

1 **Transcriptome analyses of β -thalassemia -28 (A>G) mutation using**
2 **isogenic cell models generated by CRISPR/Cas9 and asymmetric single-**
3 **stranded oligodeoxynucleotides (assODN)**

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20 **Abstract**

21 β -thalassemia, caused by mutations in the human hemoglobin (*HBB*) gene, is
22 one of the most common genetic diseases in the world. *HBB* -28 (A>G)
23 mutation is one of the five most common mutations in China patients with β -
24 thalassemia. However, few studies have been conducted to understand how
25 this mutation affects the expression of pathogenesis related genes including
26 globin genes due to limited homologous clinical materials. Therefore, we first
27 developed an efficient technique using CRISPR/Cas9 combined with
28 asymmetric single-stranded oligodeoxynucleotides (assODN) to generate a
29 K562 cell model of *HBB* -28 (A>G) named K562^{-28 (A>G)}. Then, we
30 systematically analyzed the differences between K562^{-28 (A>G)} and K562 at the
31 transcriptome level by high-throughput RNA-seq pre- and post-erythrogenic

32 differentiation. We found that *HBB* -28 (A>G) mutation not only disturbed
33 the transcription of *HBB* but also decreased the expression of *HBG*, which
34 may further aggravate the thalassemia phenotype and partially explain the
35 severer clinical outcome of β-thalassemia patients with *HBB* -28 (A>G)
36 mutation. Moreover, we found K562^{-28 (A>G)} cell line is more sensitive to
37 hypoxia and showed a defective erythrogenic program compared with K562
38 before differentiation. In agreement, p38MAPK and ERK pathway are
39 hyperactivated in K562^{-28 (A>G)} after differentiation. Importantly, all above
40 mentioned abnormalities in K562^{-28 (A>G)} were reversed after correction of this
41 mutation with CRISPR/Cas and assODN, confirming the specificity of these
42 phenotypes. Overall, this is the first time to analyze the effects of the *HBB* -
43 28 (A>G) mutation at whole-transcriptome level based on isogenic cell lines,
44 providing a landscape for further investigation of the mechanism of β-
45 thalassemia with *HBB* -28 (A>G) mutation.

46 **Keywords**

47 beta-thalassemia, *HBB* (-28 A>G), isogenic cells, K562, CRISPR/Cas9,
48 ssODN, RNA-Seq.

49 **Background**

50 Beta-thalassemia is one of most common autosomal recessive blood diseases
51 spread worldwide , caused by either point mutations or deletions in the β-
52 globin (*HBB*) gene^[1, 2]. Approximately 80 to 90 million people carried β
53 thalassemia , and about 300,000 children with severe thalassemia are born
54 every year^[3-5].Mutations or deletions of β-globin genes result in the reduction
55 of hemoglobin β chain (β-globin), deformation of hemoglobin tetramer and
56 subsequent lysis of erythrocytes, finally causing oxygen shortage, bone
57 deformity, organ dysfunction and even organ failure in many parts of the
58 human body^[6, 7]. As for the thalassemia major patients, life-long blood

59 transfusion and iron chelation treatments are required for survival, but often
60 accompanied by numerous complications, including arrhythmia, congestive
61 heart failure, hypothyroidism, hypoparathyroidism, hypogonadism, diabetes,
62 osteoporosis, liver cirrhosis and recurrent infections. Thus, thalassemia has
63 threatened millions of people's lives for decades and is still a major public
64 health issue^[8, 9].

65

66 β -thalassemia mutations are prevalent in Southern part of China and
67 Southeast Asia, and *HBB* –28 (A>G) mutation is one of the five most common
68 *HBB* mutations carried by β -thalassemia patients in China^[7, 10]. In *HBB* –28
69 (A>G) mutation, adenine (A) base located at 28 base pairs upstream from the
70 cap site is mutated to guanine (G), disrupting the binding of transcription
71 factor of ATA box and decreasing the RNA expression of *HBB*^[11]. Patients
72 with homozygous or compound heterozygous –28 (A>G) mutation may
73 develop severe anemia or intermedia anemia^[6, 11]. Although the description
74 of severe thalassemia has been first published over 90 years ago and a
75 considerable amount work has been reported to refine the understanding of
76 the pathophysiology of thalassemia syndromes in the past 50 years, the
77 cellular and molecular basis of this group of diseases are still not thoroughly
78 investigated^[12]. In particular, few studies have been conducted on *HBB* –28
79 (A>G) mutation to understand how this mutation affects gene expression at
80 transcriptome level, although correcting the *HBB* –28 (A>G) mutation with
81 base editing (BE) system has also been reported in human iPS cells and
82 reconstituted embryos^[7]. Without full understanding of the defects at
83 molecular level, especially in the short and long run, it will be difficult to
84 comprehensively evaluate the rescue effect after changing the mutation back.
85 In a recent study, high-throughput RNA-sequencing has been used to compare
86 control samples with patient samples carrying a novel *HBB* mutation (*HBB*:
87 c.51C>T). It shows that hemopoiesis, heme biosynthesis, response to
88 oxidative stress and other cellular activities pathway were directly or

89 indirectly enriched by differentially expressed genes related to β -thalassemia
90 [13], suggesting genome-wide RNA-seq analysis is a useful approach to
91 understand the mechanism of β -thalassemia with different mutations.
92 However, control samples in this study are allogenic, and different genetic
93 backgrounds and mixture of short and longterm effect would prevent deep
94 understanding of effect of each mutation.

95

96 In order to explore the specific impact of *HBB* -28 (A>G) mutation on
97 erythroid differentiation and how it affects genome-wide gene expression
98 without confounding factors, such as comparison of allogenic samples, we
99 used CRISPR/Cas9 gene-editing system combined with asymmetric single-
100 stranded oligodeoxynucleotides (assODN) to generate the disease model of
101 isogenic K562 cell lines [14, 15], and then conducted transcriptome analysis by
102 high-throughput RNA-sequencing. The mutant cell line was derived from
103 immortalized K562 and named as K562^{-28 (A>G)}, showing no detectable *HBB*
104 gene expression and enabling comparative studies in the same genome
105 background. We found that *HBB* was prevented from transcriptional
106 expression, and GO and KEGG analysis revealed that K562^{-28 (A>G)} cell line
107 is more sensitivity to hypoxia and present a defective erythrogenic program
108 when compared with wild type K562 before erythroid differentiation. In
109 agreement, p38MAPK and ERK pathway are hyperactivated in K562^{-28 (A>G)}
110 after differentiation. Interestingly, *HGB* showed a lower rate of induction in
111 K562^{-28 (A>G)} when compared with wild type K562 after erythroid
112 differentiation. Taken together, our study is the first time to analyze the effects
113 of the *HBB* -28 (A>G) mutation at whole-transcriptome level based on
114 isogenic cell lines. The unraveled molecular biomarkers and signaling
115 pathways that affected in K562^{-28 (A>G)} cell line may be further investigated as
116 therapeutic targets to improve the quality of life for those β -thalassemia
117 patients in future studies.

118

119 **Results**

120 **Generation of *HBB*-28 (A>G) mutant cell line by CRISPR/Cas9 and**
121 **asymmetric single-stranded oligodeoxynucleotides**

122 To study how *HBB* -28 (A>G) mutation affects gene expression at the
123 genome-wide level, isogenic human cell line carrying this mutation was
124 generated. The diagram of generating mutant cell line was shown, including
125 transfection, CRISPR/Cas editing, single cell sorting, cell characterization
126 and expansion (Fig. 1A). As previous studies demonstrated that using single-
127 strand oligodeoxynucleotides (ssODNs) ^[16] or asymmetric double-strand
128 DNA ^[17] as repair template resulted in higher efficiency of accurate
129 replacement of target sequences through homology directed repair (HDR), we
130 developed a new technology to combine CRISPR/Cas with asymmetric
131 ssODNs (assODNs). To generate *HBB* -28 (G>A) mutation, sgRNA
132 mediating DNA cleavage 3bp aside from the -28 mutation site and assODN
133 with 36bp on the PAM-distal side and 91bp on PAM-proximal side of the
134 cutting site were used (Fig. 1B). K562, a human erythroleukemia line that
135 resembles undifferentiated erythrocytes, was transduced with these
136 Cas/sgRNA and assODNs. As expected, we identified one cell line with
137 homozygous mutation of *HBB* -28 (A>G) by Sanger sequencing and named
138 it as K562^{-28 (A>G)} (Fig. 1C). In order to reconfirm the functional mutation of
139 *HBB* -28(A>G), we used qPCR and ELISA to detect the expression of *HBB*
140 mRNA and HBB protein respectively. In agreement with the sequencing
141 result, the expression of *HBB* mRNA and HBB protein was undetectable in
142 K562^{-28 (A>G)} cell line. In contrast, wild-type K562 showed a considerable
143 expression of *HBB* mRNA and HBB protein even without erythroid
144 differentiation (Fig. 1D and 1E). These results suggested that the mutant cell
145 line of *HBB* -28(A>G) was successfully generated, in which the expression
146 of *HBB* was eliminated.

147

148 **Transcriptome analysis of K562^{-28 (A>G)} and K562 before erythrogenic
149 differentiation**

150 Many K562^{-28 (A>G)} cells appear to have irregular morphology and
151 spontaneous cell death compared to the wt counterpart, suggesting loss of
152 HBB expression by -28(A>G) mutation may compromise cell viability in
153 normal culture condition (supplementary Fig.1). To understand how the
154 mutation affects molecular functions of cells at transcriptional level, we
155 conducted RNA-seq to analyze the transcriptome differences between the
156 isogenic cell line of K562^{-28 (A>G)} and its control K562. Pairwise Pearson
157 correlation analysis revealed high similarity between replicates from K562⁻²⁸
158 (A>G) and K562 cells, indicating high reproducibility of our data (Fig. 2A).
159 Overall, the gene expression levels between K562^{-28 (A>G)} and wt cell are
160 similar transcriptome-wide, suggesting that the mutation may affect (Fig. 2B).
161 We conducted analysis of differentially expressed genes (DEG) and found
162 120 and 524 genes were consistently upregulated and downregulated in K562-
163 28 (A>G) compared to K562 (Figure 2C). To further explore the affected
164 underlying biological functions, we conducted GO term, KEGG and
165 Reactome analysis using those DEGs and found pathways of (cellular)
166 response to hypoxia and response to (decreased) oxygen level were
167 upregulated in K562^{-28 (A>G)} mutant cell line (Figure 2D). In consistent,
168 hypoxia related genes such as *HMOX1*, *BMP7*, *GATA6*, *ESAM*, *RYR2* were
169 upregulated in K562^{-28 (A>G)} (Figure 2C). Interestingly, PI3K-Akt signaling
170 pathway that is important for erythrocyte differentiation [18], was
171 downregulated in K562^{-28 (A>G)} (Fig. 2D). To further explore the core
172 regulators, we performed interaction assay to predict transcription factors
173 (TFs) that target upregulated genes in K562^{-28 (A>G)}. In agreement with
174 previous results, we observed *GATA* family, *HOXD10* and *SPIC*, which are
175 well-known regulators of erythroid differentiation and hypoxia [ref], were
176 the core regulators for upregulated genes in K562^{-28 (A>G)} (Fig. 2E). The

177 regulators and their responsive target genes were listed and genes related
178 to hypoxia response were labelled in red (Fig. 2F). Taken together, these data
179 suggested hypoxia response was upregulated in K562^{-28 (A>G)} and the core
180 regulators were GATA family, HOXD10 and SPIC.

