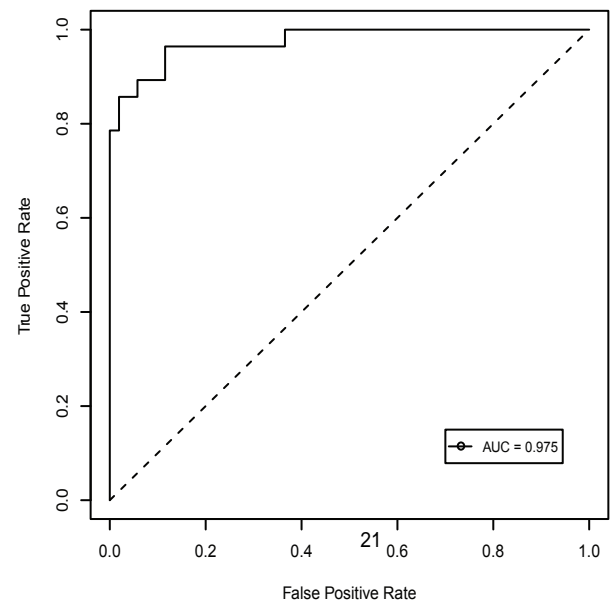


Figure S9

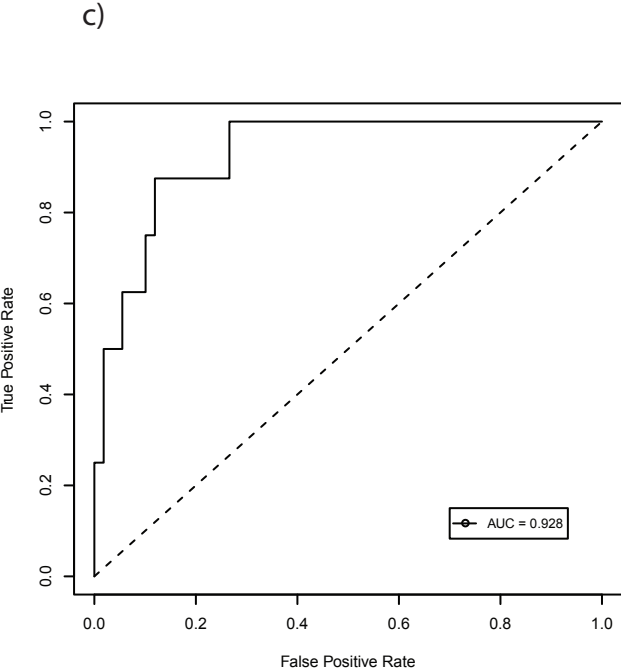
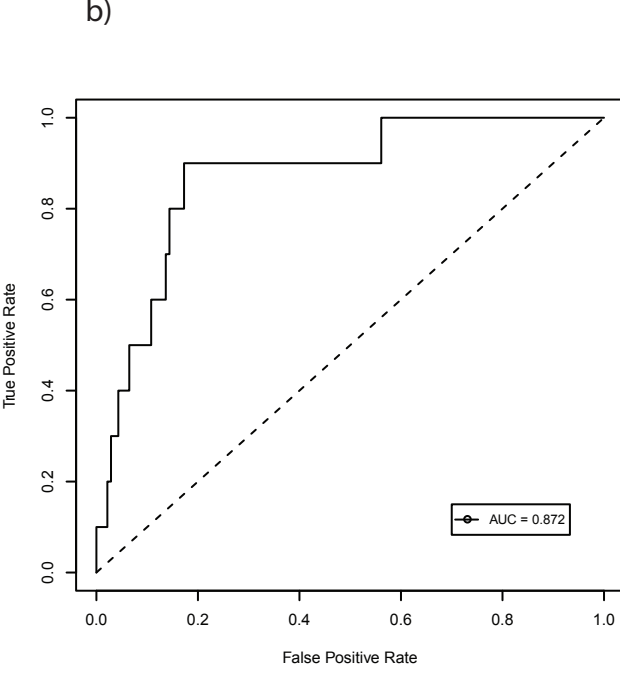
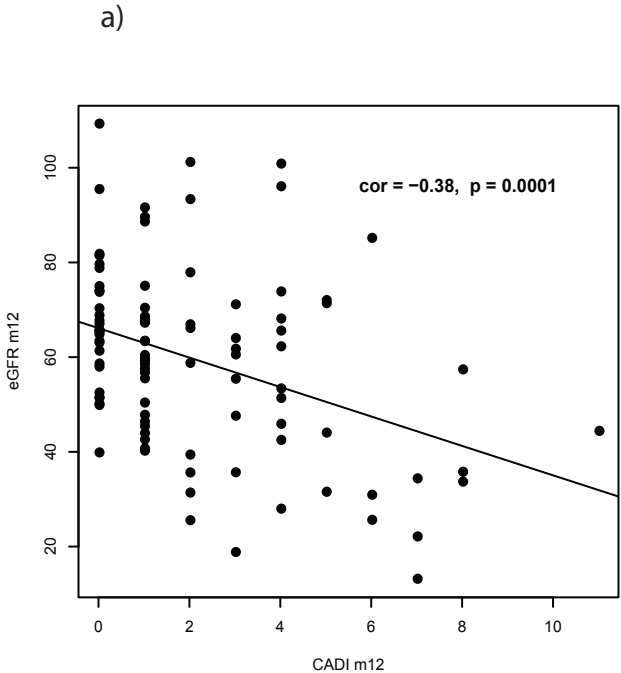
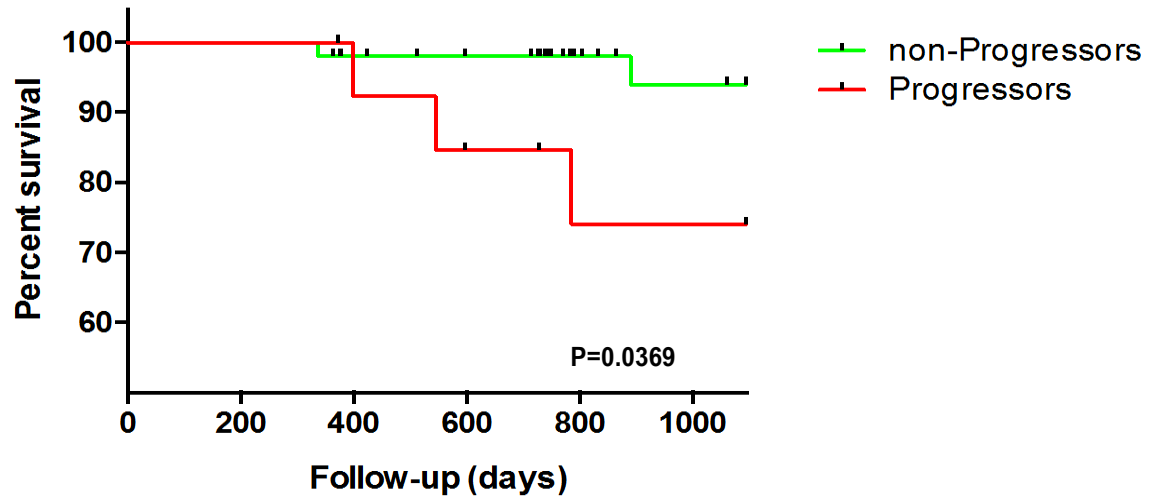


