

**Genome-wide rare variant analysis for thousands of phenotypes in
over 70,000 exomes from two cohorts**

Cirulli et al.

Supplementary note

Additional analysis methods

Gene-based collapsing analysis utilizing CADD scores

In addition to our LoF and coding models, we also tried two different collapsing models, both of which restricted to rare ($\text{MAF} < 0.1\%$) variants with a CADD score above the 95% mutation significance cutoff (MSC) for its gene¹⁻³. The inclusive CADD model collapsed all such variants that were within 5kb of a gene, and the restrictive CADD model only collapsed coding variants (stop_lost, missense_variant, start_lost, splice_donor_variant, inframe_deletion, frameshift_variant, splice_acceptor_variant, stop_gained, or inframe_insertion) that met these criteria.

In our initial analysis performing BOLT-LMM analysis on European ancestry individuals in the UKB cohort, we identified 17 significant associations ($p < 3.4 \times 10^{-10}$) in the inclusive CADD model and 26 in the restrictive CADD model. All of these associations were also statistically significant in the European ancestry BOLT-LMM meta-analysis coding or LoF models used in the main paper. In contrast, nearly half of the significant results from the main UKB European ancestry BOLT-LMM coding and LoF models were not found among the significant CADD model associations. Because these additional models did not provide new insights, we did not include these analysis results in the main manuscript.

SKAT analysis

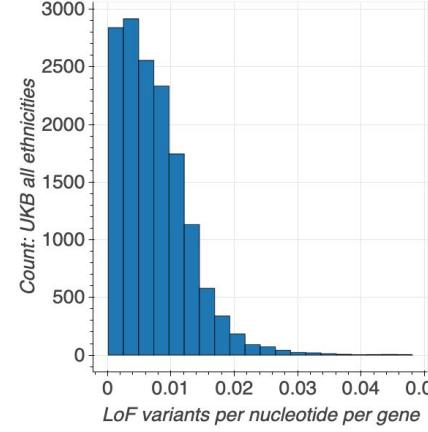
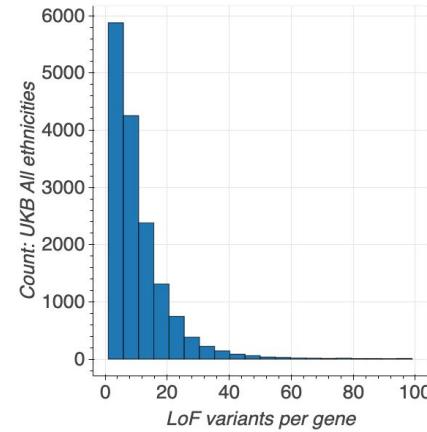
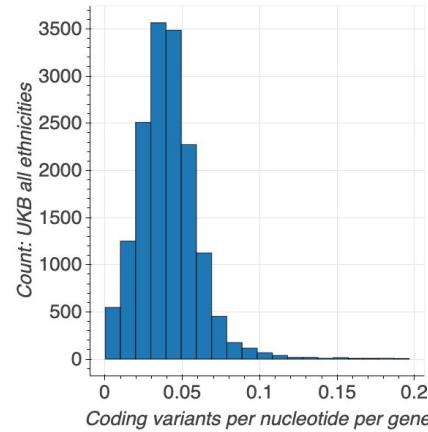
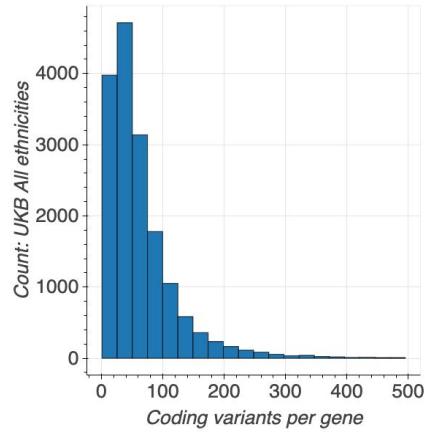
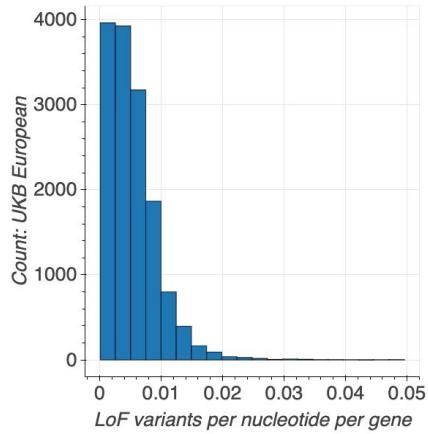
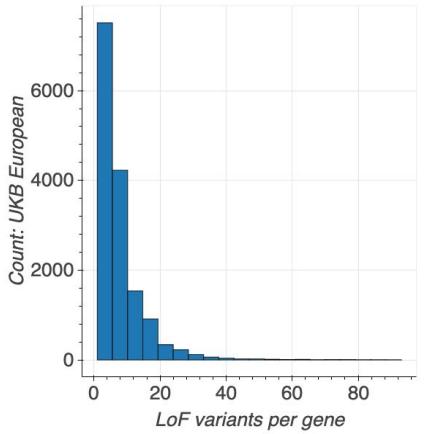
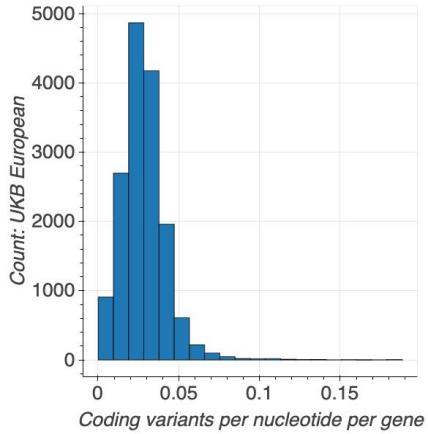
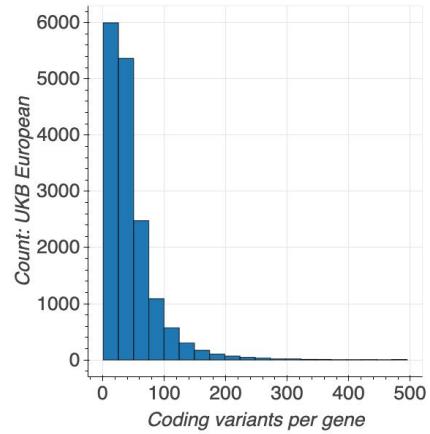
We also performed a gene-based SKAT analysis of the unrelated European ancestry individuals⁴. We performed this analysis in Hail, with accuracy set at 1×10^{-11} and 1×10^9 iterations and using age, sex, and 10 European-specific principal components as covariates⁵. We used two models: a basic SKAT model with weights based on beta (1,25) of the MAF and using the same set of coding variants from our main gene-based collapsing analysis (MAF model); and a SKAT model with weights of beta (1,25) x Phred-scaled CADD score that used all coding variants with $\text{MAF} < 0.1\%$ (MAF-CADD model). The MAF-CADD model included 2,000,908 variants for the UKB cohort and 1,427,500 for the HNP, approximately twice as many as the MAF model.

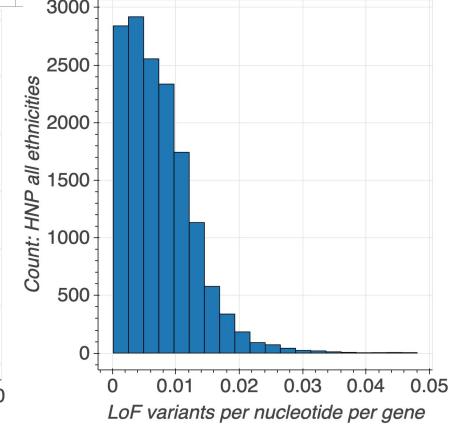
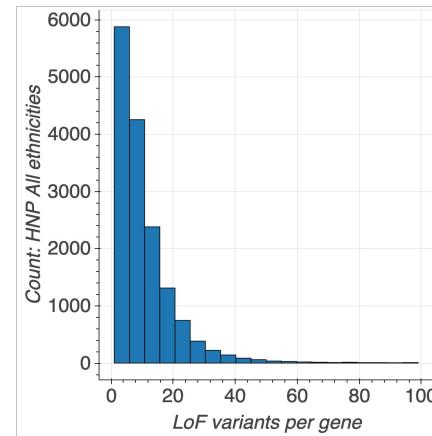
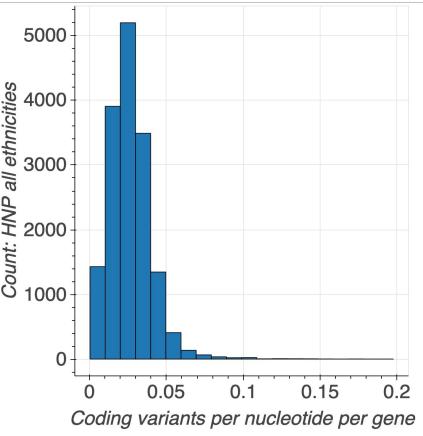
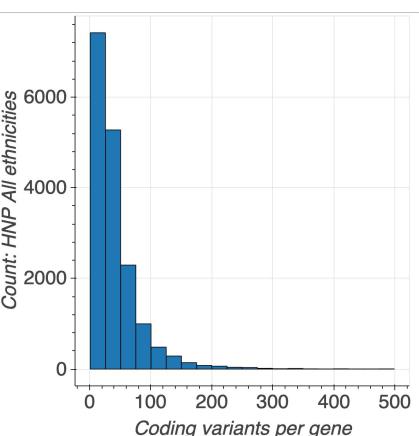
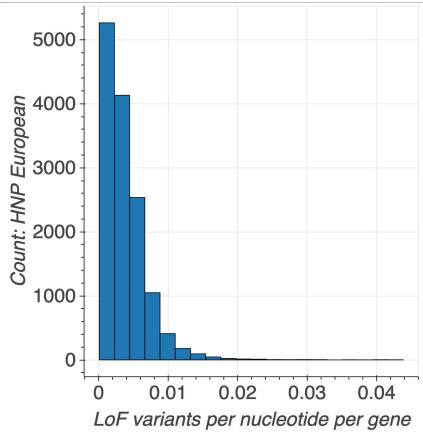
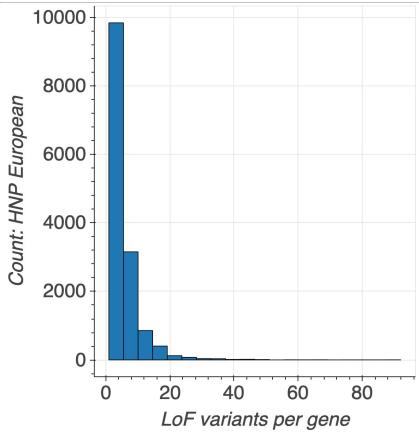
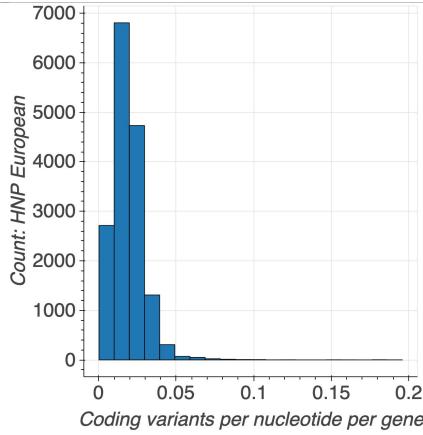
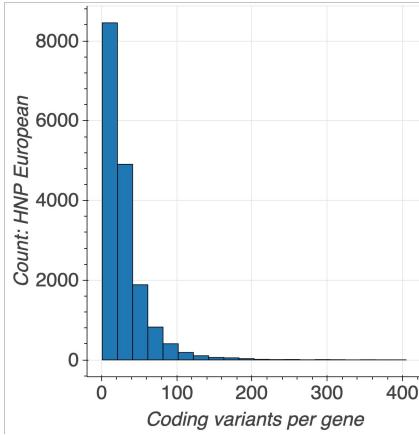
We started with the set of unrelated European ancestry individuals from the UKB cohort as a discovery set. We ran the full set of 4,264 phenotypes and restricted to results where at least five individuals were variant carriers for quantitative traits, or five expected case carriers based on the overall prevalence for binary traits. We ran linear regression for quantitative traits and logistic regression for binary traits. We identified 464 statistically significant results ($p < 3.4 \times 10^{-10}$) for the MAF model and 1,331 for the MAF-CADD model. Of these, 235 and 778 respectively had data available for replication in the HNP cohort. When we attempted to replicate the findings, we found that respectively only 8.1% of the 8.6% associations generated a statistically significant result ($p < 0.0002$, Bonferroni correction for 235 tests, and $p < 6.4 \times 10^{-5}$, correction for 788 tests). This is in contrast to 46% formal replication in our main gene-based collapsing

analysis, as described in the main text. Furthermore, if we chose a more lenient replication p-value cutoff that would confirm at least the suggestion of replication ($p<0.05$), we found that respectively only 24.2% and 24.4% of associations replicated, compared to 82% in our main gene-based collapsing analysis as described in the main manuscript. In our main gene-based collapsing analysis, 100% of signals showed at least the same direction of effect in the replication cohort, but this statistic cannot be analyzed in the context of a SKAT analysis as there is no main direction of effect provided.

Even when we were more stringent about which SKAT analyses to include as significant, the replication rate was very low. For example, when we required the significant binary associations to have at least 10 expected case carriers based on the overall frequency, for the MAF model, only 25% of the 32 eligible associations replicated ($p<0.0015$, correction for 32 tests), and only 34% had uncorrected $p<0.05$. For the MAF-CADD model, only 7.3% of the 82 eligible associations replicated ($p<0.0006$, correction for 82 tests), and only 24.4% had uncorrected $p<0.05$.

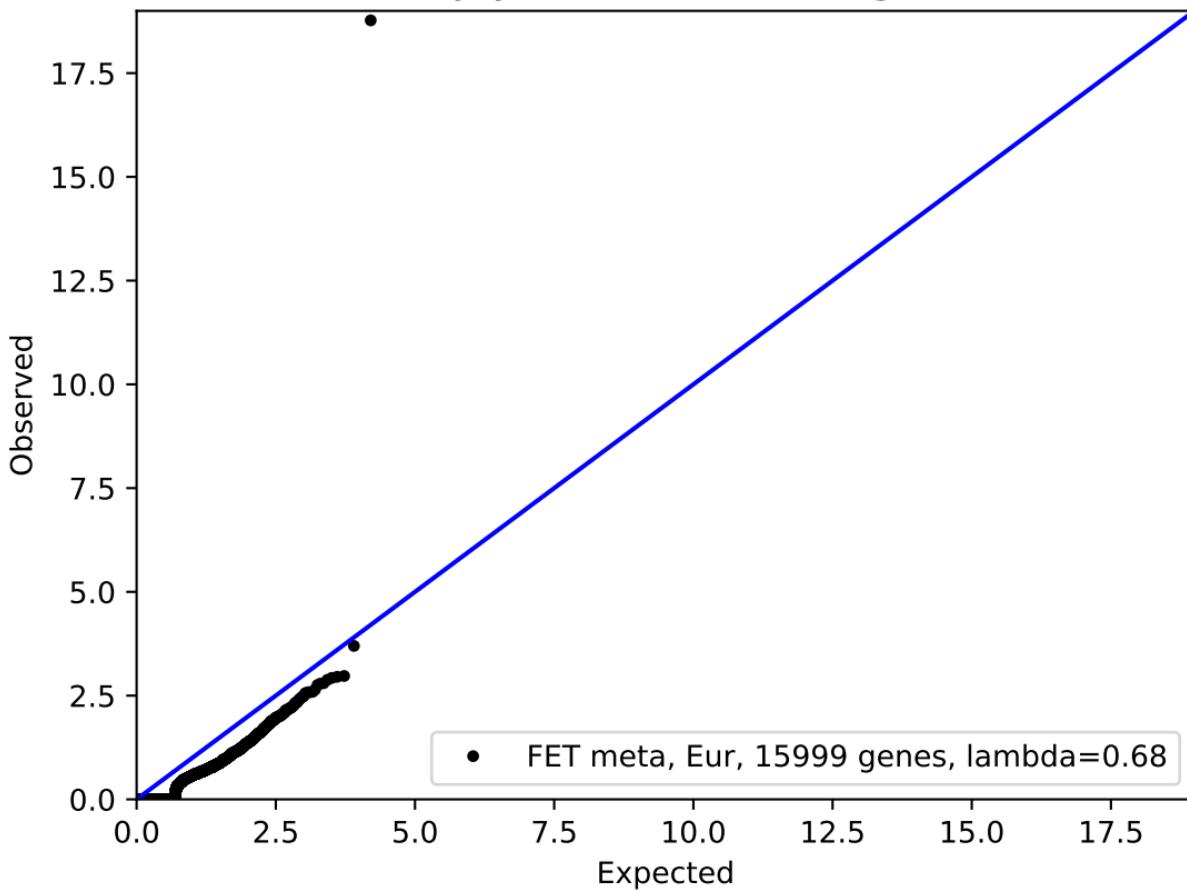
Our results coincide with a number of previous studies documenting that the results of SKAT analyses in real-world datasets can often be noisy and difficult to interpret^{6,7}. Given these difficulties, we did not include these analysis results in our main manuscript.



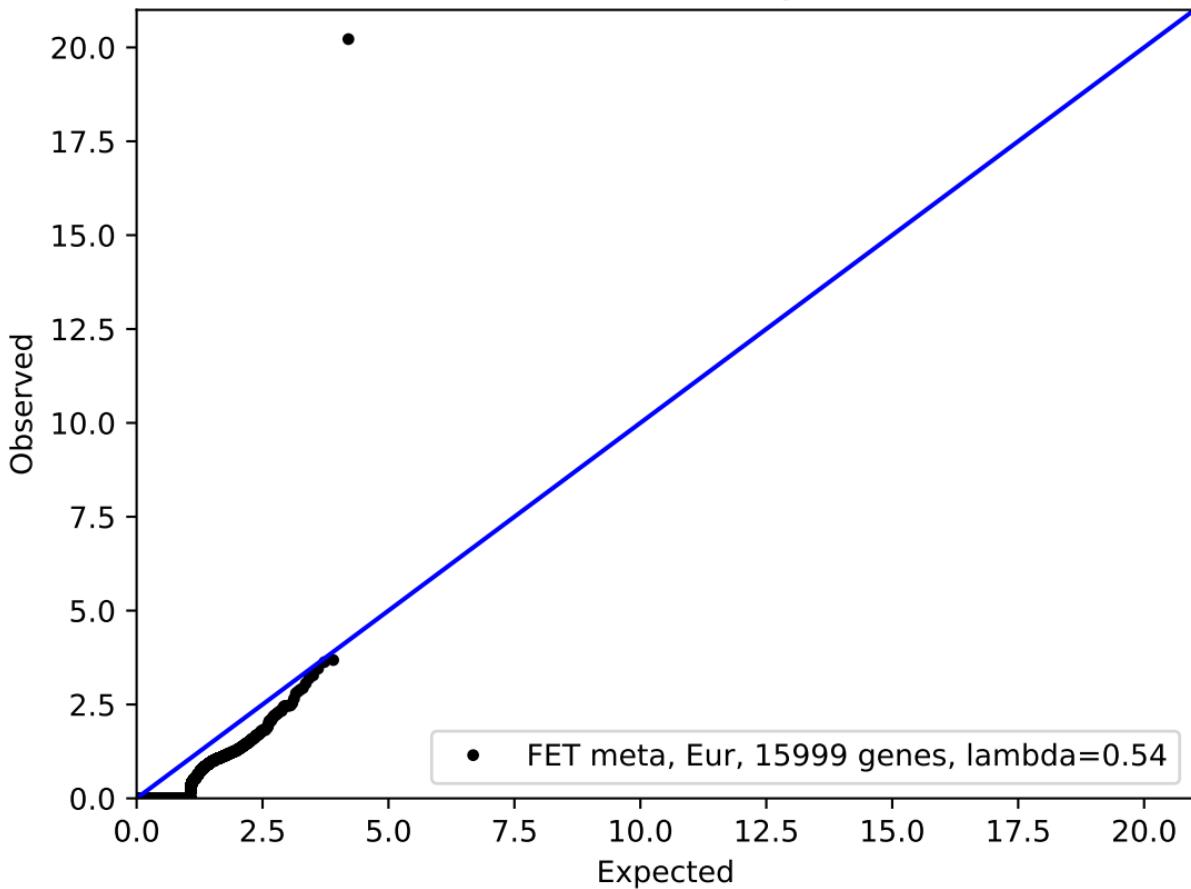


Supplementary Figure 1. Histograms of number of qualifying variants per gene. Each histogram is labeled to indicate whether it is UKB or HNP cohort, European ancestry only or all ancestries, coding or LoF model, and number of qualifying variants per gene or number of qualifying variants per coding nucleotide of each gene. Between 1 and 42 genes were excluded from each plot as they were out of range.

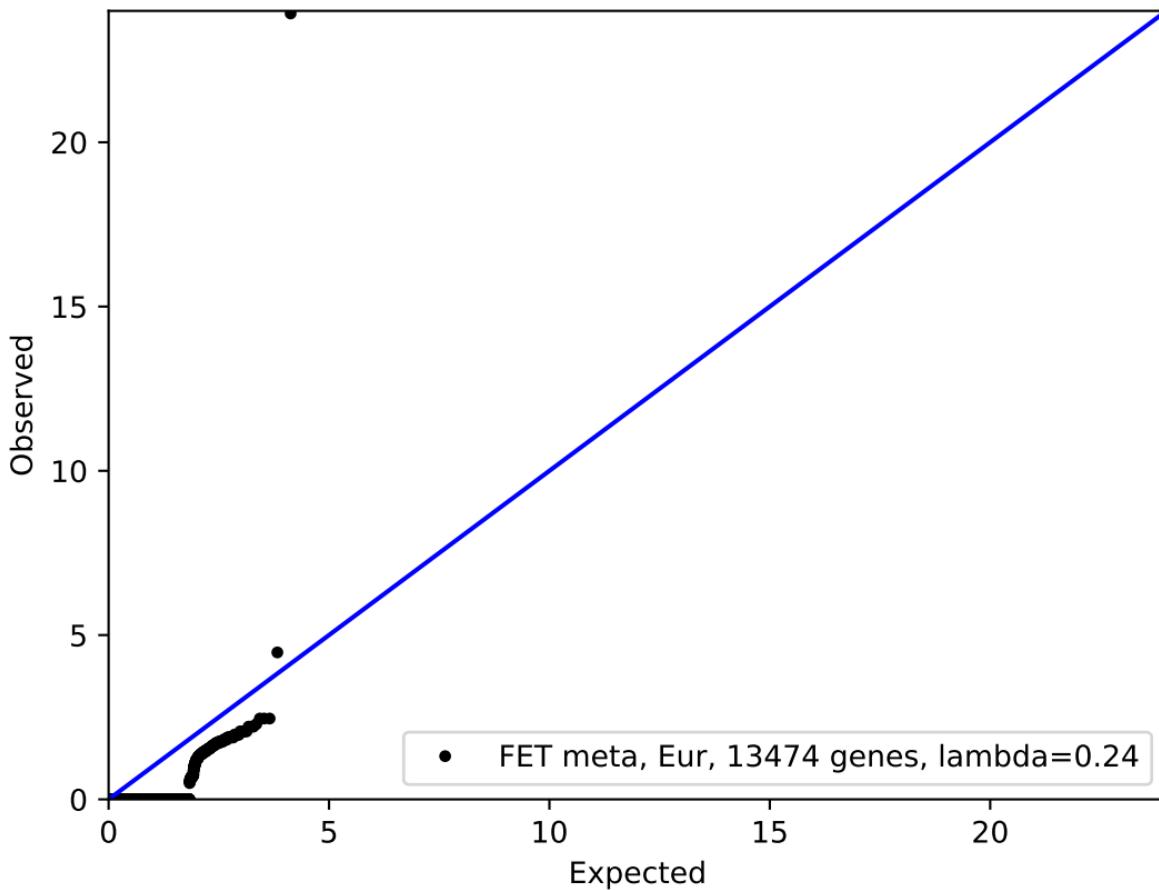
D45 Polycythaemia vera; coding model



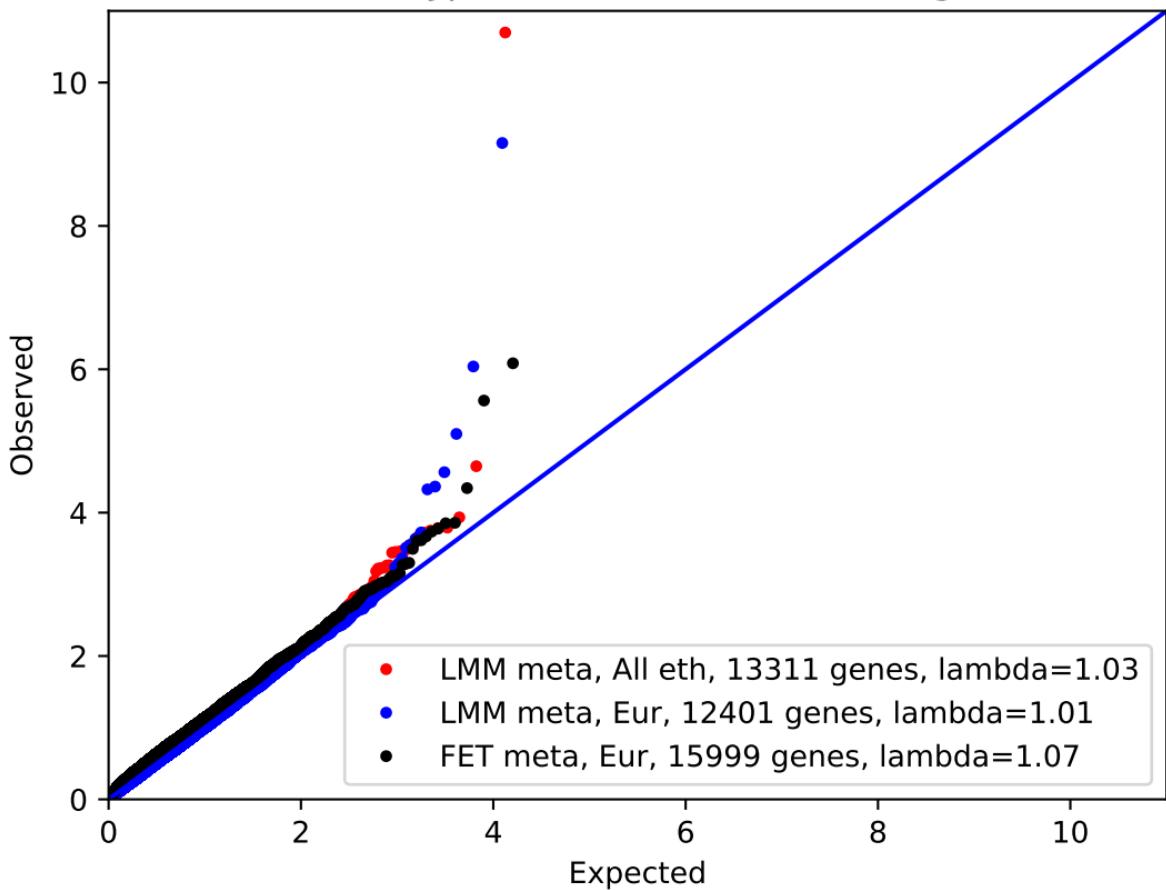
Thalassaemia; coding model



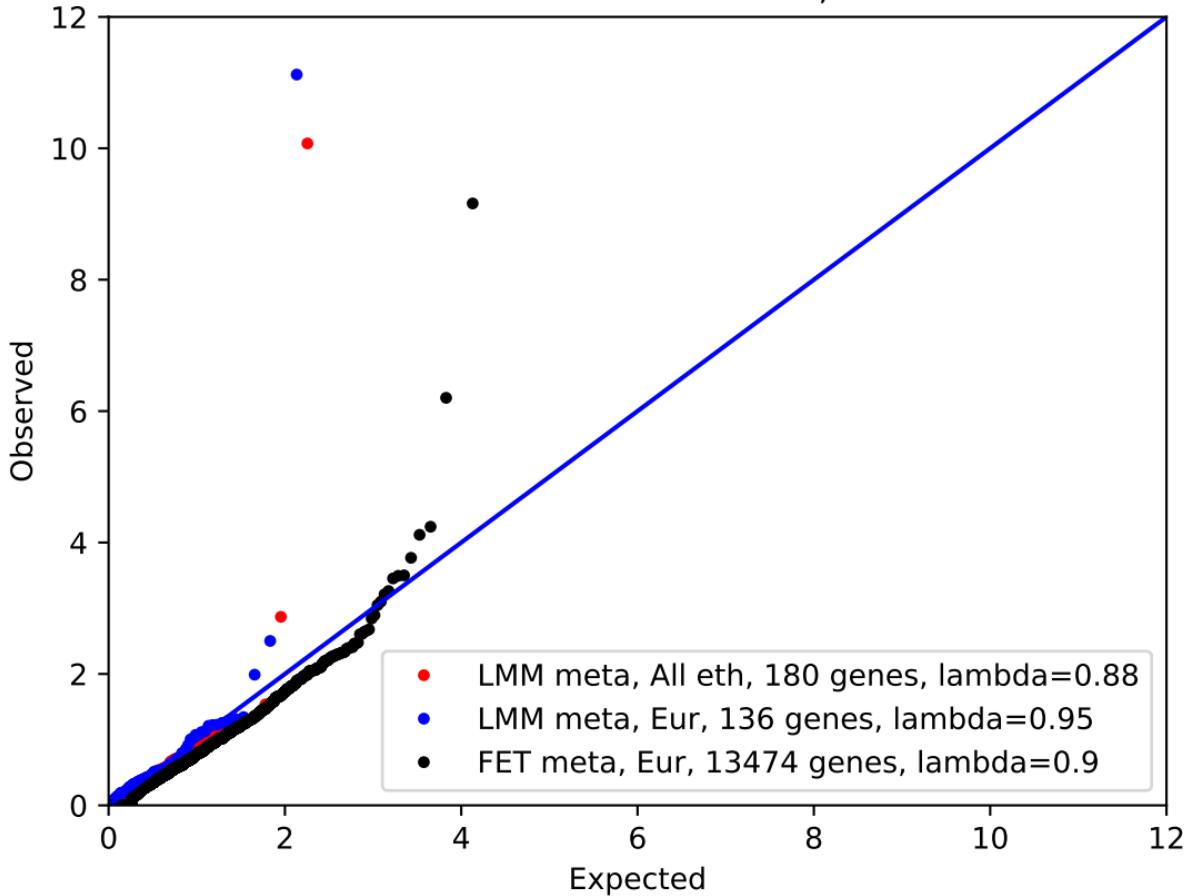
Thalassaemia; lof model



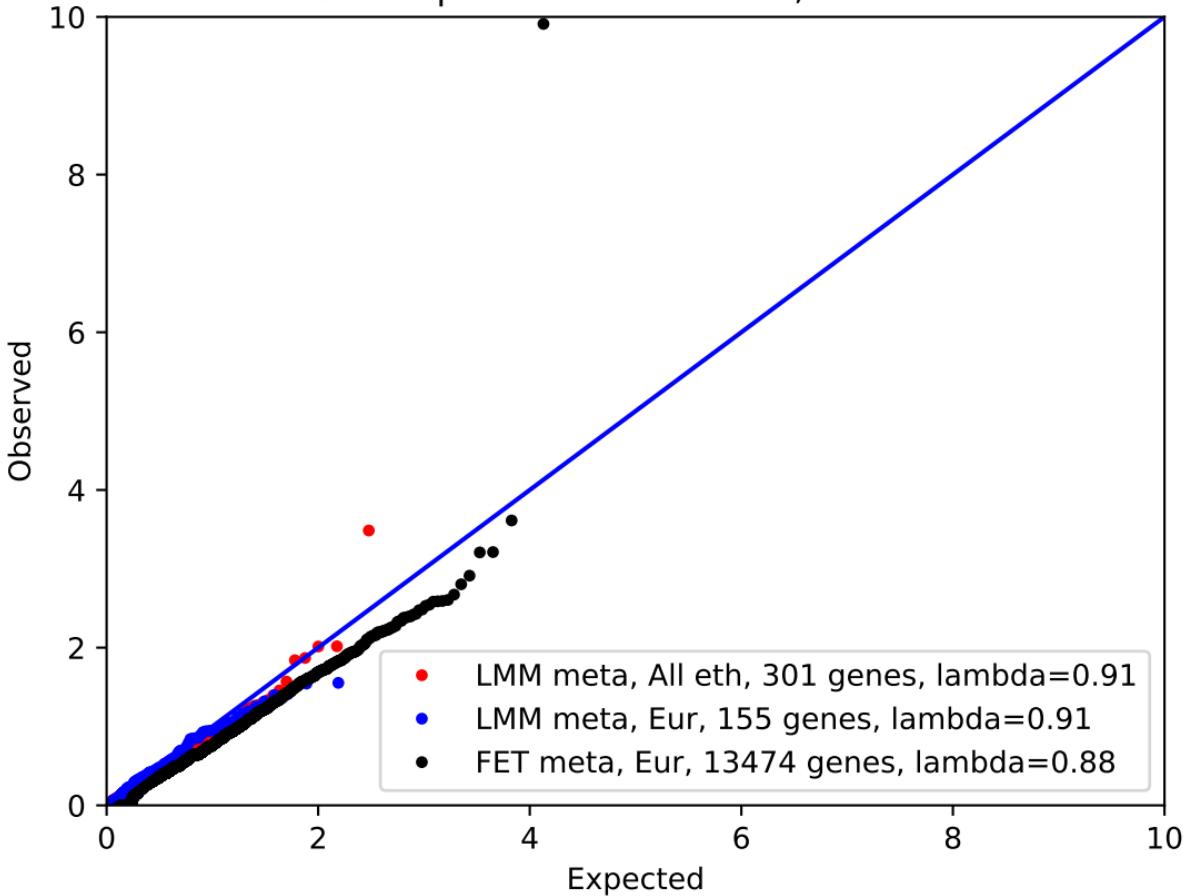
E78.0 Pure hypercholesterolaemia; coding model