181

182 **Transcriptome analysis of co-regulated genes in K562^{-28 (A>G)} and K562**
183 **cell lines after erythroid differentiation**

184 In order to investigate the effect of *HBB* –28 (A>G) mutation during erythroid
185 differentiation, we induced erythroid differentiation and then performed
186 genome-wide RNA-Seq in K562 and K562^{-28 (A>G)} mutant cell line. Pairwise
187 Pearson correlations represented in matrix indicated that the isogenic cell
188 lines showed high similarities up to 90% and the samples were clustered
189 together depending on their differentiation conditions (Fig. 3A). The
190 expression of 1385 genes were consistently upregulated in differentiated
191 K562^{-28 (A>G)} and K562 when compared to undifferentiated samples (Fig. 3B)
192 and these DEGs were used to conduct the GO term, KEGG and Reactome
193 analysis. Multiple signaling pathways were activated in both K562^{-28 (A>G)} and
194 K562 (Fig. 3C), including PI3K-Akt, MAPK and ERK pathways that have
195 been reported to be activated during erythroid differentiation [18-21]. In
196 addition, signal pathways such as cell adhesion, pluripotency of stem cells,
197 platelet activation and Notch pathway, were also co-activated in differentiated
198 samples (Fig. 3C), suggesting our induction process was successful in both
199 cell lines. *HBB* belongs to globin gene family mainly including *HBA* (α -
200 globin), *HBG* (γ -globin) and *HBE* (ϵ -globin). *HBB*, *HBG* and *HBE* are β -
201 globin-like and all capable of forming tetramer with α -globin. They are
202 located within a gene cluster on chromosome 11 and their expression are
203 coordinated by the same locus control region (LCR) with other regulatory
204 DNA elements [22]. In β -thalassemia patients, *HBG* may be upregulated to
205 compensate the loss of *HBB*. To study the compensatory gene expression of
206 globin genes in K562^{-28 (A>G)} after differentiation, the expression of *HBB*, *HBA*

207 and *HBG* was analyzed by RNA-sequencing in isogenic cell lines of K562⁻²⁸
208 ($A>G$) and K562. As expected, Integrative Genomics Viewer (IGV) analysis
209 showed that *HBB* expression was induced in K562 but undetectable in K562⁻²⁸
210 ($A>G$) after differentiation (Fig. 3D). In contrast, expression of other globin
211 genes was induced and detected in K562⁻²⁸ ($A>G$) after differentiation (Fig. 3E).
212 we noticed that fold induction rate of *HBA1*, *HBA2*, *HBE1* and *HBZ* were
213 similar or slightly increased in K562⁻²⁸ ($A>G$)-Dif when compared to those in
214 K562-Dif. However, *HBG* expression in K562⁻²⁸ ($A>G$)-Dif was generally
215 lower than K562-Dif (Fig. 3F). The expression of *HBB* and *HBG* before and
216 after differentiation were further confirmed by RT-PCR. In consistent,
217 expression of *HBB* was undetectable in undifferentiated K562⁻²⁸ ($A>G$) and its
218 expression level in K562⁻²⁸ ($A>G$)-Dif after differentiation was negligible when
219 compared to K562-Dif control (Fig. 3G). In agreement with RNA-seq results,
220 expression level of *HBG* was increased in both cell lines after differentiation,
221 but induction fold of *HBG* was lower in K562⁻²⁸ ($A>G$) than that in K562 (Fig.
222 3G and 3H). We further analyzed the expression of key transcription factors
223 that are important for regulation of globin genes during erythrogenic
224 differentiation. KLF1, a positive regulator of *HBG* expression, is
225 downregulated in K562⁻²⁸ ($A>G$). Expression of other positive regulators,
226 including GATA1, BGL3 and NFE2 [19, 23-25], were dramatically upregulated
227 in K562 after differentiation, while those increasement were largely
228 attenuated in K562⁻²⁸ ($A>G$). In contrast, negative regulator BCL11A was
229 upregulated in K562⁻²⁸ ($A>G$) before differentiation (Fig. 3I). Those data
230 suggested the erythrogenic differentiation was overall normal in K562⁻²⁸ ($A>G$),
231 but *HBB* -28 ($A>G$) mutation may affect the *HBG* expression through a
232 network of transcription factors.

233

234 **Transcriptome analysis of differentially expressed genes (DEGs) in K562**
235 **and K562⁻²⁸ ($A>G$) cell lines after erythroid differentiation**

236 To understand the effect of HBB -28 ($A>G$) mutation during erythrogenic

237 differentiation, we identified the DEGs within K562^{-28 (A>G)}-Dif and K562-
238 Dif. The number of upregulated and downregulated DGEs in K562^{-28 (A>G)}
239 were 158 and 740 respectively (Fig. 4A). With GO term, KEGG and
240 Reactome analysis, we found up-regulated DEGs in K562^{-28 (A>G)}-Dif were
241 enriched in pathways related to stress-response and hematopoiesis disorder,
242 such as regulation of apoptosis process, negative regulation of leukocyte
243 activation, myeloid leukocyte cytokine production, negative regulation of
244 blood coagulation, negative regulation of hemostasis, and negative regulation
245 of hemopoiesis. Meanwhile, down-regulated DEGs in K562^{-28 (A>G)}-Dif were
246 enriched in oxygen related pathways, including oxygen transport,
247 erythrocytes take up carbon dioxide and release oxygen and O₂/CO₂
248 exchange in erythrocytes (Fig. 4B). Reactome analysis of critical DEGs and
249 their related KEGG pathways in differentiated K562^{-28 (A>G)}-Dif was shown,
250 and *PDE4D*, *TFPI* and *CA1*, *AQPI* which were related to hypoxia were found
251 to be critical targets (Figure 4C and Supplementary table 1). Moreover, TF
252 prediction revealed that *JAZF1*, *MSI2*, *KDM4*, *HOX* and *ZNF* family were
253 core regulators for upregulated genes in K562^{-28 (A>G)}-Dif (Fig. 4D), while
254 *SPIC* and *GATA* family are core regulators for downregulated genes in K562-
255^{-28 (A>G)}-Dif (Fig. 4E). Interestingly, *GATA3* was found to be the core regulator
256 for both upregulated and downregulated genes (Fig. 4D and E). Taken
257 together, dysregulated genes and pathways were present in K562^{-28 (A>G)} after
258 differentiation and transcription factors, such as *GATA*, *HOX* and *ZNF*
259 families, may play important roles as core regulators.

260

261 **Reversion of observed abnormalities in corrected K562^{-28cor} cell line**

262 As it took weeks for the generation of K562 mutant cells by Crispr/Cas9 and
263 clone selection, it is possible that the differential gene expression is due to
264 secondary effects of the mutation and *HBB* loss, similar to studies of patient
265 samples (ref). In order to determine the specificity of changed gene
266 expression that attributes to the mutation, we corrected the *HBB* -28 (G>A)

267 mutation in K562-^{28 (A>G)} by the same strategy of CRISPR/Cas9 combined
268 with assODN (Fig. 5A and supplementary Fig.2), and named the corrected
269 cell line as K562-^{28(A>G)cor}. We analyzed the correlation of RNA-seq data
270 between K562-^{28(A>G)cor}, K562 and K562-^{28 (A>G)} and found expression
271 profile of K562-^{28(A>G)cor} was closer to K562 rather than its precursor K562-
272 ^{28 (A>G)} (Fig. 5B). DEGs of isogenic cell lines were showed in the form of
273 heat map and results indicated that upregulated and downregulated genes in
274 K562-^{28 (A>G)} were reversed in K562-^{28(A>G)cor} (Fig. 5C). Through analysis of
275 pathway enrichment, PI3K pathway and cell response to oxygen pathway
276 were recovered in K562-^{28(A>G)cor} and the related genes, including *BMP7*,
277 *EGR1* and *KCND2*, were showed in heatmap. The erythroid transcriptional
278 factors such as *GATA1*, *KLF1* and *BCL11A*, were also recovered in K562-
279 ^{28(A>G)cor} (Fig. 5D and E and supplementary Fig. 5A and B). In summary, a
280 large portion of abnormalities observed in K562-^{28 (A>G)} are reversed in
281 corrected K562-^{28(A>G)cor}, suggesting these phenotypes are specifically
282 caused by mutation of *HBB* -28 (A>G).

283

284 **Discussion**

285 In our study, we successfully generated the cell line K562-^{28 (A>G)} with *HBB*
286 28 (A>G) mutation using CRISPR/Cas9 and a 127bp assODN. This disease
287 model of cell line was used to study how *HBB* -28 (A>G) mutation affected
288 the cellular function on transcriptome level pre- and post-erythroid
289 differentiation .

290

291 Our results showed *HBB* -28 (A>G) mutation prevented the transcription of
292 *HBB* gene. Analysis of enriched pathways suggested PI3K pathway, as well
293 as JAK-STAT pathway, which play important roles in the erythroid
294 differentiation, were disrupted in K562-^{28 (A>G)} before erythroid differentiation.
295 The PI3K-Akt signaling pathway is a significant pathway that control many

296 cellular processes known as cell division, autophagy, survival, and
297 differentiation [ref]. Moreover, the mutation activated the hypoxia pathway
298 in undifferentiated K562^{-28 (A>G)}. Many clinical manifestations observed in
299 β-thalassemia is attributed to the chronic hypoxic environment due to
300 pathologic erythrocyte production, and our data suggest hematopoietic
301 precursors may also subject to oxidative stress before differentiation.

