# New gene functions in megakaryopoiesis and platelet formation

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Platelets are the second most abundant cell type in blood and are essential for maintaining haemostasis. Their count and volume are tightly controlled within narrow physiological ranges, but there is only limited understanding of the molecular processes controlling both traits. Here we carried out a high-powered meta-analysis of genome-wide association studies (GWAS) in up to 66,867 individuals of European ancestry, followed by extensive biological and functional assessment. We identified 68 genomic loci reliably associated with platelet count and volume mapping to established and putative novel regulators of megakaryopoiesis and platelet formation. These genes show megakaryocyte-specific gene expression patterns and extensive network connectivity. Using gene silencing in *Danio rerio* and *Drosophila melanogaster*, we identified 11 of the genes as novel regulators of blood cell formation. Taken together, our findings advance understanding of novel gene functions controlling fate-determining events during megakaryopoiesis and platelet formation, providing a new example of successful translation of GWAS to function.

To discover novel genetic determinants of megakaryopoiesis and platelet formation, we performed meta-analyses of GWAS for mean platelet volume (MPV) and platelet count (PLT). Our analyses included 18,600 (13 studies, MPV) and 48,666 (23 studies, PLT) individuals of European descent, respectively, and up to  $\sim 2.5$  million genotyped or imputed single nucleotide polymorphisms (SNPs)<sup>1</sup>. Briefly, we tested within each study (Supplementary Table 1) the associations of MPV and PLT with each SNP using an additive model; we then combined these study-specific test statistics in a fixed-effects meta-analysis. To reduce the risk of spurious associations, we applied common stringent quality control filters and the genomic control method<sup>2</sup> to the meta-analysis, which shows no evidence for residual inflation of summary statistics (Supplementary Fig. 1).

A total of 52 genomic loci reaching statistical significance at the genome-wide adjusted threshold of  $P \le 5 \times 10^{-8}$  were discovered in this stage 1 analysis; 55 additional loci reached suggestive association  $(5 \times 10^{-8} < P \le 5 \times 10^{-6})$ . We tested one SNP per locus in a stage 2 analysis that included in silico and de novo replication data in up to 18,838 individuals from 12 additional studies, confirming 15 additional loci (Supplementary Table 2). One further independent locus (TRIM58) associated with PLT was identified through detection of secondary association signals. Overall, 68 independent genomic regions were associated with PLT and MPV with  $P \le 5 \times 10^{-8}$ , of which 52 are new and 16 were described previously in Europeans<sup>3-6</sup> (Table 1). Of the 68 loci, 43 and 25 loci were associated significantly with PLT and MPV, respectively; 16 of them reached genome-wide significance with both traits (Supplementary Fig. 2). This partial overlap reflects the negative correlation of both traits (gender-adjusted r = -0.49, Fig. 1a) that results from the tight control of platelet mass  $(PLT \times MPV)^7$ . The association of some loci with both PLT and MPV may reflect this negative correlation between the two traits or independent pleiotropic effects of a locus on megakaryopoiesis and platelet formation. The different statistical power at the two traits and small effect sizes at many loci reduce our power to discriminate among loci controlling MPV and PLT through analysis of platelet mass. Their testing will require the collection and analysis of PLT and MPV in large independent homogeneous cohorts. Some loci, however, have a clear-cut effect. For instance, BAK1 affects PLT specifically, compatible with its role in apoptosis and platelet lifespan.

We further tested the association of the 68 loci in 7,949 (MPV) and 8,295 (PLT) samples of south Asian and 14,697 (PLT) samples of Japanese<sup>8</sup> origin. We detected substantial overlap of association signals, with effect size and direction highly concordant with findings in Europeans (Supplementary Fig. 3 and Supplementary Table 3). In the south Asian sample, 15 of the 68 (22.1%) loci were significant after adjustment for multiple testing ( $P \le 7 \times 10^{-4}$ ). In the Japanese sample, 13 of 55 (23.6%) PLT loci showed significance. Moreover, 73 of 84 (87%, South Asians) and 45 of 55 (82%, Japanese) SNPs showed associations with effect estimates directionally consistent with Europeans. Such concordance is highly unlikely to be due to chance ( $P = 2.3 \times 10^{-12}$  and  $P = 2.1 \times 10^{-6}$ ), and provides independent validation of the locus discovery in Europeans.

The 68 loci cumulatively explain 4.8% of the phenotypic variance in PLT and 9.9% in MPV, accounting respectively for average increases of  $2.57 \times 10^9 l^{-1}$  PLT and 0.10 fl MPV per copy of allele. These levels of explained variance are in accordance with other GWAS of complex quantitative traits<sup>9</sup>. Our results indicate that many other common variants of similar or lower effect size, rare variants as well as structural variants may also contribute to the variation of both platelet traits. We used the method of ref. 10 to estimate the number of additional PLT- and MPV-associated loci having effect sizes comparable to those observed in our analysis. The method (with caveats discussed in the Supplementary Information) predicted that 137 and 81 such loci exist for PLT and MPV respectively, accounting for 9.7% and 18.3% of the total phenotypic variance.

#### **Gene-prioritization strategies**

Evidence from recent, highly powered meta-analyses suggests that the association peaks are enriched for genes controlling key underlying biological pathways<sup>11,12</sup>. In our case, a large proportion of the association signals (46 out of 68) had the most significant SNP in stage 1 ('sentinel SNP') mapping to within a gene-coding region, including several key regulators of haemostasis (*ITGA2B, F2R, GP1BA*), mega-karyopoiesis (*THPO, MEF2C*) and platelet lifespan (*BAK1*). Through an unbiased analysis of our GWAS results, we estimated that PLT-associated SNPs are significantly more likely to map to gene regions than expected by chance (*P* < 0.05, Supplementary Fig. 4), suggesting that we may prioritize the search of additional yet unknown genes