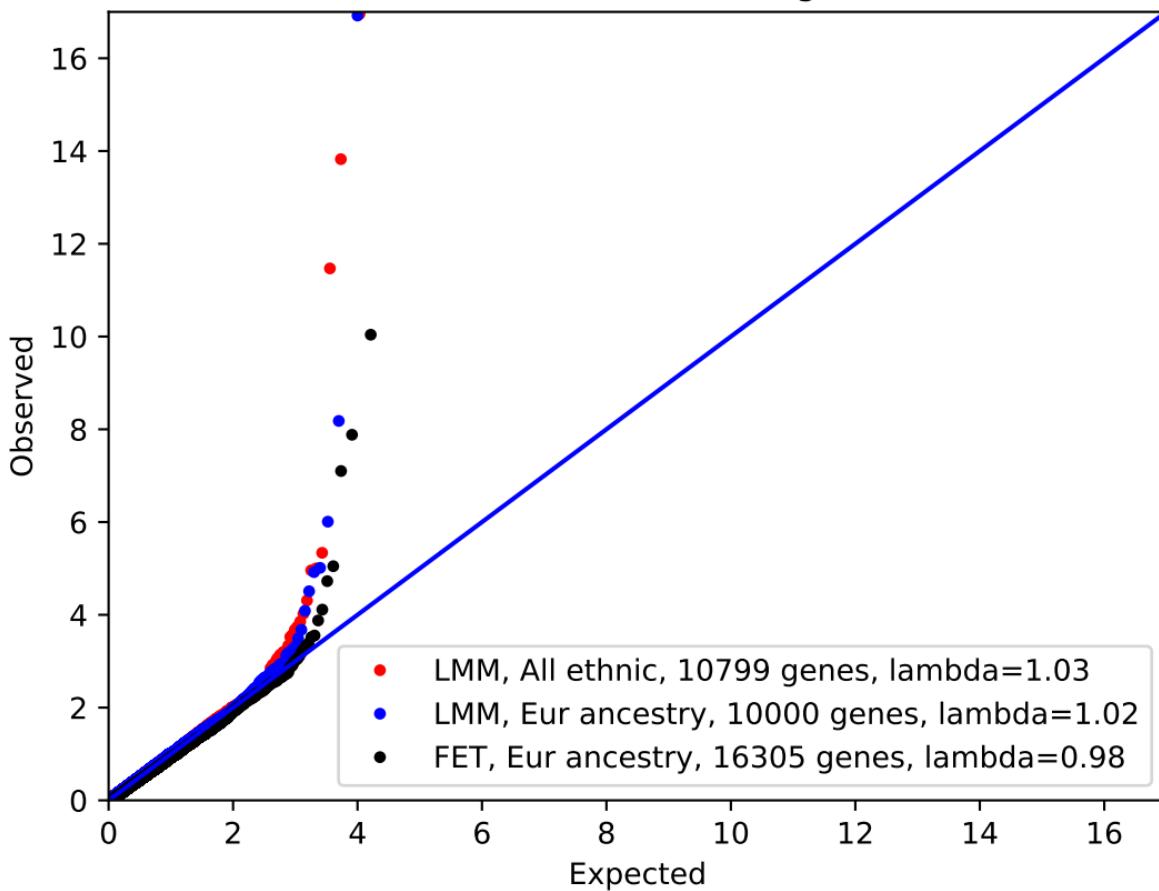
I48 Atrial fibrillation and flutter; lof model



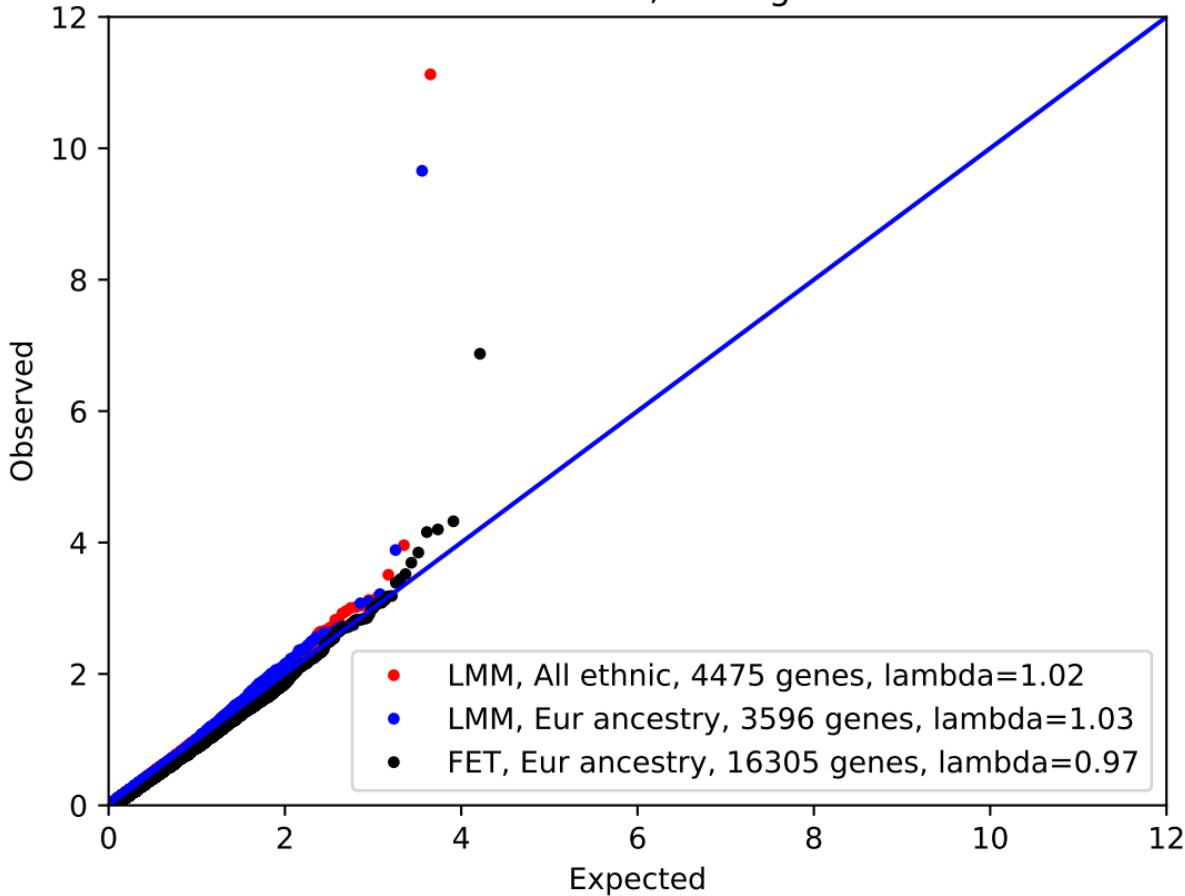
R31 Unspecified haematuria; lof model



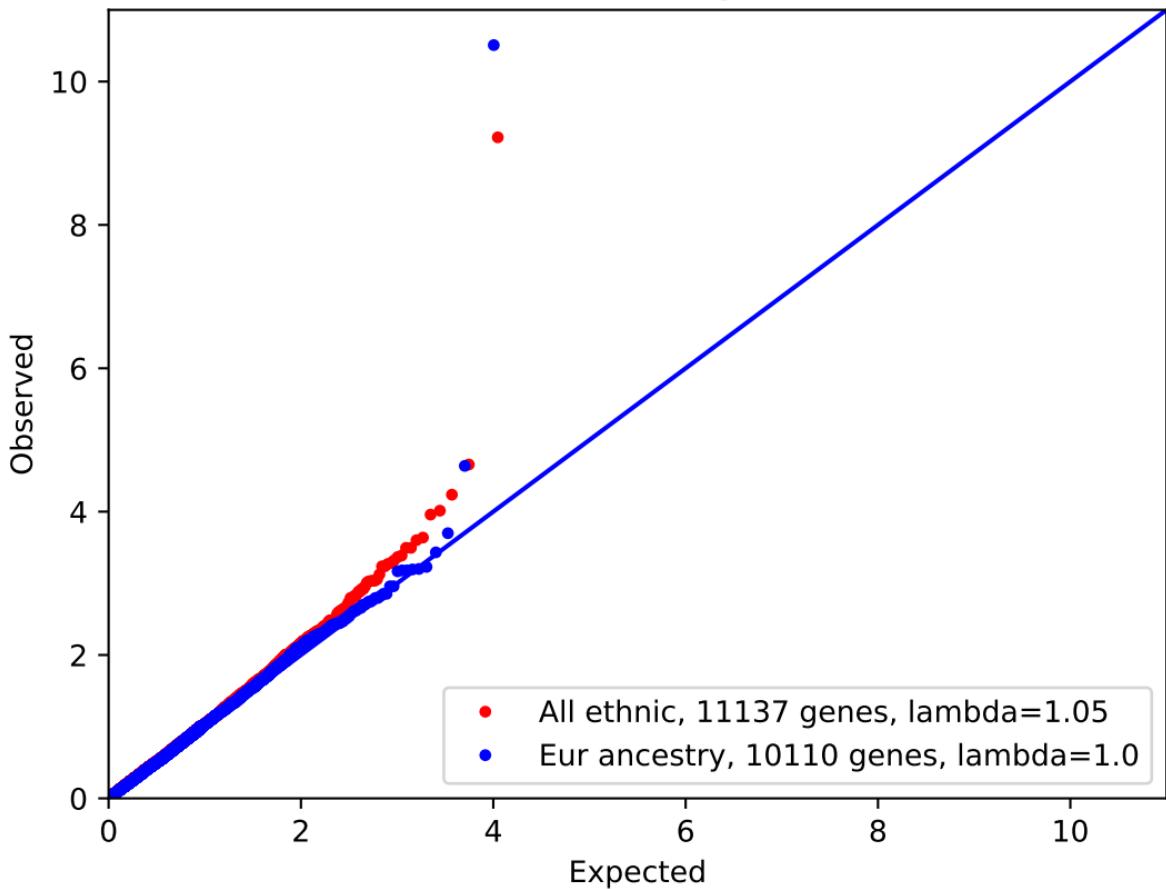
Hair colour: Blonde; coding model



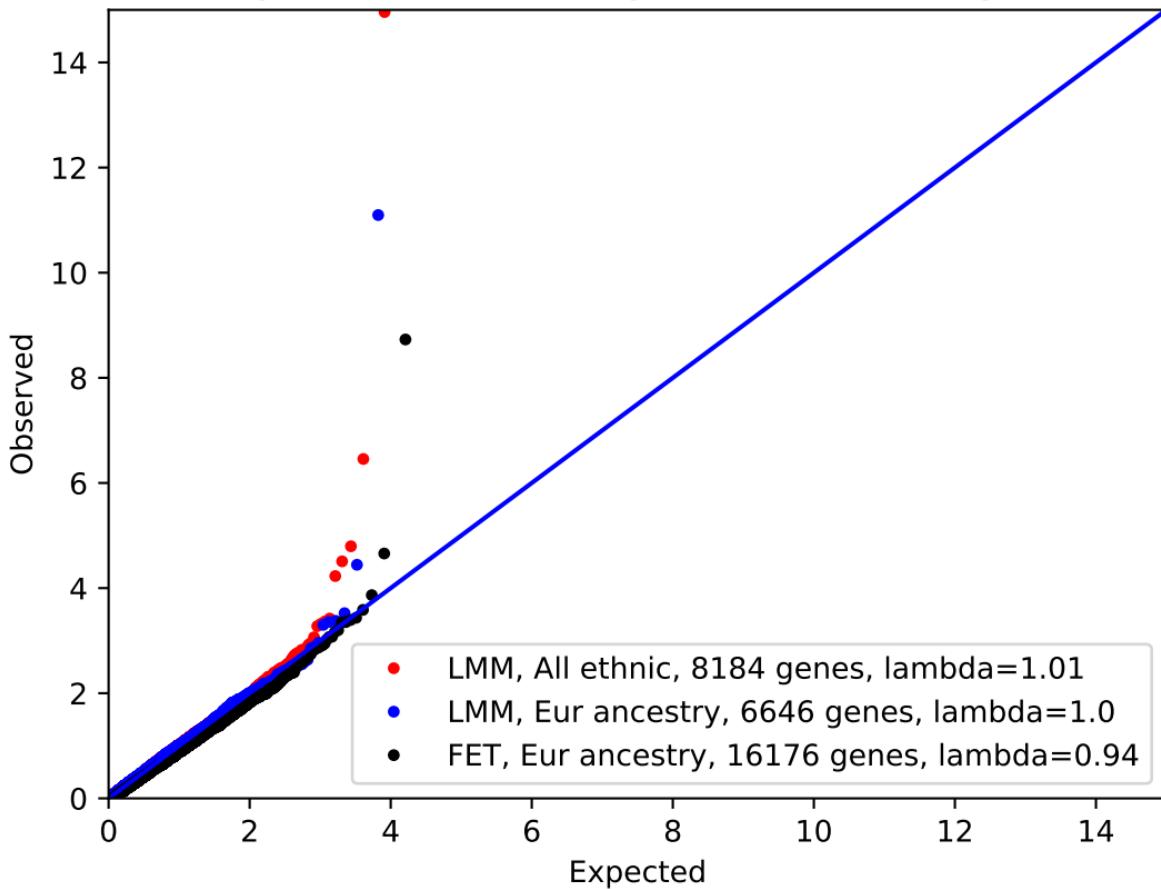
Hair colour: Red; coding model



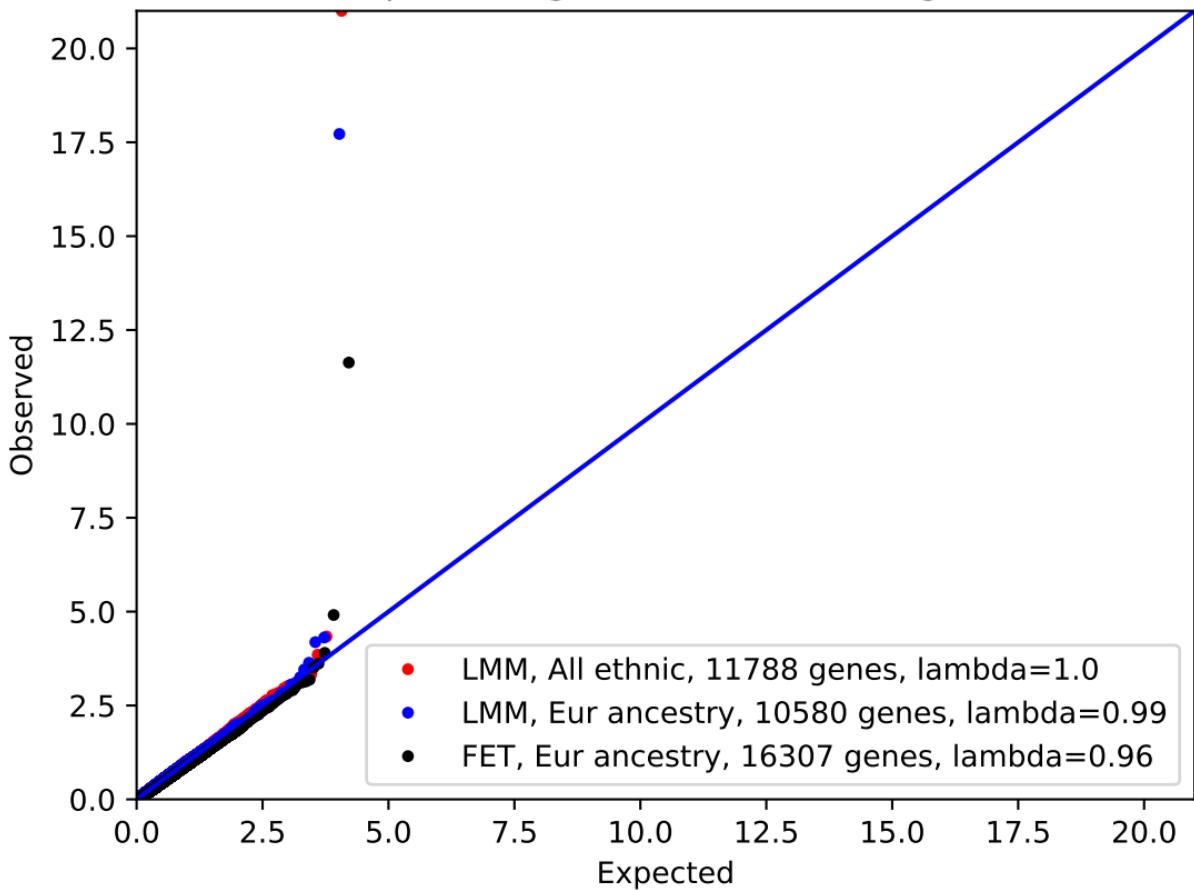
6mm weak meridian (right); lof model



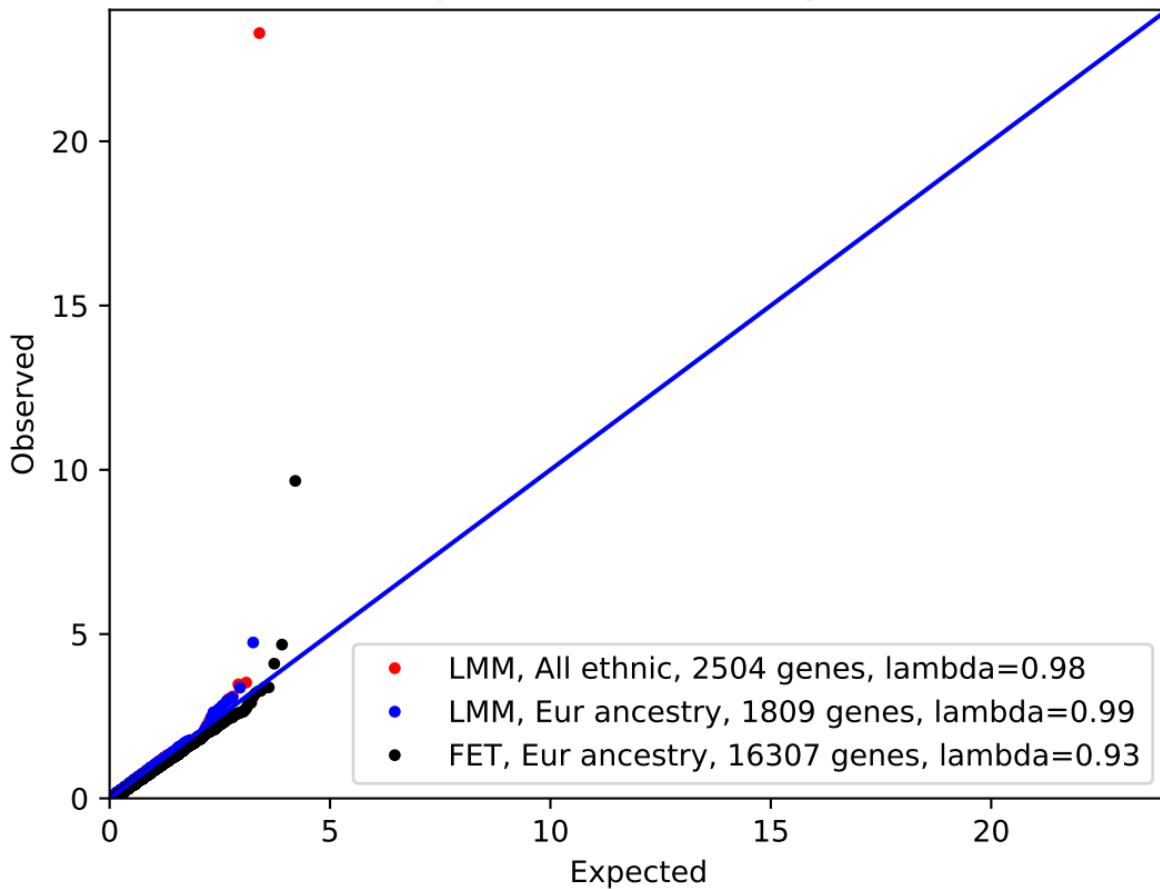
Taking cholesterol lowering medication; coding model



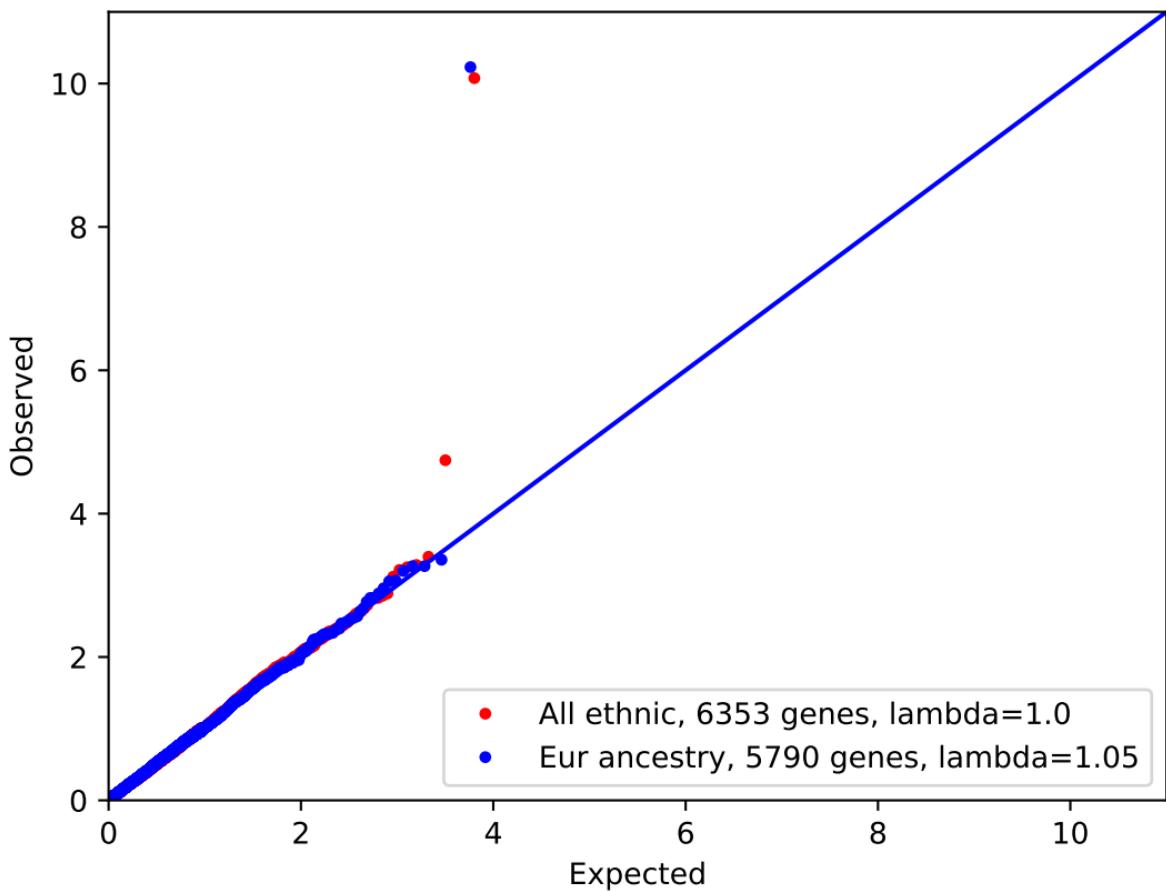
Self-reported high cholesterol; coding model



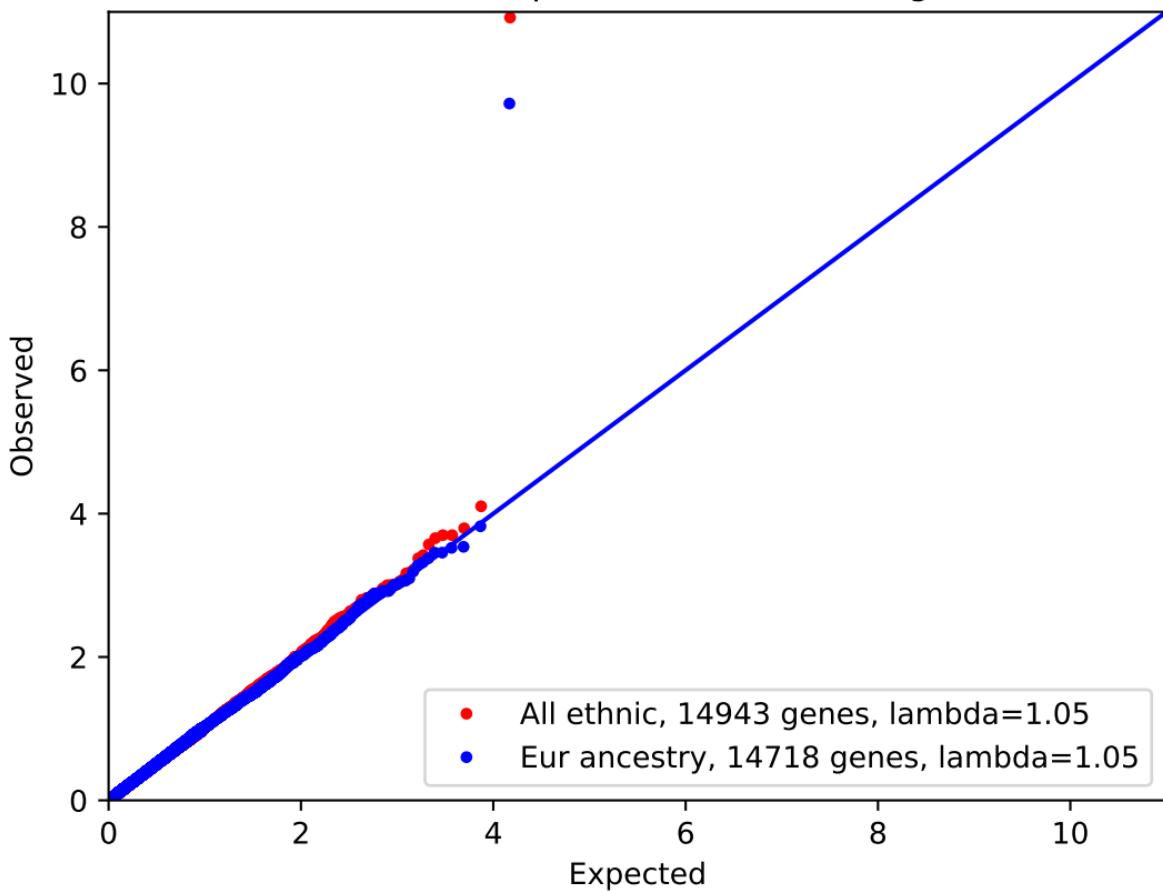
Taking atorvastatin; coding model



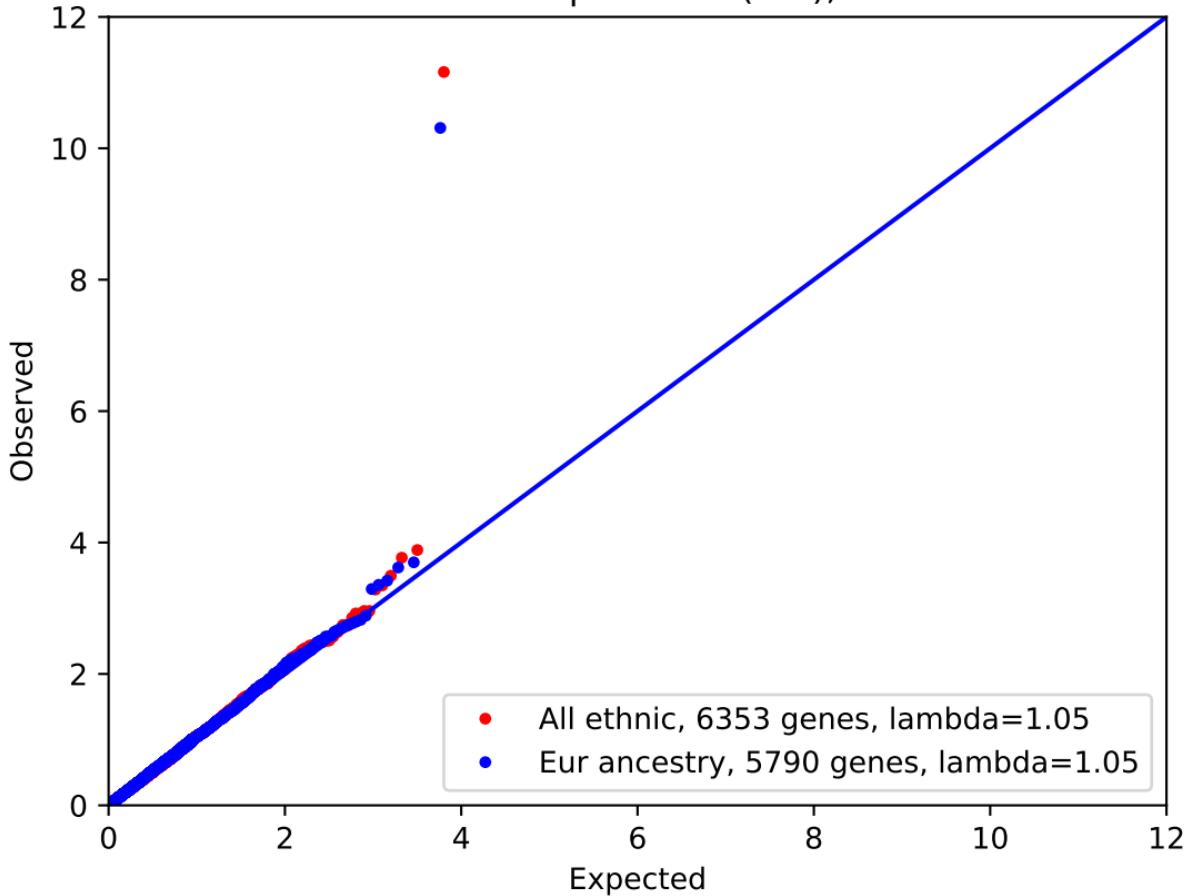
Median T2star in caudate (left); lof model



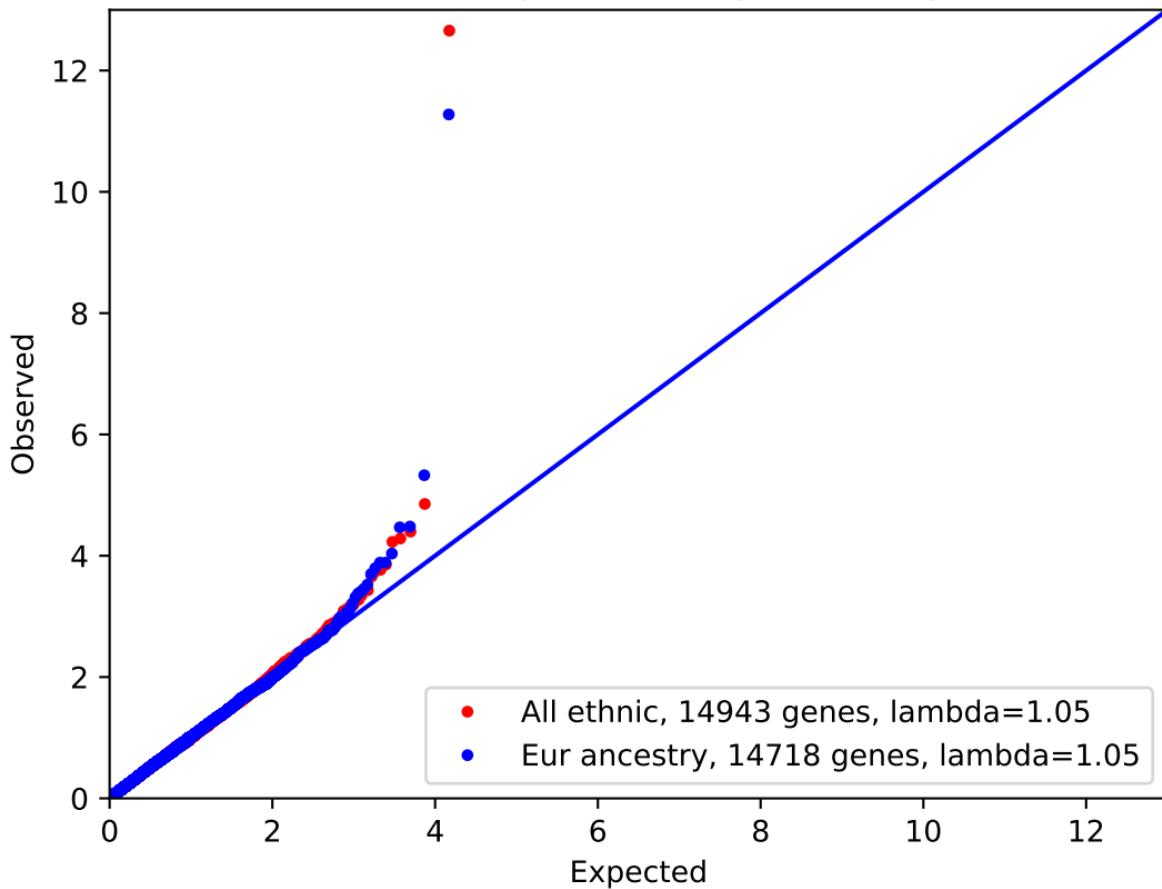
Median T2star in putamen (left); coding model



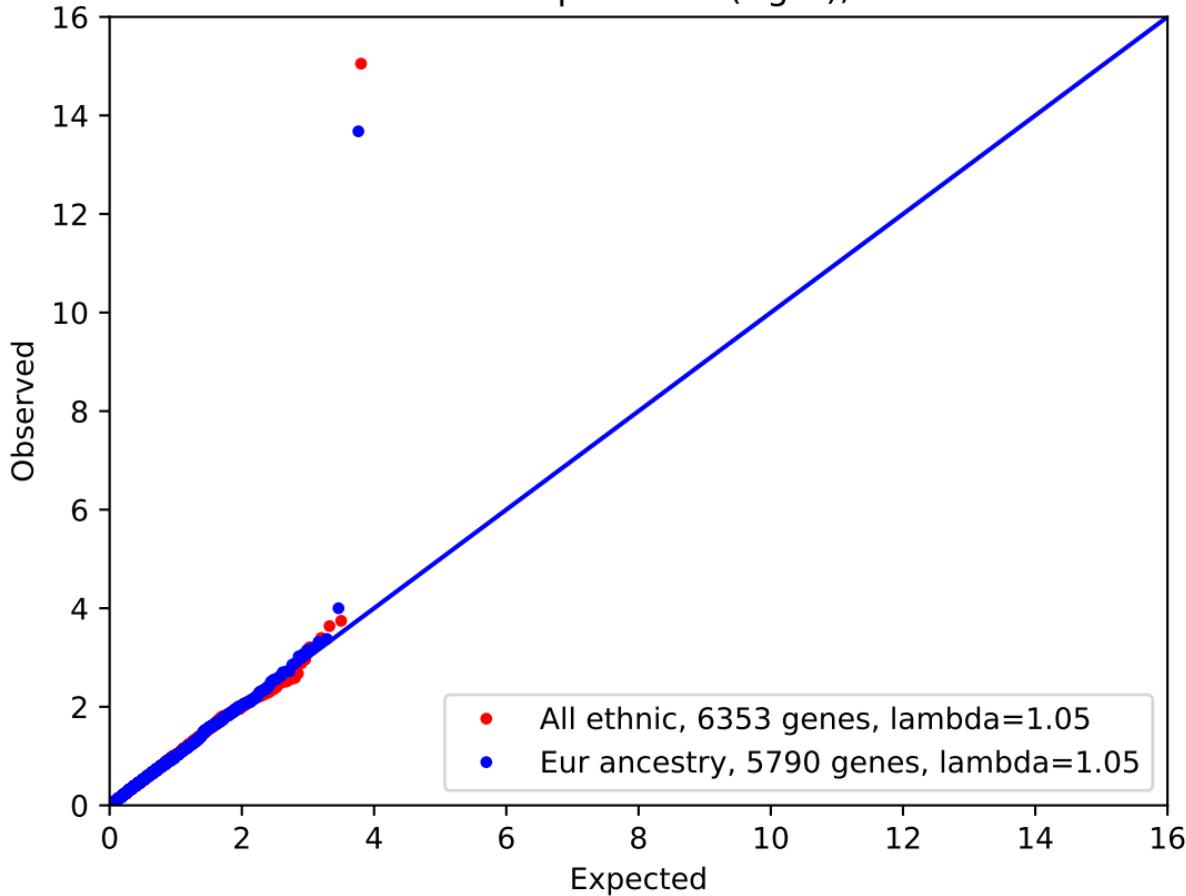
Median T2star in putamen (left); lof model