302

303 To induce erythroid differentiation, we chose the glutamine-minus medium
304 with sodium butyrate, as hemoglobin synthesis was markedly induced using
305 this condition with a differentiation efficiency of 11%~19% in K562 [26, 27].
306 Consistent with previous reports, the differentiation efficiency of K562 in our
307 study was nearly 12% (data not shown), indicating that our erythroid
308 differentiation is effective. In agreement, the MAPK and ERK pathway was
309 activated in both K562 and K562^{-28 (A>G)} (Fig. 2), a finding consistent with
310 observations in previous studies [20, 28]. Interestingly, PI3K-Akt signaling
311 pathway was activated in K562^{-28 (A>G)} after induction, suggesting the
312 defective PI3K pathway may be caused by lack of activators in
313 undifferentiated K562^{-28 (A>G)}. Other pathways, such as cell adhesion,
314 pluripotency of stem cells, platelet activation and Notch pathway, were also
315 co-activated in differentiated K562 and K562^{-28 (A>G)} samples, indicating
316 mutation of *HBB* -28 (G>A) didn't block the pathways required for
317 differentiation. Nevertheless, in consistent with data from undifferentiated
318 K562^{-28 (A>G)}, oxygen related pathways were downregulated in differentiated
319 K562^{-28 (A>G)} (Fig. 4). In both undifferentiated and differentiated conditions,
320 SPIC and GATA families are predicted as core regulators (Fig.2 and Fig.4).
321 The GATA family of transcription factors (GATA1-6) are essential for normal
322 hematopoiesis and a multitude of other developmental processes [19, 29]. *GATA-*
323 *1* regulates terminal differentiation and function of erythroid which activates
324 or represses erythroid-specific gene, such as β-globin locus-binding protein,
325 and it might regulate the switch of fetal to adult haemoglobin in human [30].

326 Interestingly, increased expression of *GATA1* was largely attenuated in K562-
327 28 (A>G) during erythroid differentiation (Fig. 3), which may play a role for
328 dysregulated oxygen related pathways.

329

330 As improving the levels of *HBG* in adults could partially reverse the severity
331 of symptoms in sickle disease and β -thalassemia, it is important to understand
332 the coordinated regulation between *HBB* and *HBG* [31-34]. In this study, we
333 noticed that fold induction of *HBG* was decreased in K562-28 (A>G). *ZBTB7A*
334 and *BCL11A* were two major repressors of *HBG* by directly bound the *HBG*
335 gene promoters [24, 35-37]. Expression of *ZBTB7A* was decreased during
336 differentiation in K562, consistent with increased expression of *HBG*.
337 However, the overall expression level was higher in K562 than that in K562-
338 28 (A>G), paradoxical with the results of decreased fold induction of *HBG* in
339 mutant cell line. Although expression of *BCL11A* was lower in K562 when
340 compared to 562-28 (A>G) before differentiation, its expression increased
341 dramatically during differentiation (Figure3I and supplementary Figure5).
342 Collectively, our data suggest the expression of *HBG* was not only regulated
343 by *ZBTB7A* and *BCL11A*, but may also be regulated by GATA proteins that
344 also regulate *HBB*. However, the interaction requires further investigations.

345

346 Lastly, we not only used CRISPR/Cas9 to generate mutation but also
347 corrected the mutation with the same strategy (Fig. 5A). On one aspect,
348 reversed abnormalities in corrected cell line confirmed the specificities of
349 these phenotypes. On another aspect, the efficient editing results indicate our
350 gene editing strategy using assODN is powerful and provide means for gene
351 editing treatment of *HBB* mutation with -28(A>G).

352

353 In summary, we show isogenic K562-28 (A>G) cell line generated with
354 CRISPR/Cas and assODN is a valuable model to evaluate the β -thalassemia
355 with homozygous mutation of *HBB* -28 (A>G). It provides us with the first

356 transcriptome data for mechanistic study on the effects of *HBB* -28 (A>G),
357 and our disease model may also be used to assay the new therapies against
358 β -thalassemia in the future.

359

360 **Data Availability**

361 The data of our study have been deposited in the CNSA
362 (<https://db.cngb.org/cnsa/>) of CNGBdb with accession code CNP0000981.

363

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373

374 **AUTHOR CONTRIBUTIONS**

375 Y.G., C.L. and X.Z conceived and designed the study. J.L performed
376 experiment from L.G, T.L, G.D and Ouyang; Z.Z, and H.S performed
377 bioinformatics analysis; J.L., Z.Z., Y.G and C.L. wrote the manuscript with
378 the inputs from all authors.

379

380 **Methods**

381 **Generation of β -thalassemia with-28 (A/G) cell line and corrected cell line**

382 **sgRNA design and construction:** two 20-bp sgRNAs were chosen
383 containing the -28 (A/G) site, and the cutting site about 3 bp and 9bp before

384 the mutation site respectively, the sequence we showed in Figure1B. The
385 guide RNA oligonucleotides were synthesis by BGI and inserted into the
386 gRNA cloning vector pSpCas9(BB)-2A-GFP (PX458) (Add gene 48138)
387 according to the protocol provided by Zhang F's protocol^[38].

388 Design of ss ODN repair templates :The 127-nt asymmetric ss ODN repair
389 templates were designed by overlapped the CRISPR/Cas9 cleavage site with
390 36 bp on the PAM-distal side, and with a 91-bp extension on the PAM-
391 proximal side of the break^[16, 17] (Figure1A and 1B) and were synthesized by
392 BGI. Once the mutation of -28 (A/G) were mutated, the site was blocked and
393 Cas9 could not cut this site again without anything changed. So, it is easy
394 manipulate and seamless on the genome.

395 Gene editing :For gene targeting, 1*10⁶ K562 cells were collected and
396 resuspended in 100ul Buffer R at a final density of 1.0 × 10⁷ cells/mL,
397 electroporated with 3 mg each of the ss ODN, 1.5mg gRNA and Cas9
398 (Addgene48138) by Neon Transfection System(Invitrogen) Transfected cells
399 were plated onto the prepared 6 well plates. After transfection 48h, we use
400 flow cytometry to isolate the single cell in 96 well plates. about 1 week later,
401 we Identify the single cell clones by PCR and sanger sequence. The resistant
402 colonies were picked and expanded until we generated the expected cell line.
403 primers are listed in Supplemental.

404 **Cell Cultures and differentiation**--- K562 cells obtained from American
405 Tissue Culture Collection. the cells of K562 and K562^{-28(A>G)} were cultured
406 in glutamine-minus RPMI 1640 medium(Gibco) with10% FBS in the
407 presence of 1 mM sodium butyrate for 7 days to induce the erythroid
408 differentiation, and then collected^[39]. And the control cells were cultured in
409 RPMI 1640 medium with 10% FBS and P/S antibiotics for 7 week at the same
410 time.

411 **Real-time Reverse transcriptase (RT)-PCR analysis**---Total RNA was
412 isolated from the cells by the TRIzol™ Reagent (invitrogen). Single stranded
413 cDNA was synthesized with the oligo(dT) primer using PrimeScript™ RT
414 reagent Kit with gDNA Eraser (Takara), the obtained cDNAs were analyzed
415 by real-time PCR, using indicated primers. The *HBB* primers were 5'-
416 GCTCGGTGCCTTAGTGATG -3' (forward) and 5'-
417 GCACACAGACCAGCACGTT -3' (reverse); for *HBG*, 5'-
418 GGAAGATGCTGGAGGAGAAACC -3' (forward) and 5'-
419 GTCAGCACCTTCTGCCATGTG -3' (reverse). The cycling conditions
420 were: 95°C denaturation for 10 min, 95°C for 15 s, annealing and extension
421 at 60°C for 40s, 40 cycles on the ABI step one machine.

422 Comparison the hemoglobin expression :

423 To comparison the hemoglobin expression of the uninduced cells
424 (K562,K562^{28(A>G)},K562^{28(A>G)cor} dif) and induced cells. K562dif K562^{28(A>G)} dif

426 we used Tetramethylbenzidine(TMB) Elisa Kit (Invitrogen) .10⁵ cells from
427 each of the test and control groups were resuspended in phosphate buffered
428 saline (PBS) and mixed with equal volume of the Tetramethylbenzidine
429 solution and then kept at room temperature for several mins. And then add
430 double volume of Tetramethylbenzidine solution for stop solution. Brown-
431 blue wells were regarded as positive and read at 450nm by Biotek epoch. Each
432 treatment was performed in triplicate and each experiment was repeated for
433 three times. Sample information in table1

Dif	Dif	Dif	Dif	Dif	Dif
K562 ^{-28(A>G)cor}					
Dif	Dif	Dif	Dif	Dif	Dif

434 **Flow cytometry:** We used CD235ab (Bio legend, USA) as the erythroid-
435 specific surface marker which was determined by direct immunofluorescent
436 staining with FITC-conjugated mouse monoclonal antibody. About $5 * 10^5$
437 cells were harvested and counted, resuspended in 100ul PBS with Human BD
438 Fc BlockTM(BD) for about 10mins at room temperature, then add100 ul FITC-
439 conjugated with cd235ab diluted by 1:10 and incubated at 4 °C for 30 min.
440 Cells were washed with ice-cold PBS three times and The fluorescence was
441 measured assayed by flow cytometry of BD Aria III. Unstained group was
442 used as antibody stain control for each samples (K562, K562-28, K562
443 induced, K562-28 induced)

444 **RNA-Seq**

445 **RNA-Seq analysis**

446 There are exceeding 2 million 100 bp pair-ended reads in each sample. Prior
447 to assembly, Raw reads were filtered by SOAPnuke ^[40] with the parameters
448 “-l 15 -q 0.2 -n 0.05”. Reads were mapped to the human reference genome
449 using HISAT2^[41], which included both the genome sequences (GRCh38.p12)
450 and known reference sequence (RefSeq) transcripts. Finally, the 80% of reads
451 were aligned to human genome.

452 We used Samtools (Trapnell et al., 2012)^[42] to sort and index the alignment
453 files and Integrative Genomics Viewer (IGV) tool (Casero et al., 2015)^[43] was
454 used to visualize the reads. The sorted binary sequence analysis file (BAM
455 files) was also used to generate UCSC Browser tracks with a genome

456 Coverage Bed from Bed Tools (Dennis et al., 2003)^[44]. To this end, coverage
457 files were normalized using the total signal for each sample.