## Table 1 | Summary of loci associated with platelet count and mean platelet volume in Europeans

Table	I Ju	initiary of loo	LI 8550C12	ateu witii piat	elet coulit	and mean pi	αιειει νοια		ropeans				
GWAS locus	Trait	Sentinel SNP	Chr (build 36)	Position (build 36)	Cytoband	Locus	Effect/other allele*	n	Effect (s.e.)†	P value‡	Het. <i>P</i> value	Rep.¶	Refs#
1	MPV	rs17396340	1	10,208,762	1p36.22	KIF1B	A/G	21,612	0.008 (0.002)	$2.83 \times 10^{-8}$	0.83	-	_
2	PLT	rs2336384	1	11,968,649	1p36.22	MFN2	G/T	57,366	2.172 (0.382)	$1.25 \times 10^{-8}$	0.31	-	-
3	MPV	rs10914144	1	170,216,372	1q24.3	DNM3	C/T	18,589	0.014 (0.001)	$1.11 \times 10^{-24}$	0.46	Yes	6
	PLT	rs10914144	1	170,216,372			T/C	54,978	3.417 (0.487)	$2.22 \times 10^{-12}$	0.79	Yes	
4	MPV	rs1172130	1	203,511,575	1q32.1	TMCC2	G/A	21,141	0.011 (0.001)	$3.82 \times 10^{-27}$	0.17	Yes	6
-	PLT	rs1668871	1	203,503,759			C/T	58,108	2.804 (0.368)	$2.59 \times 10^{-14}$	0.45	-	
5	PLT	rs7550918	1	245,742,181	1q44	LOC148824	T/C	54,171	3.133 (0.471)	$2.91 \times 10^{-11}$	0.85	-	-
6 7	PLT PLT	rs3811444 rs1260326	1 2	246,106,073	1q44	TRIM58§ GCKR	C/T T/C	27,955 54,396	3.346 (0.574)	$5.60  imes 10^{-9}$ $9.12  imes 10^{-10}$	0.66 0.11	– Yes	-
8	MPV	rs649729	2	27,584,443 31,317,888	2p23 2p23.1	EHD3	T/A	20,850	2.334 (0.381) 0.008 (0.001)	$1.17 \times 10^{-12}$	0.11	Yes	- 6
0	PLT	rs625132	2	31,335,803	2023.1	LIIDS	G/A	45,217	4.236 (0.568)	$9.15 \times 10^{-14}$	0.98	-	0
9	PLT	rs17030845	2	43,541,382	2p21	THADA	C/T	65,738	3.577 (0.556)	$1.27 \times 10^{-10}$	0.40	_	_
10	MPV	rs4305276	2	241,143,685	2q37.3	ANKMY1	G/C	20,618	0.008 (0.001)	$1.71 \times 10^{-11}$	0.71	_	_
11	PLT	rs7616006	3	12,242,647	3p25	SYN2	A/G	58,564	1.997 (0.366)	$4.86 \times 10^{-8}$	0.20	-	_
12	PLT	rs7641175	3	18,286,415	3p23	SATB1	A/G	58,366	2.757 (0.416)	$3.37 \times 10^{-11}$	0.34	_	-
13	MPV	rs1354034	3	56,824,788	3p14.3	ARHGEF3	T/C	18,286	0.023 (0.001)	$3.31  imes 10^{-69}$	0.00	Yes	4,6
	PLT	rs1354034	3	56,824,788			C/T	49,135	6.848 (0.442)	$2.86  imes 10^{-54}$	0.50	Yes	
14	PLT	rs3792366	3	124,322,565	3q21.1	PDIA5	G/A	58,335	2.153 (0.365)	$3.60 \times 10^{-9}$	0.07	-	-
15	MPV	rs10512627	3	125,822,911	3q21.1	KALRN	C/G	21,108	0.006 (0.001)	$5.10  imes 10^{-10}$	0.41	-	-
16	MPV	rs11734132	4	6,942,419	4p16.1	KIAA0232	G/C	17,444	0.011 (0.002)	$1.11 \times 10^{-11}$	0.20	-	-
17	PLT	rs7694379	4	88,405,532	4q22.1	HSD17B13	A/G	56,430	2.129 (0.37)	$8.70 \times 10^{-9}$	0.44	Yes	-
18	MPV	rs2227831	5	76,059,249	5q13.3	F2R	G/A	21,654	0.021 (0.003)	$9.65 \times 10^{-16}$	0.11	-	-
10	PLT	rs17568628	5	76,082,694	E 140	115500	T/C	44,759	6.074 (0.993)	$9.61 \times 10^{-10}$	0.77	-	
19	PLT	rs700585	5	88,187,872	5q14.3	MEF2C	C/T	55,469	2.703 (0.442)	$9.86 \times 10^{-10}$	0.06	-	-
20	MPV PLT	rs4521516 rs2070729	5 5	88,135,706	5 ~ 2 1 1		G/C	28,157	0.008 (0.001)	$1.89  imes 10^{-9}$ $1.13  imes 10^{-10}$	0.39	_	
20 21	MPV	rs10076782	5 5	131,847,819 158,537,540	5q31.1 5q33.3	IRF1 RNF145	A/C A/G	56,469 18,025	2.394 (0.371) 0.007 (0.001)	$4.48 \times 10^{-8}$	0.73 0.52	_	_
22	PLT	rs441460	6	25,656,266	6p22.2	LRRC16	G/A	58,064	3.08 (0.359)	$4.48 \times 10^{-18}$ $8.70 \times 10^{-18}$	0.52	_	_
23	PLT	rs3819299	6	31,430,345	6p21.33	HLA-B	G/T	48,687	5.048 (0.824)	$8.80 \times 10^{-10}$	0.01	_	_
24	PLT	rs399604	6	33,082,991	6p21.33	HLA-DOA	C/T	57,674	2.346 (0.365)	$1.30 \times 10^{-10}$	0.23	_	_
25	PLT	rs210134	6	33,648,186	6p21.31	BAK1	G/A	58,554	4.957 (0.396)	$7.11 \times 10^{-36}$	0.67	Yes	6,8
26	PLT	rs9399137	6	135,460,710	6q23.3	HBS1L- MYB	C/T	57,857	5.901 (0.41)	$5.04 \times 10^{-47}$	0.74	Yes	8
27	MPV	rs342293	7	106,159,454	7q22.3	FLJ36031–	G/C	20,193	0.017 (0.001)	$7.03  imes 10^{-57}$	0.19	Yes	5,6
	PLT	rs342275	7	106,146,451		PIK3CG	C/T	58,571	3.742 (0.363)	$5.57  imes 10^{-25}$	0.17	-	
28	PLT	rs4731120	7	123,198,458	7q31.3	WASL	C/A	66,147	4.14 (0.592)	$2.77  imes 10^{-12}$	0.46	-	-
29	PLT	rs6993770	8	106,650,703	8q23.1	ZFPM2	A/T	54,960	3.668 (0.437)	$4.30 \times 10^{-17}$	0.14	-	-
30	PLT	rs6995402	8	145,077,548	8q24.3	PLEC1	C/T	57,593	2.304 (0.371)	$5.09 \times 10^{-10}$	0.10	-	-