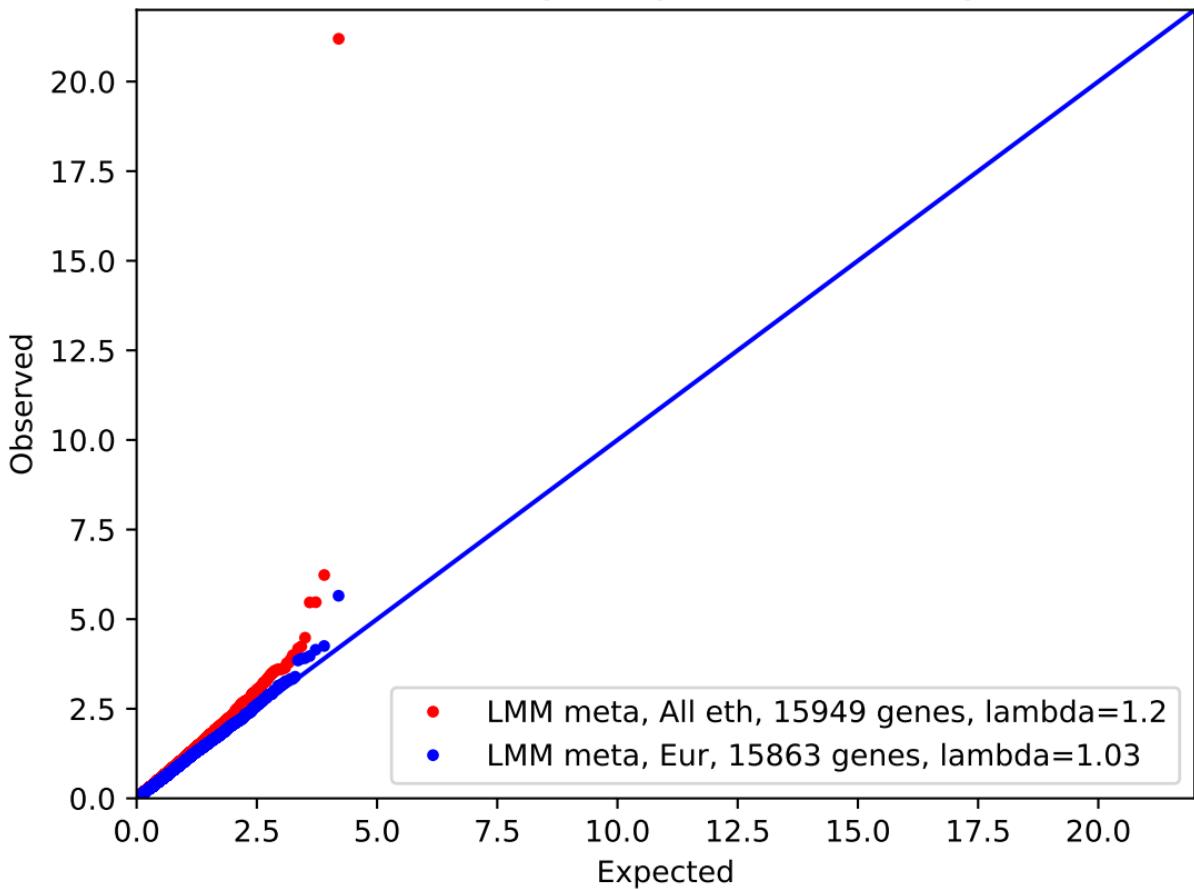
Median T2star in putamen (right); coding model



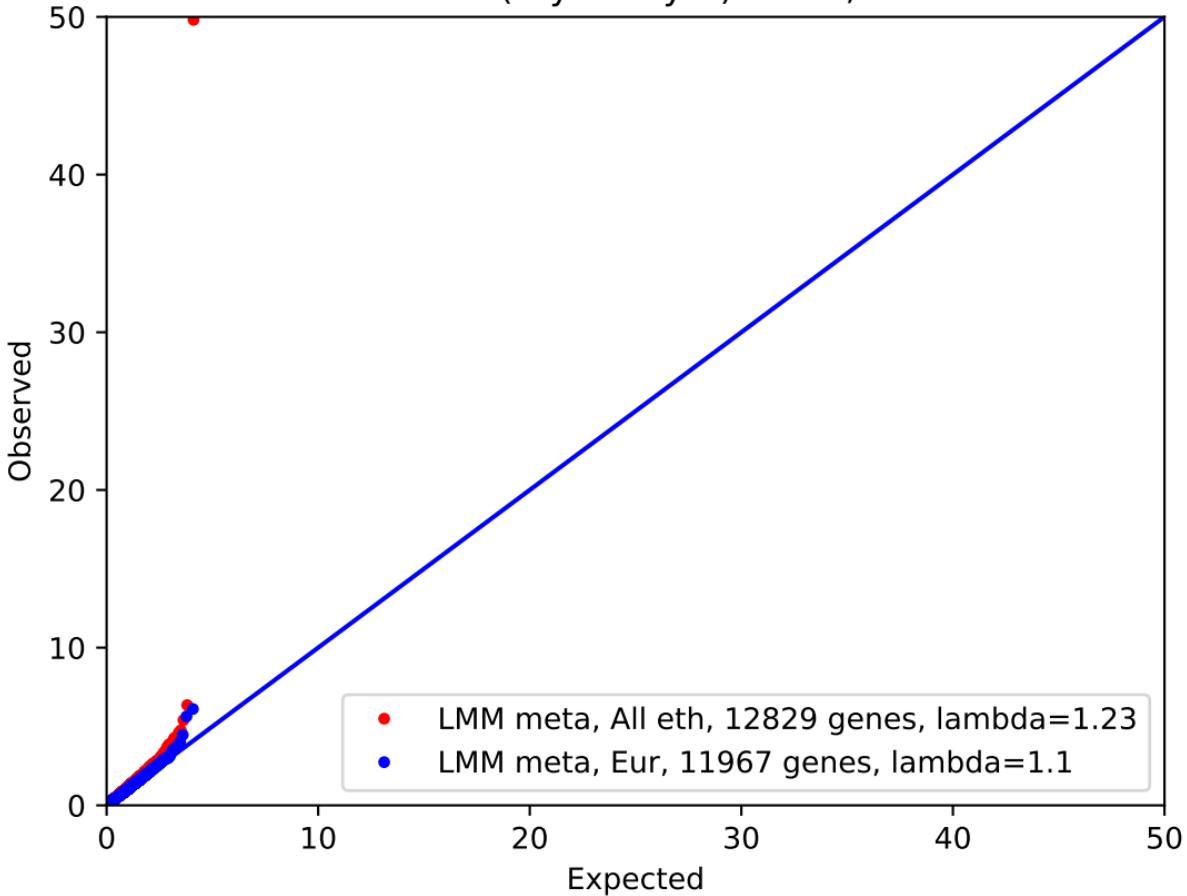
Median T2star in putamen (right); lof model



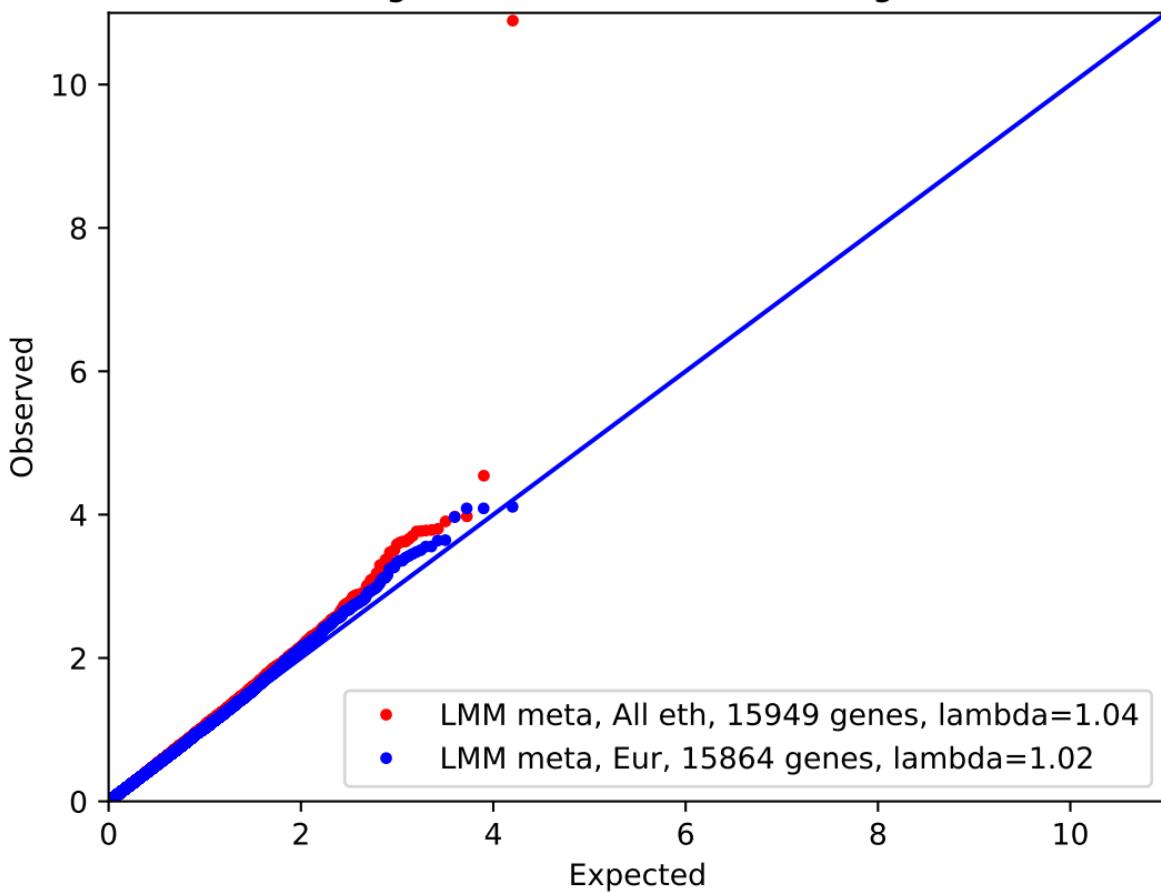
Red blood cell (erythrocyte) count; coding model



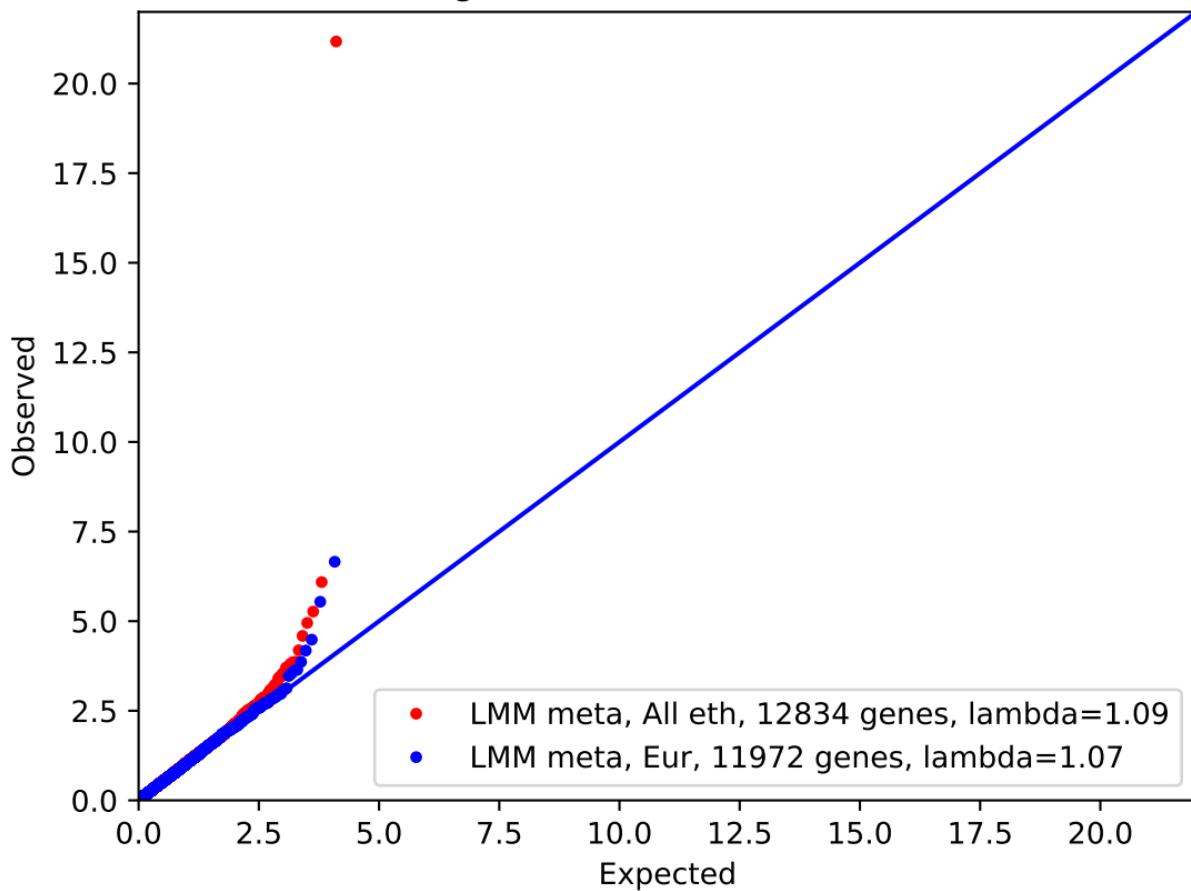
Red blood cell (erythrocyte) count; lof model



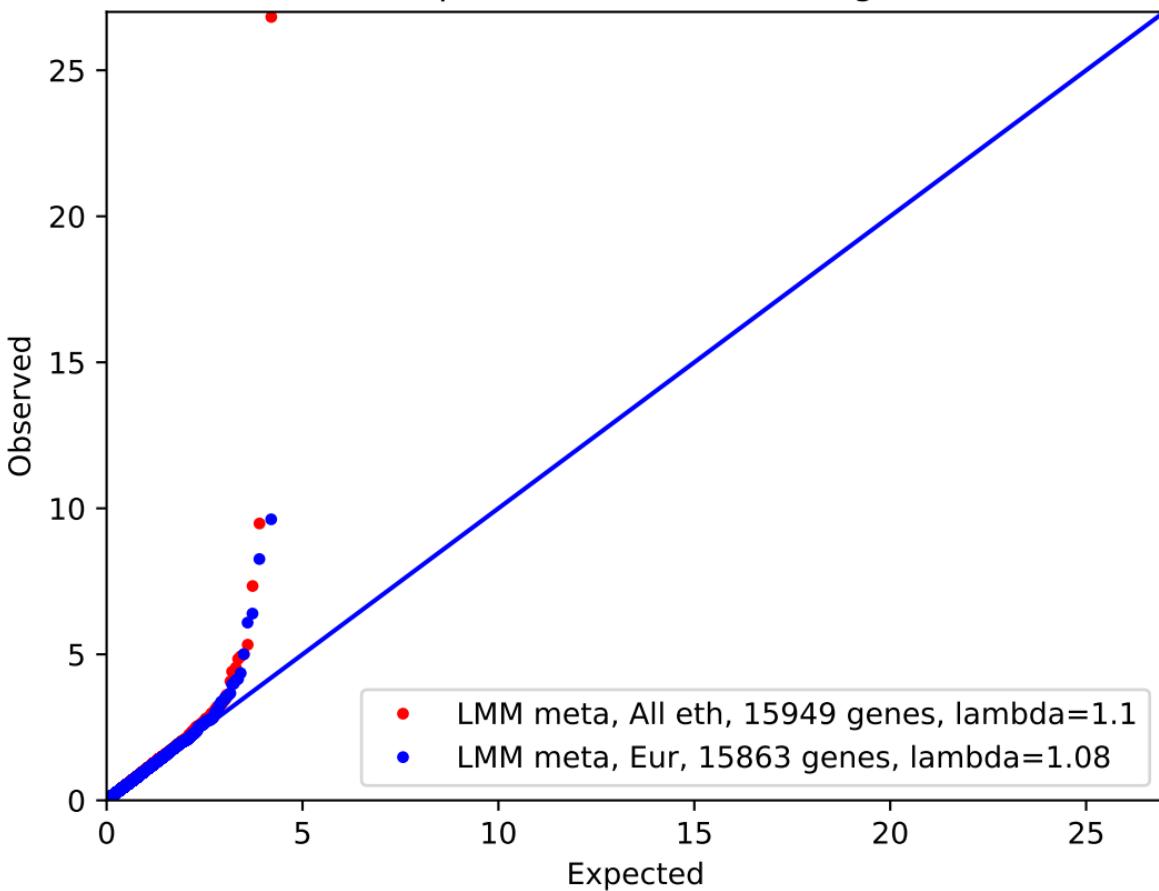
Haemoglobin concentration; coding model



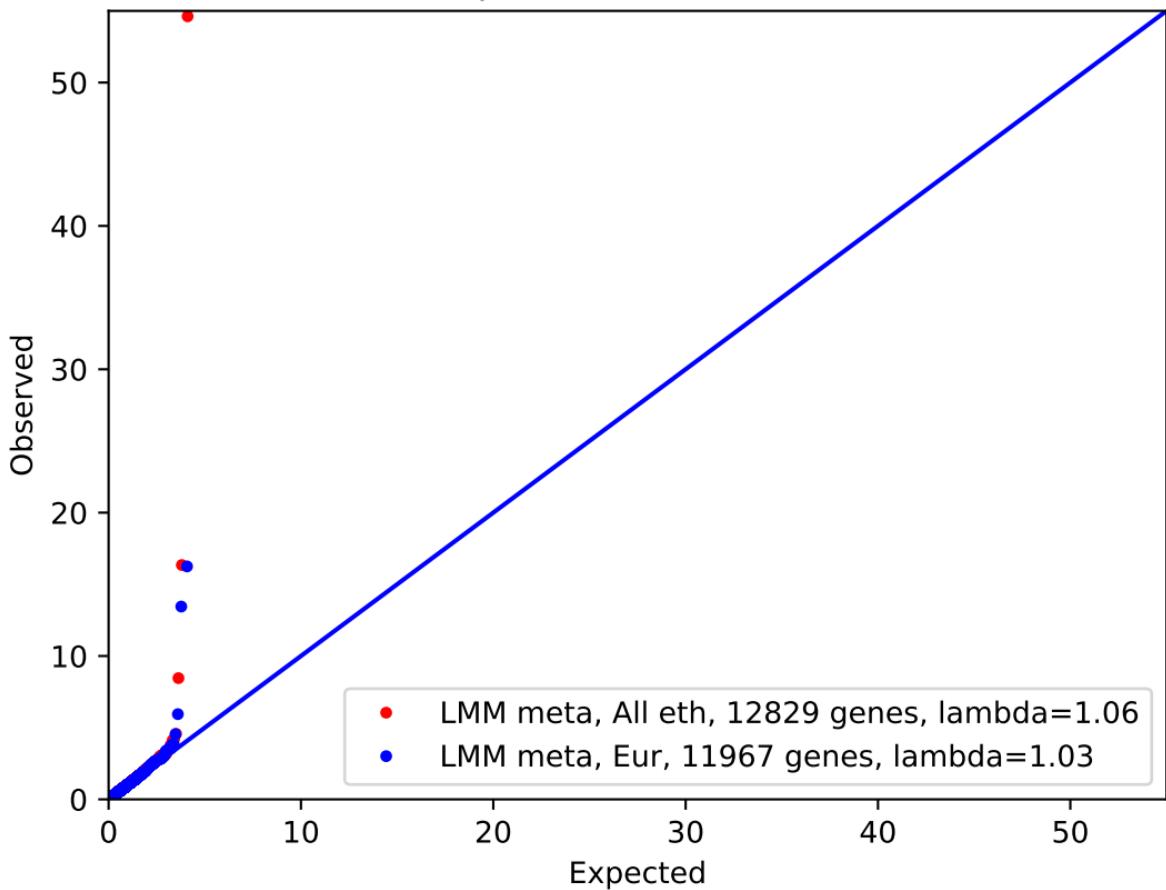
Haemoglobin concentration; lof model



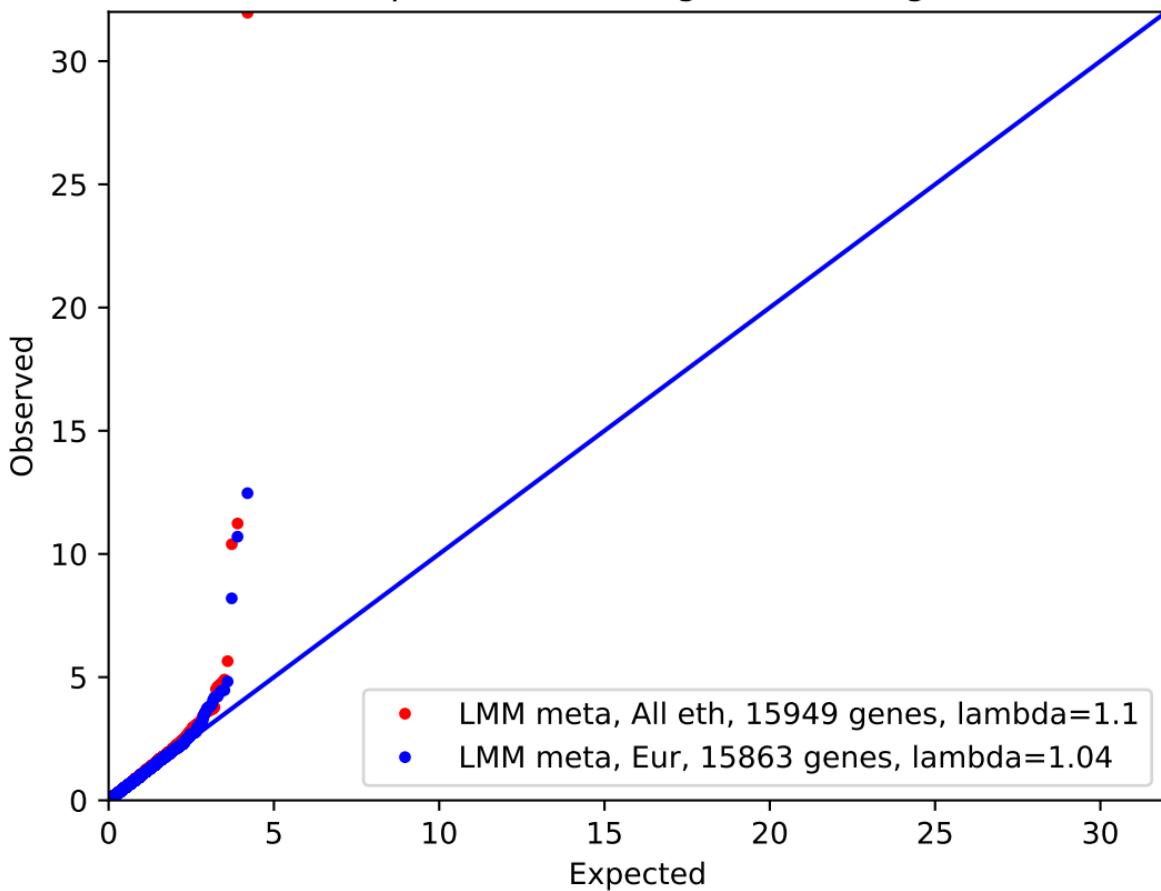
Mean corpuscular volume; coding model



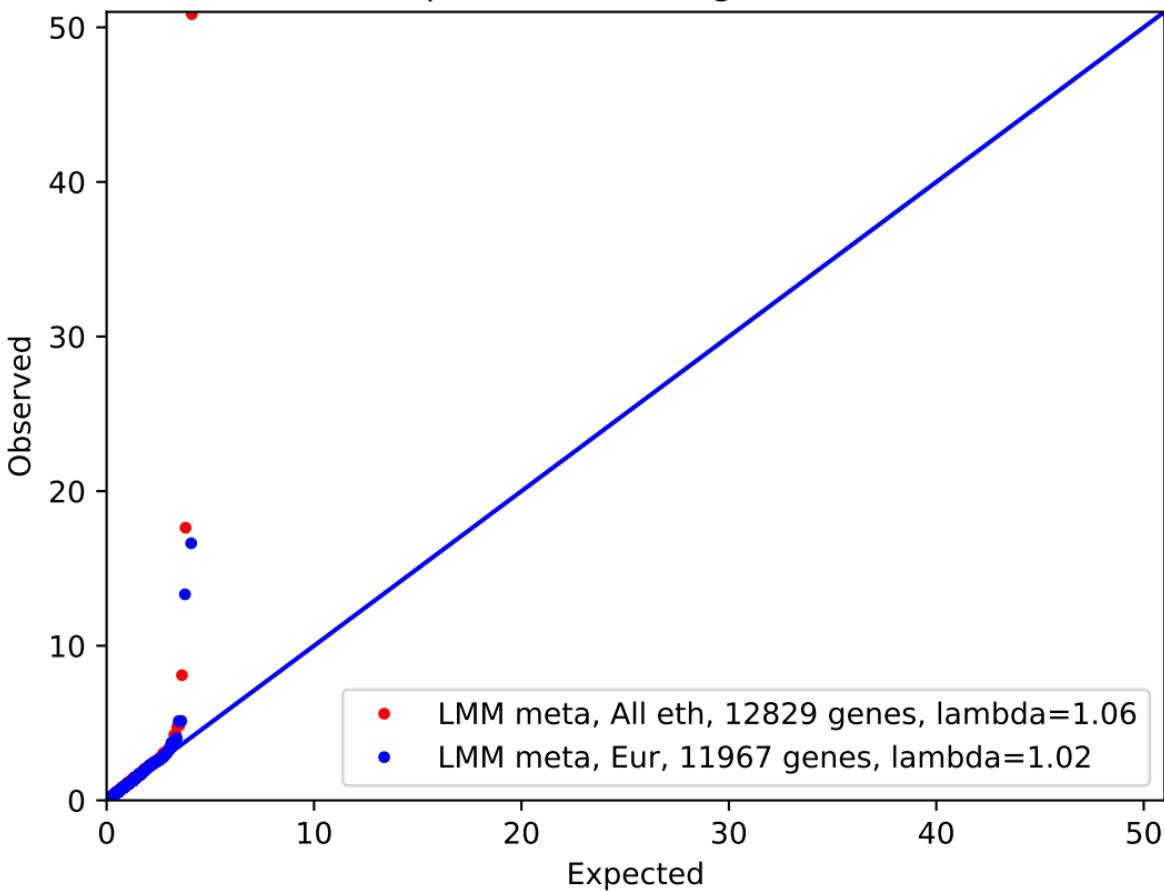
Mean corpuscular volume; lof model



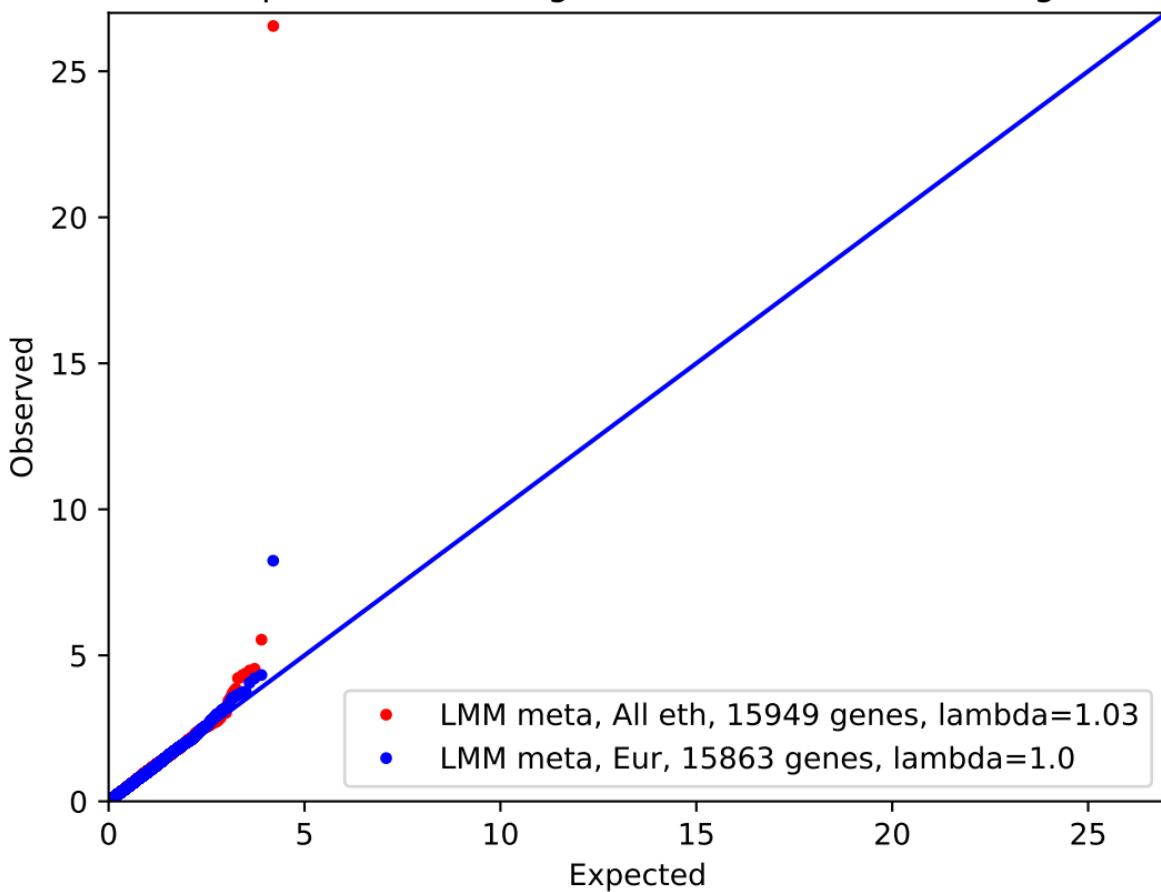
Mean corpuscular haemoglobin; coding model



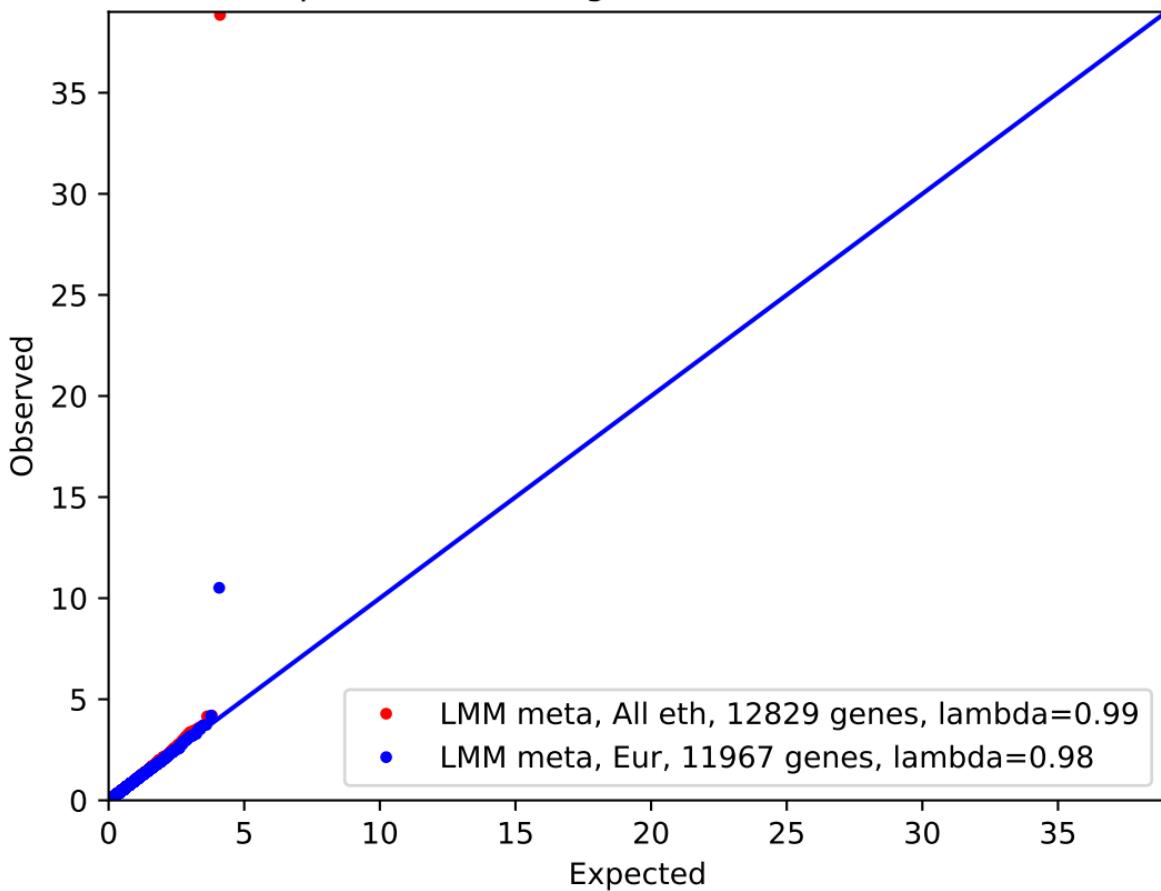
Mean corpuscular haemoglobin; lof model



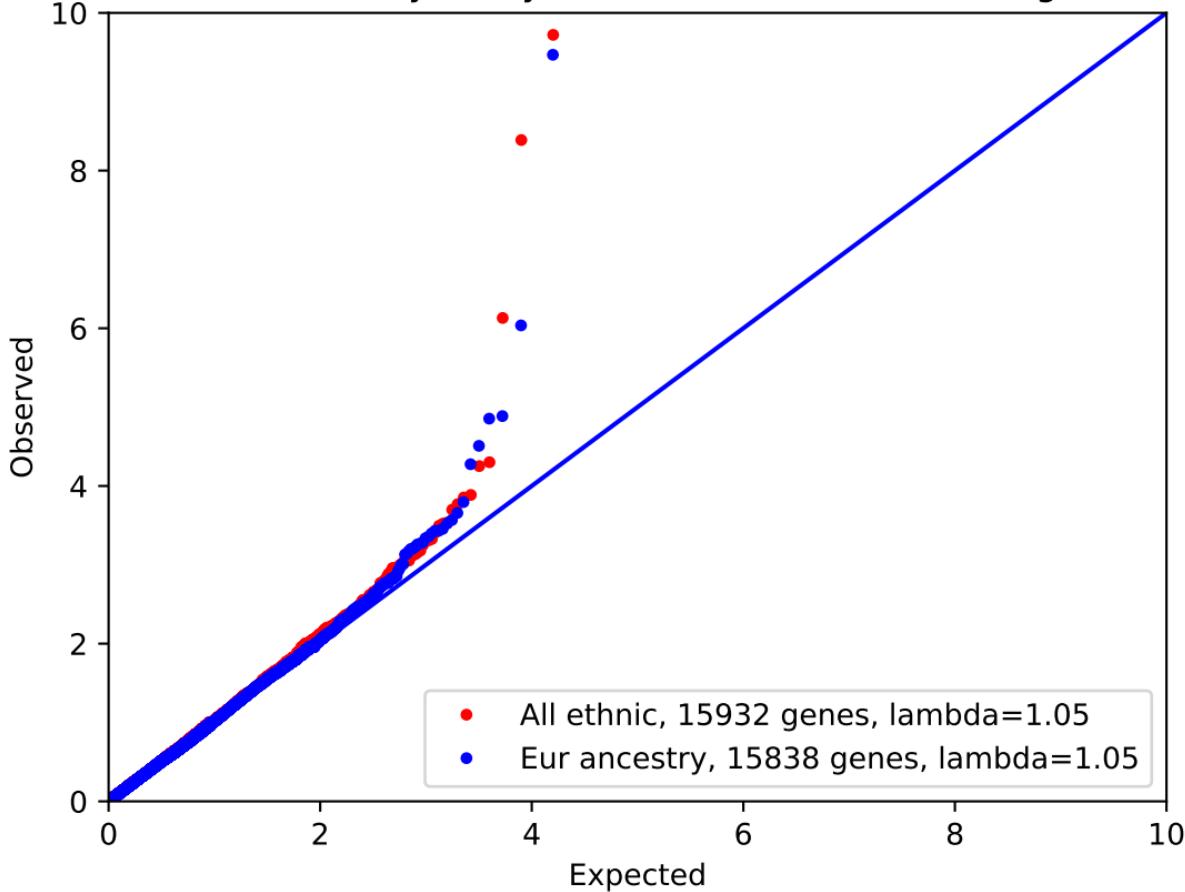
Mean corpuscular haemoglobin concentration; coding model