Figure S11



Progressor:	14	14	13	11	8	7
Non-progressor:	52	52	48	45	28	22

Table S1 : Baseline clinical and demographic characteristics for GoCAR patient cohorts.

Characteristics:	Microarray patients (n=101) Mean ± SD (%)	RT-PCR patients (n=45) Mean ± SD (%)	*P-value
Recipient age	46.90±12.38	46.81±11.52	0.69
Recipient race			0.96
Caucasian	66 (65.35)	33 (73.33)	
African American	15 (14.85)	3 (6.67)	
Other	20 (19.80)	9 (20.0)	
Recipient ESRD diagnosis			0.63
Diabetic nephropathy	33 (32.67)	10 (22.22)	
Hypertension	17 (16.83)	6 (13.33)	
Glomerulonephritis	22 (21.78)	15 (33.33)	
Polycystic Kidney	13 (12.87)	5 (11.11)	
Other	16 (15.84)	9 (20.00)	
Donor age	40.73±16.80	44.87±14.68	0.16
Donor race			0.72
Caucasian	80 (79.21)	42 (93.33)	
Non-Caucasian	21 (20.79)	3 (6.67)	
h/o Delayed graft function	9 (8.91)	5 (11.11)	0.54
Anti-HLA antibodies**	26 (26.8)	19 (42.2)	0.08
Class-I	26 (26.8)	19 (42.2)	
Class-II	10 (9.9)	12 (26.7)	
3-month eGFR-creatinine	59.48±18.11	59.27±18.91	0.94
3-month Acute rejection [#]	22 (21.7)	11 (28.94)	0.50
High/low CADI-12	44/57	18/27	0.72
High CADI-12			0.68
- Mean±SD	4.21±2.09	4.00±2.09	
- Median(IQR)	3 (2.75-5.0)	3 (2.75-5.0)	
Low CADI-12			0.99
- Mean±SD	0.49±0.50	0.48±0.51	
- Median(IQR)	0.0 (0.0-1.0)	0.0 (0.0-1.0)	