31	MPV	rs10813766	9	321,489	9p24.3	DOCK8	T/G	21,104	0.007 (0.001)	$3.68 \times 10^{-12}$	0.45	-	-
32	PLT	rs409801	9	4,734,742	9p24.1	AK3	C/T	56,063	5.585 (0.378)	$2.59 \times 10^{-49}$	0.47	_	6
33	PLT	rs13300663	9	4,804,947	9p24.1	RCL1	C/G	48,092	5.585 (0.483)	$9.83 \times 10^{-30}$	0.64	Yes	8
34	PLT	rs3731211	9	21,976,846	9p21.3	CDKN2A	A/T	54,529	3.281 (0.438)	$\begin{array}{c} 6.43 \times 10^{-14} \\ 2.39 \times 10^{-10} \end{array}$	0.86	Yes	-
35 36	PLT MPV	rs11789898 rs7075195	9 10	135,915,483 64,720,664	9q34.2 10q21.2	BRD3 JMJD1C	T/G A/G	57,391 21,226	3.014 (0.476) 0.014 (0.001)	$2.39 \times 10^{-44}$ $2.39 \times 10^{-44}$	0.70 0.89	– Yes	- 6
50	PLT	rs10761731	10	64,697,615	10421.2	JIVIJDIC	T/A	54,344	3.849 (0.378)	$2.02 \times 10^{-24}$	0.56	Yes	0
37	PLT	rs505404	10	233,267	11p15.5	PSMD13-	G/T	54,642	4.662 (0.453)	$7.44 \times 10^{-25}$	0.86	-	6
07	MPV	rs17655730	11	260,714	11010.0	NLRP6	T/C	20,875	0.01 (0.001)	$2.29 \times 10^{-15}$	0.29	_	Ũ
38	PLT	rs4246215	11	61,320,874	11q12.2	FEN1	T/G	56,299	2.451 (0.39)	$3.31 \times 10^{-10}$	0.41	Yes	_
39	PLT	rs4938642	11	118,605,115	11q23.3	CBL	C/G	56,605	4.73 (0.727)	$7.66  imes 10^{-11}$	0.98	Yes	_
40	MPV	rs1558324	12	6,159,479	12p13.31	CD9–VWF	A/G	20,387	0.01 (0.001)	$1.55  imes 10^{-21}$	0.48	Yes	-
	PLT	rs7342306	12	6,161,353			G/A	55,636	2.532 (0.384)	$4.29  imes 10^{-11}$	0.14	-	
41	MPV	rs2015599	12	29,326,746	12p11.22	MLSTD1	A/G	21,102	0.008 (0.001)	$5.55 \times 10^{-16}$	0.76	-	-
42	MPV	rs10876550	12	52,998,574	12q13.13	COPZ1-	G/A	21,214	0.008 (0.001)	$1.86  imes 10^{-14}$	0.38	Yes	-
	•					NFE2– CBX5			0.00	14	~ -		
43	MPV	rs2950390	12	55,341,557	12q13.3	PTGES3-	C/T	21,238	0.008 (0.001)	$7.45 \times 10^{-14}$	0.75	-	-
1.0	PLT	rs941207	12	55,309,550	10~0/10	BAZ2A SH2B3	G/C T/C	55,653 56,354	2.751 (0.431)	$\begin{array}{c} 1.74 \times 10^{-10} \\ 1.22 \times 10^{-26} \end{array}$	0.33	-	60
44 45	PLT PLT	rs3184504 rs17824620	12 12	110,368,990	12q24.12	SHZB3 RPH3A–	C/A	56,354 51,530	3.99 (0.374)	$9.67 \times 10^{-9}$	0.07 0.26	_	6,8
40	ΓLΙ	151/024020	12	111,585,376	12q24.13	PTPN11	C/A	51,550	2.457 (0.428)	9.07 × 10	0.20	-	-
46	MPV	rs7961894	12	120,849,965	12q24.31	WDR66	T/C	29,755	0.03 (0.001)	$1.42 \times 10^{-103}$	0.48	Yes	4,6
.0	PLT	rs7961894	12	120,849,965	10427.01		C/T	51,897	3.923 (0.609)	$1.42 \times 10^{-10}$ $1.22 \times 10^{-10}$	0.05	Yes	1,0
47	PLT	rs4148441	13	94,696,207	13q32	ABCC4	G/A	64,120	4.117 (0.6)	$6.76 \times 10^{-12}$	0.38	Yes	_
48	MPV	rs7317038	13	113,060,898	13q34	GRTP1	C/T	27,646	0.006 (0.001)	$8.27  imes 10^{-12}$	0.09	-	_
49	PLT	rs8022206	14	67,590,658	14q24.1	RAD51L1	G/A	52,251	3.197 (0.5)	$1.55 \times 10^{-10}$	0.59	-	_
50	PLT	rs8006385	14	92,570,778	14q31	ITPK1	G/A	64,929	3.587 (0.558)	$1.24 \times 10^{-10}$	0.28	-	-
51	PLT	rs7149242	14	100,229,168	14q32.2	C14orf70–	G/T	61,247	2.142 (0.385)	$2.68  imes 10^{-8}$	0.07	-	-
						DLK1							
52	PLT	rs11628318	14	102,109,839	14q32.31	RCOR1	A/T	62,438	2.572 (0.405)	$2.04 \times 10^{-10}$	0.84	-	-
53	PLT	rs2297067	14	102,636,537	14q32.32	C14orf73	T/C	41,687	3.538 (0.553)	$1.58 \times 10^{-10}$	0.79	_	-
	MPV	rs944002	14	102,642,567	14 000-	0000	A/G	22,910	0.008 (0.001)	$4.76 \times 10^{-11}$	0.66	Yes	
54	MPV	rs3000073	14	104,800,836	14q32.33	BRF1	G/A	21,229	0.007 (0.001)	$3.27 \times 10^{-11}$	0.28	-	-
55	PLT	rs3809566	15	61,120,776	15q22.2	TPM1	G/A	57,113	2.443 (0.39)	$3.65 \times 10^{-10}$	0.33	-	6
56 57	PLT	rs1719271	15	62,970,853	15q22.31	ANKDD1A	G/A	56,782	3.414 (0.502)	$1.05 \times 10^{-11}$	0.00	- Voc	-
57 58	PLT PLT	rs6065	17	4,777,160	17pter-p12		T/C	64,987	4.191 (0.63)	$\begin{array}{c} 2.92 \times 10^{-11} \\ 2.32 \times 10^{-9} \end{array}$	0.00	Yes	8
20	ET L	rs397969	17	19,744,838	17p11.1	AKAP10	C/T	60,944	2.131 (0.357)		0.92	-	_
50		rs8076720	17	24 738 710	17a110	TAOK1	T/C	21652	()()   2 (0 001)	A 59 ∨ 10-30	(112)		
59	MPV PLT	rs8076739 rs559972	17 17	24,738,712 24,838,621	17q11.2	TAOK1	T/C T/C	21,652 53,460	0.013 (0.001) 3.264 (0.375)	$\begin{array}{c} 4.59 \times 10^{-38} \\ 3.30 \times 10^{-18} \end{array}$	0.12 0.25	-	4,6