458 The StringTie^[45] suite of tools was used to calculate and compare gene
459 expression levels and normalized as FPKMs (Fragments Per Kilobase of
460 transcript per Million mapped reads). Differential expression analysis was
461 assessed at each sample by comparing the pre- and post-induction cells using
462 EdgeR Bioconductor package^[46]. Differentially expressed Genes (DEGs)
463 were identified when the $\log_2|\text{fold change}| > 1$ and the adjusted p-value < 0.01 .

464 **Gene ontology (GO) analysis**

465 Gene ontology enrichment analysis of the gene sets was then performed on
466 each sample using the cluster Profiler R package^[47], including KEGG^[48]
467 pathways and Gene Ontology^[49] (<http://www.geneontology.org/>), which were
468 collected in Molecular Signatures Database (MSigDB)^[50], Meanwhile, ,
469 DAVID (<https://david.ncifcrf.gov/>) and Metascape were utilized to assess the
470 enrichment of functional categories (GO and KEGG) of the DEGs^[51].

471 **Transcription factor prediction**

472 To compare the expression levels of transcription regulator genes between
473 pre-induced and post-induced K562 cells, we collected a comprehensive
474 transcription factor annotation from AnimalTFDB 3.0^[52] and iRegulon^[53],
475 and the results visualized using Cytoscape^[54].

476 **List of abbreviations**

DMEM	Dulbecco's modified Eagle's medium
HBB	Hemoglobin, Beta

FCS	fetal calf serum
BSA	bovine serum albumin
assODN	asymmetric single strand oligo DNA nucleotides
K562 ^{-28(A>G)}	HBB-28(A>G) cell line
K562 ^{-28(A>G)cor}	Corrected HBB-28(G>A) cell line
Dif	Erythroid differentiation

477

478 **Declarations**

479 Competing interests

480 The authors declare that they have no competing interest.

481

482 **FIGURE LEGEND**

483 **Figure 1.** Generation of K562^{-28 (A>G)} cell line by CRISPR/Cas9 combined
484 with asymmetric ssODN. (A) Experimental diagram of generation of the *HBB*
485 -28 (A>G) mutation cell line in K562; (B) The region around *HBB* -28 are
486 targeted with two asymmetric sgRNAs and ssODN are provided along with
487 CRISPR/Cas9 DNA cleavage to generate *HBB* -28 (A>G) mutation. *sgRNA1*
488 and *sgRNA2* are complementary to the sense and antisense strands
489 respectively. Mutation site is indicated with red color in the middle of
490 sequence. PAM: protospacer adjacent motif (orange); (C) Identification of the
491 -28 (A>G) mutation by sanger sequencing. Expected mutation is shown in the
492 red rectangle; (D) Expression of *HBB* mRNA determined by qPCR in K562⁻
493 28 (A>G) and K562; (E) Expression of *HBB* mRNA determined by ELASA with

494 benzidine staining in K562^{-28 (A>G)} and K562.

495 **Figure 2.** Transcriptome analysis of K562 and K562^{-28 (A>G)} cell lines before
496 erythrogenic differentiation. (A) Pairwise Pearson correlations are
497 represented in matrix between two K562 and two K562^{-28 (A>G)} samples before
498 differentiation ; (B) The correlation between representative K562^{-28 (A>G)} and
499 K562 sample before differentiation; (C) Heatmap shows the differentially
500 expressed genes (DEGs) between K562 and K562^{-28 (A>G)} cell lines; genes
501 related to hypoxia were showed on right (D) Enrichment analysis of GO ,
502 KEGG and Reactome pathways based on DEGs in K562^{-28 (A>G)} before
503 differentiation; (E) The predicted interaction map between transcription
504 factors (TF) in DEGs of K562^{-28 (A>G)} before differentiation; (F) The regulator
505 genes and their responsive target genes. The hypoxia gene were showed in
506 red.

507 **Figure 3.** Transcriptome analysis of co-regulated genes, including HBB genes,
508 in K562 and K562^{-28 (A>G)} cell lines after erythrogenic differentiation. (A)
509 Pairwise Pearson correlations are represented in matrix between isogenic cell
510 lines. The differentiated group are clustered together; (B) Heatmap shows the
511 co-regulated genes in K562 and K562^{-28 (A>G)} after erythrogenic differentiation
512 when compared to those before differentiation. (C) KEGG signaling pathways
513 enriched in differentiated K562 and K562^{-28 (A>G)} when compared to their
514 corresponding cell lines before differentiation; (D) The Integrative Genomics
515 Viewer (IGV) shows the *HBB* gene expression in K562 and K562^{-28 (A>G)} cell
516 lines; (E and F) Expression and change trends of globin genes determined by
517 RNA-seq in the K562 and K562^{-28 (A>G)} cell lines before and after induction;
518 (G and H) Expression and change trends of globin *HBB* and *HBG* determined
519 by qPCR in the K562 and K562^{-28 (A>G)} cell lines before and after induction;
520 (I) Expression of key transcription factors related to erythroid differentiation.

521 **Figure 4.** Transcriptome analysis of differentially expressed genes in K562
522 and K562^{-28 (A>G)} cell lines after erythrogenic differentiation. (A) Heatmap

523 shows DEGs in K562^{-28 (A>G)} when compared to K562 after differentiation;
524 (B) Signaling pathways analysis based on DEGs of K562^{-28 (A>G)} compared to
525 K562 after differentiation; (C) Reactome analysis of critical DEGs and their
526 related KEGG pathways in differentiated K562^{-28 (A>G)} when compared to its
527 responsive K562 control. (D) the prediction of TFs in K562 after
528 differentiation. (E) the prediction of TFs in K562^{-28 (A>G)} after differentiation.

529 **Figure 5.** Genes and key pathways are reversed in mutation corrected K562-
530 28(A>G)^{cor} cell line. (A) the identify of HBB gene in K562^{-28(A>G)cor} by sanger
531 sequencing. (B) The correlations between the K562 and K562^{-28(A>G)cor}; (C)
532 Heatmap shows the up-regulated and down-regulated DEGs in K562, K562-
533 28 (A>G) and K562^{-28(A>G)cor}; (D) Differentially regulated signaling pathways in
534 K562^{-28cor} when compared to K562^{-28 (A>G)}; (E) the recovery of genes relative
535 to Key pathway and hypoxia.

536

537 **Reference**

- 538 1. de Dreuzy E, Bhukhai K, Leboulch P, Payen E. **Current and future alternative therapies for**
539 **beta-thalassemia major.** *Biomed J* 2016; 39(1):24-38.
- 540 2. Mansilla-Soto J, Riviere I, Boulad F, Sadelain M. **Cell and Gene Therapy for the Beta-**
541 **Thalassemias: Advances and Prospects.** *Hum Gene Ther* 2016; 27(4):295-304.
- 542 3. Galanello R, Origa R. **Beta-thalassemia.** *Orphanet J Rare Dis* 2010; 5:11.
- 543 4. Origa R. **beta-Thalassemia.** *Genet Med* 2017; 19(6):609-619.
- 544 5. Weatherall DJ, Williams TN, Allen SJ, O'Donnell A. **The population genetics and dynamics of**
545 **the thalassemias.** *Hematol Oncol Clin North Am* 2010; 24(6):1021-1031.
- 546 6. Cao A, Galanello R. **Beta-thalassemia.** *Genet Med* 2010; 12(2):61-76.
- 547 7. Liang P, Ding C, Sun H, Xie X, Xu Y, Zhang X, et al. **Correction of beta-thalassemia mutant by**
548 **base editor in human embryos.** *Protein Cell* 2017; 8(11):811-822.
- 549 8. Kumar SR, Markusic DM, Biswas M, High KA, Herzog RW. **Clinical development of gene**
550 **therapy: results and lessons from recent successes.** *Mol Ther Methods Clin Dev* 2016; 3:16034.
- 551 9. Xu P, Tong Y, Liu XZ, Wang TT, Cheng L, Wang BY, et al. **Both TALENs and CRISPR/Cas9**
552 **directly target the HBB IVS2-654 (C > T) mutation in beta-thalassemia-derived iPSCs.** *Sci Rep*
553 2015; 5:12065.
- 554 10. Lai K, Huang G, Su L, He Y. **The prevalence of thalassemia in mainland China: evidence from**
555 **epidemiological surveys.** *Sci Rep* 2017; 7(1):920.
- 556 11. Orkin SH, Sexton JP, Cheng TC, Goff SC, Giardina PJ, Lee JL, et al. **ATA box transcription**
557 **mutation in beta-thalassemia.** *Nucleic Acids Res* 1983; 11(14):4727-4734.
- 558 12. Taher AT, Weatherall DJ, Cappellini MD. **Thalassaemia.** *The Lancet* 2018; 391(10116):155-167.

559 13. Taghavifar F, Hamid M, Shariati G. **Gene expression in blood from an individual with beta-**
560 **thalassemia: An RNA sequence analysis.** *Mol Genet Genomic Med* 2019; 7(7):e00740.

561 14. Men K, Duan X, He Z, Yang Y, Yao S, Wei Y. **CRISPR/Cas9-mediated correction of human**
562 **genetic disease.** *Sci China Life Sci* 2017; 60(5):447-457.

563 15. Zhang X, Wang L, Liu M, Li D. **CRISPR/Cas9 system: a powerful technology for in vivo and**
564 **ex vivo gene therapy.** *Sci China Life Sci* 2017; 60(5):468-475.

565 16. Niu X, He W, Song B, Ou Z, Fan D, Chen Y, et al. **Combining Single Strand**
566 **Oligodeoxynucleotides and CRISPR/Cas9 to Correct Gene Mutations in beta-Thalassemia-**
567 **induced Pluripotent Stem Cells.** *J Biol Chem* 2016; 291(32):16576-16585.

568 17. Paquet D, Kwart D, Chen A, Sproul A, Jacob S, Teo S, et al. **Efficient introduction of specific**
569 **homozygous and heterozygous mutations using CRISPR/Cas9.** *Nature* 2016; 533(7601):125-
570 129.

571 18. Jafari M, Ghadami E, Dadkhah T, Akhavan-Niaki H. **PI3k/AKT signaling pathway:**
572 **Erythropoiesis and beyond.** *J Cell Physiol* 2019; 234(3):2373-2385.