*P-value by Unpaired T-test (or non-parametric) and, Chi-square/Fisher's exact test.

** 97/101 & 38/45 patients had HLA antibodies measured.

Table S2: The 84 focus geneset

ProbeID	Gene Symbc	Gene Description	Cytoband	mRNA Accessic	CADI Corr	Pvalue
3040518	MACC1	metastasis associated in colon cancer 1	7p21.1	NM_182762	0.411	1.95E-05
3954887	CHCHD10	coiled-coil-helix-coiled-coil-helix domain containing 10	22q11.23	NM_213720	0.404	2.85E-05
3464860	DUSP6	dual specificity phosphatase 6	12q22-q23	NM_001946	0.391	5.20E-05
2761842	PROM1	prominin 1	4p15.32	NM_001145847	0.380	9.03E-05
2721959	SLC34A2	solute carrier family 34 (sodium phosphate), member 2	4p15.3-p15	NM_001177995	0.375	1.11E-04
3596147	GCNT3	glucosaminyl (N-acetyl) transferase 3, mucin type	15q21.3	NM_004751	0.373	1.22E-04
3796620	DLGAP1	discs, large (Drosophila) homolog-associated protein 1	18p11.3	NM_004746	0.369	1.44E-04
4019160	KLHL13	kelch-like 13 (Drosophila)	Xq23-q24	NM_001168307	0.369	1.49E-04
3326826	FJX1	four jointed box 1 (Drosophila)	11p13	NM_014344	0.367	1.60E-04
2868265	LIX1	Lix1 homolog (chicken)	5q15	NM_153234	0.359	2.29E-04
3020192	TES	testis derived transcript (3 LIM domains)	7q31.2	NM_015641	0.357	2.51E-04
3020343	MET	met proto-oncogene (hepatocyte growth factor receptor)	7q31	NM_001127500	0.352	3.01E-04
2583465	ITGB6	integrin, beta 6	2q24.2	NM_000888	0.352	3.09E-04
3129065	CLU	clusterin	8p21-p12	NM_001831	0.349	3.46E-04
2344888	CYR61	cysteine-rich, angiogenic inducer, 61	1p31-p22	NM_001554	0.342	4.60E-04
3167110	ANXA2P2	annexin A2 pseudogene 2	9p13	NR_003573	0.340	5.02E-04
2602770	DNER	delta/notch-like EGF repeat containing	2q36.3	NM_139072	0.340	5.02E-04
2825629	TNFAIP8	tumor necrosis factor, alpha-induced protein 8	5q23.1	NM_014350	0.338	5.45E-04
2974413	MOXD1	monooxygenase, DBH-like 1	6q23.1-q23	NM_015529	0.328	8.11E-04
2864449	SERINC5	serine incorporator 5	5q14.1	NM_001174077	0.318	0.0012
3108489	LAPTM4B	lysosomal protein transmembrane 4 beta	8q22.1	NM_018407	0.318	0.0012
3024025	MEST	mesoderm specific transcript homolog (mouse)	7q32	NM_002402	0.304	0.0020
3662041	OGFOD1	2-oxoglutarate and iron-dependent oxygenase domain containing 1	16q12.2	NM_018233	0.303	0.0021
3605395	ADAMTSL3	ADAMTS-like 3	15q25.2	NM_207517	0.300	0.0023
2876361	PITX1	paired-like homeodomain 1	5q31	NM_002653	0.294	0.0028
3224087	TTL11	tubulin tyrosine ligase-like family, member 11	9q33.2	NM_001139447	0.287	0.0036
3872335	ZNF416	zinc finger protein 416	19q13.4	NM_017879	0.287	0.0037
3332913	TMEM216	transmembrane protein 216	11q13.1	NM_016499	0.286	0.0037
3888383	SLC9A8	solute carrier family 9 (sodium/hydrogen exchanger), member 8	20q13.13	NM_015266	0.286	0.0037
2669979	CX3CR1	chemokine (C-X3-C motif) receptor 1	3p21 3p21	NM_001171177	0.284	0.0040
2486927	ARHGAP25	Rho GTPase activating protein 25	2p13.3	NM_014882	0.284	0.0040
2435218	TDRKH	tudor and KH domain containing	1q21	NM_001083967	0.283	0.0041