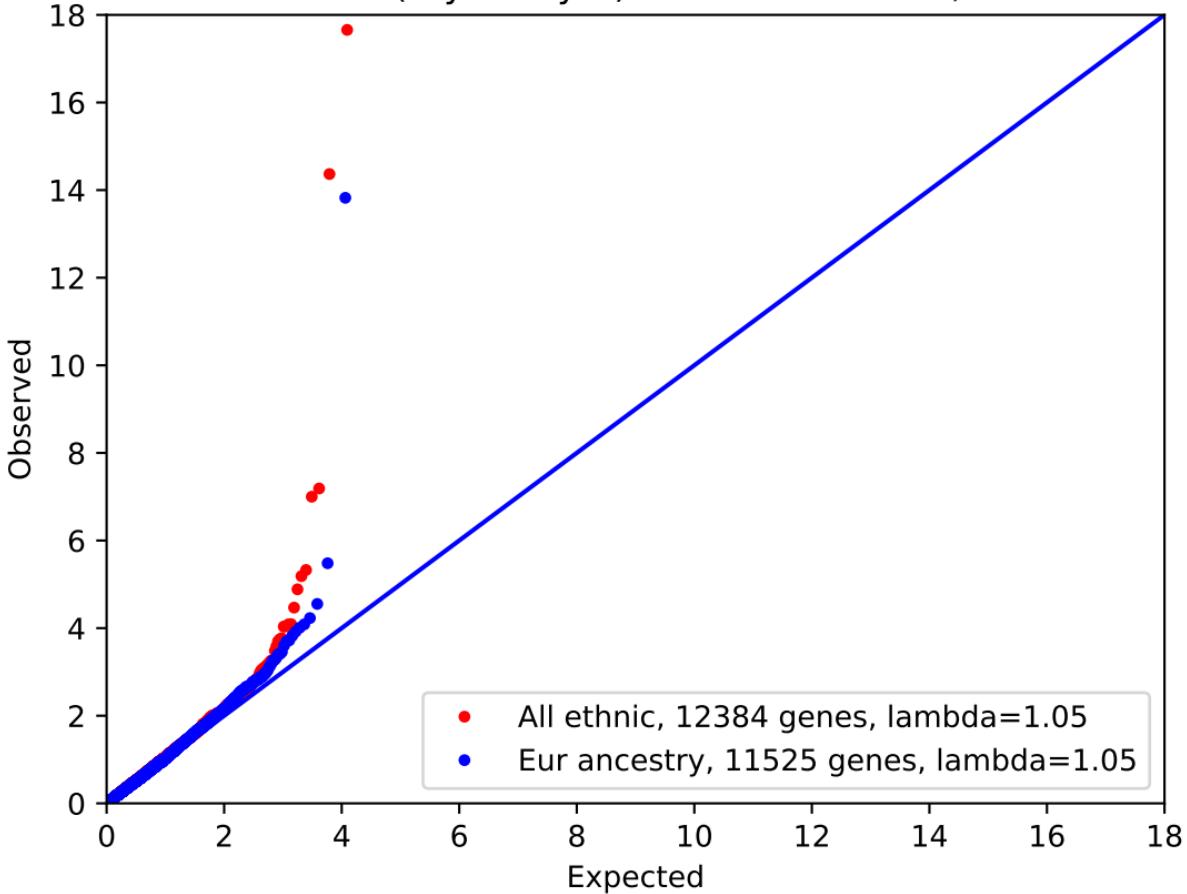
Mean corpuscular haemoglobin concentration; lof model



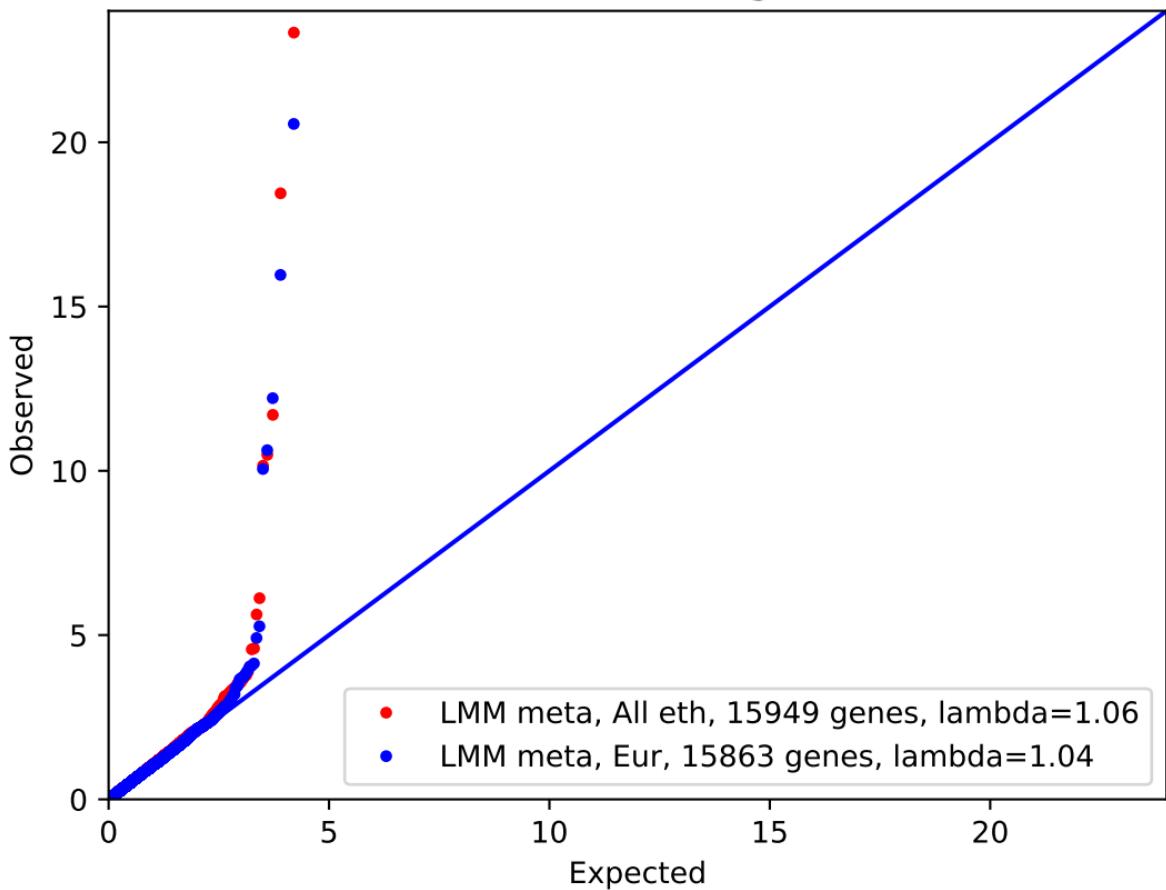
Red blood cell (erythrocyte) distribution width; coding model



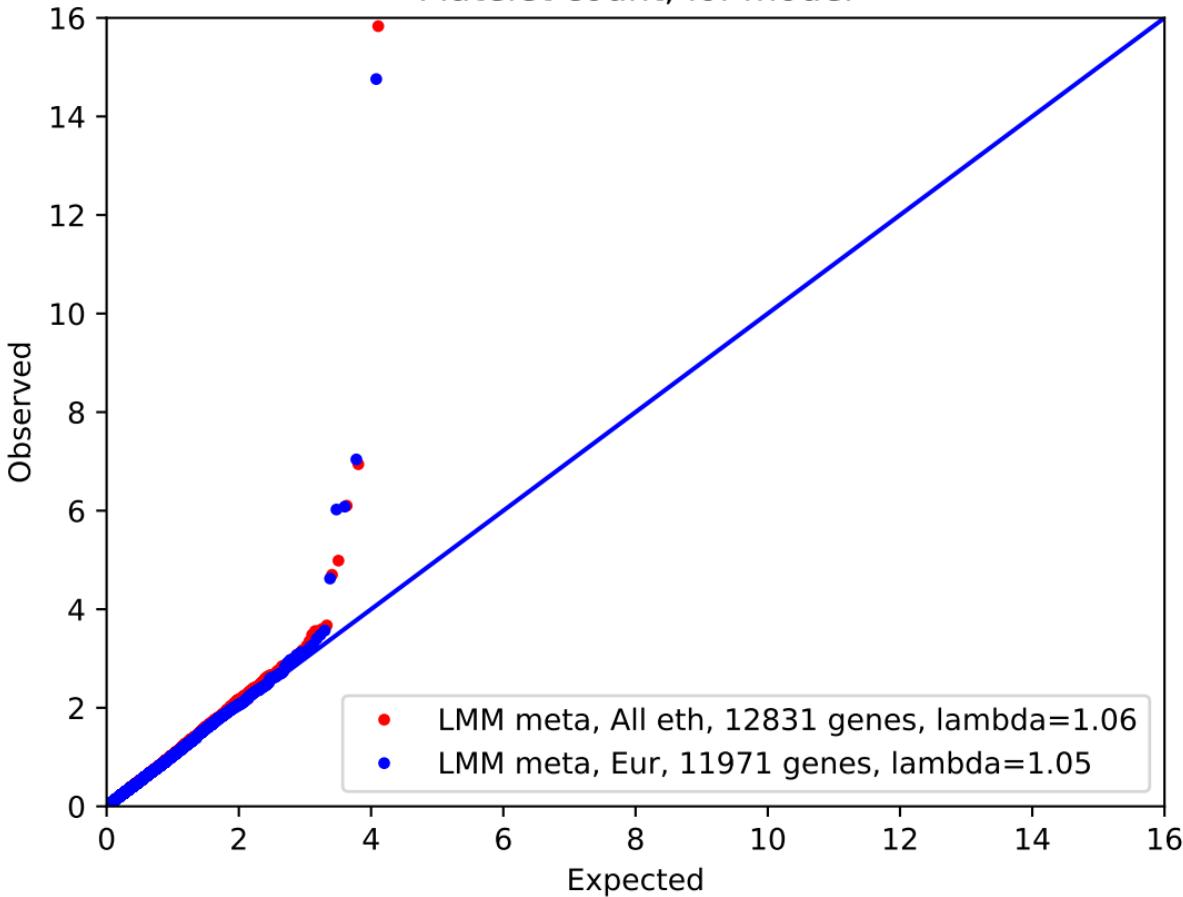
Red blood cell (erythrocyte) distribution width; lof model



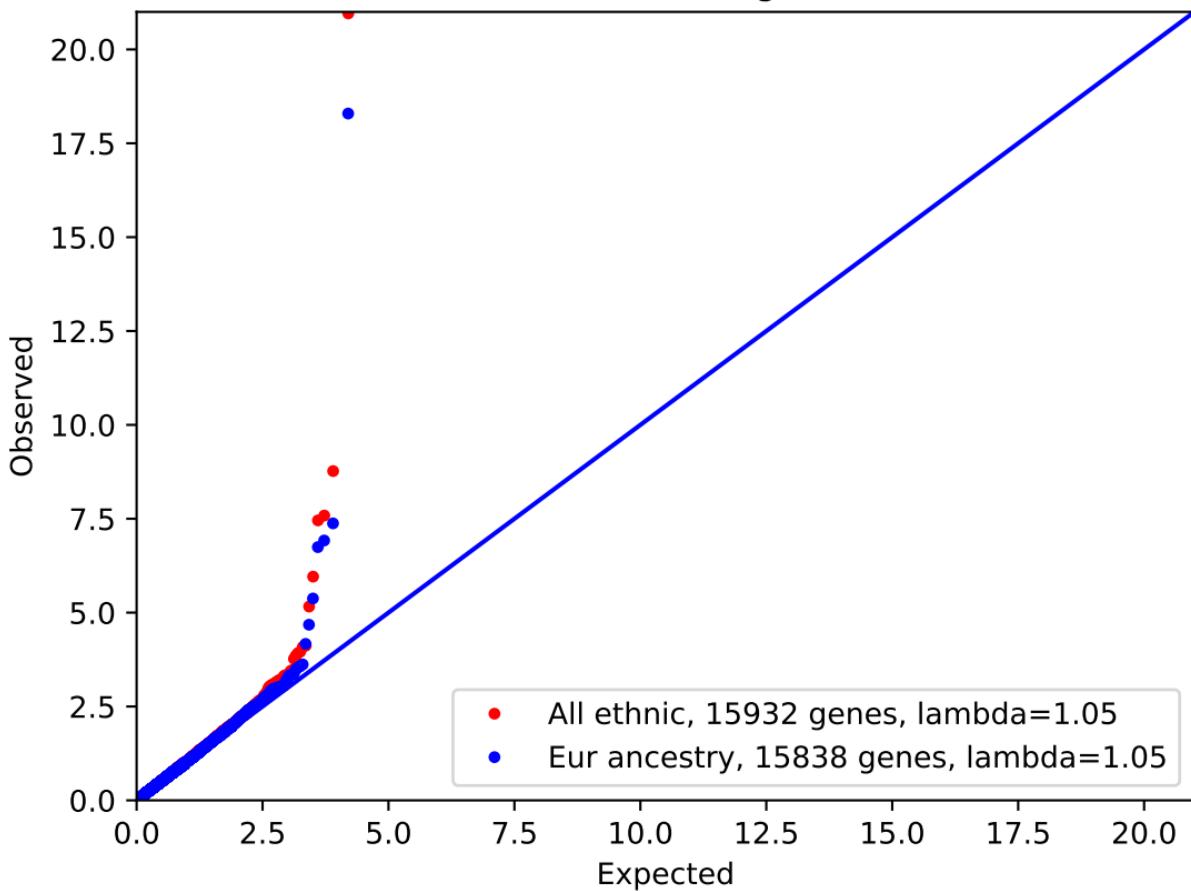
Platelet count; coding model



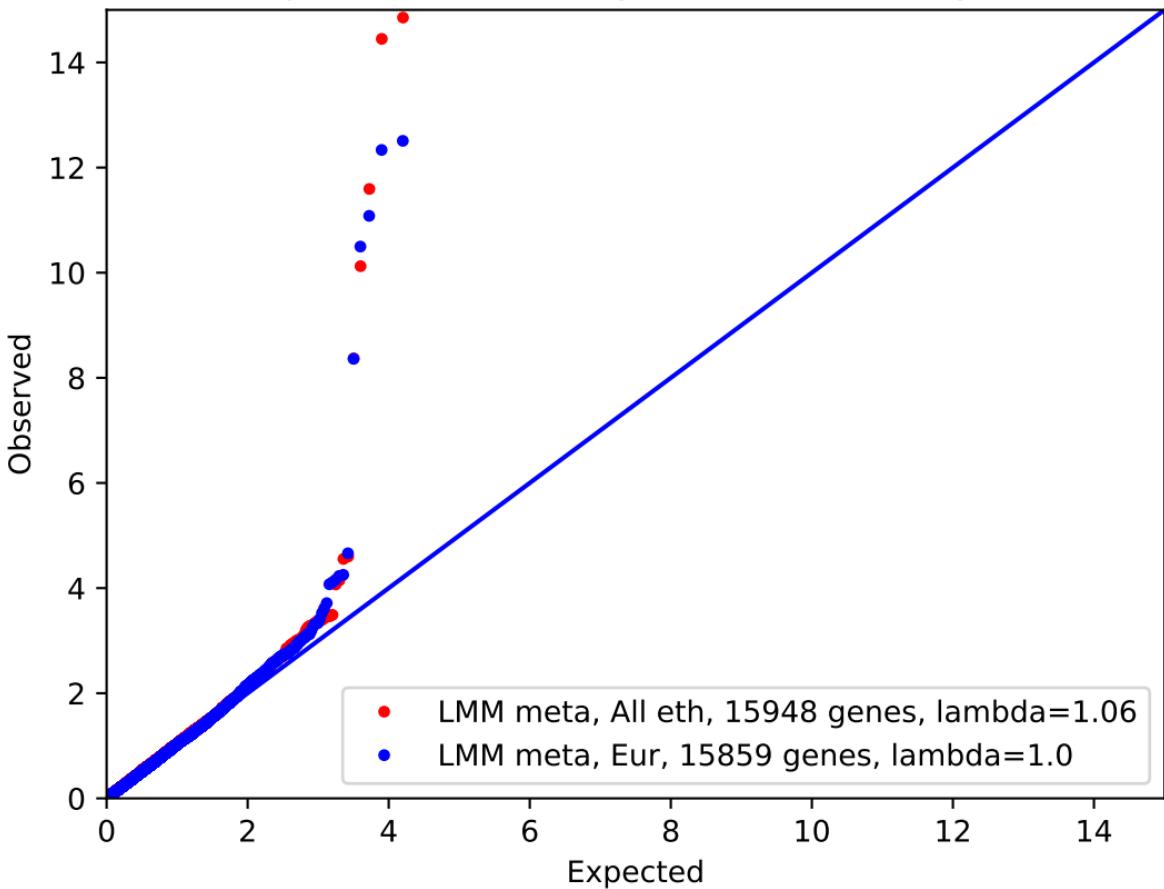
Platelet count; lof model



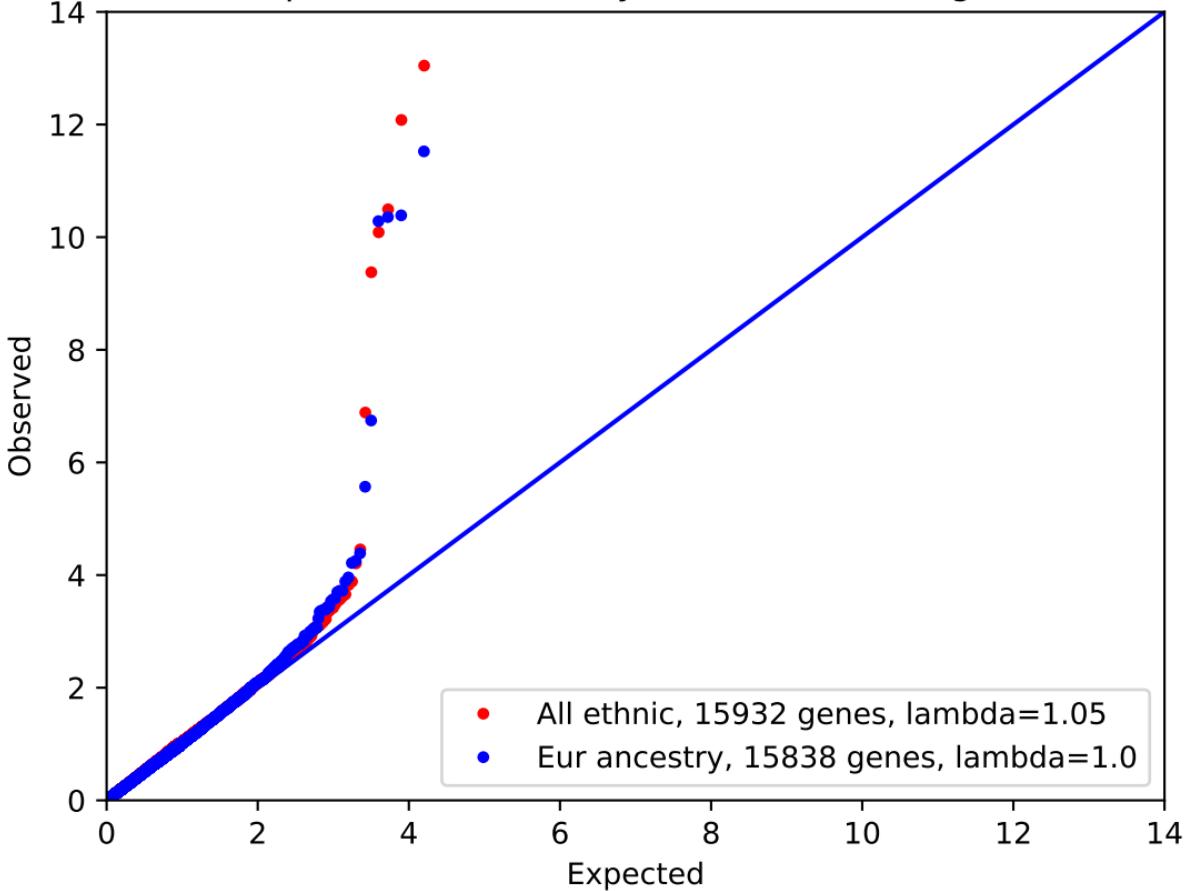
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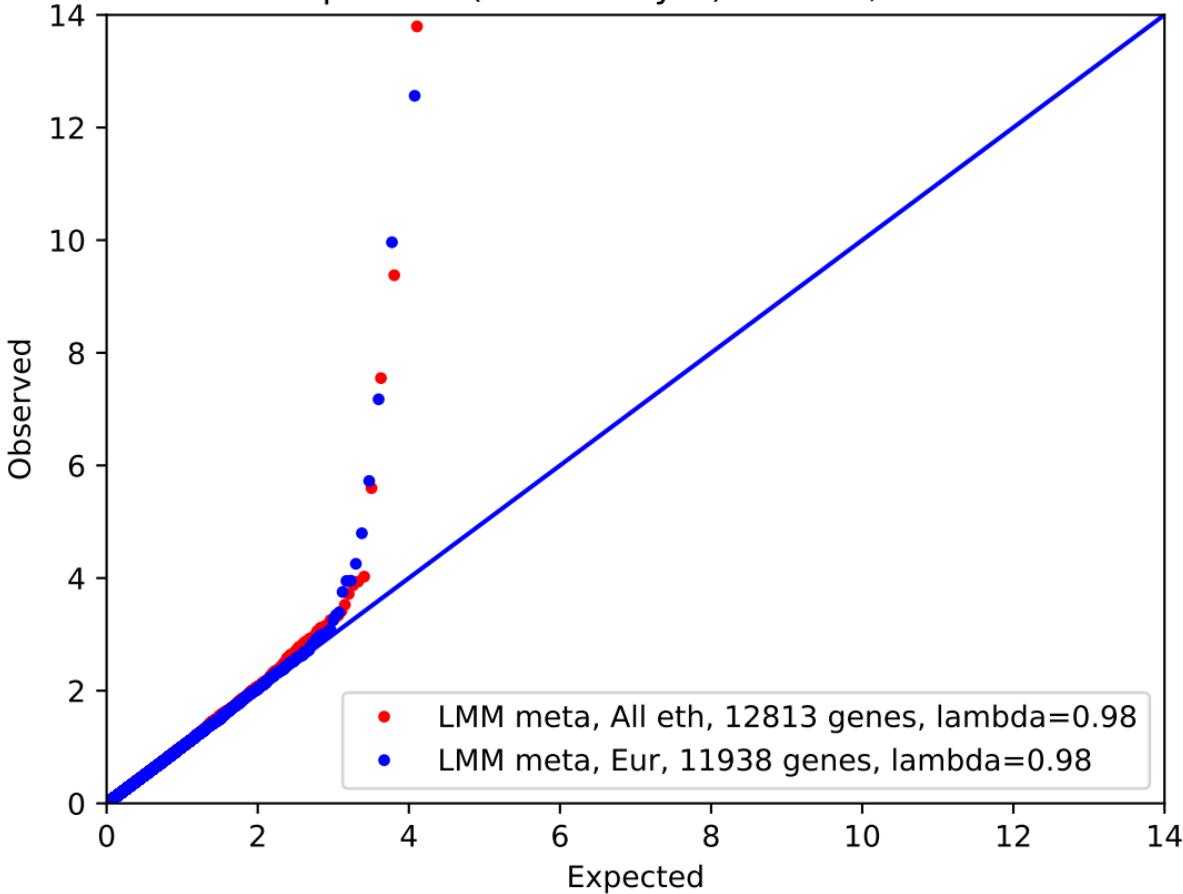
Mean platelet (thrombocyte) volume; coding model



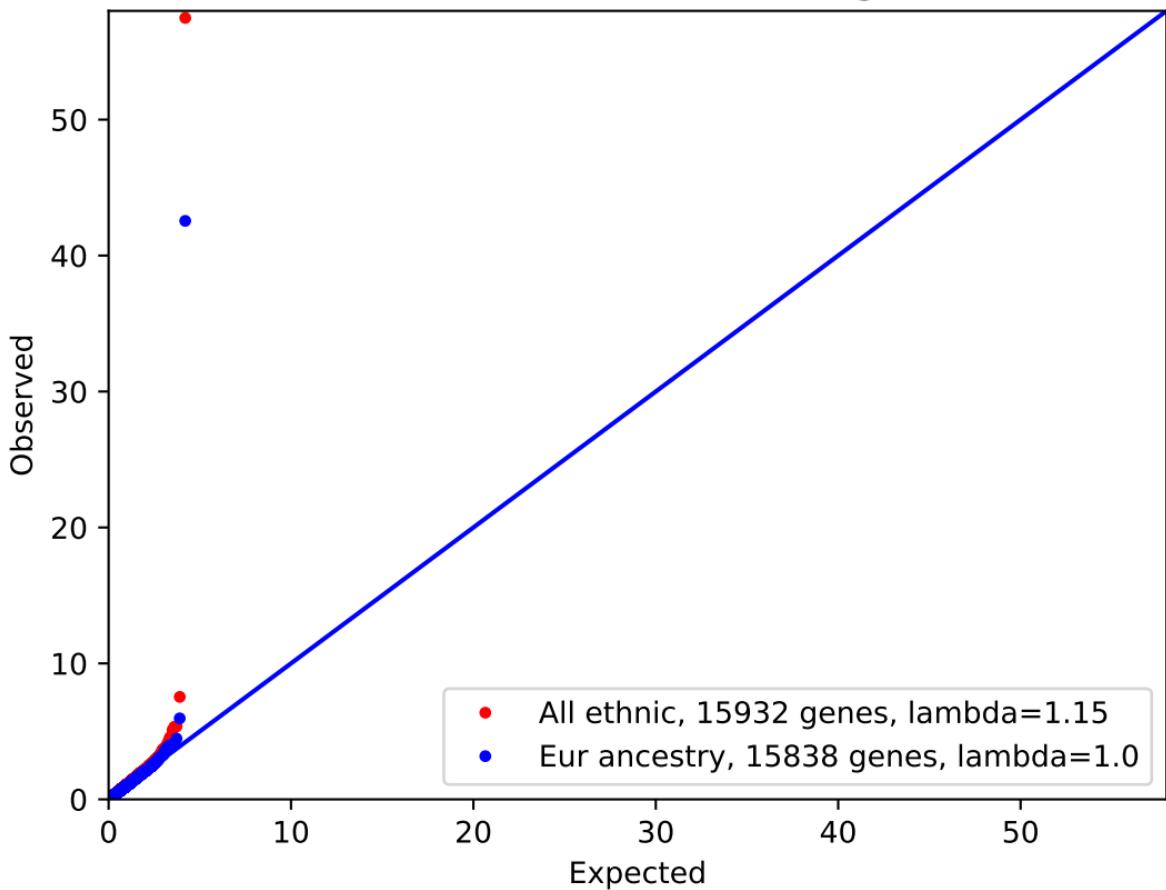
Mean platelet (thrombocyte) volume; coding model



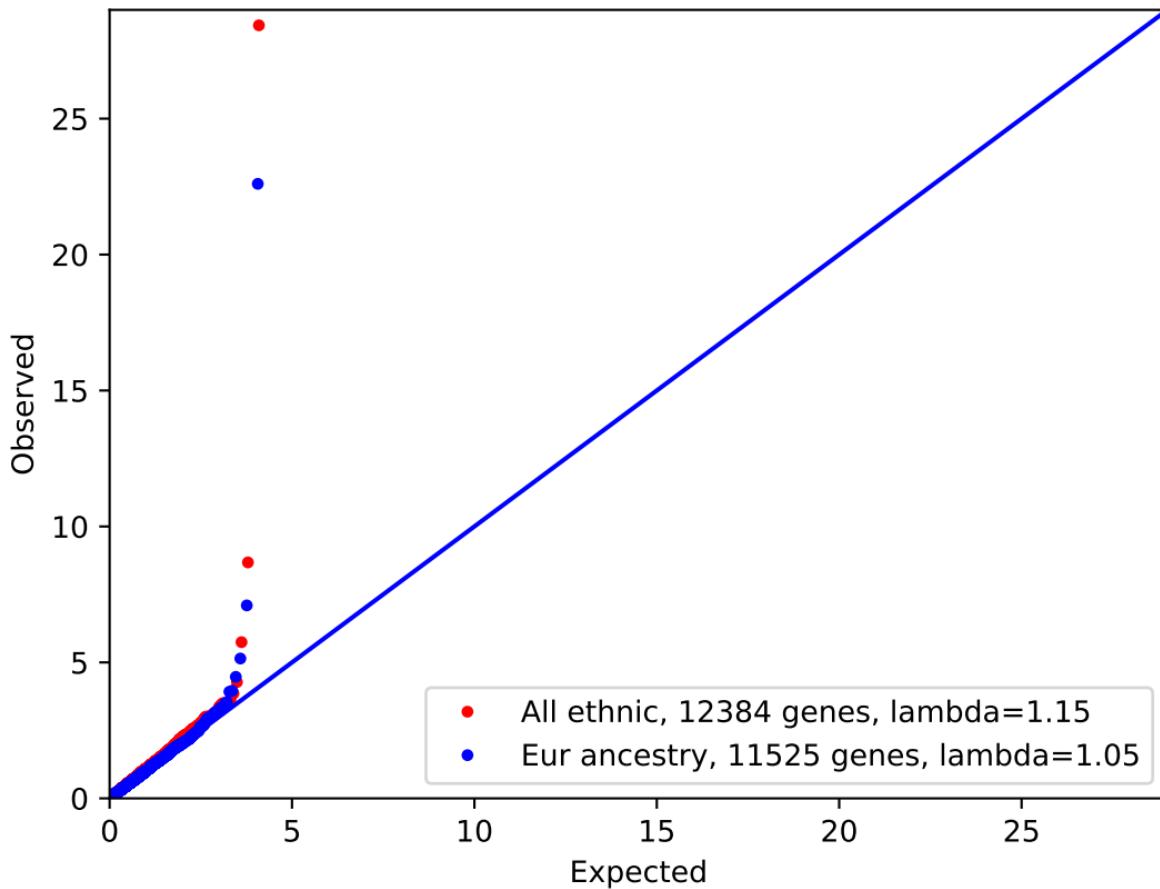
Mean platelet (thrombocyte) volume; lof model