#### Table 1 Continued

GWAS locus	Trait	Sentinel SNP	Chr (build 36)	Position (build 36)	Cytoband	Locus	Effect/other allele*	п	Effect (s.e.)†	P value‡	Het. <i>P</i> value	Rep.¶	Refs#
60	PLT	rs10512472	17	30,908,916	17q12	SNORD7-	C/T	58,692	3.636 (0.477)	$2.40 \times 10^{-14}$	0.08	Yes	_
	MPV	rs16971217	17	30,968,167	·	AP2B1	C/G	21,089	0.009 (0.001)	$3.77  imes 10^{-12}$	0.01		
61	PLT	rs708382	17	39,797,869	17q21.31	FAM171A2-	T/C	50,036	2.439 (0.431)	$1.51  imes 10^{-8}$	0.46	-	-
						ITGA2B							
62	PLT	rs11082304	18	18,974,970	18q11.2	CABLES1	G/T	58,215	2.48 (0.378)	$5.27  imes 10^{-11}$	0.73	Yes	-
63	MPV	rs12969657	18	65,687,475	18q22.2	CD226	T/C	19,285	0.007 (0.001)	$3.36 \times 10^{-11}$	0.38	Yes	6
64	MPV	rs8109288	19	16,046,558	19p13.12	TPM4	A/G	13,964	0.029 (0.004)	$1.15  imes 10^{-11}$	0.14	-	3
	PLT	rs8109288	19	16,046,558			G/A	29,014	11.945 (1.892)	$2.75  imes 10^{-10}$	0.04	-	
65	PLT	rs17356664	19	50,432,610	19q13.32	EXOC3L2	C/T	55,487	2.599 (0.415)	$3.60  imes 10^{-10}$	0.07	-	-
66	MPV	rs13042885	20	1,872,706	20p13	SIRPA	C/T	21,186	0.008 (0.001)	$5.56  imes 10^{-14}$	0.56	-	6
67	MPV	rs4812048	20	57,021,165	20q13.32	CTSZ-	C/T	20,811	0.008 (0.001)	$1.30  imes 10^{-9}$	0.06	-	-
						TUBB1							
68	PLT	rs1034566	22	18,364,276	22q11.21	ARVCF	T/C	61,469	2.128 (0.384)	$3.06  imes 10^{-8}$	0.43	-	-
69	PLT	rs6141	3	185,572,959	3q27	THPO	T/C	39,366	2.467 (0.456)	$6.18 \times 10^{-8}$	0.59	Yes	24, 8

Results are provided for the 68 loci and 84 sentinel SNPs reaching genome-wide significant ( $P \le 5 \times 10^{-8}$ ) association with PLT or MPV. Results for stages 1 and 2 of the analysis in Europeans are provided in Supplementary Table 2. MPV, mean platelet volume; PLT, platelet count.

\* Alleles are indexed to the forward strand of NCBI build 36.

 $\dagger$  Effect sizes in In(fl) for MPV and  $10^9\,I^{-1}$  for PLT.

‡ All P values are based on the inverse-variance weighted meta-analysis model (fixed effects).

§ TRIM58 identifies the only secondary signal identified in this study, derived from a genome-wide secondary signal discovery effort carried out by conditioning the discovery GWAS on all SNPs reaching

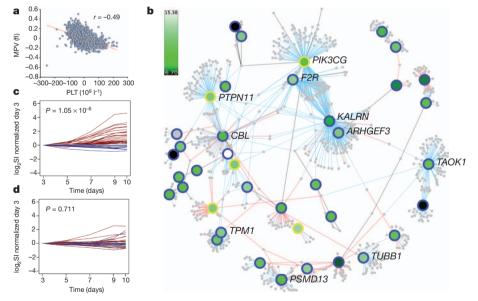
significance in the stage 1 meta-analysis. The effects (s.e.) and P values reported are obtained in the secondary analysis. The corresponding values in the stage 1 analysis are effect (s.e.) = 2.721 (0.542) and  $P = 4.06 \times 10^{-7}$ . Further details of this analysis are given in the Supplementary Information.

||*THPO* narrowly misses the level required for nominal significance ( $P < 5 \times 10^{-8}$ ) in Europeans, but shows genome-wide significance in Japanese.

Rep. indicates replication of European stage 1+2 results in non-Europeans (Supplementary Table 3): yes, if association P value is at least in one non-European population <0.0007 (to account for multiple testing of 68 loci).