2933392	SYNJ2	synaptojanin 2	6q25.3	NM_003898	0.281	0.0044
3431892	SH2B3	SH2B adaptor protein 3	12q24	NM_005475	0.281	0.0044
2672140	LTF	lactotransferrin	3p21.31	NM_002343	0.281	0.0045
2567583	RNF149	ring finger protein 149	2q11.2	NM_173647	0.280	0.0046
3734648	SLC16A5	solute carrier family 16, member 5 (monocarboxylic acid transporte	17q25.1	NM_004695	0.277	0.0050
3726154	ITGA3	integrin, alpha 3 (antigen CD49C, alpha 3 subunit of VLA-3 receptor)	17q21.33	NM_002204	0.272	0.0060
3850445	CDKN2D	cyclin-dependent kinase inhibitor 2D (p19, inhibits CDK4)	19p13	NM_001800	0.272	0.0060
2899437	BTN2A1	butyrophilin, subfamily 2, member A1	6p22.1	NM_078476	0.270	0.0062
2879105	SPRY4	sprouty homolog 4 (Drosophila)	5q31.3	NM_030964	0.270	0.0062
3623717	FLJ10038	hypothetical protein FLJ10038	15q21.2	NR_026891	0.267	0.0070
3168938	POLR1E	polymerase (RNA) I polypeptide E, 53kDa	9p13.2	NM_022490	0.266	0.0072
2714132	PDE6B	phosphodiesterase 6B, cGMP-specific, rod, beta	4p16.3	NM_000283	0.263	0.0078
2356142	LIX1L	Lix1 homolog (mouse)-like	1q21.1	NM_153713	0.263	0.0080
3232349	PFKP	phosphofructokinase, platelet	10p15.3-p1	NM_002627	0.261	0.0084
2931391	MTHFD1L	methylenetetrahydrofolate dehydrogenase (NADP+ dependent) 1-li	6q25.1	NM_015440	0.259	0.0089
3960061	RAC2	ras-related C3 botulinum toxin substrate 2 (rho family, small GTP bi	22q13.1	NM_002872	0.259	0.0089
3261009	KAZALD1	Kazal-type serine peptidase inhibitor domain 1	10q24.31	NM_030929	0.255	0.0099
2315918	ATAD3C	ATPase family, AAA domain containing 3C	1p36.33	NM_00103921	0.254	0.0103
3820443	ICAM1	intercellular adhesion molecule 1	19p13.3-p1	NM_000201	0.253	0.0108
2374982	RNPEP	arginyl aminopeptidase (aminopeptidase B)	1q32	NM_020216	0.252	0.0109
3405587	GPRC5A	G protein-coupled receptor, family C, group 5, member A	12p13-p12	NM_003979	0.250	0.0115
3270270	PTPRE	protein tyrosine phosphatase, receptor type, E	10q26	NM_006504	0.247	0.0126
2359885	SLC27A3	solute carrier family 27 (fatty acid transporter), member 3	1q21.3	NM_024330	0.247	0.0127
3415320	KRT7	keratin 7	12q12-q13	NM_005556	0.246	0.0130
2414958	TACSTD2	tumor-associated calcium signal transducer 2	1p32-p31	NM_002353	0.246	0.0130
3868998	NKG7	natural killer cell group 7 sequence	19q13.41	NM_005601	0.245	0.0136
2361342	SEMA4A	sema domain, immunoglobulin domain (Ig), transmembrane domai	1q22	NM_022367	0.245	0.0137
3776504	TGIF1	TGFB-induced factor homeobox 1	18p11.3	NM_170695	0.244	0.0140
3028217	---	---	---	AK303101	0.243	0.0143
2881187	CSF1R	colony stimulating factor 1 receptor	5q33-q35	NM_005211	0.242	0.0146
2898441	KAAG1	kidney associated antigen 1	6p22.1	NM_181337	0.240	0.0154
3056264	ABHD11	abhydrolase domain containing 11	7q11.23	NR_026912	0.240	0.0156
2621881	P4HTM	prolyl 4-hydroxylase, transmembrane (endoplasmic reticulum)	3p21.31	NM_177938	0.237	0.0168
3185593	BSPRY	B-box and SPRY domain containing	9q32	NM_017688	0.237	0.0169