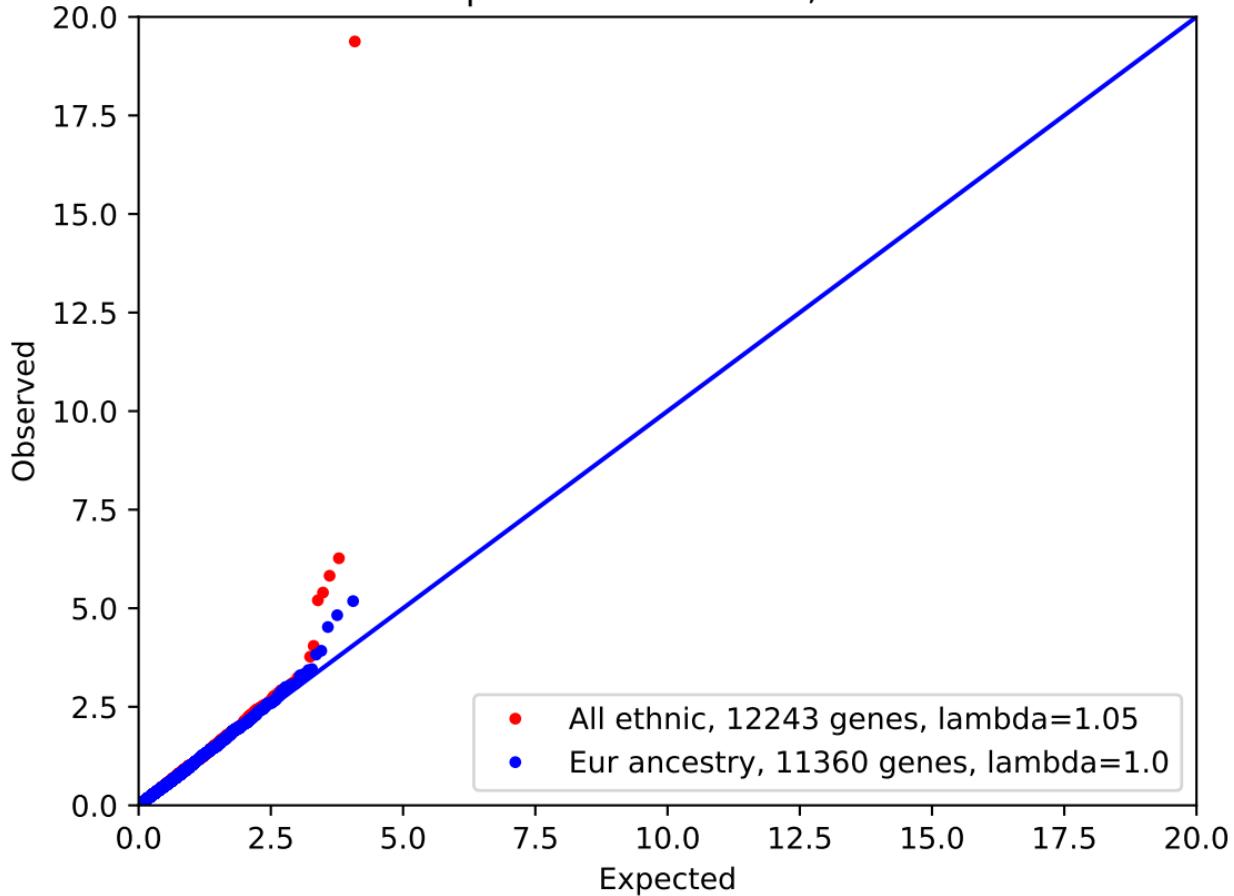
Platelet distribution width; coding model