#Relevant references are indicated.

controlling these processes in the associated regions. To define a univocal rule to study the enrichment of functional relationships in associated genes, we made the choice to focus on a set of 54 'core' genes selected as either containing the sentinel SNP or mapping to within 10 kb from an intergenic sentinel SNP (Table 2). This selection strategy is designed to obtain unbiased hypotheses producing interpretable biological inference for genes near the association signals, but has reduced sensitivity for genes that map further from the sentinel SNP. For instance *VWF*, a key regulator of haemostasis, maps to 55 kb from the sentinel SNP (Supplementary Fig. 3 and Supplementary Table 4) and is therefore not considered as a core gene. We further note that this selection strategy does not imply knowledge of the location of causative



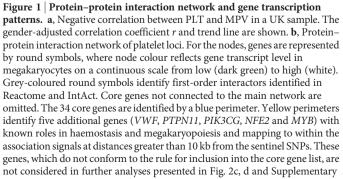


Fig. 5 and are shown here for illustration purposes only. Network edges were obtained from the Reactome (blue) and IntAct-like (red) databases and through manual literature curation (black). The network including the 34 core genes alone contains 633 nodes and 827 edges; after inclusion of the 5 additional genes, the network (shown here) includes 785 nodes and 1,085 edges. The full network, containing gene expression levels and other annotation features, is available in Cytoscape<sup>25</sup> format for download (Supplementary Data 1). **c**, **d**, Time course experiments of gene expression in megakaryocytes and erythroblasts. Expression of core genes in  $log_2$  transformed signal intensities ( $log_2$  SI) during differentiation of the haematopoietic stem cells into megakaryocytes (**c**) or erythroblasts (**d**), segregated by their trends of statistically significant increasing (red), decreasing (blue) or unchanged (grey) gene expression. The corresponding gene list for the three classes is given in Supplementary Data 1.



## Table 2 | Summary of functional evidence for core genes

Sentinel SNP (trait)	Core gene (distance in kb)*	Phenotype†
rs17396340 (MPV)	KIF1B kinesin family member 1B (0)	Variant annotation: sentinel SNP in $r^2 = 1$ with eQTL for <i>K1F1B</i>
rs2336384 (PLT)	MFN2 mitofusin 2 (0)	Variant annotation: sentinel SNP is eQTL for <i>MFN2</i>
rs10914144 (MPV, PLT)	DNM3 dynamin 3 (0)	shibire (DNM-like): overproliferation of plasmatocytes in Drosophila (this
rs1172130, rs1668871	TMCC2 transmembrane and coiled-coil domain	study) Variant annotation: sentinel SNP in $r^2 = 0.928$ with eQTL for <i>RIPK5</i>
(MPV, PLT)	family 2 (2,481; 0)	
rs1260326 (PLT)	GCKR glucokinase (hexokinase 4) regulator (0)	Xab1 (non-core gene): pronounced increase in plasmatocyte and crystal cell counts in <i>Drosophila</i> (this study)
rs649729, rs625132 (MPV, PLT)	EHD3 EH-domain-containing 3 (0)	ehd3 morpholino-injected embryos had no haematopoietic phenotype in <i>D. rerio</i> (this study)
rs17030845 (PLT)	THADA thyroid adenoma associated (0)	Zfp36/2 (non-core gene): decreased platelet cell number in mouse
rs1354034 (MPV, PLT)	ARHGEF3 Rho guanine nucleotide exchange factor (GEF) 3 (0)	arhgef3: profound effect on thrombopoiesis and erythropoiesis in <i>D. rerio</i> (this study)
rs2227831, rs17568628	<i>F2R</i> coagulation factor II (thrombin) receptor (0: 15.343)	Par1 (F2R): thrombin activation of platelets attenuated in mouse
(MPV, PLT) rs700585, rs4521516	<i>MEF2C</i> myocyte enhancer factor 2C (0)	Mef2: severely impaired megakaryopoiesis with reduced platelet count and
(PLT, MPV) rs2070729 (PLT)	IRF1 interferon regulatory factor 1 (0)	increased platelet volume in mouse Irf1: decreased number of NK lymphocytes in mouse
rs10076782 (MPV)	<i>RNF145</i> ring finger protein 145 (0)	<i>rnf145</i> : ablation of thrombopoiesis and erythropoiesis in <i>D. rerio</i> (this study)
rs210134 (PLT)	BAK1 BCL2-antagonist/killer 1 (116)	Bak1: genetic ablation of Bcl-xl in mouse leads to thrombocytopenia by reducing platelet lifespan and this is corrected by ablation of Bak1
rs6993770 (PLT)	ZFPM2 zinc finger protein, multitype 2 (0)	Zfpm2: peripheral haemorrhage in mouse; ush (ZFPM2): reduction in
rs6995402 (PLT)	PLEC1 plectin (0)	plasmatocytes and crystal cells in <i>Drosophila</i> (this study) <i>Plec1</i> : impaired leukocyte recruitment to wounds in mouse
rs10813766 (MPV)	DOCK8 dedicator of cytokinesis 8 (0)	Dock8: decrease in number of B cells and T cells in mouse; autosomal
	()	recessive hyper-IgE recurrent infection syndrome (OMIM: 243700)
	AK3 adenylate kinase 3 (2,699) JMJD1C jumonji domain containing 1C (0)	<i>ak</i> 3: ablation of thrombopoiesis and erythropoiesis in <i>D. rerio</i> (this study) <i>jmjd1c</i> : ablation of thrombopoiesis and erythropoiesis in <i>D. rerio</i> (this study)
(MPV, PLT) rs505404, rs17655730	PSMD13 proteasome (prosome, macropain) 26S	rpn9 (PSMD13): reduction in plasmatocyte numbers in Drosophila (this
(PLT, MPV)	subunit, non-ATPase, 13 (0); <i>NLRP6</i> NLR family, pyrin domain containing 6 (7.856)	study)
rs4246215 (PLT)	<i>FEN1</i> flap structure-specific endonuclease 1 (0)	Variant annotation: sentinel SNP is eQTL for CPSF7; Fads2 (non-core gene):
		abnormal platelet physiology and decreased platelet aggregation in mouse
rs4938642 (PLT)	CBL Cas-Br-M (murine) ecotropic retroviral transforming sequence (0)	Acute myeloid leukaemia (OMIM: 165360); <i>CbI</i> : increased platelet numbers, increased thymic CD3 and CD4 expression on T cells in mouse;
	transionning sequence (0)	haematopoietic stem/progenitor cells showed enhanced sensitivity to
		cytokines in Cbl-null mice
rs10876550 (MPV)	<i>COPZ1</i> coatomer protein complex, subunit zeta 1 (6,604)	Variant annotation: sentinel SNP is eQTL for <i>GPR84</i> ;
		<i>Copz1</i> : iron deficiency in mouse; <i>Nfe2</i> (non-core): thrombocytopenia in mouse; <i>Znf385a</i> (non-core): abnormal platelet morphology in mouse;
		Su(var)205 (non-core CBX5): reduction in plasmatocyte number and
		overproliferation of crystal cells in Drosophila (this study)
rs3184504 (PLT)	SH2B3 SH2B adaptor protein 3 (0)	<i>Lnk</i> ( <i>SH2B3</i> ): increased megakaryopoiesis and platelet count in mouse; increased white blood cell counts and decreased platelet count in mouse;
		rpl6 (non-core): reduced plasmatocyte and crystal cell number in Drosophila
		(this study)
rs4148441 (PLT)	ABCC4 ATP-binding cassette, sub-family C	ABCC4 is an active constituent of mediator-storing granules in human
rs7317038 (MPV)	(CFTR/MRP), member 4 (0) <i>GRTP1</i> growth hormone regulated TBC protein 1 (0)	platelets Variant annotation: sentinel SNP is eQTL for <i>GRTP1</i> ; sentinel SNP in $r^2 =$
-2000072 (MDV)		0.93 with eQTL for RASA3
rs3000073 (MPV)	<i>BRF1</i> BRF1 homologue, subunit of RNA polymerase III transcription initiation factor IIIB ( <i>S. cerevisiae</i> ) (0)	<i>brf</i> : reduction in plasmatocyte cell number in <i>Drosophila</i> (this study)
rs3809566 (PLT)	<i>TPM1</i> tropomyosin 1 (alpha) (1,115)	Variant annotation: sentinel SNP in $r^2 = 1$ with eQTL for <i>TPM1</i> ; <i>tpma</i> ( <i>TPM1</i> ): total abrogation of thrombopoiesis, but normal erythropoiesis in <i>D. rerio</i>
		(this study)
rs6065 (PLT)	GP1BA glycoprotein lb (platelet), alpha polypeptide (0)	Bernard–Soulier syndrome (OMIM: 231200), benign Mediterranean
		macrothrombocytopenia (OMIM: 153670), pseudo-von Willebrand disease
		(OMIM: 177820); Gp1ba: giant platelets, a low platelet count and increased bleeding in mouse; Gp1ba <sup>+/-</sup> mice show complete inhibition of arterial
		thrombus formation and intermediate platelet numbers
rs708382 (PLT)	FAM171A2 family with sequence similarity 171,	Glanzmann thrombasthenia (OMIM: 607759); decreased platelet count,
	member A2 (1,108); <i>ITGA2B</i> integrin, alpha 2b (7,207)	abnormal platelet morphology and decreased platelet aggregation in
rs12969657 (MPV)	CD226 CD226 molecule (0)	mouse; <i>itga2b</i> : severely reduced thrombocyte function in <i>D. rerio</i> Variant annotation: sentinel SNP is eQTL for <i>CD226</i> ; leukocyte adhesion
		deficiency (OMIM: 116920); CD226 mediates adhesion of megakaryocytic
		cells to endothelial cells and inhibition of this diminishes megakaryocytic
		cell maturation; <i>Dnam1</i> ( <i>CD226</i> ): cytotoxic T cells and NK cells less able to lyse tumours in mouse
rs13042885 (MPV)	SIRPA signal-regulatory protein alpha (4,163)	Iyse tumours in mouse Sirpa: mild thrombocytopenia in mouse, decreased proportion of single
		positive T cells, enhanced peritoneal macrophage phagocytosis
- 4010040 (MDV)	CTSZ cathepsin Z (5,468); TUBB1 tubulin, beta 1 (6,539)	Autosomal dominant macrothrombocytopenia (OMIM: 613112); <i>Tubb1</i> :
rs4812048 (MPV)		
rs4812048 (MPV)		thrombocytopenia resulting from a defect in generating proplatelets in mouse: prolonged bleeding time and attenuated response of platelets to
rs4812048 (MPV)		thrombocytopenia resulting from a defect in generating proplatelets in mouse; prolonged bleeding time and attenuated response of platelets to thrombin in mouse; <i>sun</i> (non-core ATP5E): reduction of crystal cell numbers