2369484	TOR3A	torsin family 3, member A	1q25.2	NM_022371	0.237	0.0171
2787902	GYPE	glycophorin E (MNS blood group)	4q31.1	NM_198682	0.237	0.0172
3738471	RAC3	ras-related C3 botulinum toxin substrate 3 (rho family, small GTP bi	17q25.3	NM_005052	0.234	0.0186
2692319	ADCY5	adenylate cyclase 5	3q13.2-q21	NM_183357	0.233	0.0192
3361971	ST5	suppression of tumorigenicity 5	11p15	NM_005418	0.232	0.0197
3865998	PNMAL1	PNMA-like 1	19q13.32	NM_018215	0.220	0.0270
2407985	HEYL	hairy/enhancer-of-split related with YRPW motif-like	1p34.3	NM_014571	0.219	0.0275
2323899	UBXN10	UBX domain protein 10	1p36.12	NM_152376	0.216	0.0300
2459352	WNT9A	wingless-type MMTV integration site family, member 9A	1q42	NM_003395	0.212	0.0332
3051655	VOPP1	vesicular, overexpressed in cancer, prosurvival protein 1	7p11.2	NM_030796	0.210	0.0353
3635903	LOC388152	hypothetical LOC388152	15q25.2	BC054509	-0.213	0.0327
3394412	THY1	Thy-1 cell surface antigen	11q22.3-q22	NM_006288	-0.234	0.0184
3907507	C20orf165	chromosome 20 open reading frame 165	20q13.12	NM_080608	-0.239	0.0160
3021696	ASB15	ankyrin repeat and SOCS box-containing 15	7q31.31	NM_080928	-0.263	0.0079
3645901	NAT15	N-acetyltransferase 15 (GCN5-related, putative)	16p13.3	NM_024845	-0.264	0.0078
2942578	CCDC90A	coiled-coil domain containing 90A	6p24.3-p23	NM_001031713	-0.272	0.0059
3193339	RXRA	retinoid X receptor, alpha	9q34.3	NM_002957	-0.300	0.0023
3305801	SORCS1	sortilin-related VPS10 domain containing receptor 1	10q23-q25	NM_052918	-0.306	0.0019

Table S3a: Multivariate analysis of high CADI-12 prediction with clinical/pathological variables only

Terms	OR	lower	upper	pvalue
Donor_Age	1.023	-0.015	0.061	0.2331
Recipient Race (Caucasian vs Non-Caucasian)	1.486	-0.742	1.534	0.4901
Recipient Gender	0.601	-1.627	0.583	0.3574
Deceased_donor	1.323	-1.233	1.773	0.7116
ECD_kidney	0.321	-3.548	1.238	0.3397
CIT_min	1.001	-0.001	0.004	0.1794
Induction_Therapy	0.774	-1.432	0.904	0.6631
Anti_HLA_Ab	0.856	-1.387	1.022	0.7973
Delayed_Graft_Function	1.719	-1.473	2.669	0.5912
HLA_Mismatch	1.202	-0.111	0.500	0.2242
m3_eGFR	0.971	-0.065	0.001	0.0552
pre_or_m3_ACR	2.977	-0.085	2.342	0.0690
CADI-3	1.212	-0.171	0.590	0.3058

*N=83 patients have complete demographic, clinical and pathological data

Table S3b: Multivariate analysis of high CADI-12 prediction with clinical/ pathological variables and the geneset

Terms	OR	lower	upper	pvalue
Donor_Age	0.997	0.931	1.066	0.9341
Recipient Race (Caucasian vs Non-Caucasian)	0.464	0.041	3.186	0.4433
Recipient Gender	0.709	0.113	6.838	0.7079
Deceased_donor	1.231	0.099	15.878	0.8621
ECD_kidney	0.319	0.003	14.644	0.5771
CIT_min	1.001	0.998	1.006	0.4830
Induction_Therapy	1.214	0.168	10.472	0.8444
Anti_HLA_Ab	0.215	0.010	1.652	0.1463
Delayed_Graft_Function	0.213	0.001	5.963	0.4057
HLA_Mismatch	1.021	0.575	1.989	0.9400
m3_eGFR	0.960	0.871	1.016	0.1696
pre_or_m3_ACR	2.732	0.345	31.021	0.3319
CADI-3	1.466	0.721	3.608	0.2921
Geneset	621.774	49.955	9.74E+04	1.06E-10