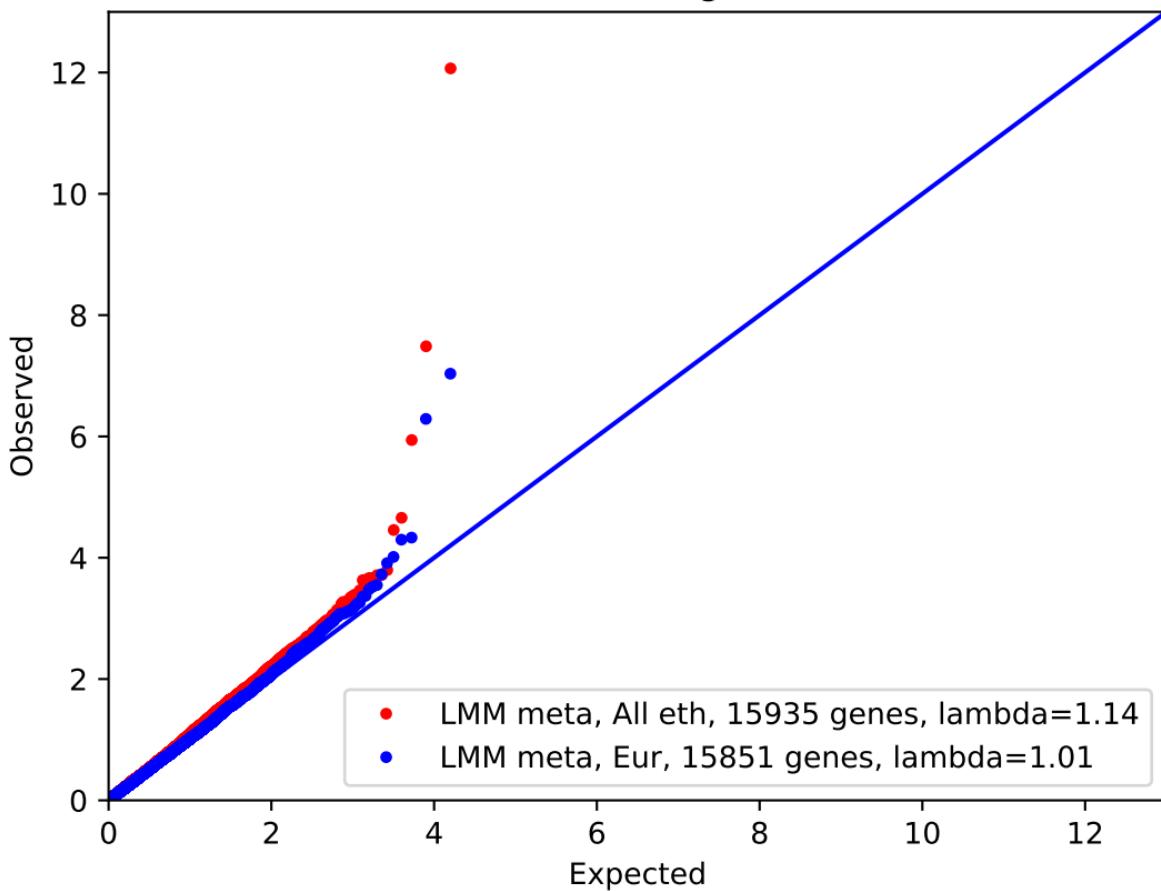
Platelet distribution width; lof model



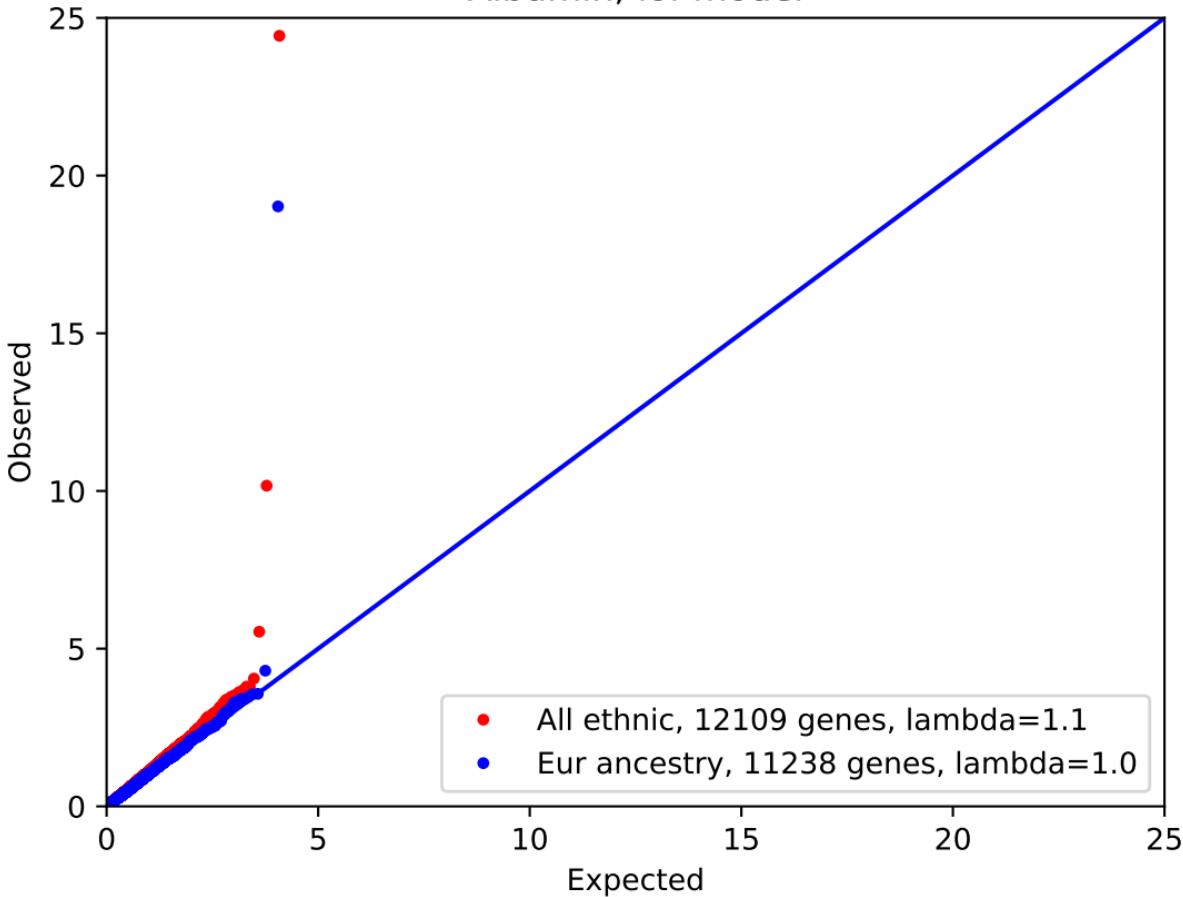
Mean spheroid cell volume; lof model



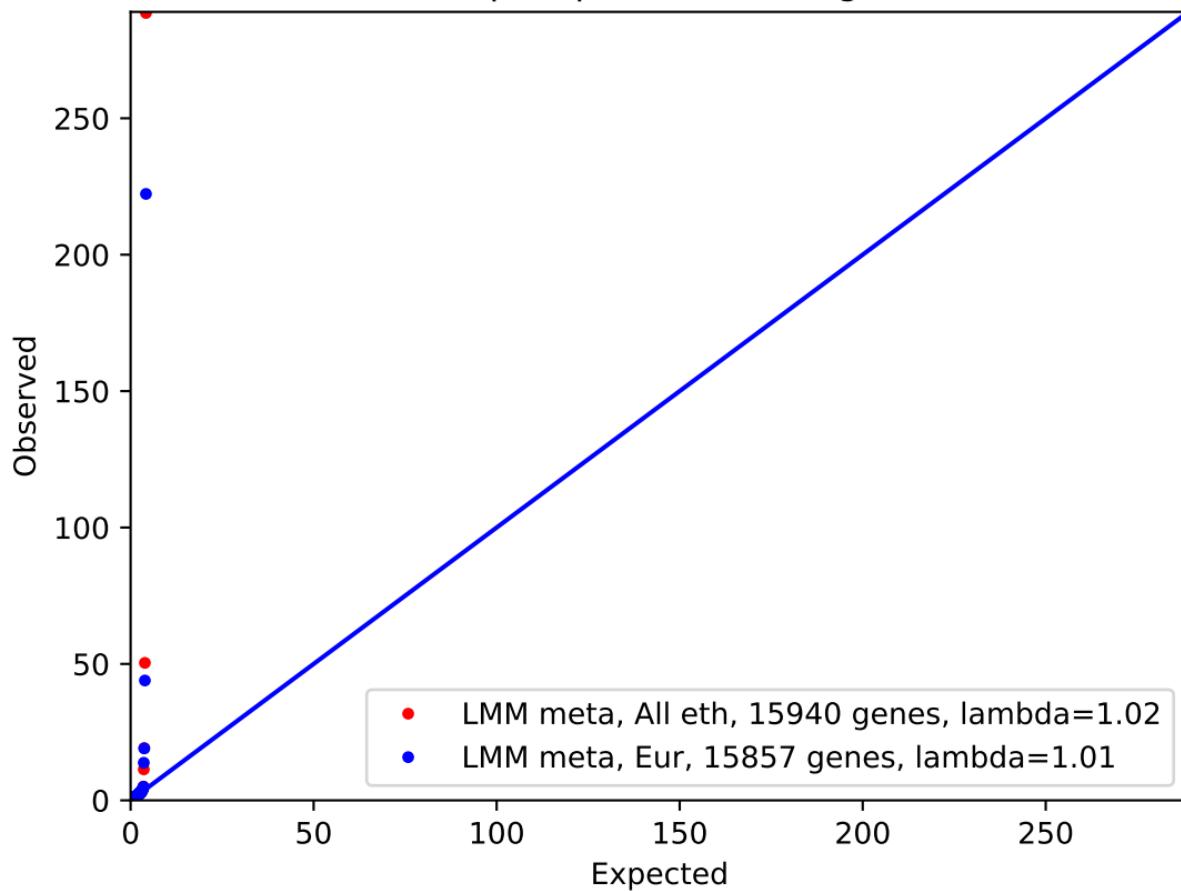
Albumin; coding model



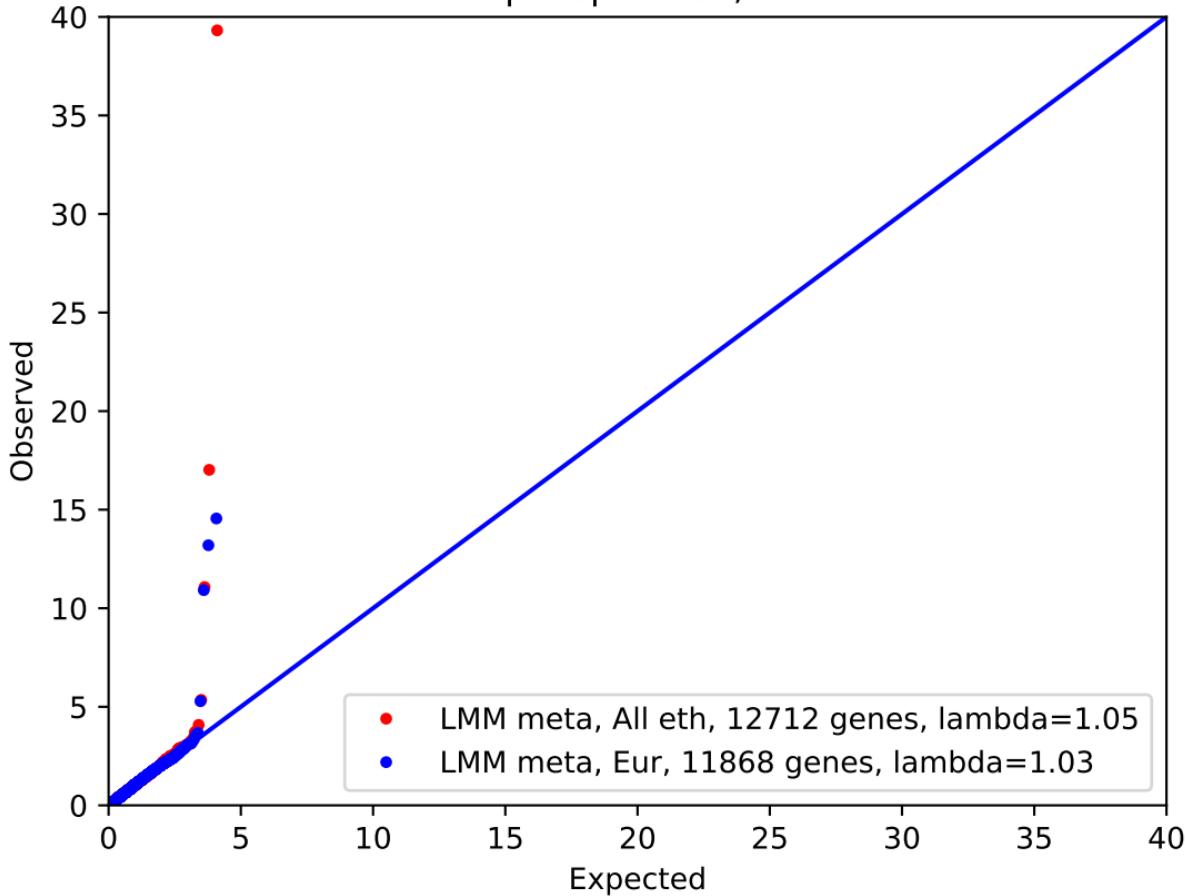
Albumin; lof model



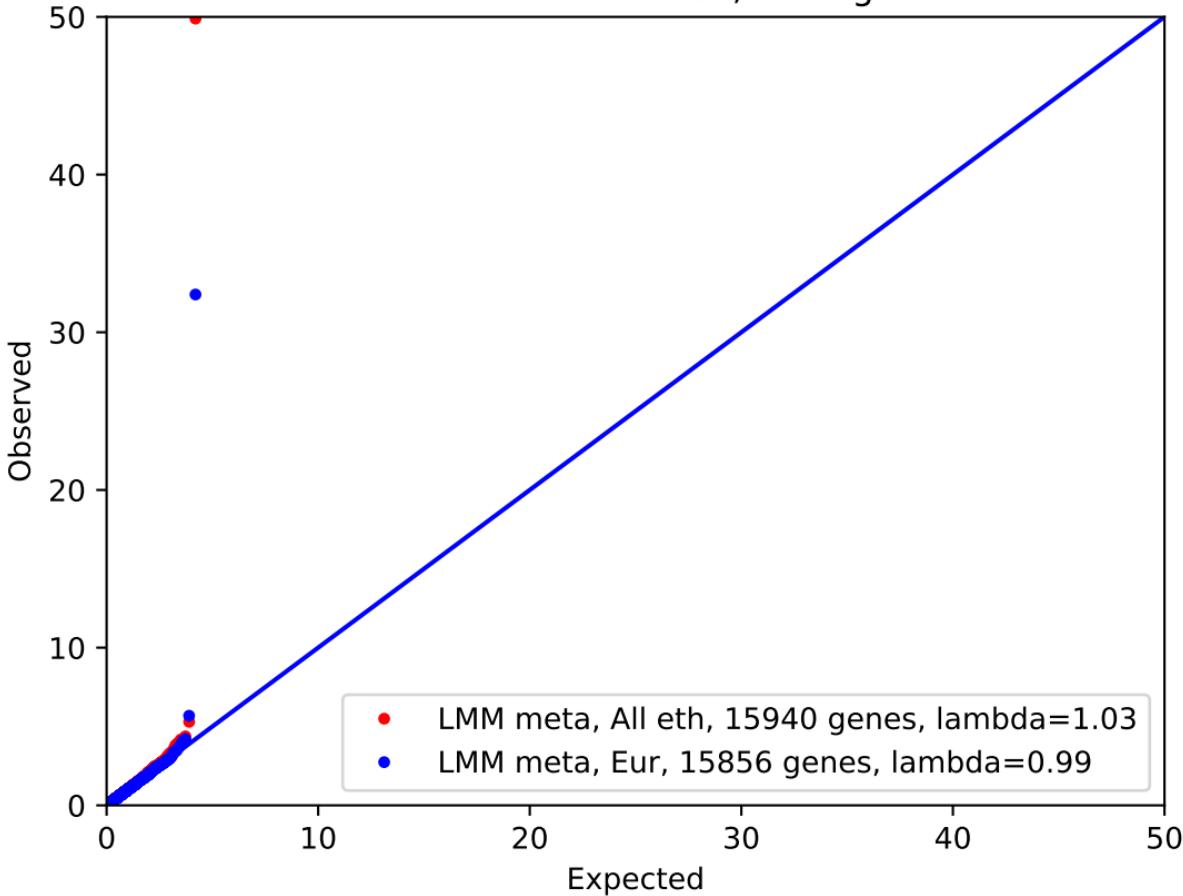
Alkaline phosphatase; coding model



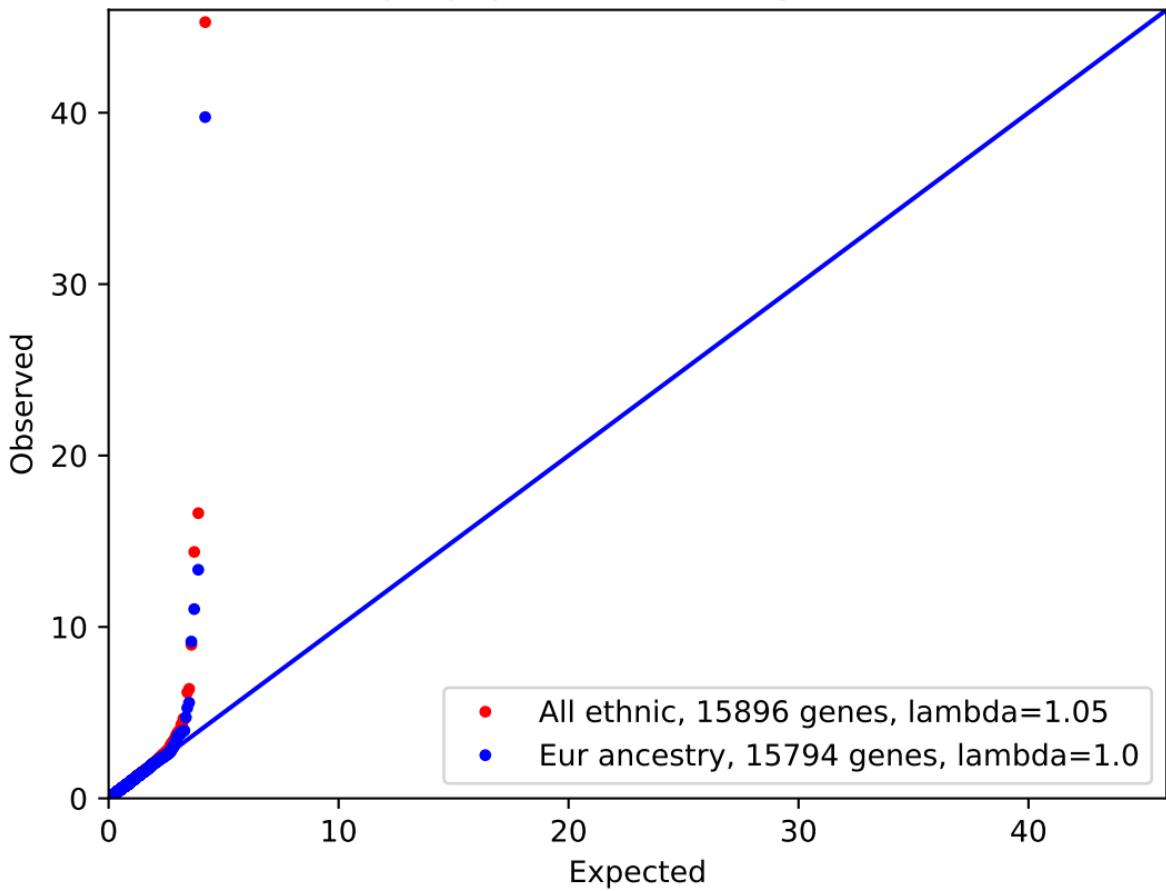
Alkaline phosphatase; lof model



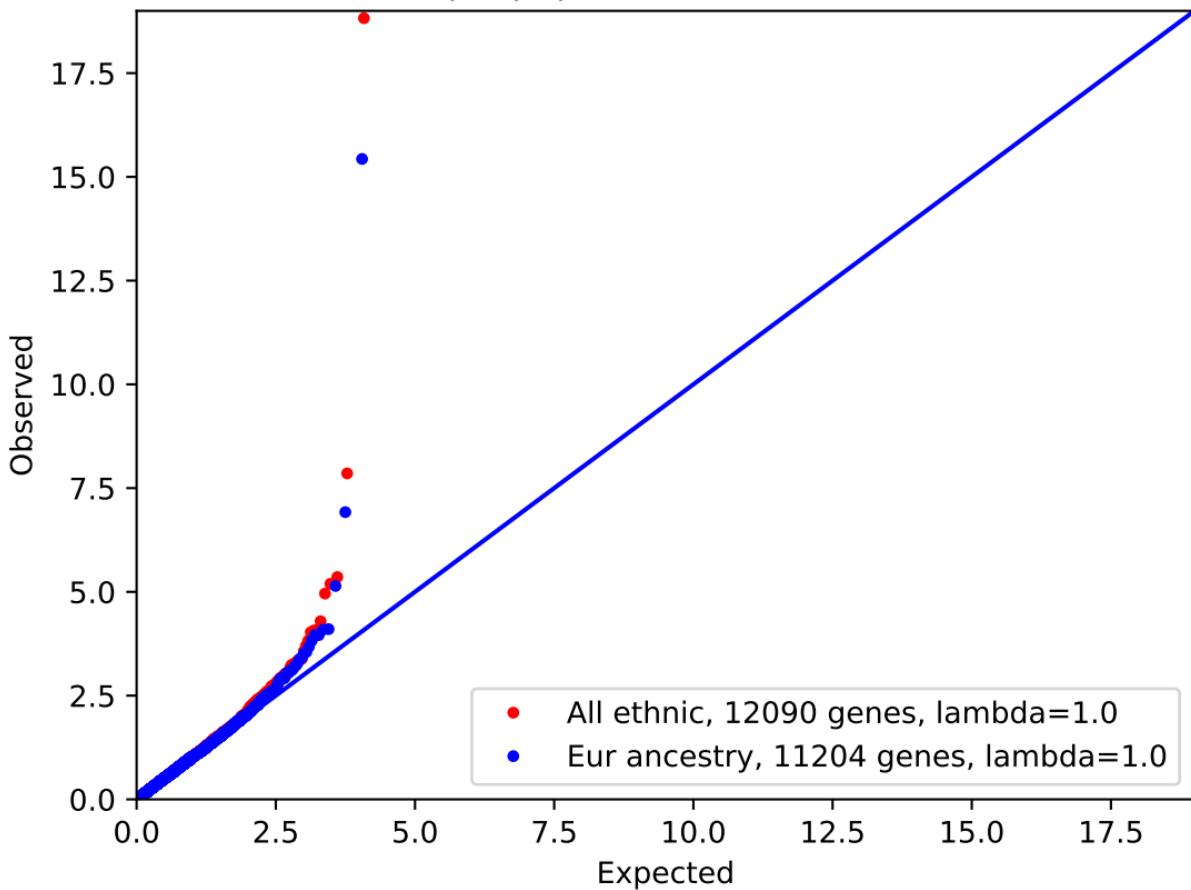
Alanine aminotransferase; coding model



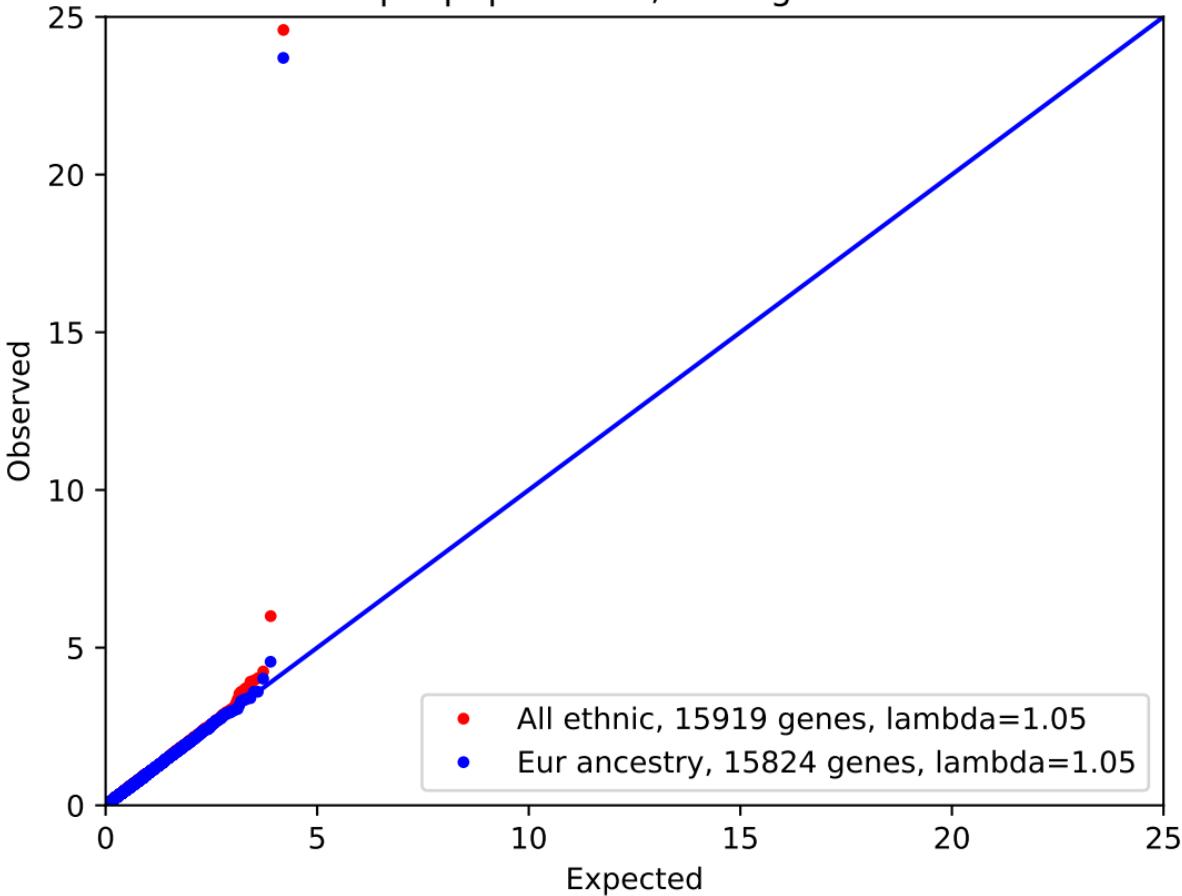
Apolipoprotein A; coding model



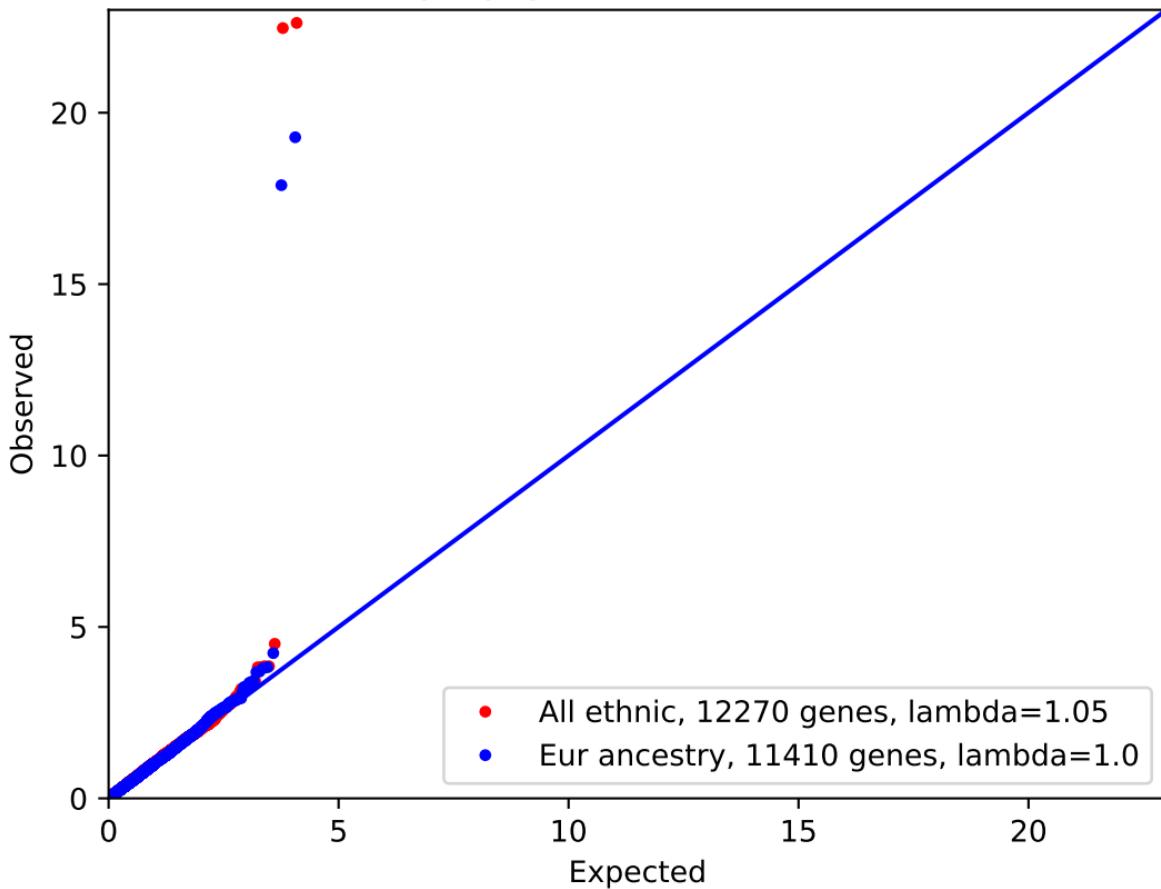
Apolipoprotein A; lof model



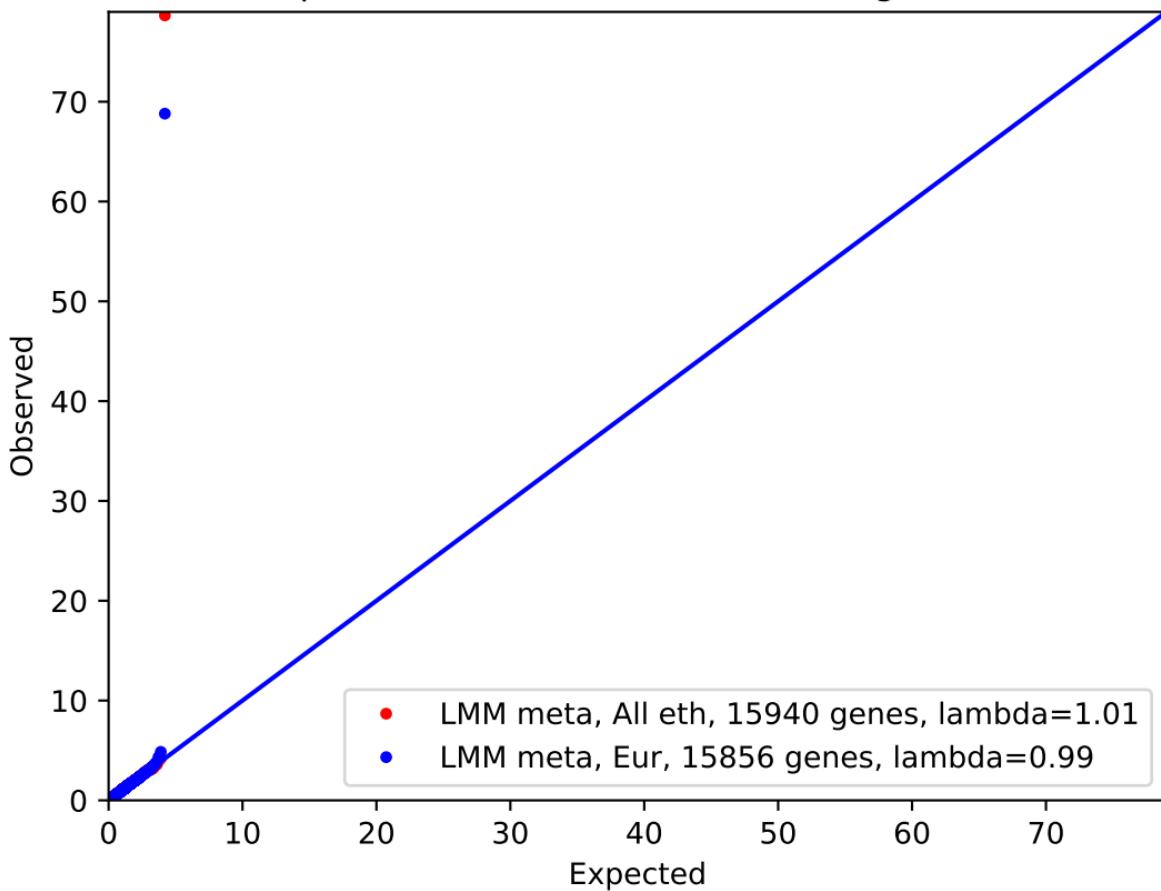
Apolipoprotein B; coding model



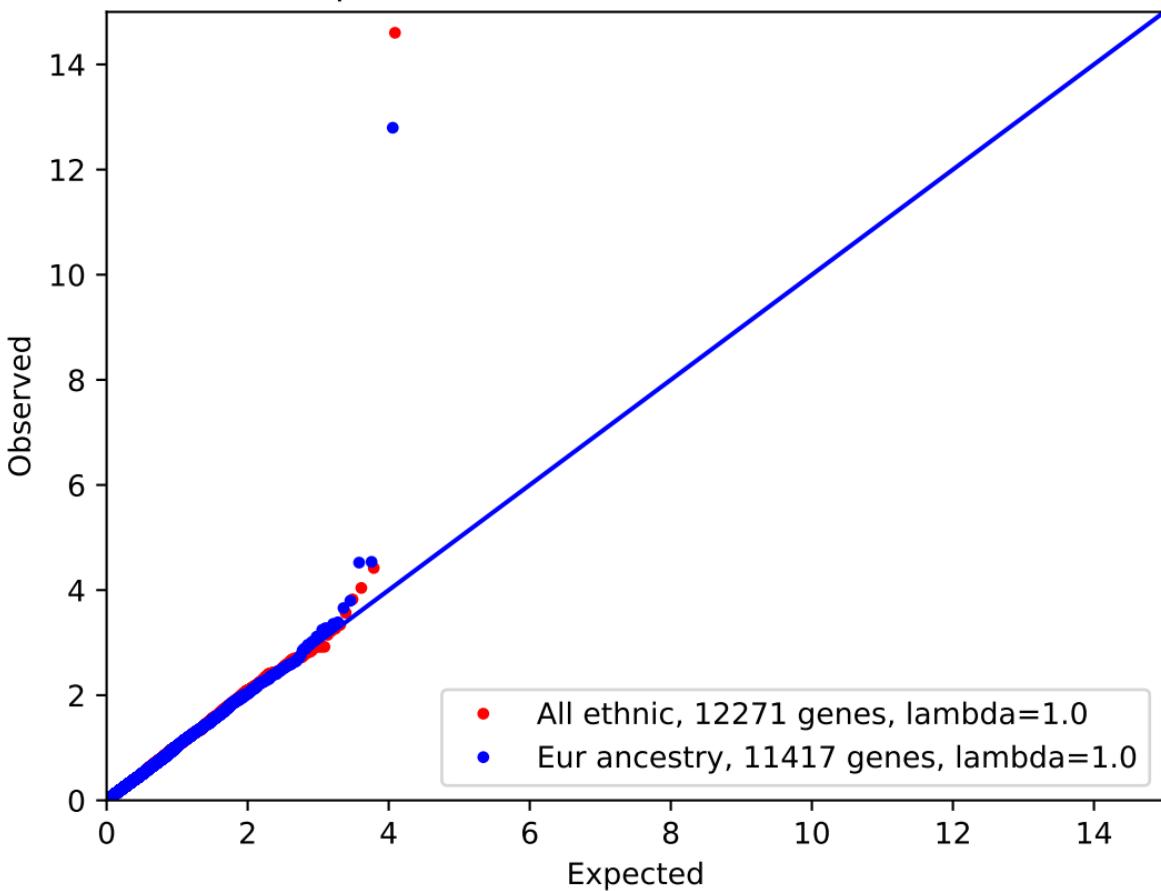
Apolipoprotein B; lof model



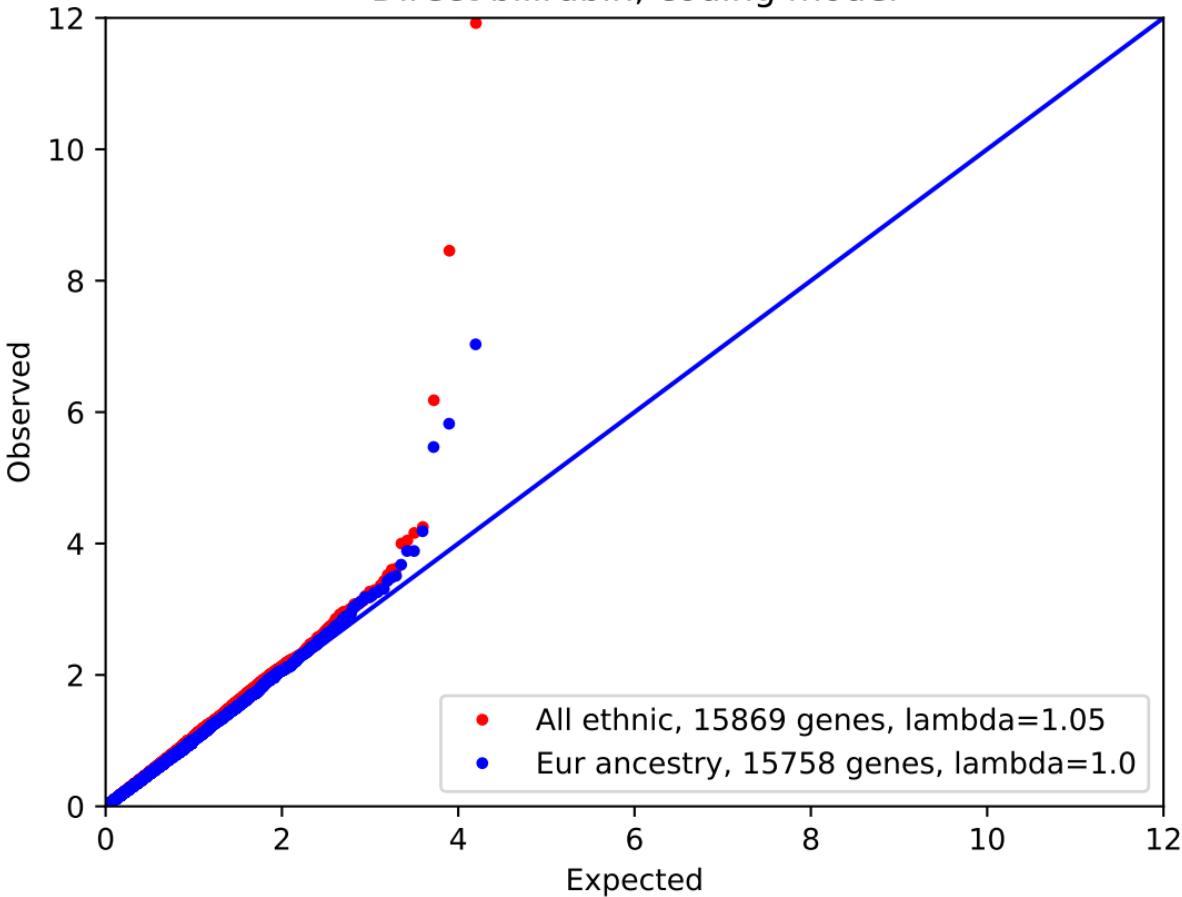
Aspartate aminotransferase; coding model