#### Table 2 | Continued

Sentinel SNP (trait)	Core gene (distance in kb)*	Phenotype†
rs1034566 (PLT)	ARVCF armadillo repeat gene deleted in velocardiofacial syndrome (0)	Variant annotation: sentinel SNP in $r^2 = 1$ with eQTL for UFD1L
rs6141 (PLT)	THPO thrombopoietin (0)	Essential thrombocythemia (OMIM: 187950); <i>Thpo</i> : decrease in platelet number and increase in platelet volume in mouse

Information is given only for genes with a haematopoietic phenotype. A more extensive annotation of genes within associated intervals is presented in Supplementary Table 4. Information on variants associated with gene expression is presented in Supplementary Table 6. No evidence for a haematopoietic effect was associated with the following core genes: rs3811444 (PLT) (*TRIMS8* tripartite motif-containing 58 (0)); rs3792366 (PLT) (*PDIA5* protein disulphide isomerase family A, member 5 (0)); rs10512627 (MPV) (*KALRN* kalirin, RhoGEF kinase (0)); rs11734132 (MPV) (*KIAA0232* (5,628)); rs441460 (PLT) (*LRR1* 64 leucine-rich-repeat containing 16A (0)); rs13300633 (PLT) (*RCL1* RNA terminal phosphate cyclase-like 1 (0)); rs3731211 (PLT) (*CDKN2A* cyclin-dependent kinase inhibitor 2A (0)); rs2950390, rs941207 (MPV, PLT) (*PTGES3* prostaglandin E synthase 3 (cytosolic) (1,871); *BA22A* bromodomain adjacent to zinc finger domain, 2A (0)); rs7961894 (MPV, PLT) (*WDR66* WD repeat domain 66 (0)); rs8076739, rs59972 (MPV, PLT) (*TAOK1* TAO kinase 1 (3,357,0)); rs1697127 (MPV) (*AP281* daptor-related protein complex 2, beta 1 subunit (0)); rs11082304 (PLT) (*CABLES1* Cdk5 and Abl enzyme substrate 1 (0)); rs8109288 (MPV, PLT) (*TPM4* tropomyosin 4 (0)), rs17356664 (PLT) (*EXOC3L2* exocyst complex component 3-like 2 (3,301)); rs2015599 (MPV, PLT) (*TPM4* tropomyosin 4 (0)), rs17356664 (PLT) (*EXOC3L2* exocyst complex 2, 0); rs397969 (PLT) (*AKAP10* A kinase (PRKA) anchor protein 10 (4,506)); rs11789888 (PLT) (BRD3 bromodomain containing 3 (0)).