573 19. Grass JA, Boyer ME, Pal S, Wu J, Weiss MJ, Bresnick EH. **GATA-1-dependent transcriptional**
574 **repression of GATA-2 via disruption of positive autoregulation and domain-wide chromatin**
575 **remodeling.** *Proc Natl Acad Sci U S A* 2003; 100(15):8811-8816.

576 20. Witt O, Sand K, Pekrun A. **Butyrate induced erythroid differentiation of human K562 cells**
577 **involves inhibition of ERK and activation of p38 MAP kinase pathways.** 2000; 95(7):2391-2396.

578 21. Yang J, Kawai Y, Hanson RW, Arinze IJJJoBC. **Sodium Butyrate Induces Transcription from**
579 **the $\text{G}\alpha_i$ 2 Gene Promoter through Multiple Sp1 Sites in the Promoter and by Activating the**
580 **MEK-ERK Signal Transduction Pathway ***. 2001; 276(28):25742.

581 22. Palstra RJ, de Laat W, Grosveld F. **Beta-globin regulation and long-range interactions.**
582 *Advances in genetics* 2008; 61:107-142.

583 23. Stamatoyannopoulos G. **Control of globin gene expression during development and**
584 **erythroid differentiation.** *Experimental Hematology* 2005; 33(3):259-271.

585 24. Wienert B, Martyn GE, Funnell APW, Quinlan KGR, Crossley M. **Wake-up Sleepy Gene:**
586 **Reactivating Fetal Globin for beta-Hemoglobinopathies.** *Trends Genet* 2018; 34(12):927-940.

587 25. Zhou D, Liu K, Sun CW, Pawlik KM, Townes TM. **KLF1 regulates BCL11A expression and**
588 **gamma- to beta-globin gene switching.** *Nat Genet* 2010; 42(9):742-744.

589 26. Bruchova-Votavova H, Yoon D, Prchal JTJL, Lymphoma. **MiR-451 enhances erythroid**
590 **differentiation in K562 cells.** 2010; 51(4):686-693.

591 27. Qun HE, Yuan LBJCMJ. **Dopamine inhibits proliferation, induces differentiation and**
592 **apoptosis of K562 leukaemia cells.** 2007; 120(011):970-974.

593 28. Park JI, Choi HS, Jeong JS, Han JY, Kim IHJCGD. **Involvement of p38 kinase in hydroxyurea-**
594 **induced differentiation of K562 cells.** 2001; 12(9):481-486.

595 29. Li B, Ding L, Li W, Story MD, Pace BS. **Characterization of the transcriptome profiles related**
596 **to globin gene switching during in vitro erythroid maturation.** *BMC Genomics* 2012; 13:153.

597 30. Sankaran VG, Xu J, Orkin SH. **Advances in the understanding of haemoglobin switching.**
598 *British Journal of Haematology* 2010; 149(2):181-194.

599 31. Chen Z, Luo HY, Steinberg MH, Chui DH. **BCL11A represses HBG transcription in K562 cells.**
600 *Blood Cells Mol Dis* 2009; 42(2):144-149.

601 32. Dewitt MA, Magis W, Bray NL, Wang T, Corn JEJSTM. **Selection-free genome editing of the**
602 **sickle mutation in human adult hematopoietic stem/progenitor cells.** 2016; 8(360):360ra134-

603 360ra134.

604 33. Li J, Lai Y, Shi L. **BCL11A Down-Regulation Induces gamma-Globin in Human beta-**
605 **Thalassemia Major Erythroid Cells.** *Hemoglobin* 2018; 42(4):225-230.

606 34. Traxler EA, Yao Y, Wang YD, Woodard KJ, Kurita R, Nakamura Y, et al. **A genome-editing**
607 **strategy to treat beta-hemoglobinopathies that recapitulates a mutation associated with a**
608 **benign genetic condition.** *Nat Med* 2016; 22(9):987-990.

609 35. Martyn GE, Wienert B, Yang L, Shah M, Norton LJ, Burdach J, et al. **Natural regulatory**
610 **mutations elevate the fetal globin gene via disruption of BCL11A or ZBTB7A binding.** *Nat*
611 *Genet* 2018; 50(4):498-503.

612 36. Masuda T, Wang X, Maeda M, Canver MC, Sher F, Funnell APW, et al. **Transcription factors**
613 **LRF and BCL11A independently repress expression of fetal hemoglobin.** 2016; 351(6270):285-
614 289.

615 37. Liu N, Hargreaves VV, Zhu Q, Kurland JV, Hong J, Kim W, et al. **Direct Promoter Repression**
616 **by BCL11A Controls the Fetal to Adult Hemoglobin Switch.** *Cell* 2018; 173(2):430-442 e417.

617 38. Ran FA, Hsu PD, Wright J, Agarwala V, Scott DA, Zhang F. **Genome engineering using the**
618 **CRISPR-Cas9 system.** *Nat Protoc* 2013; 8(11):2281-2308.

619 39. Shariati L, Modaress M, Khanahmad H, Hejazi Z, Tabatabaiefar MA, Salehi M, et al. **Comparison**
620 **of different methods for erythroid differentiation in the K562 cell line.** *Biotechnol Lett* 2016;
621 38(8):1243-1250.

622 40. Chen Y, Chen Y, Shi C, Huang Z, Zhang Y, Li S, et al. **SOAPnuke: a MapReduce acceleration-**
623 **supported software for integrated quality control and preprocessing of high-throughput**
624 **sequencing data.** *Gigascience* 2017; 7(1):gix120.

625 41. Kim D, Langmead B, Salzberg SL. **HISAT: a fast spliced aligner with low memory**
626 **requirements.** *Nature methods* 2015; 12(4):357.

627 42. Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, Homer N, et al. **The sequence alignment/map**
628 **format and SAMtools.** *Bioinformatics* 2009; 25(16):2078-2079.

629 43. Robinson JT, Thorvaldsdóttir H, Winckler W, Guttman M, Lander ES, Getz G, et al. **Integrative**
630 **genomics viewer.** *Nature biotechnology* 2011; 29(1):24.

631 44. Quinlan AR, Hall IM. **BEDTools: a flexible suite of utilities for comparing genomic features.**
632 *Bioinformatics* 2010; 26(6):841-842.

633 45. Pertea M, Pertea GM, Antonescu CM, Chang T-C, Mendell JT, Salzberg SL. **StringTie enables**
634 **improved reconstruction of a transcriptome from RNA-seq reads.** *Nature biotechnology* 2015;
635 33(3):290.

636 46. Robinson MD, McCarthy DJ, Smyth GK. **edgeR: a Bioconductor package for differential**
637 **expression analysis of digital gene expression data.** *Bioinformatics* 2010; 26(1):139-140.

638 47. Yu G, Wang L-G, Han Y, He Q-Y. **clusterProfiler: an R package for comparing biological**
639 **themes among gene clusters.** *Omics: a journal of integrative biology* 2012; 16(5):284-287.

640 48. Kanehisa M, Goto S. **KEGG: kyoto encyclopedia of genes and genomes.** *Nucleic acids*
641 *research* 2000; 28(1):27-30.

642 49. Ashburner M, Ball CA, Blake JA, Botstein D, Butler H, Cherry JM, et al. **Gene ontology: tool for**
643 **the unification of biology.** *Nature genetics* 2000; 25(1):25.

644 50. Liberzon A, Subramanian A, Pinchback R, Thorvaldsdóttir H, Tamayo P, Mesirov JP. **Molecular**
645 **signatures database (MSigDB) 3.0.** *Bioinformatics* 2011; 27(12):1739-1740.

646 51. Dennis G, Sherman BT, Hosack DA, Yang J, Gao W, Lane HC, et al. **DAVID: database for**