*N=83 patients have complete demographic, clinical and pathological data

Table S4: CADI subscore comparisons between 12-month progressors/non-progressors

Parameter	3-month			12-month		
	Progressors Mean±SD	Non-Progressors Mean±SD	*p-value	Progressors Mean±SD	Non-Progressors Mean±SD	*p-value
CADI	1.36±1.28	1.07±1.06	0.45	5.50±2.56	1.25±1.17	<0.0001
ct-score	0.38±0.50	0.46±0.50	0.75	1.71±0.91	0.56±0.50	<0.0001
cv-score	0.22±0.67	0.22±0.59	0.95	0.91±1.09	0.19±0.55	0.0025
ci-score	0.15±0.38	0.15±0.41	0.99	1.93±1.07	0.21±0.45	<0.0001
i-score	0.07±0.27	0.02±0.14	0.36	0.35±0.74	0.07±0.43	0.0439
mm-score	0.0±0.0	0.02±0.1	0.99	0.14±0.53	0.04±0.28	0.39
g-score	0.45±0.82	0.17±0.61	0.09	0.35±0.74	0.08±0.44	0.0478

*Mann-Whitney test

Table S5a: Multivariate analysis of m12 progressor prediction with clinical parameters and geneset

Terms	OR	lower	upper	pvalue
Donor_Age	1.020	-0.025	0.073	0.3869
Race:Caucasian vs Non-Caucasian	2.686	-0.698	2.860	0.2477
Gender	0.421	-2.607	0.708	0.2797
Deceased_donor	4.036	-0.609	3.910	0.1791
ECD_kidney	0.188	-5.168	1.446	0.2938
CIT_min	1.001	-0.001	0.004	0.3131
Induction_Therapy	0.983	-1.658	1.761	0.9833
Anti_HLA_Ab	0.245	-3.581	0.358	0.1227
Delayed_Graft_Function	0.217	-4.557	0.878	0.2236
HLA_Mismatch	0.992	-0.508	0.463	0.9731
m3_eGFR	0.951	-0.116	-0.002	0.0425
pre_or_m3_ACR	5.795	0.118	3.691	0.0353
m3_CADI	0.626	-1.346	0.244	0.2040

*N=63 patients have complete demographic, clinical and pathological data

Table S5b: Multivariate analysis of m12 progressor prediction with clinical parameters and geneset

Terms	OR	lower	upper	pvalue
Donor_Age	0.993	0.911	1.068	0.8191
Race:Caucasian vs Non-Caucasian	0.529	0.021	6.518	0.6238
Gender	0.449	0.026	8.293	0.5410
Deceased_donor	2.093	0.066	148.439	0.6640
ECD_kidney	0.233	0.003	9.497	0.4440
CIT_min	1.001	0.998	1.005	0.6260
Induction_Therapy	0.992	0.102	18.526	0.9942
Anti_HLA_Ab	0.349	0.028	3.138	0.3361
Delayed_Graft_Function	0.079	0.000	2.887	0.2004
HLA_Mismatch	0.836	0.306	1.558	0.5506
m3_eGFR	0.934	0.809	0.991	0.0200
pre_or_m3_ACR	2.133	0.254	30.003	0.4591
m3_CADI	0.530	0.114	1.432	0.2261
Generisk	5.84E+03	23.237	3.25E+09	0.0002

*N=63 patients have complete demographic, clinical and pathological data

Table S5c: Multivariate analysis of m24 progressor prediction with clinical parameters and geneset

Terms	OR	lower	upper	pvalue
Donor_Age	0.993	-0.057	0.042	0.7850
Race:Caucasian vs Non-Caucasian	0.525	-2.106	0.740	0.3601
Gender	1.315	-1.050	1.642	0.6826
Deceased_donor	0.606	-3.013	1.872	0.6784
ECD_kidney	0.649	-4.509	2.914	0.8043
CIT_min	1.000	-0.002	0.003	0.6818
Induction_Therapy	0.441	-2.256	0.541	0.2389
Anti_HLA_Ab	1.186	-1.493	1.783	0.8340
Delayed_Graft_Function	2.057	-1.780	3.125	0.5504
HLA_Mismatch	1.086	-0.304	0.498	0.6746
m3_eGFR	0.980	-0.068	0.021	0.3413
pre_or_m3_ACR	2.062	-0.795	2.260	0.3428
m3_CADI	1.058	-1.033	1.146	0.9179