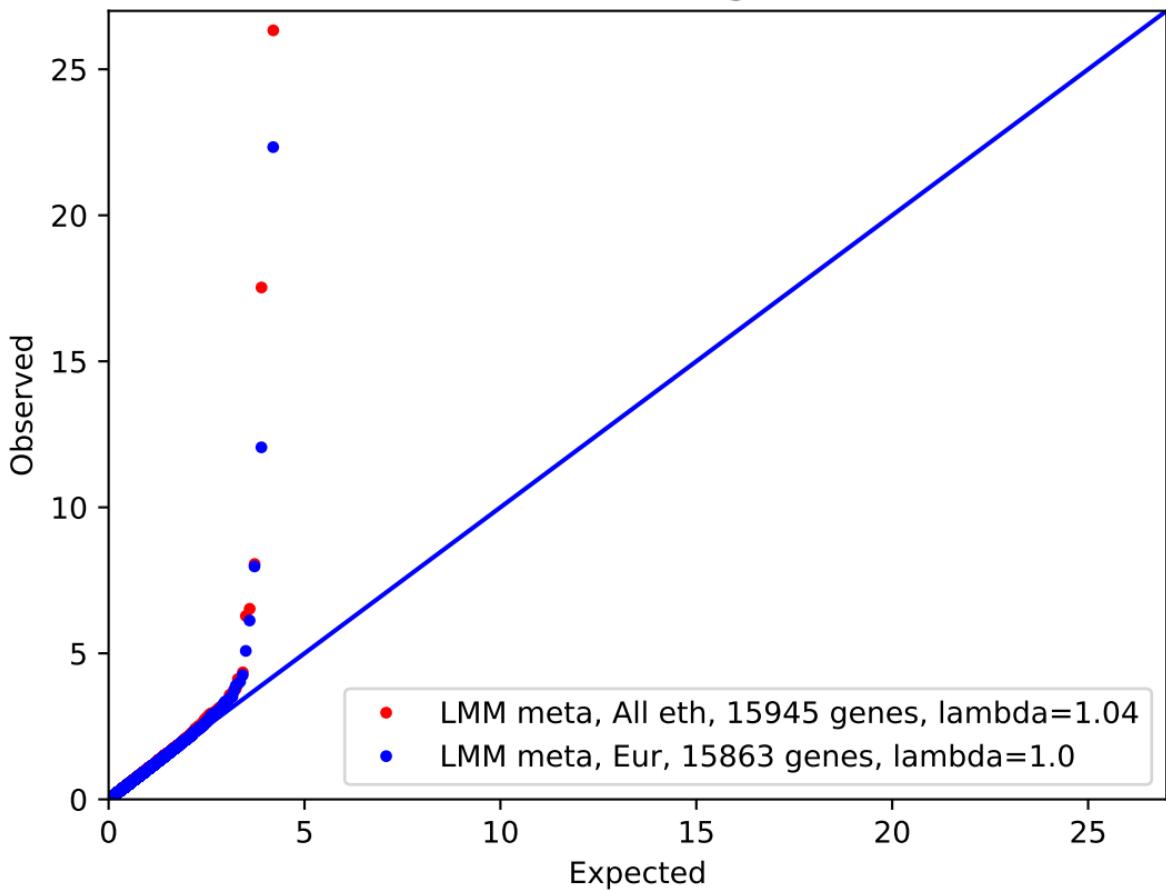
Aspartate aminotransferase; lof model



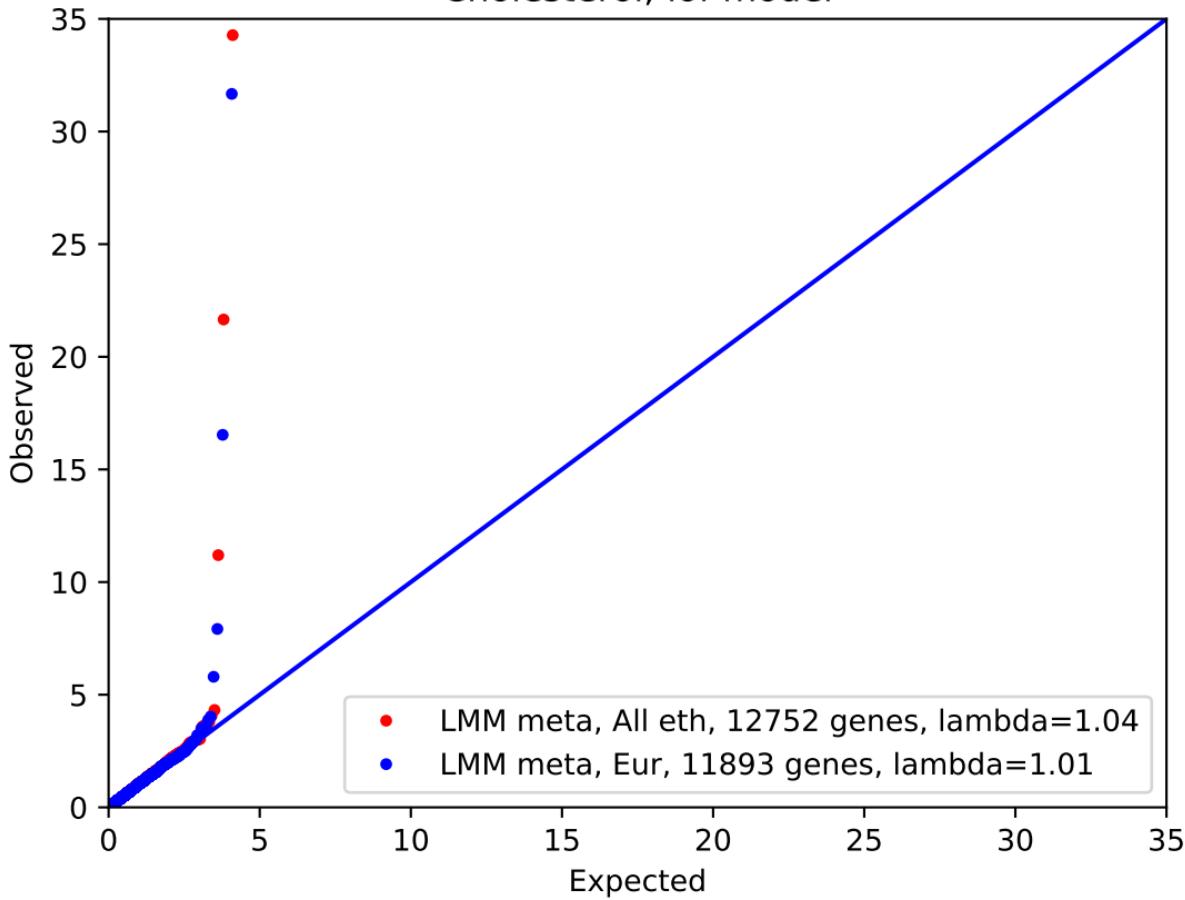
Direct bilirubin; coding model



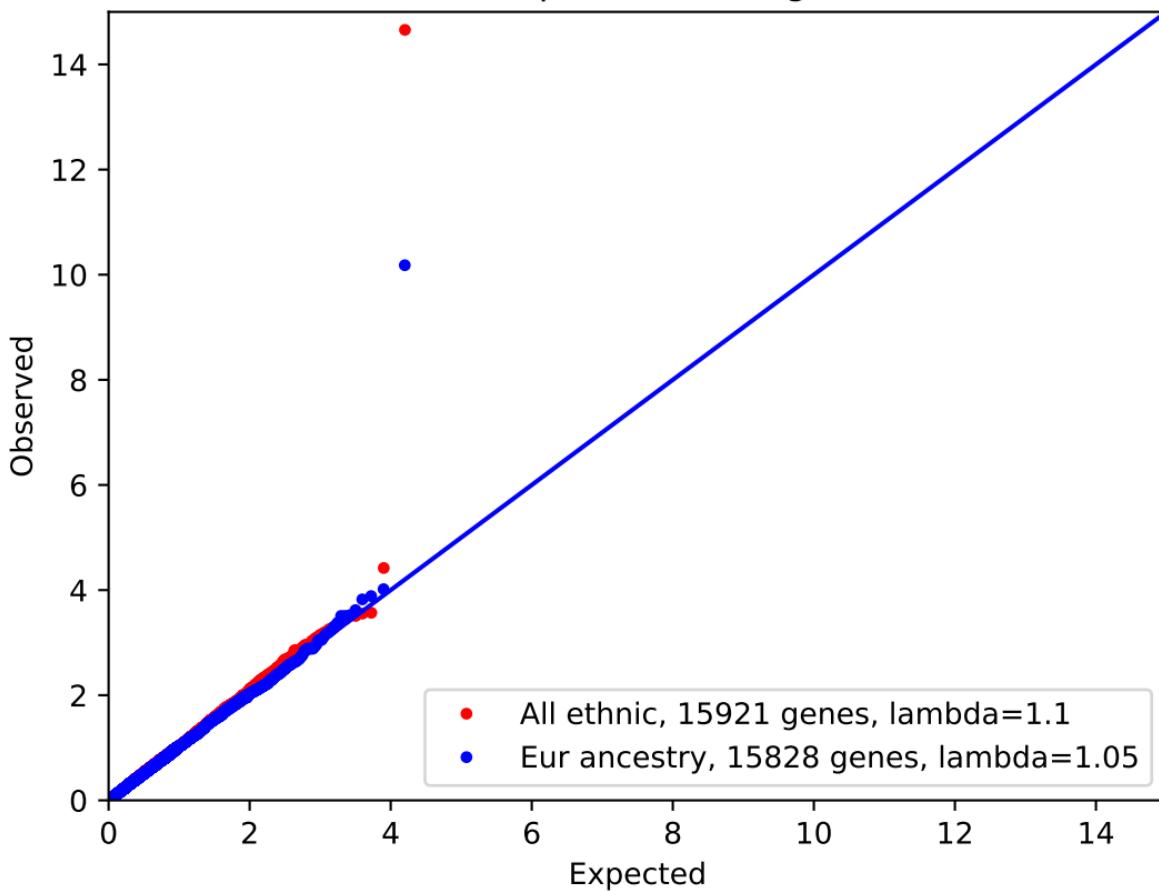
Cholesterol; coding model



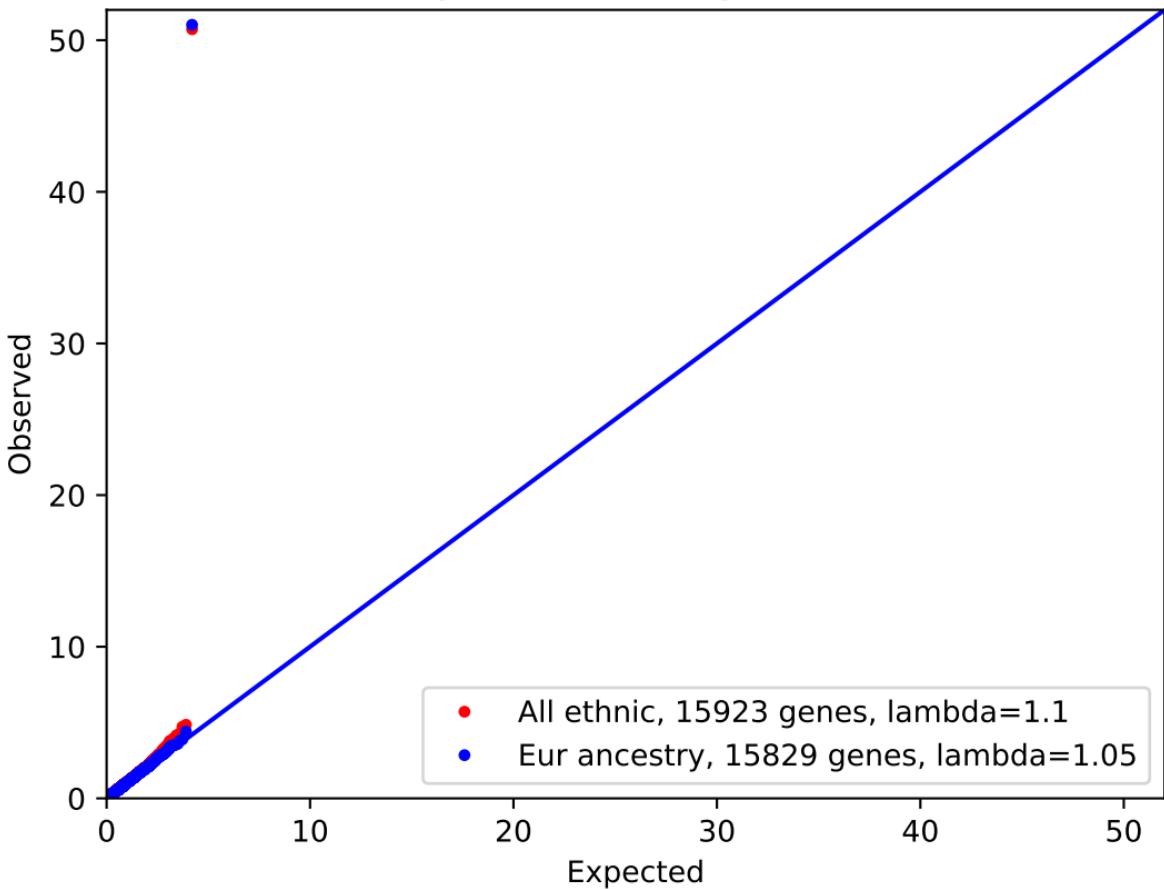
Cholesterol; lof model



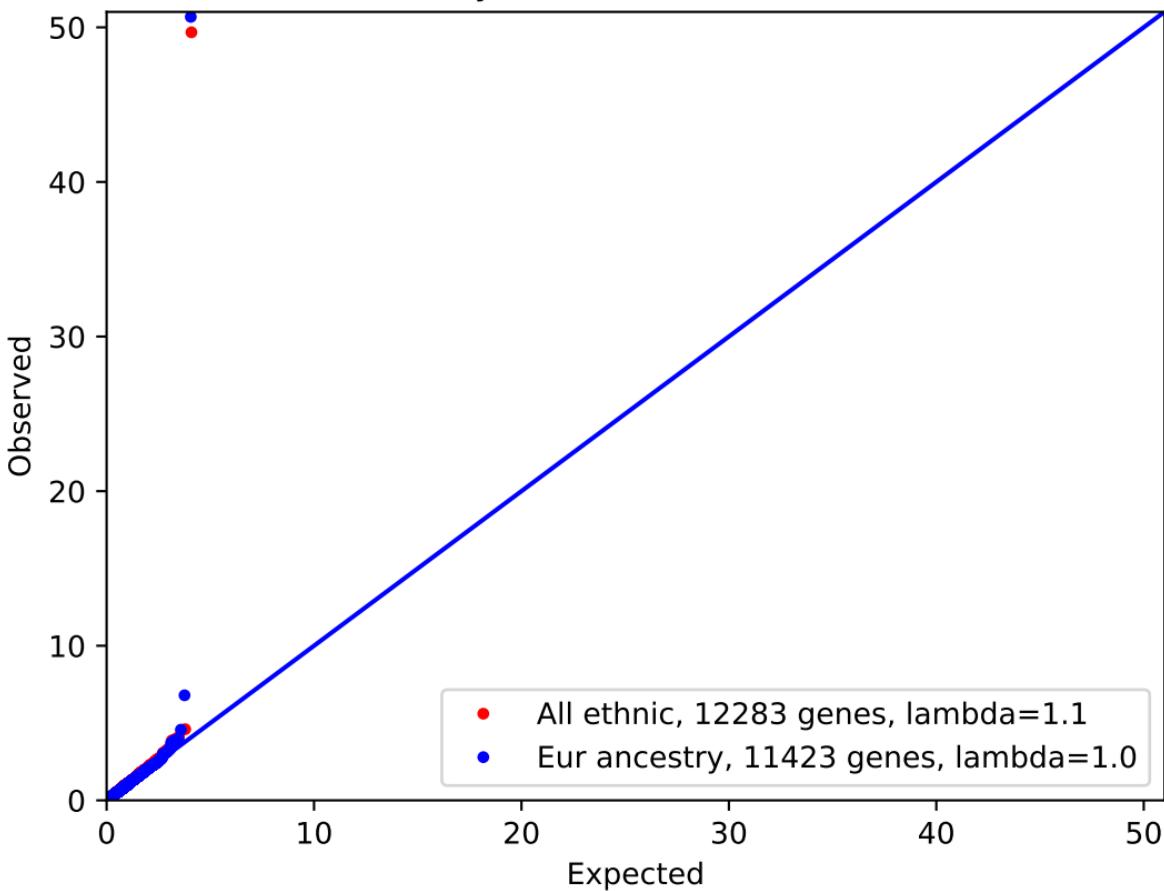
C-reactive protein; coding model



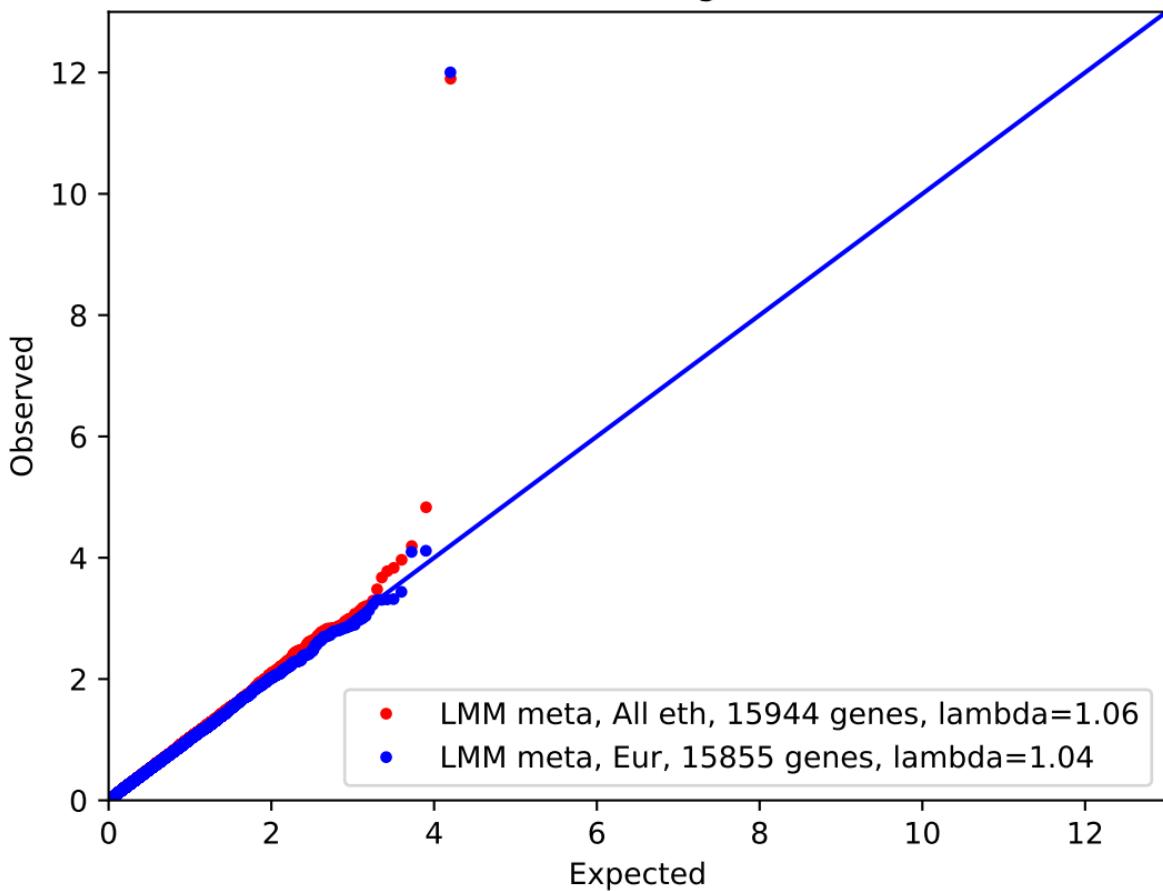
Cystatin C; coding model



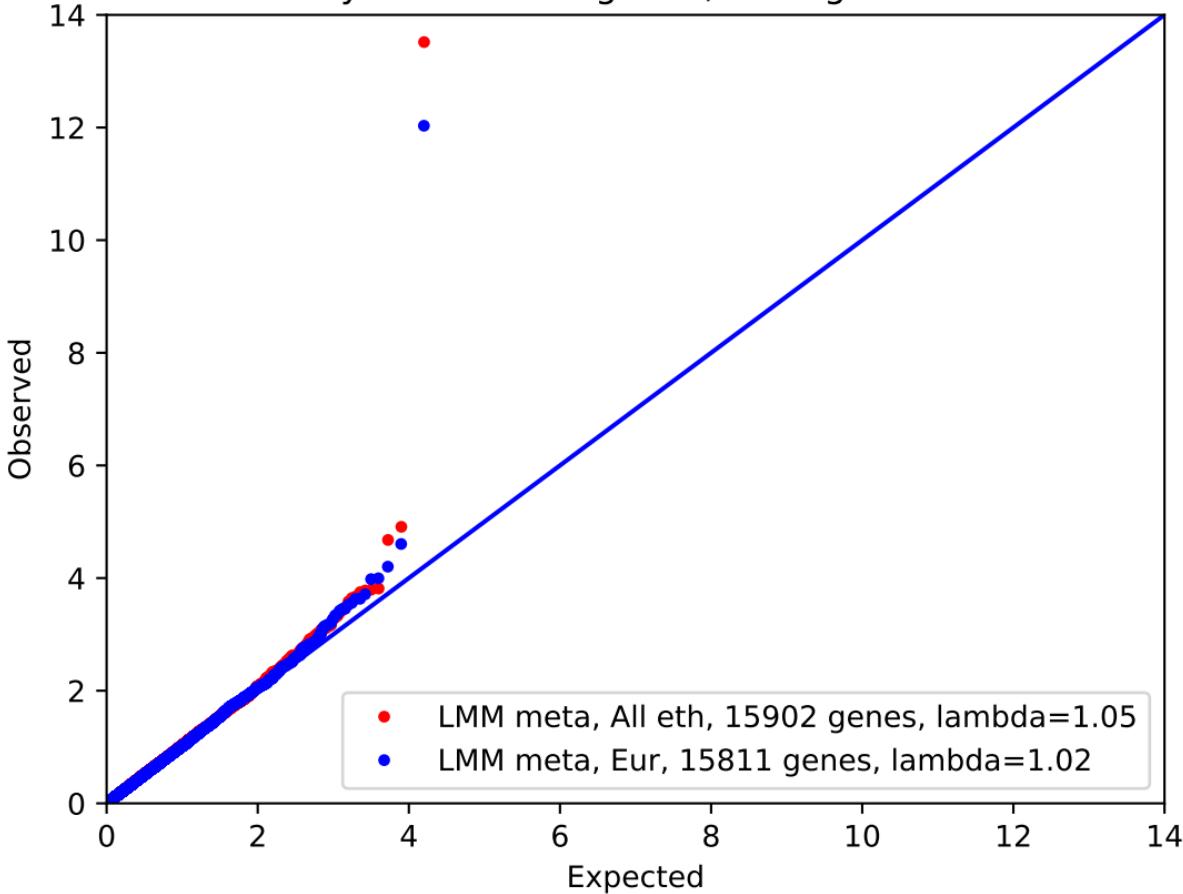
Cystatin C; lof model



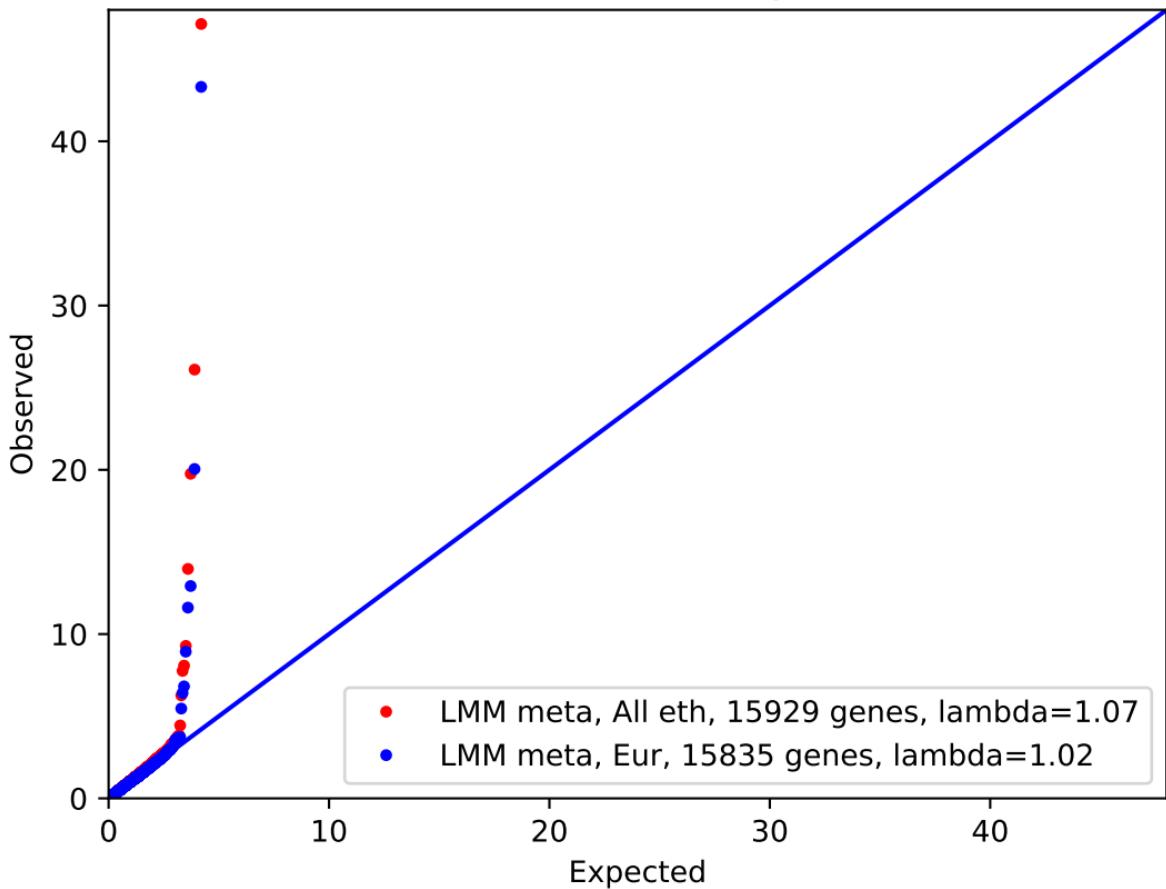
Glucose; coding model



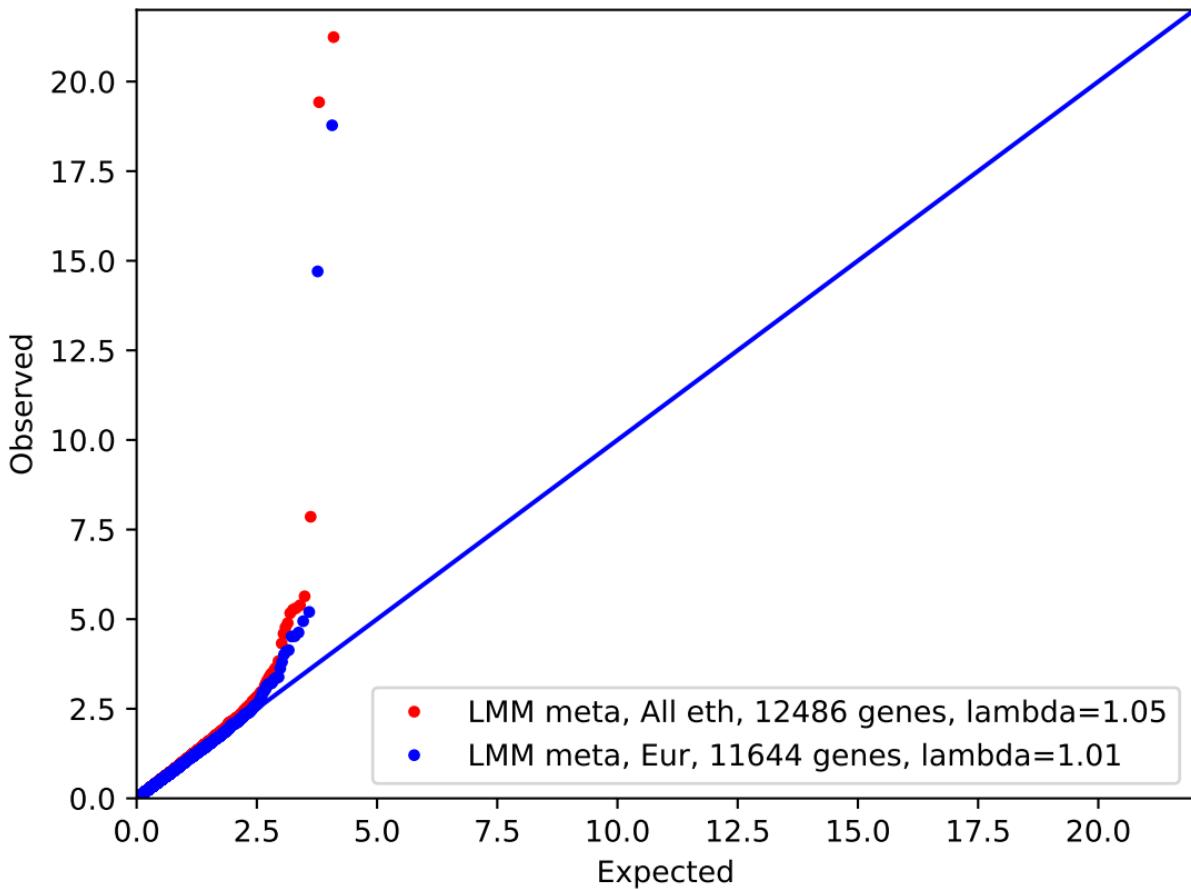
Glycated haemoglobin; coding model



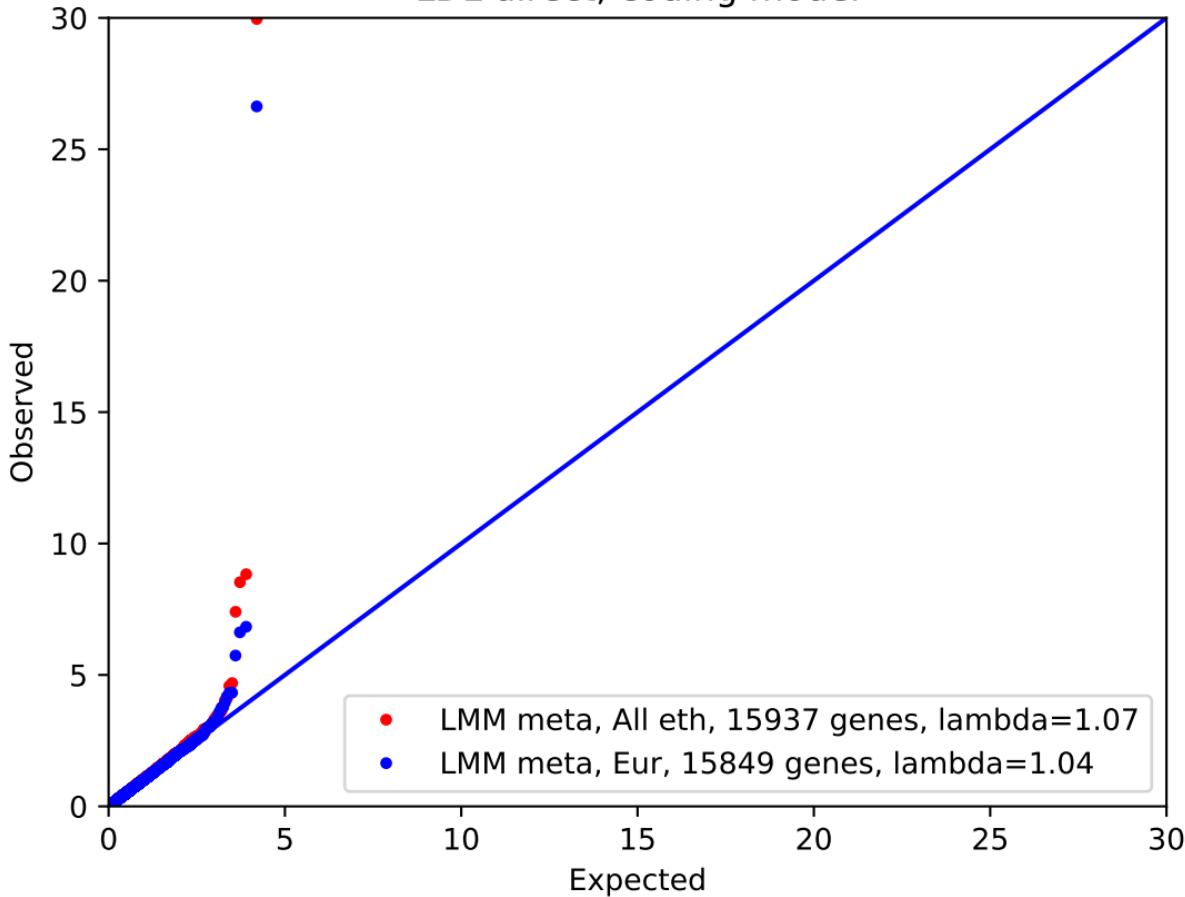
HDL cholesterol; coding model



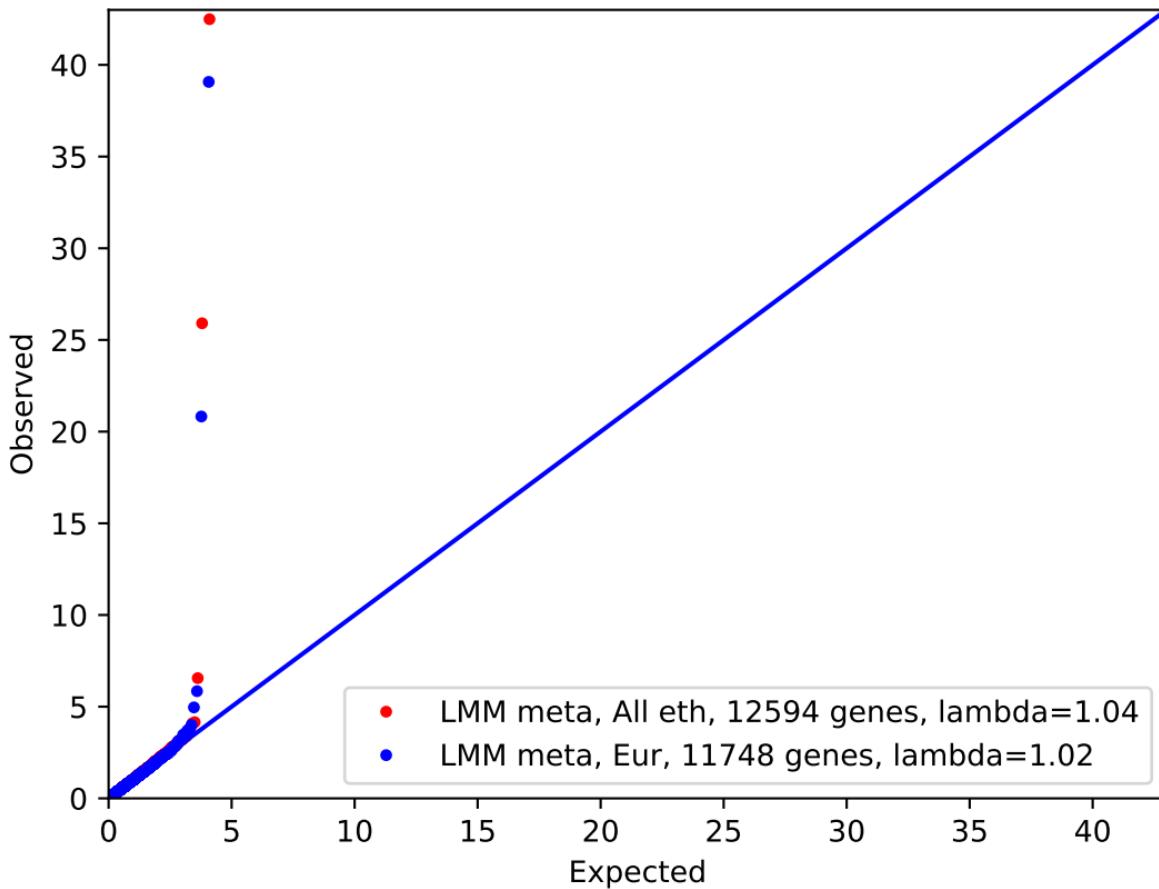
HDL cholesterol; lof model



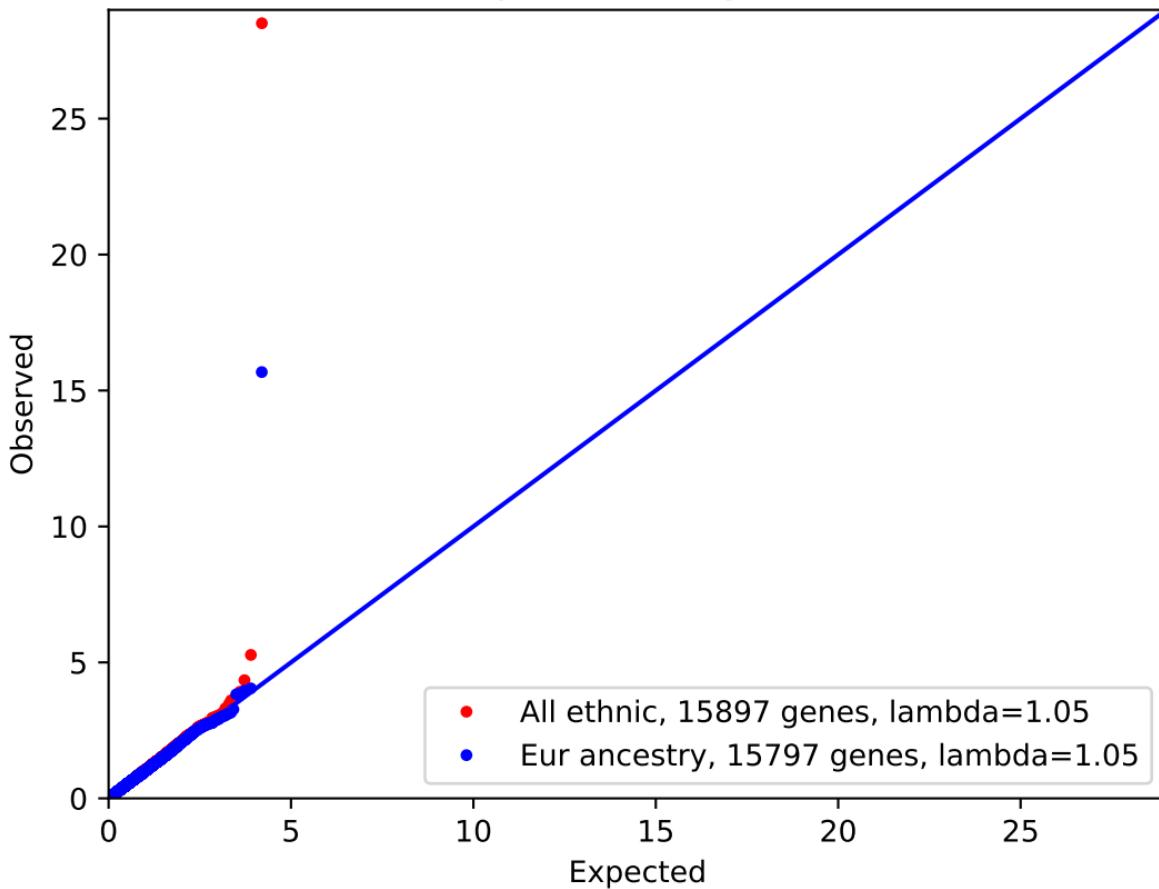
LDL direct; coding model



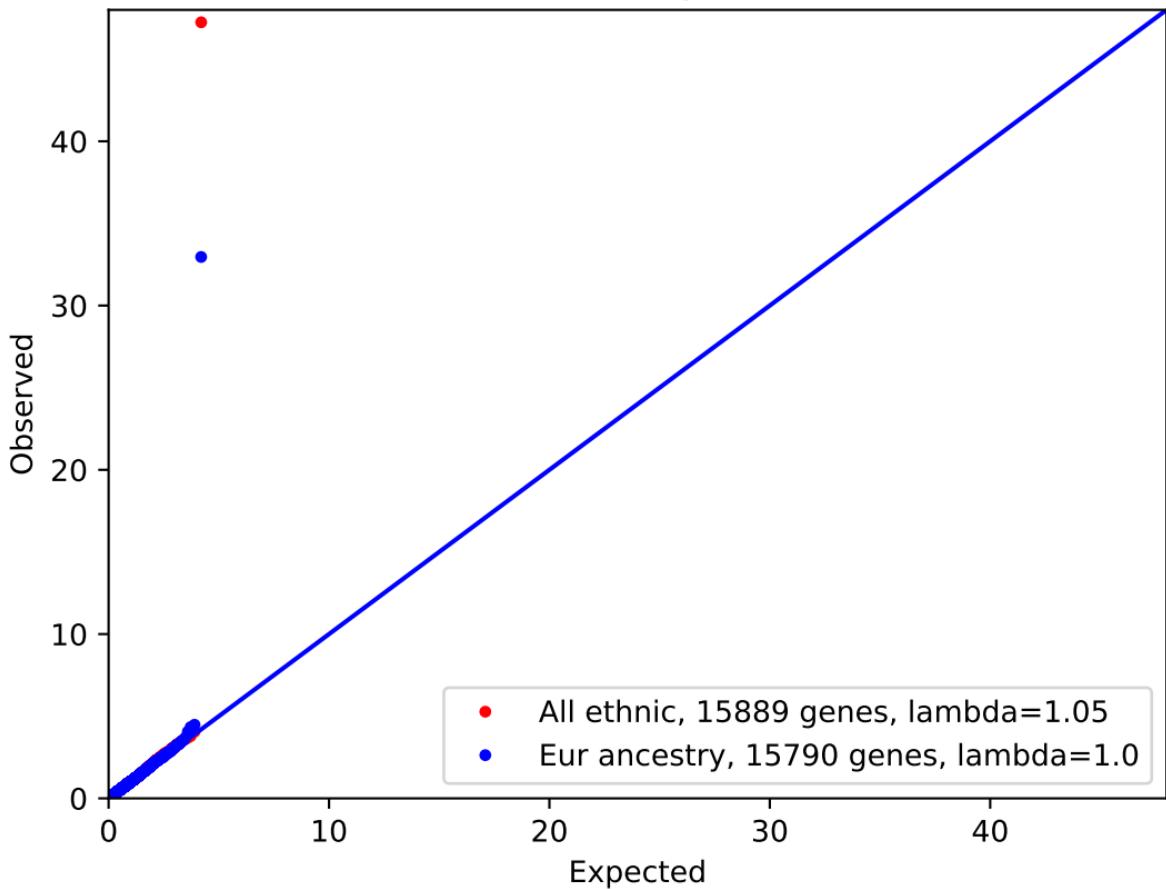
LDL direct; lof model



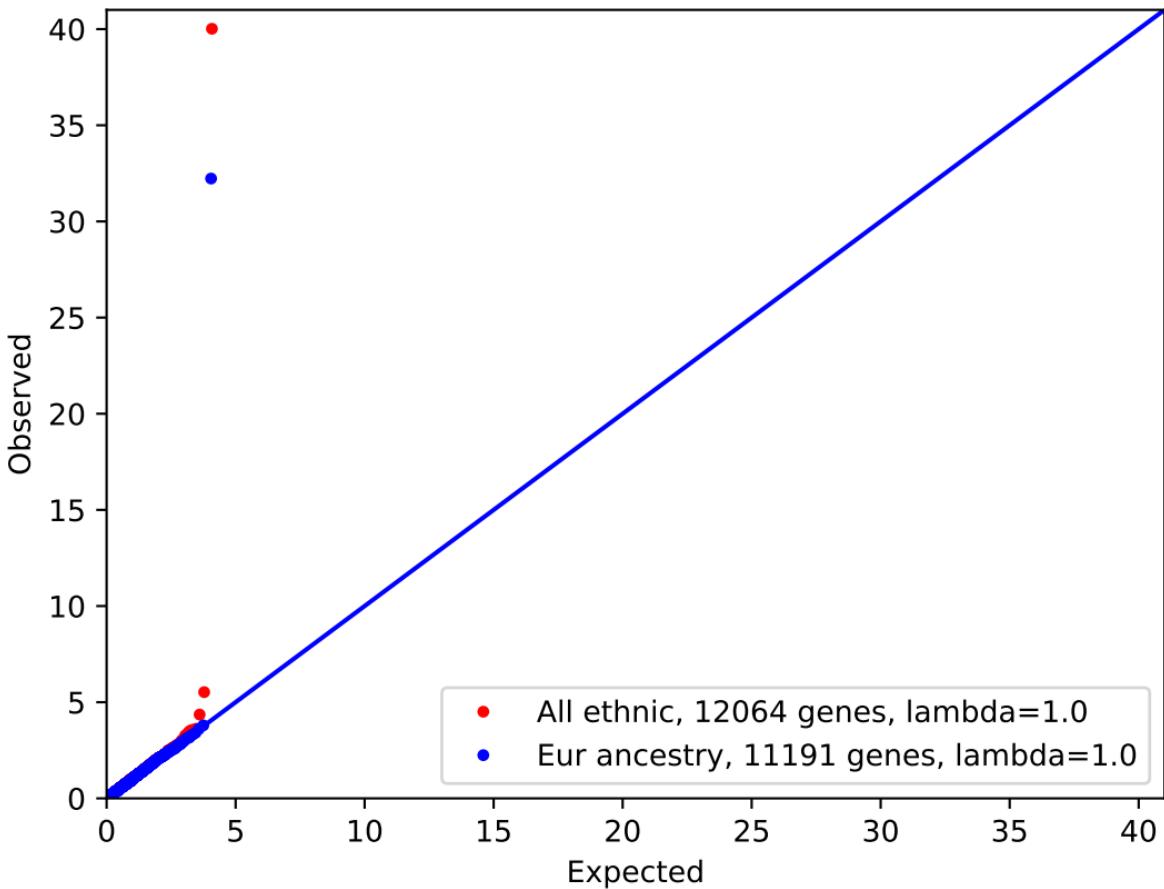
Phosphate; coding model



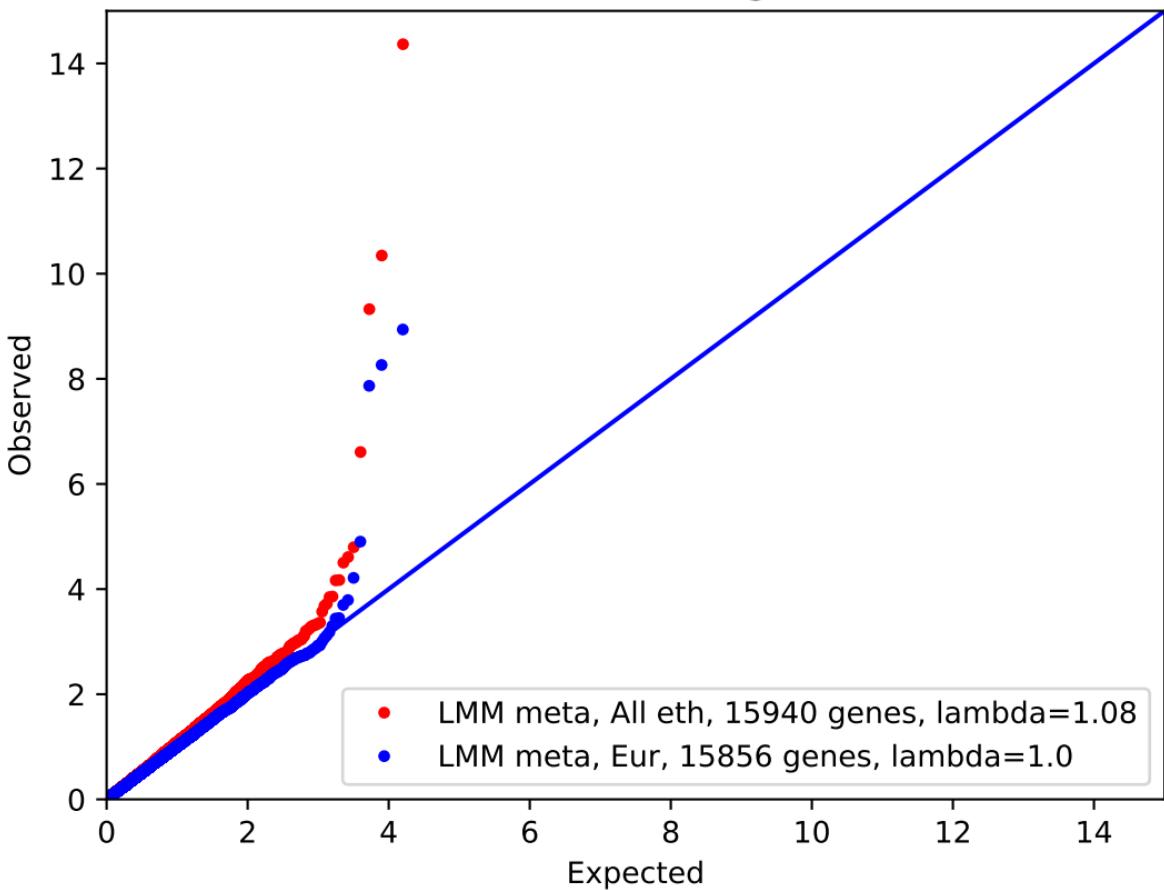
SHBG; coding model



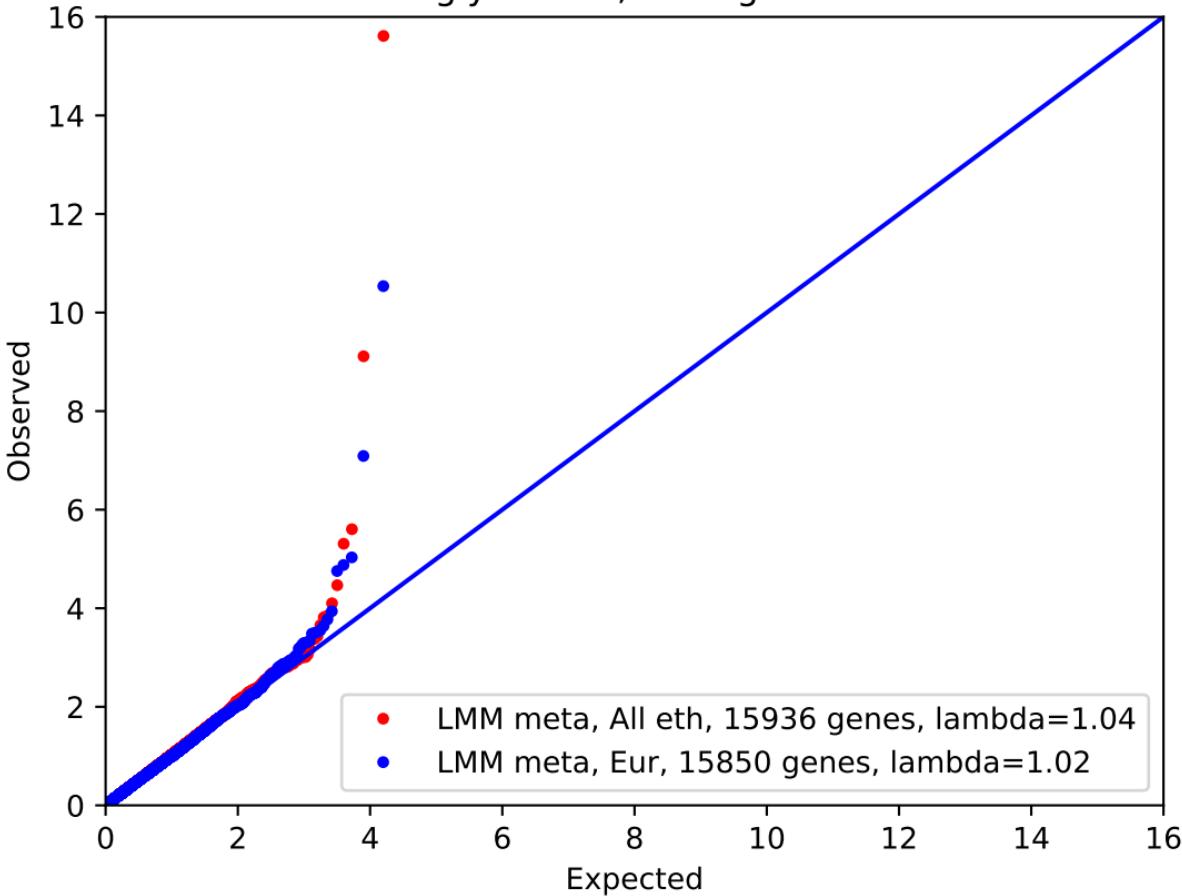
SHBG; lof model



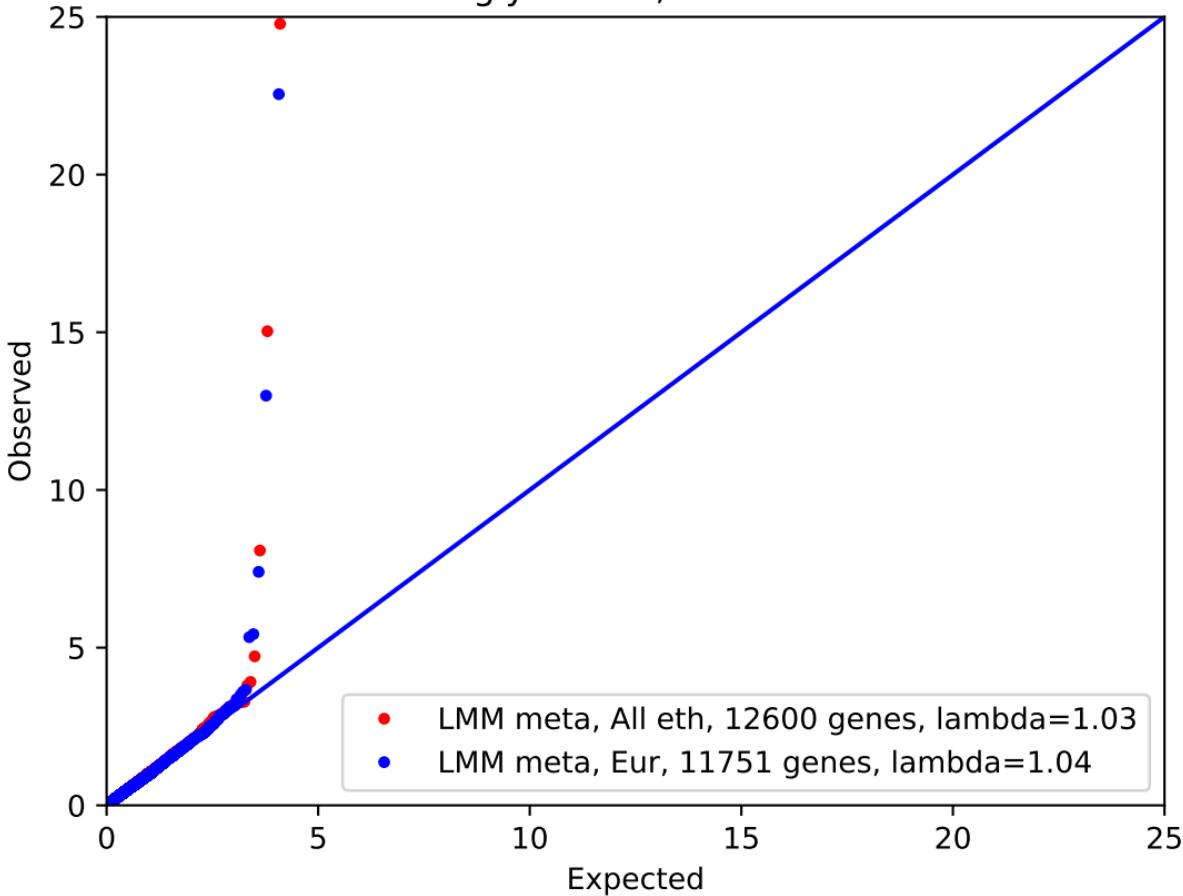
Total bilirubin; coding model



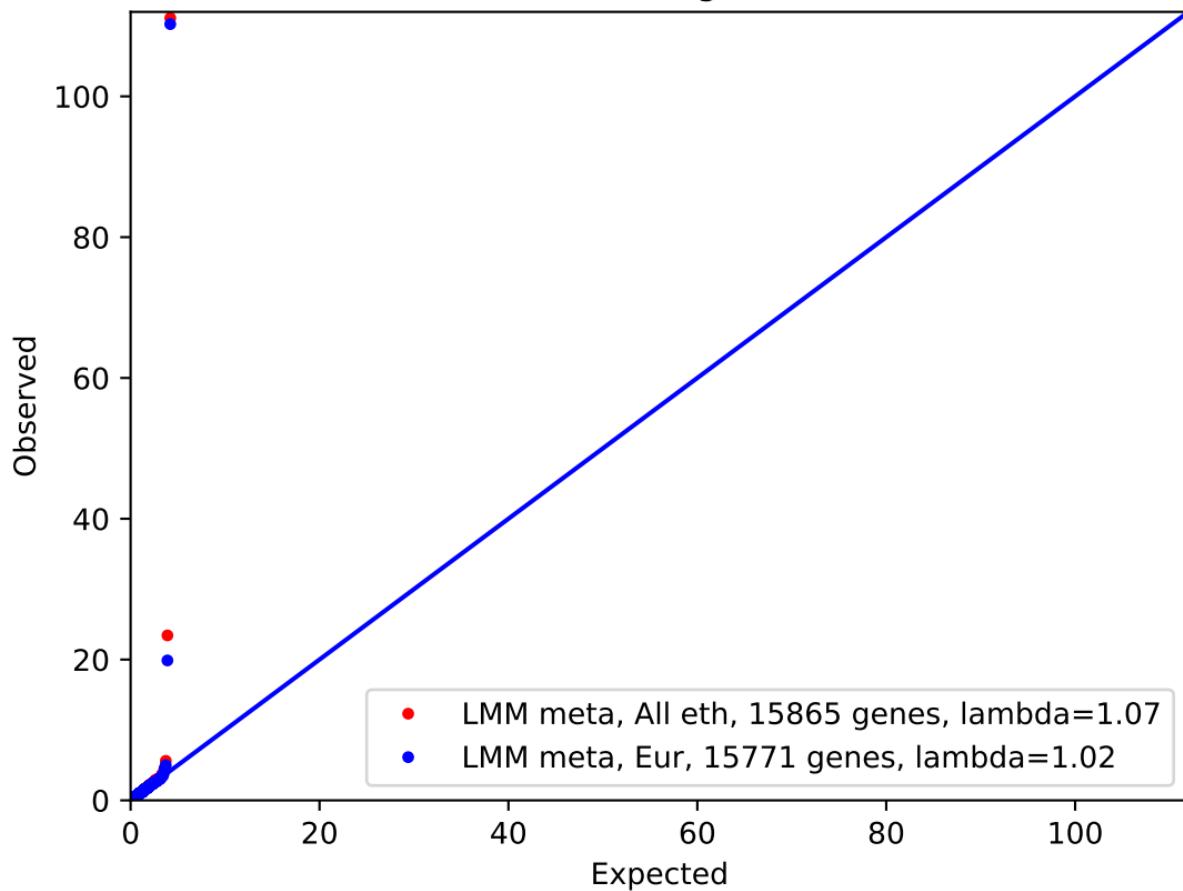
Triglycerides; coding model



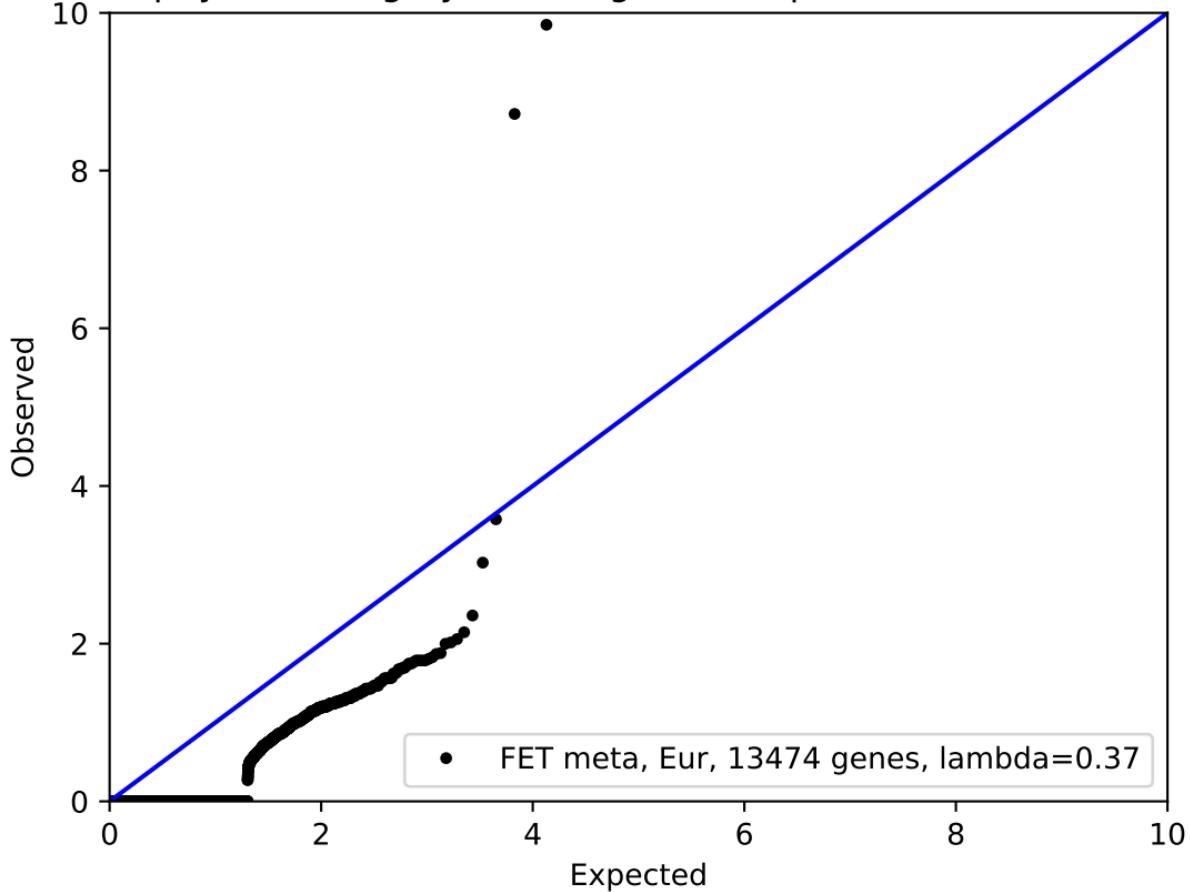
Triglycerides; lof model



Urate; coding model

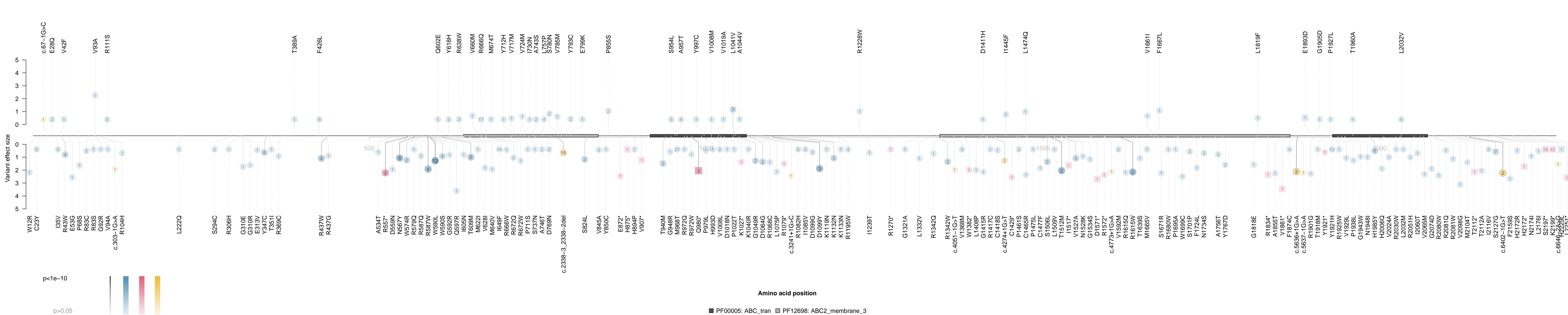


Z40.0 Prophylactic surgery for malignant neoplasm risk-factors; lof model