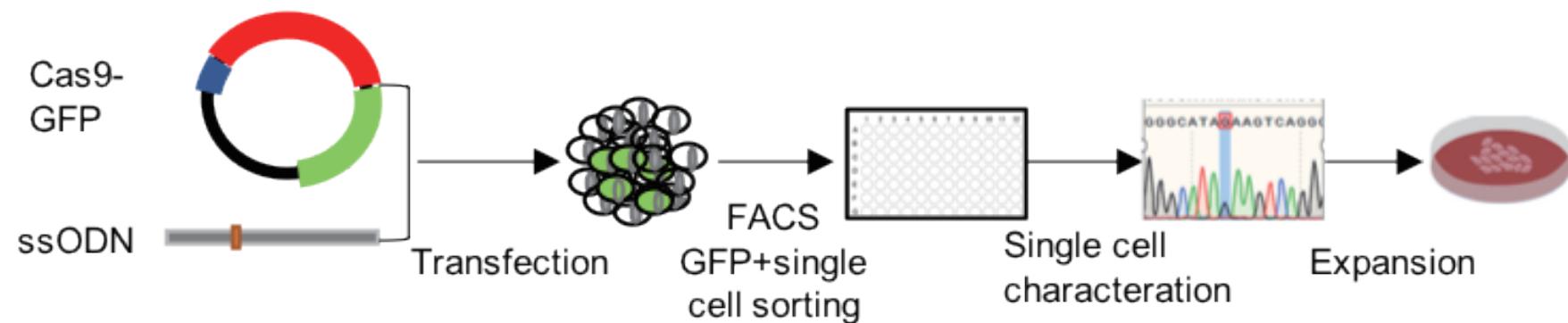
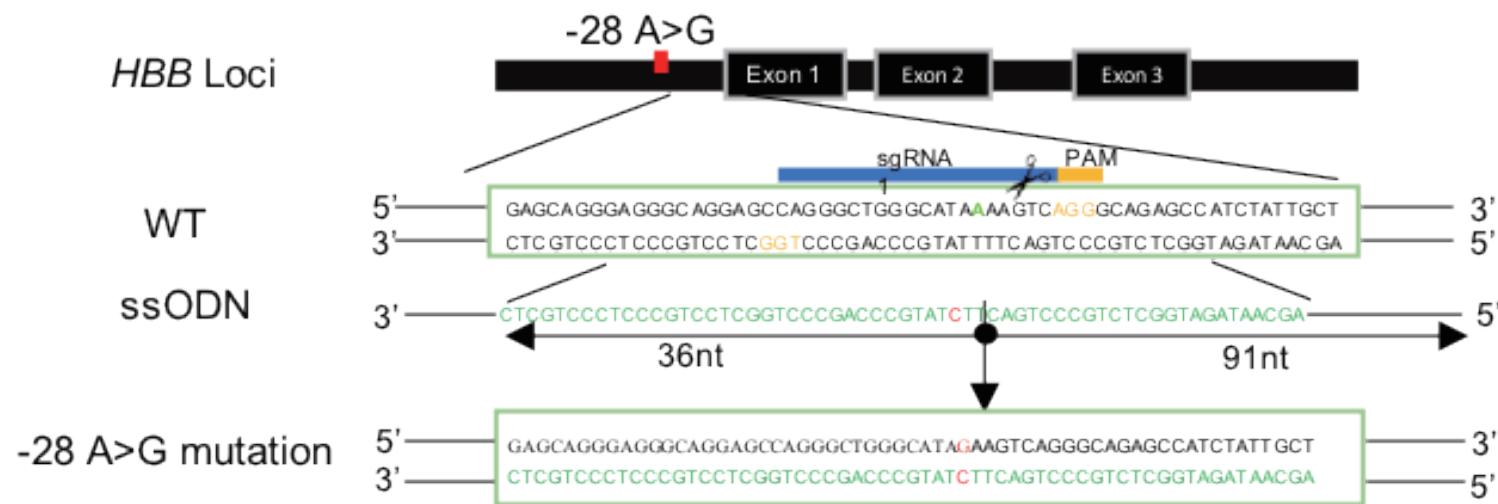
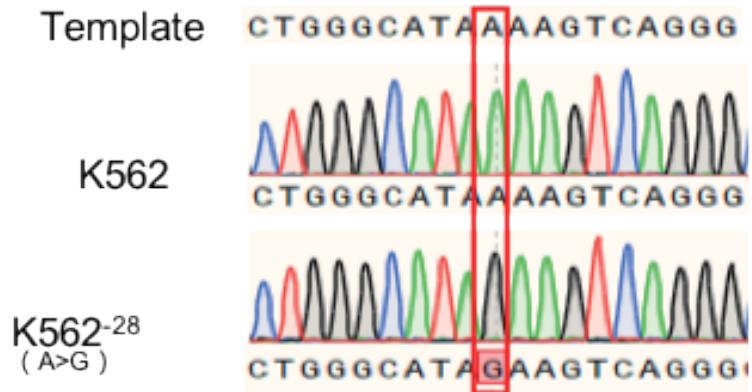
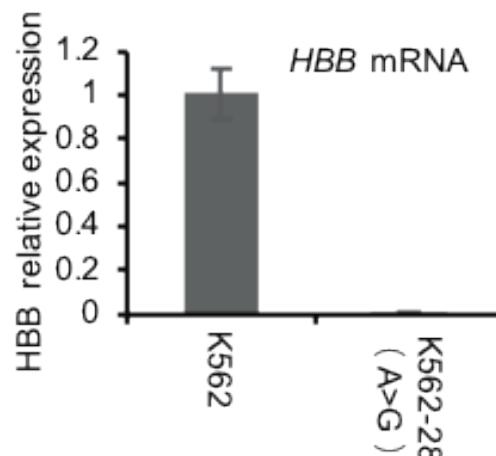
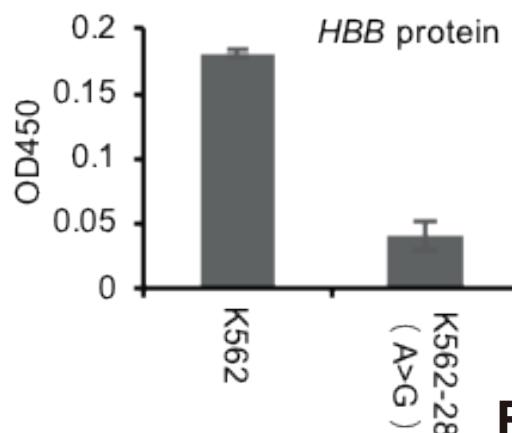
647 **annotation, visualization, and integrated discovery.** *Genome biology* 2003; 4(9):R60.

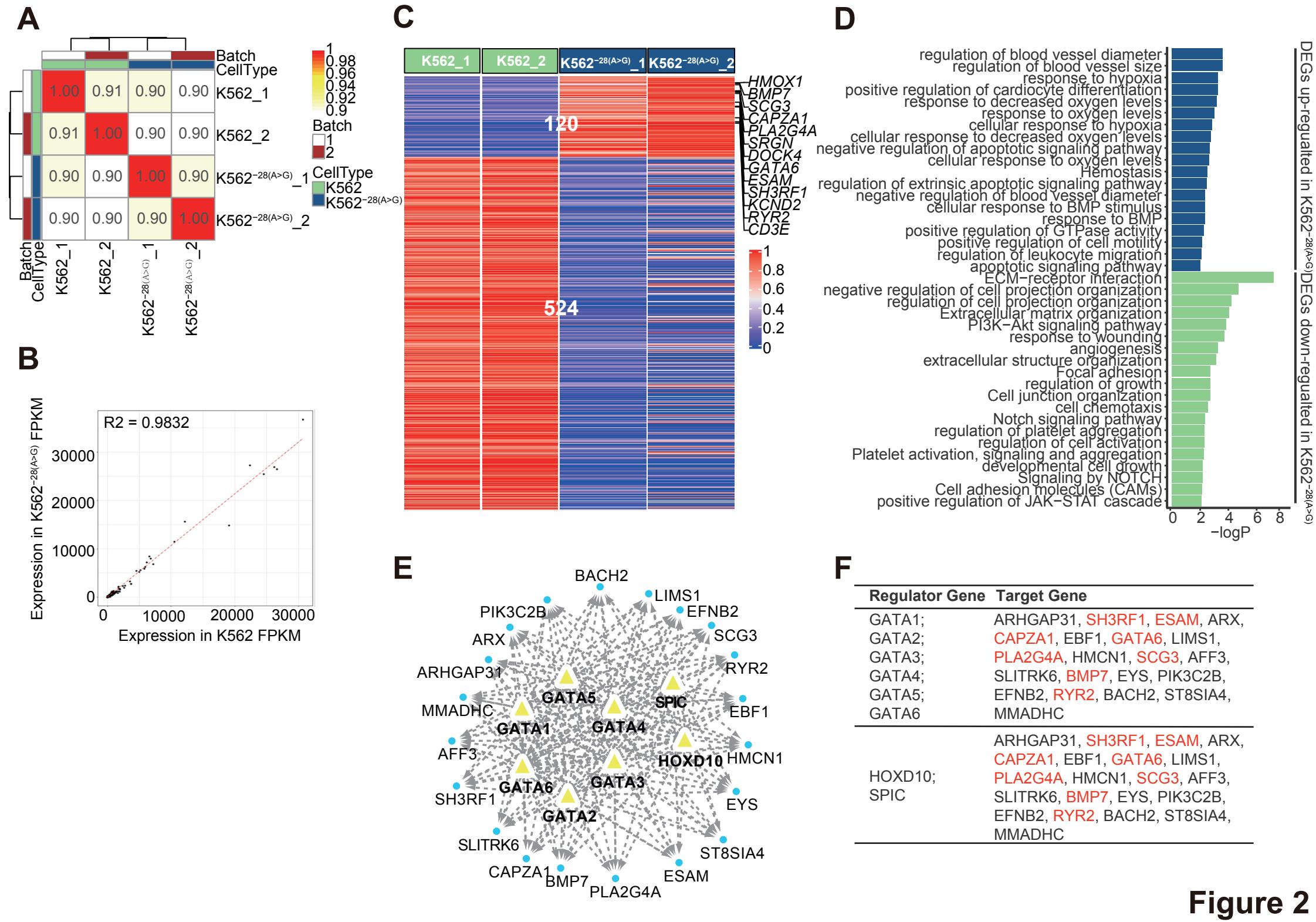
648 52. Hu H, Miao Y-R, Jia L-H, Yu Q-Y, Zhang Q, Guo A-Y. **AnimalTFDB 3.0: a comprehensive**
649 **resource for annotation and prediction of animal transcription factors.** *Nucleic acids research*
650 2018; 47(D1):D33-D38.

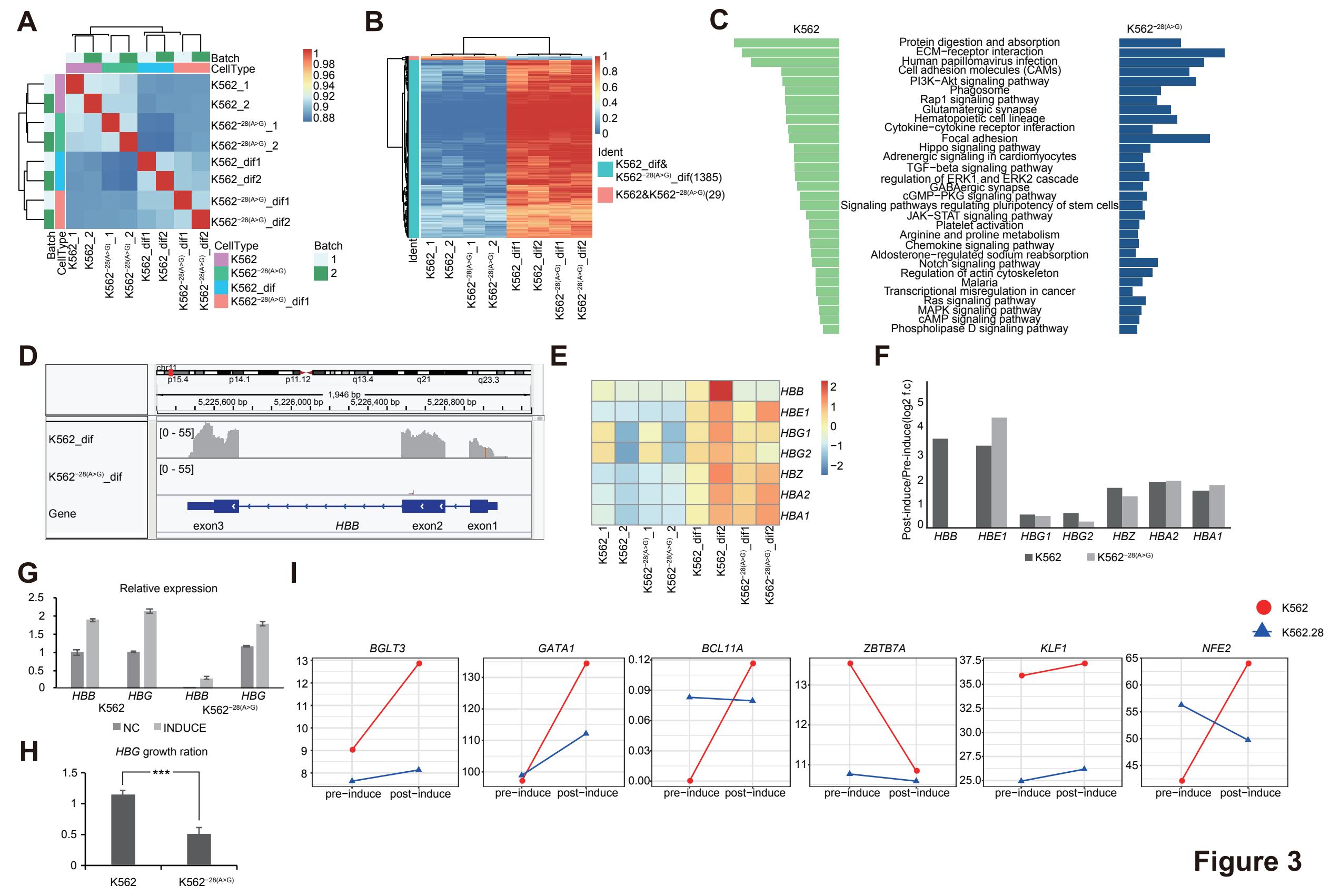
651 53. Janky R, Verfaillie A, Imrichová H, Van de Sande B, Standaert L, Christiaens V, et al. **Naval,**
652 **Potier D, et al: iRegulon: From a gene list to a gene regulatory network using large motif and**
653 **track collections.** *PLoS Comput Biol*; 10.