*N=50 patients have complete demographic, clinical and pathological data

Table S5d: Multivariate analysis of m24 progressor prediction with clinical parameters and geneset

Terms	OR	lower	upper	pvalue
Donor_Age	0.941	0.785	1.050	0.2601
Race:Caucasian vs Non-Caucasian	0.127	0.001	1.534	0.1051
Gender	4.554	0.395	1.38E+04	0.2425
Deceased_donor	0.012	4.26E-07	3.046	0.1184
ECD_kidney	0.034	6.85E-08	99.226	0.4065
CIT_min	1.003	1.000	1.011	0.0889
Induction_Therapy	0.198	0.001	2.772	0.2090
Anti_HLA_Ab	7.356	0.219	740.253	0.2903
Delayed_Graft_Function	3.797	0.001	3.42E+04	0.7457
HLA_Mismatch	1.341	0.533	3.168	0.4341
m3_eGFR	0.974	0.848	1.093	0.6251
pre_or_m3_ACR	2.934	0.080	674.514	0.4715
m3_CADI	3.393	0.311	251.299	0.2903
Generisk	7.51E+03	56.185	3.98E+12	2.22E-06

*N=50 patients have complete demographic, clinical and pathological data

Table S6: Association of 10 principle components of 13 geneset with graft loss in Cox proportional hazard model

	coef	exp(coef)	se(coef)	z	p	
PC1	-5.592	3.73E-03	29.95	-0.1867	0.8500	
PC2	-7.413	6.03E-04	6.37	-1.1642	0.2400	
PC3	-2.874	5.65E-02	8.23	-0.3494	0.7300	
PC4	-14.75	3.93E-07	5	-2.9512	0.0032	*
PC5	0.783	2.19E+00	4.02	0.1948	0.8500	
PC6	13.701	8.92E+05	5.45	2.5141	0.0120	*
PC7	6.738	8.44E+02	4.11	1.6389	0.1000	
PC8	0.224	1.25E+00	3.72	0.0601	0.9500	
PC9	-0.749	4.73E-01	4.95	-0.1513	0.8800	
PC10	4.418	8.29E+01	4.07	1.0853	0.2800	

Likelihood ratio test=20.1 on 10 df, p=0.0287 n= 159, number of events= 11

Table S7: Association of demographic or clinical variables with graft loss in Cox proportional hazard mode

Variable	Coef	Exp(coef)	SE(coef)	Z	P
m3_eGFR	-0.016	0.984	0.027	-0.598	0.5500
pre_or_m3_ACR	2.475	11.877	1.186	2.086	0.0370
CADI-3	-0.329	0.720	0.264	-1.245	0.2100
CIT_min	2.6E-04	1.000	0.001	0.263	0.7900
Deceased_donor (yes vs no)	1.439	4.218	1.434	1.003	0.3200
Anti_HLA_Ab	-0.719	0.487	1.162	-0.619	0.5400
Induction_Type (yes vs no)	0.233	1.263	1.207	0.193	0.8500
Recipient Race (Caucasian vs non- Caucasian)	-1.150	0.317	1.004	-1.146	0.2500
Donor Age	5.3E-03	1.005	0.024	0.217	0.8300
HLA mismatch	-0.051	0.950	0.470	-0.108	0.9100
Delayed Graft Function	1.028	2.797	0.979	1.051	0.2900

Anti_HLA_Ab : Yes (donor specific antigen or non dsa antibody), No : no antibody

Induction type: Yes (Lymphocyte Depletion or Lymphocyte Non-Depletion); No; Induction

Likelihood ratio test=11.5 on 11 df, p=0.4010 n= 120, number of events= 7

Table S8: Validation of the GoCAR gene set in other kidney transplant cohorts.

Data Set	Genechip / Platform	Sample Size	Outcome	AUC	Ref.
Dataset 1	Affymetrix U133 Plus 2.0	282	Allograft loss	0.83	9
Dataset 2	Affymetrix U133 Plus 2.0	24	CADI	0.972	10

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