† Phenotypes are defined from exhaustive search of the OMIM (Online Mendelian Inheritance in Man) database, published *in vitro* studies for humans and knockout and knockdown experiments for model organisms for both core and non-core genes. r<sup>2</sup> values are calculated from the HapMap phase 2 CEU panel. *Drosophila* indicates *Drosophila melanogaster*.

variants, which is currently incomplete. A detailed SNP survey showed that at 15 loci the sentinel SNPs either encoded, or were in high linkage disequilibrium (LD,  $r^2 \ge 0.8$ ) with, a non-synonymous variant (Supplementary Table 5); another 11 either matched or were in high linkage disequilibrium with SNPs associated with expression levels of core genes (or cis-eQTLs, Supplementary Table 6), indicating that other loci may exert their effect through regulation of gene expression<sup>13</sup>. The validation of suggestive causative effects, as well as the identification of more complex interactions involving other genomic loci (trans eQTLs), will require a more comprehensive discovery in appropriately powered genomic data sets.

As a first effort to characterize biological connectivity among the core genes, we applied canonical pathway analyses (see http:// www.ingenuity.com), detecting a highly significant over-representation of core genes in relevant biological functions such as haematological disease, cancer and cell cycle (Supplementary Table 7). Encouraged by these results, we extended this effort to construct a comprehensive network of protein–protein interactions incorporating the core genes. This effort integrated information from public databases (principally Reactome and IntAct) with careful manual revision of published evidence and high-throughput gene expression data. The resulting network, which includes 633 nodes and 827 edges, showed extensive connectivity between the proteins encoded by the core genes with an established functional role in megakaryopoiesis and platelet formation and those encoded by genes hitherto unknown to be implicated in these processes (Fig. 1b).

#### Transcriptional patterns of core genes

We next considered whether this connectivity was also reflected in the regulation of core gene transcription, and whether expression patterns were unique to megakaryocytes. Despite high levels of correlation in gene expression between different blood cell types (median = 0.8; median absolute deviation = 0.1)<sup>14</sup>, we found that core genes tend to have significantly greater expression in megakaryocytes than in the other blood cells  $(P = 7.5 \times 10^{-5})$ , Supplementary Fig. 5a). This observation is compatible with the notion that ultimate steps in blood cell lineage specification are accompanied, or driven, by the emergence of increasing numbers of lineage-specific transcripts. To explore this assumption, we used genome-wide expression arrays to determine changes in global transcript levels during in vitro differentiation of umbilical-cord blood-derived haematopoietic stem cells to precursors of blood cells. We considered five different time points and two cell types, erythroblasts (the precursors of red blood cells) and megakaryocytes. Notwithstanding high levels of correlation of gene expression between erythroblasts and megakaryocytes<sup>14</sup>, core gene transcripts showed a significant increase over time in megakaryocytes ( $P = 1.5 \times 10^{-6}$ ) but not in erythroblasts (P = 0.77, Fig. 1c, d; see also Supplementary Fig. 5b). Taken together, these patterns of core gene expression are consistent with a different regulation of their transcription in

megakaryocytes versus erythroblasts, and with their centrality in megakaryopoiesis and platelet formation. This hypothesis is also consistent with the observation that only 5 of the 68 sentinel SNPs exert a significant effect on erythrocyte parameters (*HBS1L-MYB*, *RCL1*, *SH2B3*, *TRIM58* and *TMCC2*, Supplementary Table 8).

#### Gene silencing in model organisms

To assess whether core genes are indeed implicated in haematopoiesis, we interrogated the function of 15 genes using gene silencing in D. rerio and D. melanogaster, and supported empirical data with published evidence on knockout models in M. musculus (Table 2 and Supplementary Table 4). In D. rerio, we applied morpholino constructs to silence the expression of six genes (Fig. 2 and Supplementary Fig. 6) selected to have >50% homology with the human counterpart and no previous evidence of involvement in haematopoiesis. Silencing of four genes in D. rerio (arhgef3, ak3, rnf145, jmjd1c) resulted in the ablation of both primitive erythropoiesis and thrombocyte formation. Silencing of *tpma*, the orthologue of *TPM1* that is transcribed in megakaryocytes but not in other blood cells, abolished the formation of thrombocytes but not of erythrocytes. Silencing of ehd3 did not yield a haematopoietic phenotype. We also screened D. melanogaster RNA interference (RNAi) knockdown lines for quantitative alterations in the two most prevalent classes of blood elements: plasmatocytes and crystal cells. The repertoire of blood cells in D. melanogaster, consisting of about 95% plasmatocytes and 5% crystal cells, is less varied than in vertebrates. Transcription factors and signalling pathways regulating haematopoiesis have, however, been conserved throughout evolution<sup>15</sup>, making the RNAi knockdown studies a relevant first step towards a better understanding of the putative role of these GWAS genes in haematopoiesis. Four core-gene D. melanogaster lines (shibire (DNM), ush (ZFPM2), rpn9 (PSMD13), Brf (BRF1)), as well as five others (sun (ATP5E), CG3704 (XAB1), Su(var)205 (CBX5), dve (SATB1) and RpL6 (RPL6)), displayed highly reproducible differences in the numbers of these two cell types (Table 2 and Supplementary Table 4). Despite widespread differences between mammalian and insect haematopoietic lineages<sup>16</sup>, our findings from *D. melanogaster* provide new and supporting examples of functional conservation in the control of blood cell formation in invertebrates and vertebrates<sup>17-19</sup>.