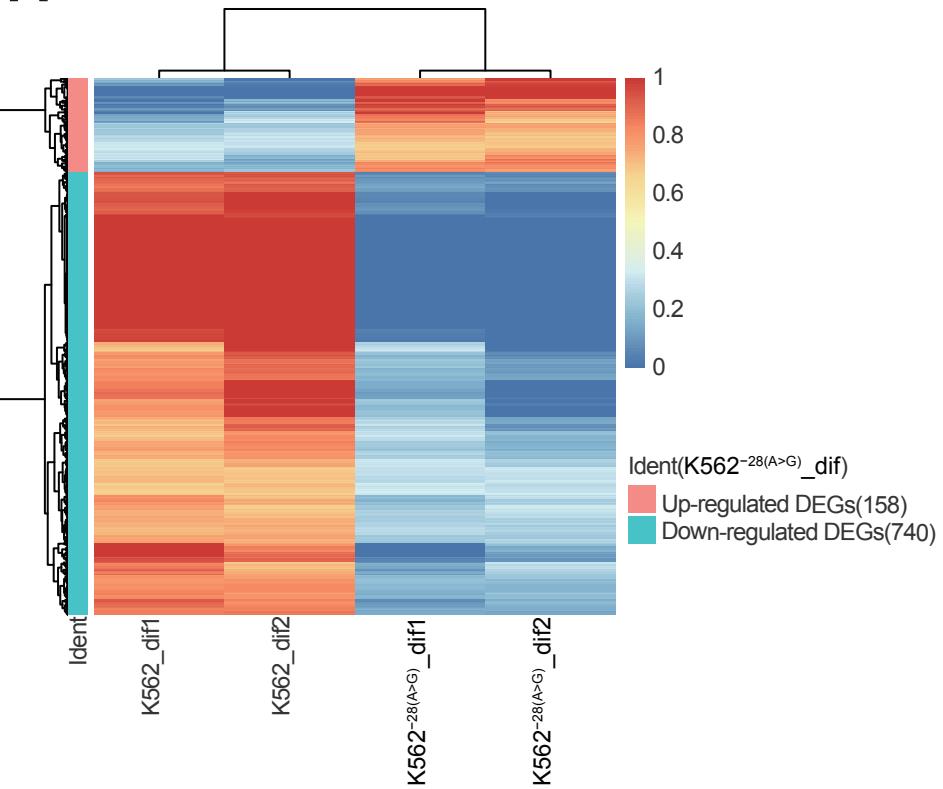
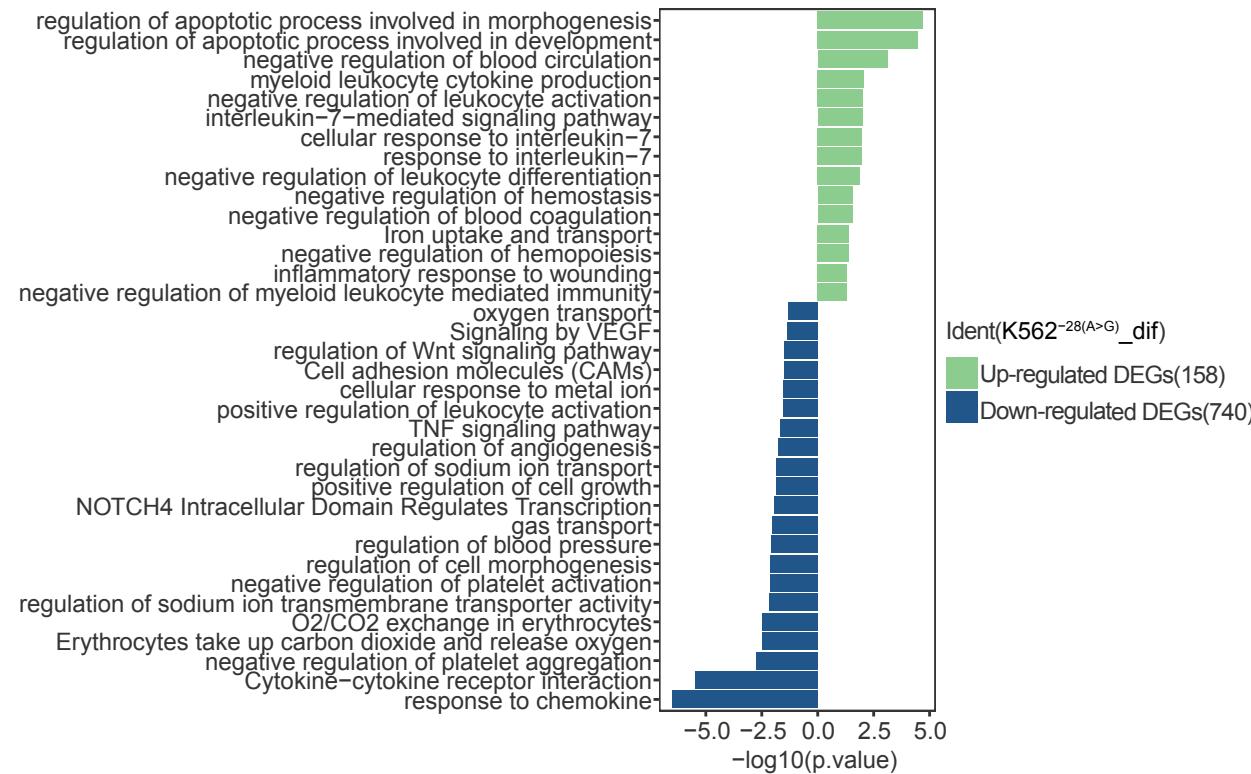
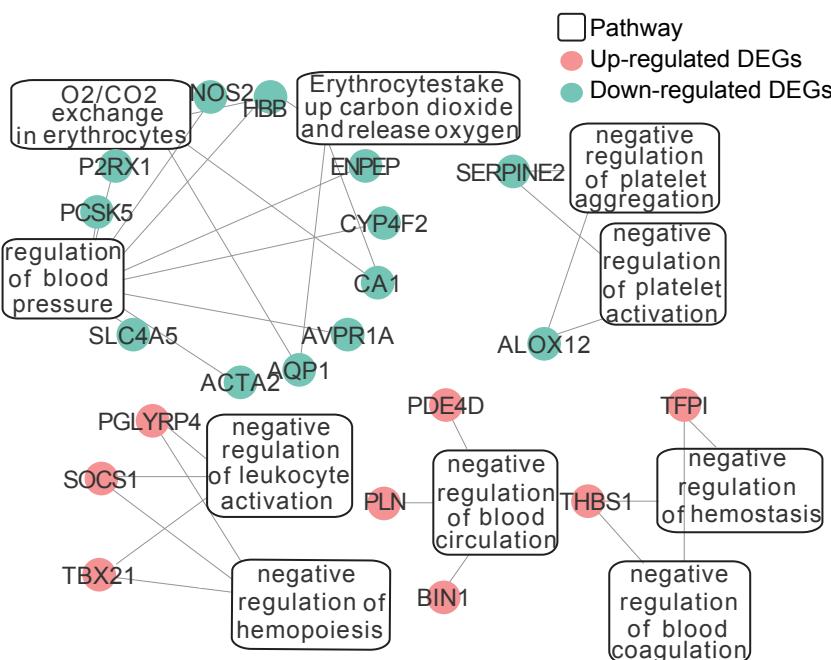
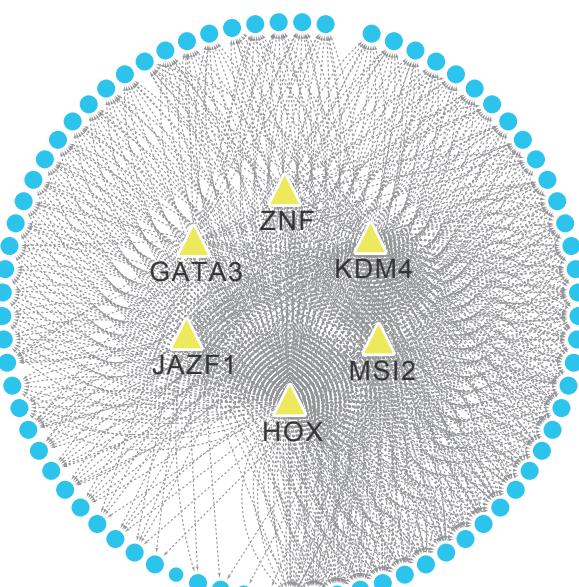
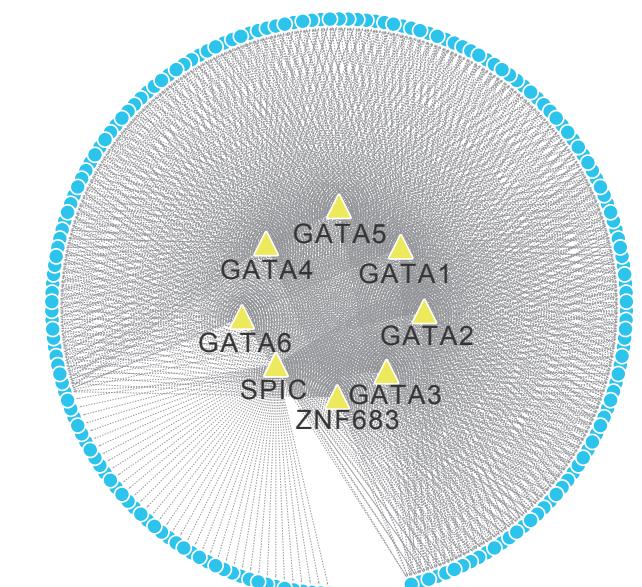
654 54. Shannon P, Markiel A, Ozier O, Baliga NS, Wang JT, Ramage D, et al. **Cytoscape: a software**
655 **environment for integrated models of biomolecular interaction networks.** *Genome Res* 2003;
656 13(11):2498-2504.