#### New gene and functional discoveries

The data from studies in *D. rerio* by us and in *M. musculus* by others (see Supplementary Table 4) provided proof-of-concept evidence that our prioritization strategy is appropriate for selecting novel genes controlling thrombopoiesis and megakaryopoiesis, respectively. More detailed insights and additional implicated genes will be revealed through the systematic silencing of all genes in the associated regions. For instance, RNAi knockdown of *dve* in *D. melanogaster* reduces plasmatocyte numbers and increases the number of crystal cells, thus providing supporting evidence that its non-core gene

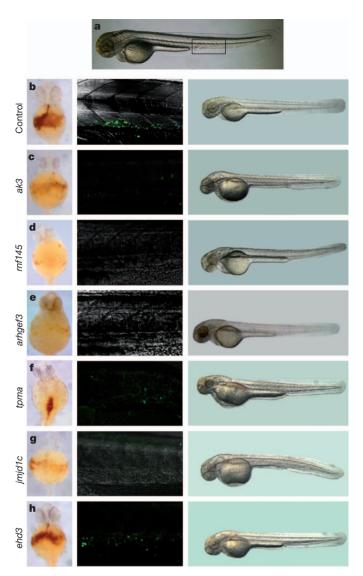


Figure 2 | Functional assessment of novel loci in D. rerio. Gene-specific morpholinos were injected into wild-type and Tg(cd41:EGFP) embryos at the one cell stage (Supplementary Fig. 6) to assess alterations in erythropoiesis and thrombopoiesis. a, Control D. rerio embryo at 72 h post fertilization (h.p.f.); the boxed region corresponds to images in the middle panels of b-h. b-h, Left: o-dianisidine staining was used to assess the number of mature erythrocytes at 48 h.p.f.: ehd3 (h) morpholino-injected embryos showed normal haemoglobin staining, whereas embryos injected with ak3 (c), rnf145 (d), arhgef3 (e) or jmjd1c (g) morpholinos showed a decrease in the number of haemoglobinpositive cells compared to control embryos (b). Embryos injected with tpma morpholinos (f) showed normal numbers of erythrocytes but unusual accumulation dorsally in the blood vessels (compatible with cardiomyopathy). Middle: haematopoietic stem-cell and thrombocyte development was assessed using the transgenic Tg(cd41:EGFP) line at 72 h.p.f. Embryos injected with the ehd3 (h) morpholino had a normal number of GFP<sup>+</sup> cells in the caudal haematopoietic tissue and circulation, when compared to control embryos (b). However, GFP<sup>+</sup> cells were absent in ak3 (c), rnf145 (d), arhgef3 (e), tpma (f) and *jmjd1c* (g) morpholino-injected embryos. Right: One-cell-stage embryos were injected with the standard control morpholino (b) or genespecific morpholino (c-h) and monitored during development. No gross lethality or developmental abnormalities were observed at 72 h.p.f. in genespecific morpholino-injected embryos (c-h) compared with the control (b). a and middle and right panels of b-h, lateral view, anterior left; left panels of b-e, g, h, ventral view, anterior up; left panel of f, dorsal view, anterior up. The genes appear to be nonspecifically expressed during embryogenesis as shown by patterns deposited in the ZFIN resource (http://zfin.org).

human homologue SATB1 should be prioritized in functional studies. However, the results of the knockdown study in *D. rerio* do not clarify at which hierarchical positions in thrombopoiesis and erythropoiesis the genes exert their effect, requiring further assessment in conditional knockout models in M. musculus with lineage-specific regulation of gene transcription. Nevertheless, our results have already allowed novel insights into the genetic control of these processes. Signalling cascades initiated by thrombopoietin (THPO) and its receptor cMPL via the JAK2/STAT3/5A signalling pathway are key regulatory steps initiating changes in gene expression responsible for driving forward megakaryocyte differentiation<sup>20</sup>. Our study highlights several additional signalling proteins implicating potentially important novel regulatory routes. For instance, two genes encoding guanine nucleotide exchange factors (DOCK8 and ARHGEF3) were identified. Mendelian mutations of the former are causative of the hyper-IgE syndrome, but its effect on platelets had not yet been identified. The silencing of the latter gene in D. rerio resulted in a profound haematopoietic phenotype characterized by a complete ablation of both primitive erythropoiesis and thrombocyte formation, demonstrating its novel regulatory role in myeloid differentiation. In a parallel and in-depth study we demonstrated its novel role in the regulation of iron uptake and erythroid cell maturation<sup>21</sup>. A second class of genes also known to critically control early and late events of megakaryopoiesis are transcription factors. For instance, MYB silencing by microRNA 150 determines the definitive commitment of the megakaryocyte-erythroblast precursor to the megakaryocytic lineage<sup>15</sup>. A further 10 core genes identified in this study are implicated in the regulation of transcription. Among these, we have demonstrated here that silencing of *rnf145* and *jmjd1c* in *D. rerio* severely affects both lineages.

In conclusion, this highly powered study describes a catalogue of known and novel genes associated with key haematopoietic processes in humans, providing an additional example of GWAS leading to biological discoveries. We further showed that for a large proportion of these known and new genes, functional support is achieved from model organisms and by overlap with genes implicated in inherited Mendelian disorders and in human cancers because of acquired mutations. In-depth functional studies and comparative analyses will be necessary to characterize the precise mechanisms by which these new genes and variants affect haematopoiesis, megakaryopoiesis and platelet formation. Furthermore, we provide extensive new resources, most notably a freely accessible knowledge base embedded in the novel protein-protein interaction network, with information about the identified platelet genes being implicated in Mendelian disorders and results from gene-silencing studies in model organisms. We anticipate that these resources will help to advance megakaryopoiesis research, to address key questions in blood stem-cell biology and to propose new targets for the treatment of haematological disorders. Finally, MPV has been associated with the risk of myocardial infarction<sup>22,23</sup>. The contribution of the new loci to the aetiology of acute myocardial infarction events will require assessment in a prospective setting.

#### **METHODS SUMMARY**

A summary of the methods can be found in Supplementary Information and includes detailed information on: study populations; blood biochemistry measurements; genotyping methods and quality control filters; genome-wide association and meta-analysis methods; gene prioritization strategies for functional assessment and network construction; protein–protein interaction network; *in vitro* differentiation of blood cells; experimental data sets and analytical methods for gene expression analysis; zebrafish morpholino knockdown generation; assessment of other model organism resources.

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# **Supplementary Information** is linked to the online version of the paper at www.nature.com/nature.

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