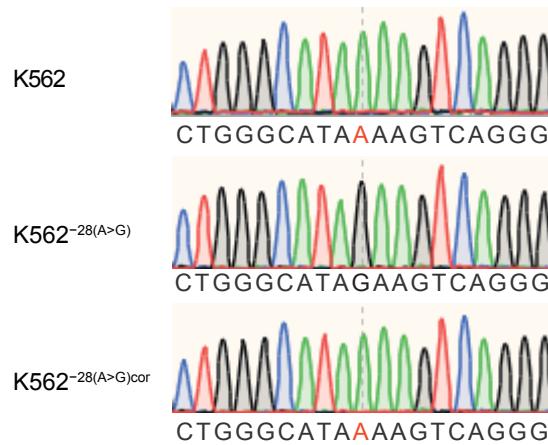
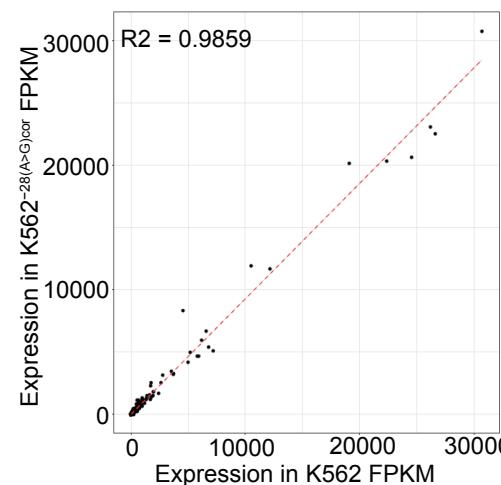
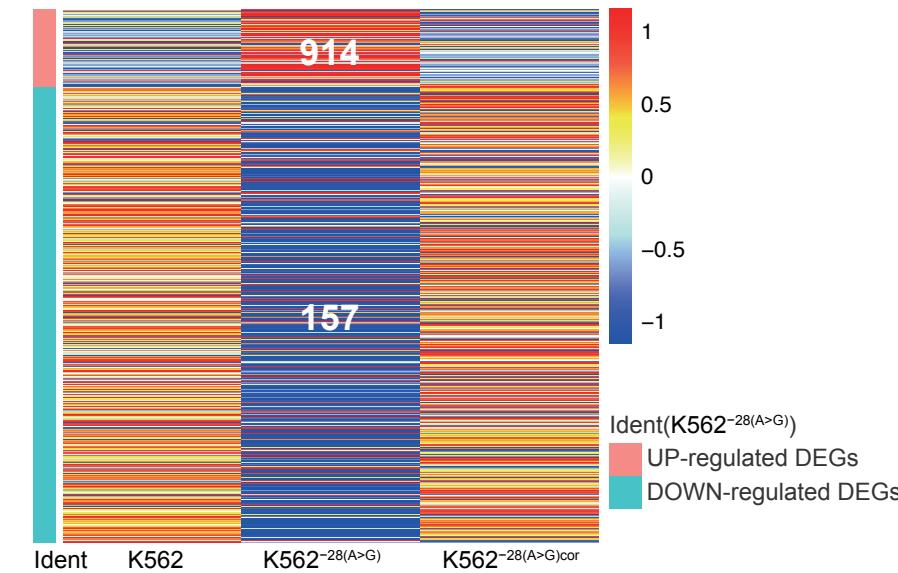
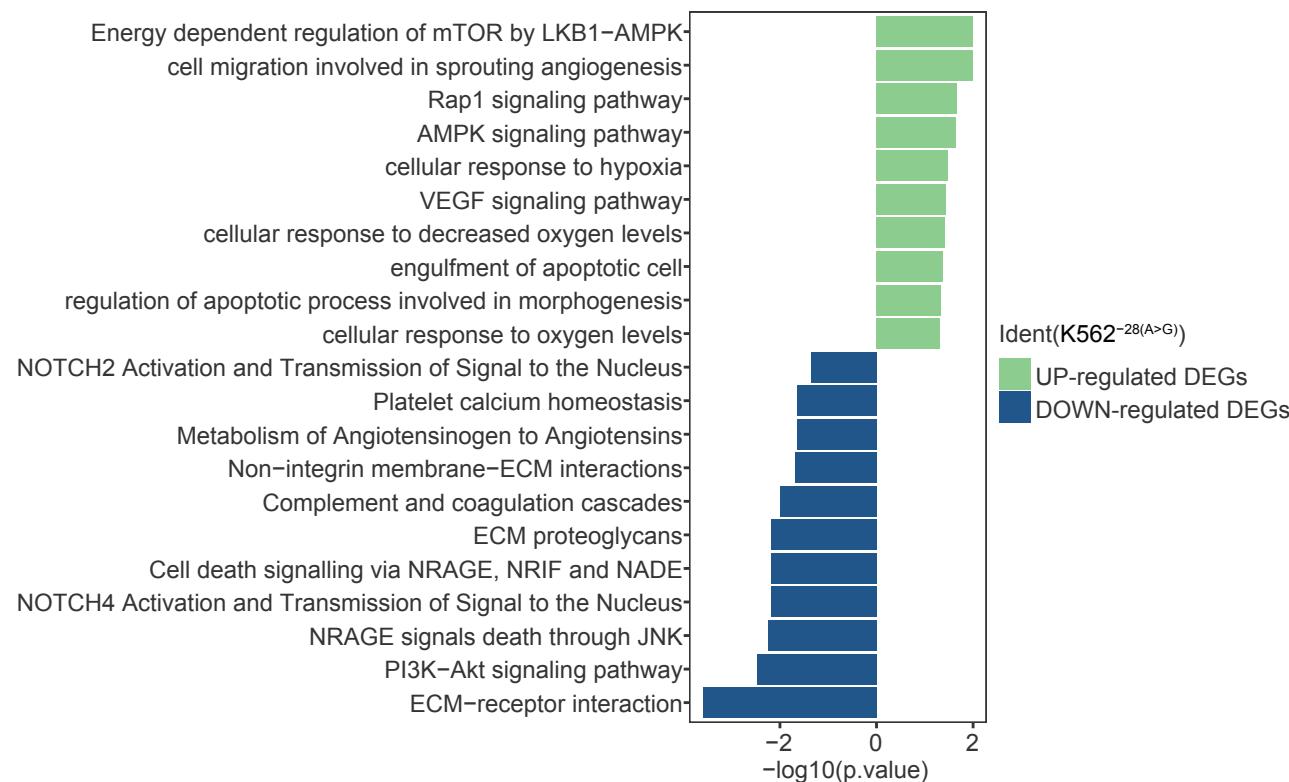
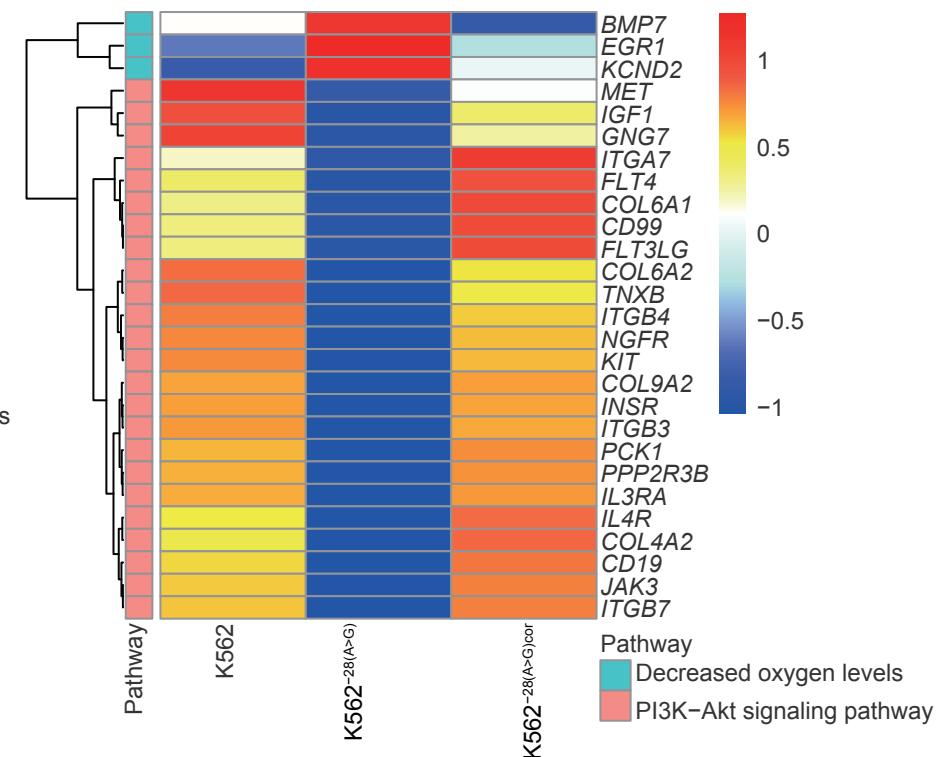
657

A**B****C****D****E****Figure 1**





A**B****C****D****E****Figure 4**

A**B****C****D****E****Figure 5**