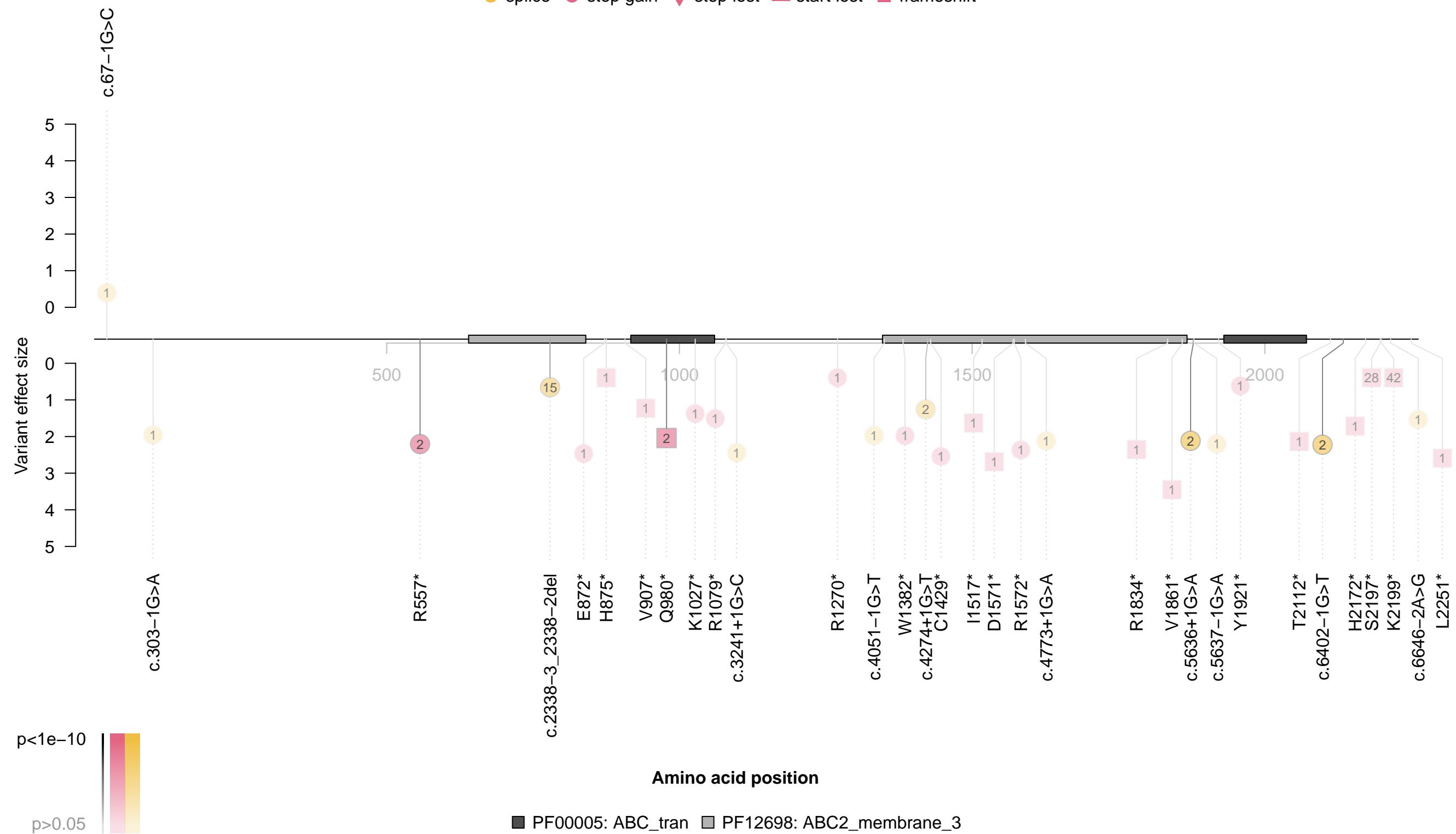
Supplementary Figure 2. Overlaid QQ plots for each phenotype that produced a statistically significant association. Shown is the number of genes analyzed and resulting lambda (genomic inflation factor) for each analysis.

0.57

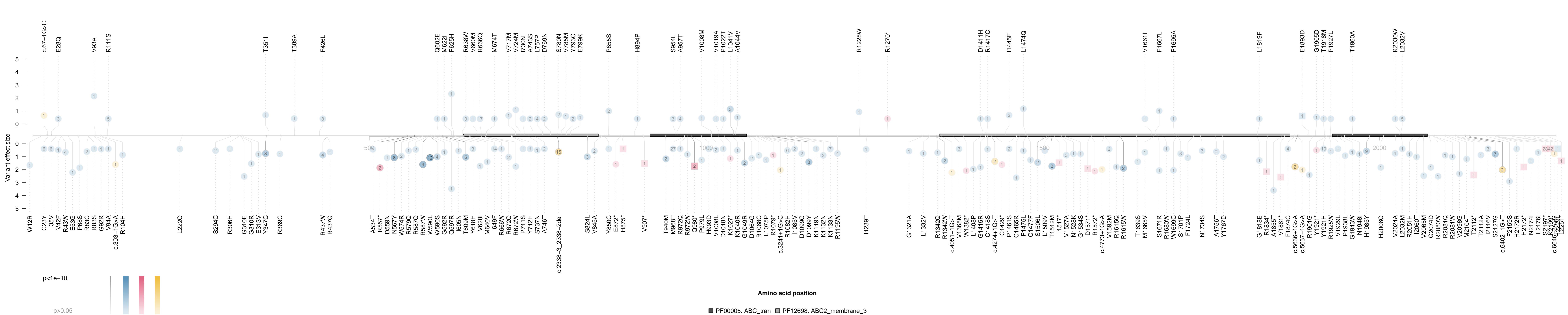


Gene=ABCA1; Chr=9; Phenotype=Apolipoprotein A; Gene effect size=-0.82

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift

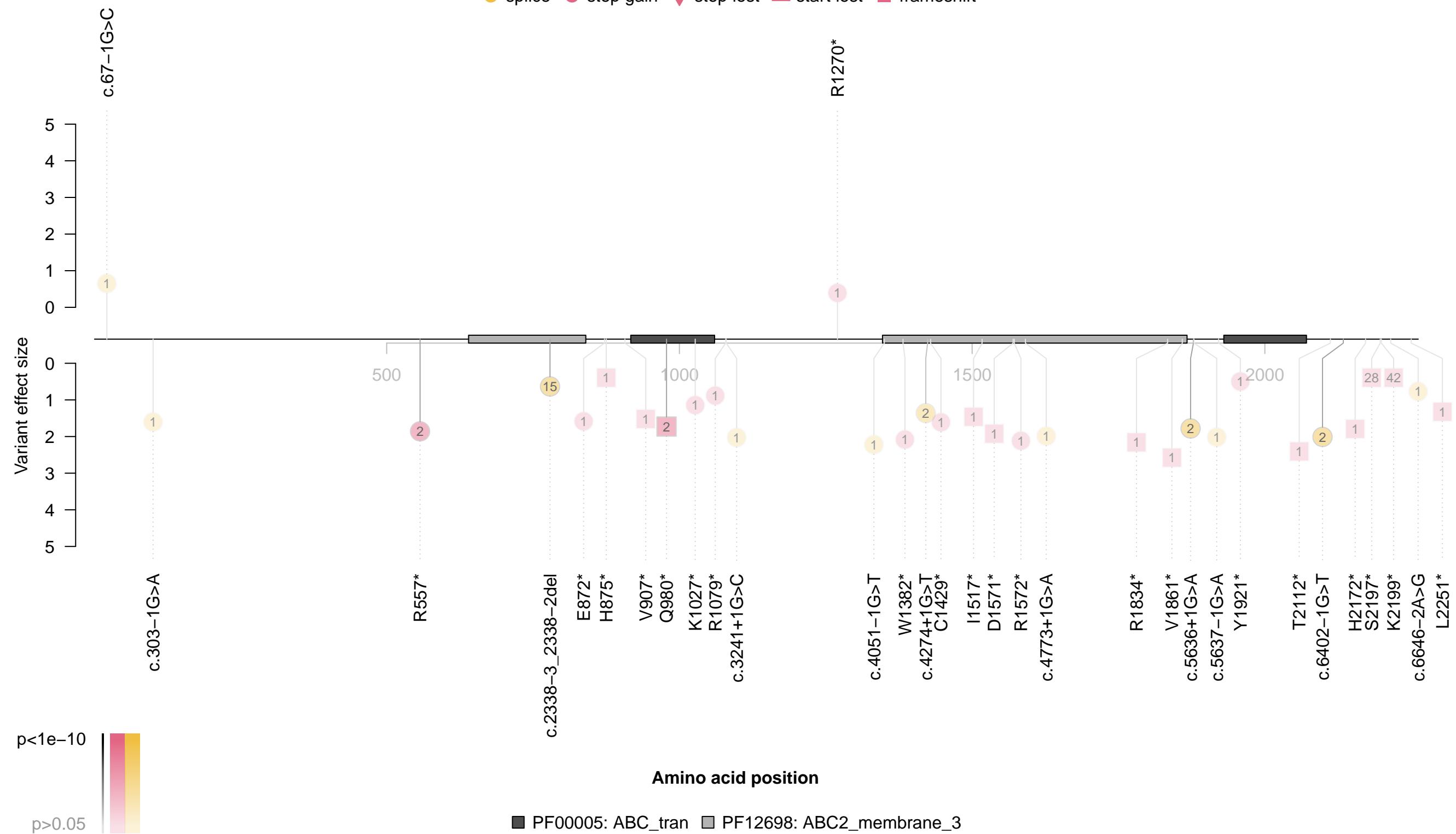


52



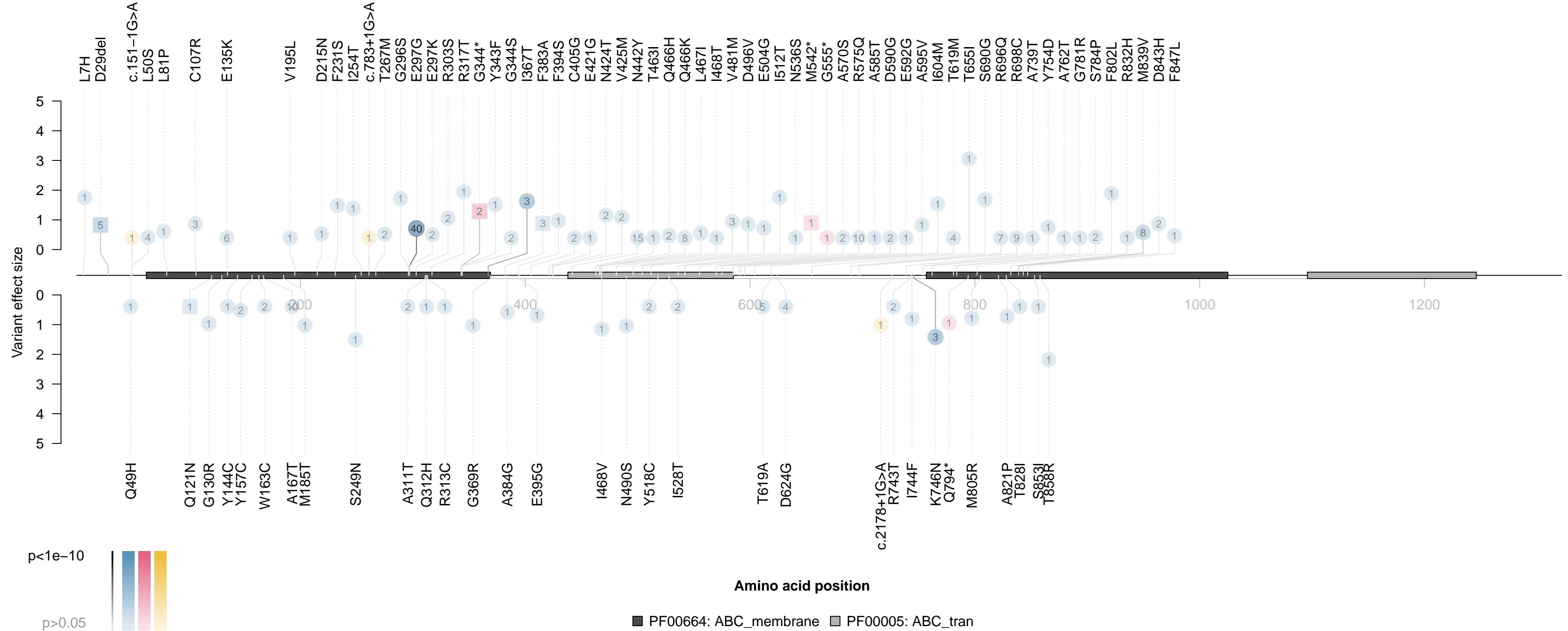
Gene=ABCA1; Chr=9; Phenotype=HDL cholesterol; Gene effect size=-0.71

● splice ● stop gain ● stop lost ● start lost ● frameshift



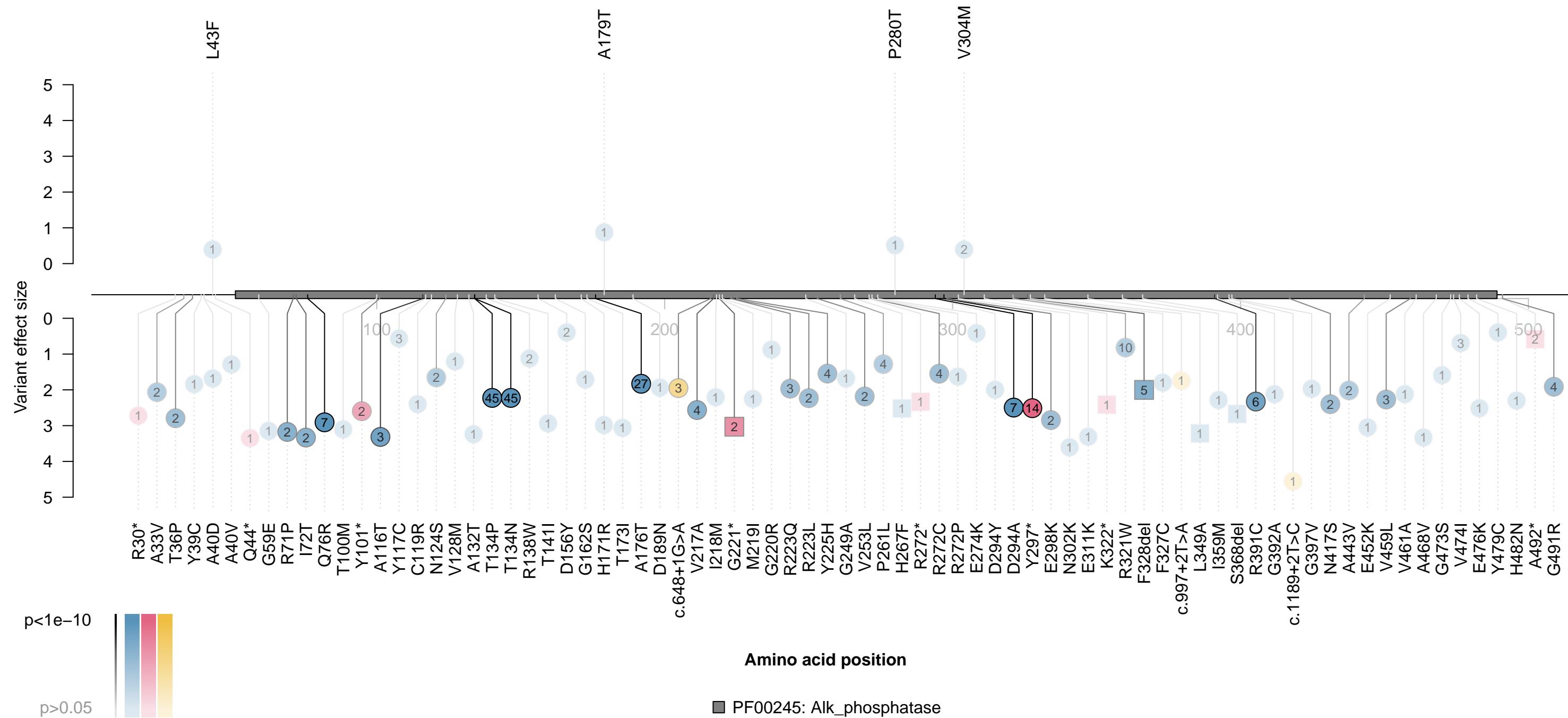
Gene=ABCB11; Chr=2; Phenotype=Alkaline phosphatase; Gene effect size=0.4

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



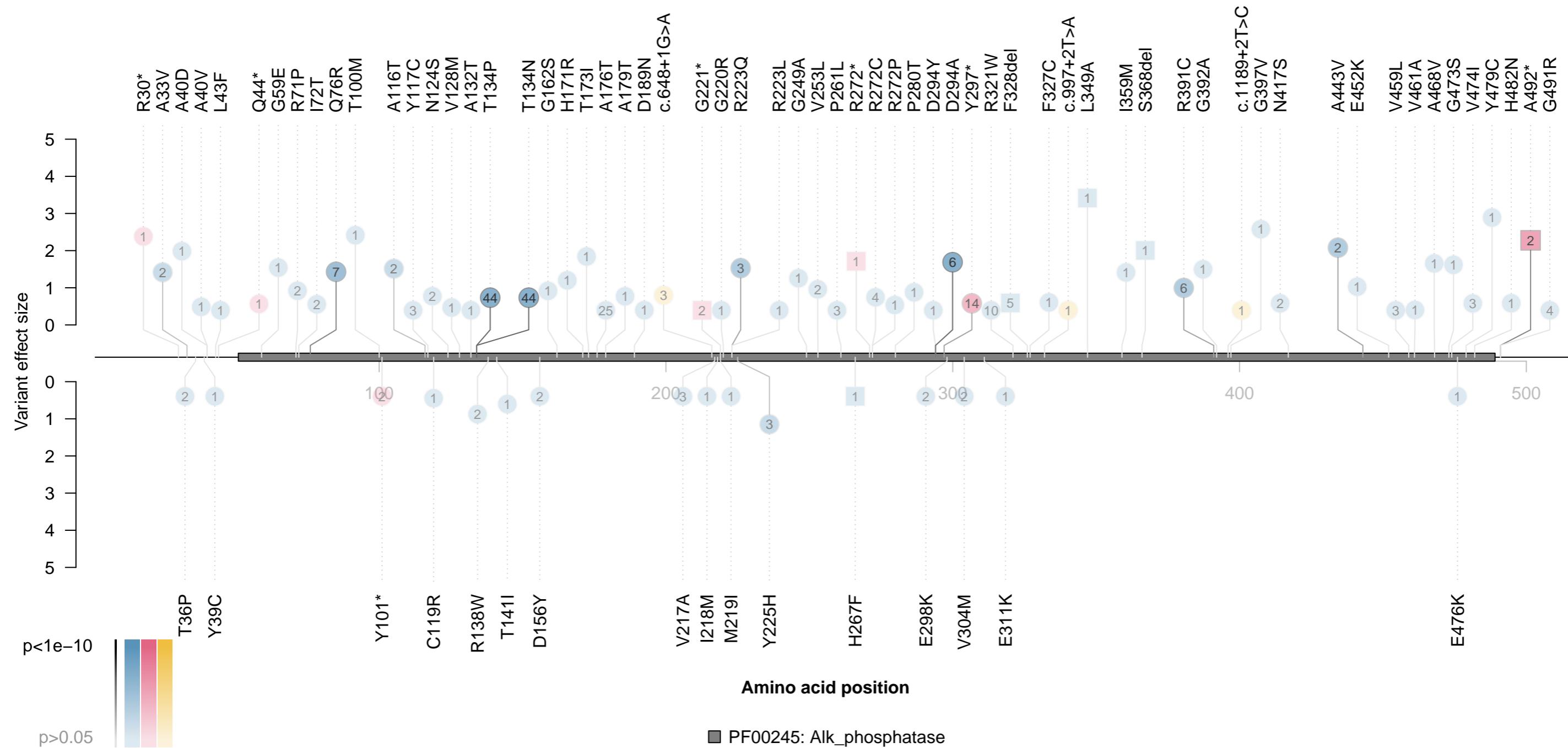
Gene=ALPL; Chr=1; Phenotype=Alkaline phosphatase; Gene effect size=-2.08

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



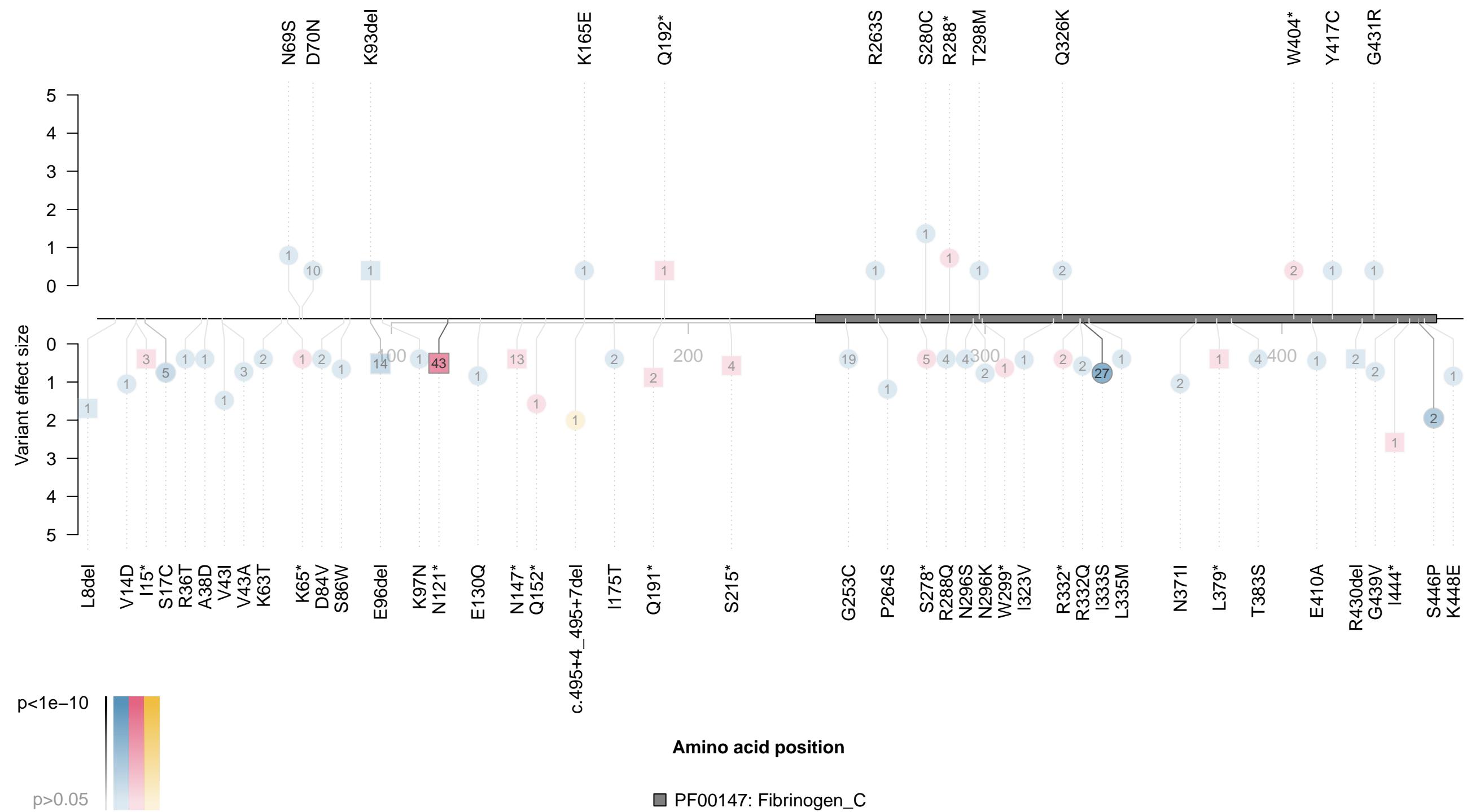
Gene=ALPL; Chr=1; Phenotype=Phosphate; Gene effect size=0.72

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



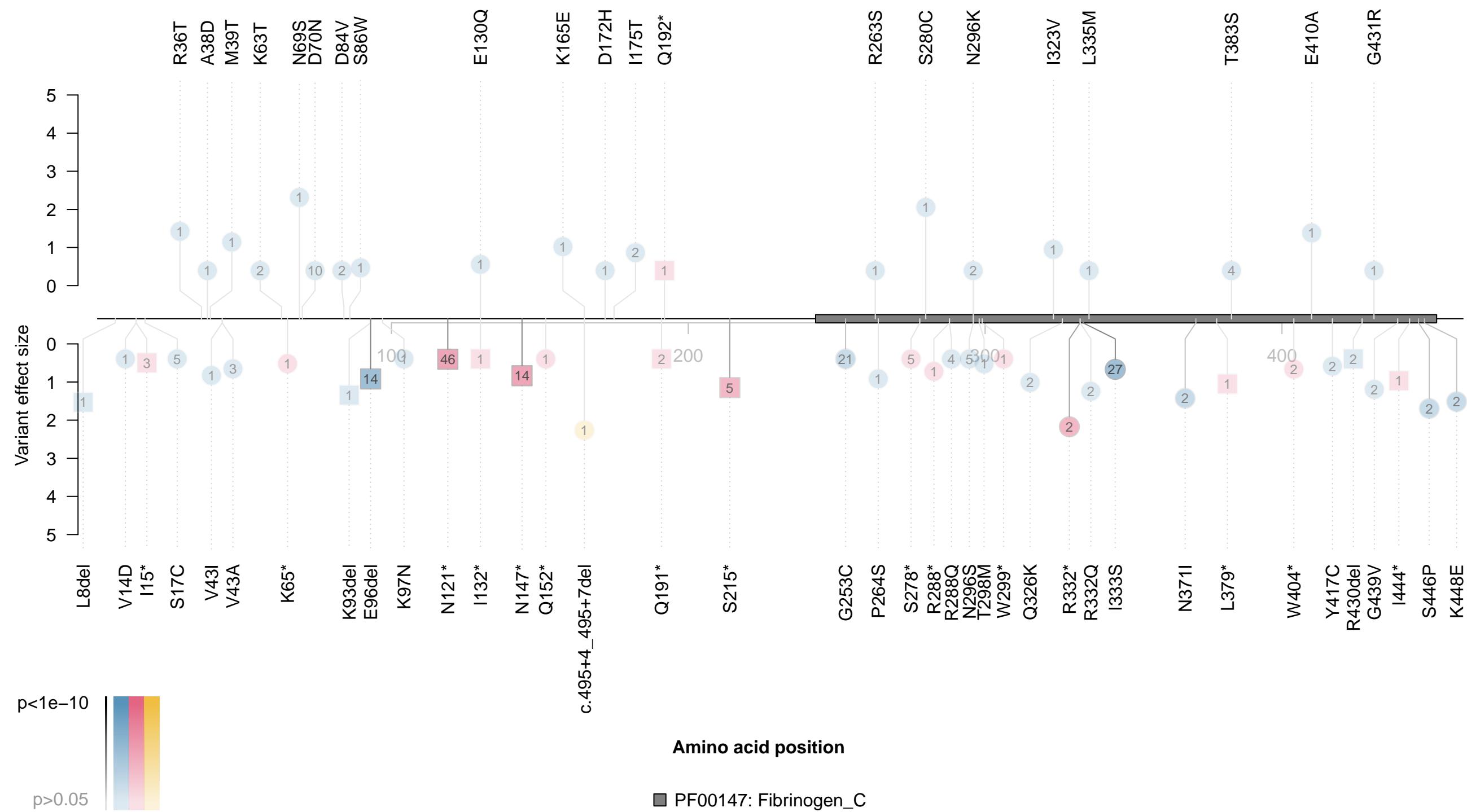
Gene=ANGPTL3; Chr=1; Phenotype=Apolipoprotein A; Gene effect size=-0.52

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



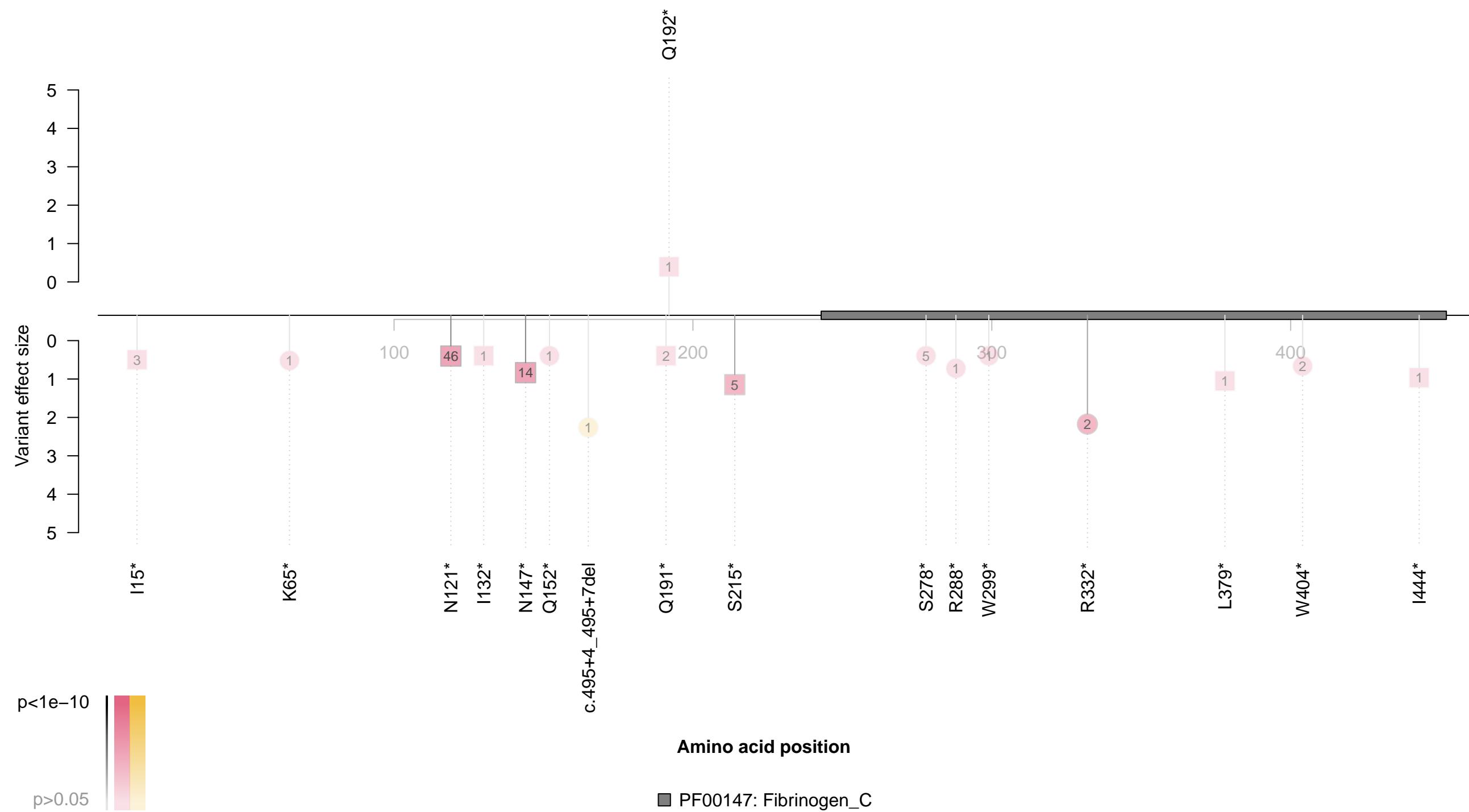
Gene=ANGPTL3; Chr=1; Phenotype=Cholesterol; Gene effect size=-0.5

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



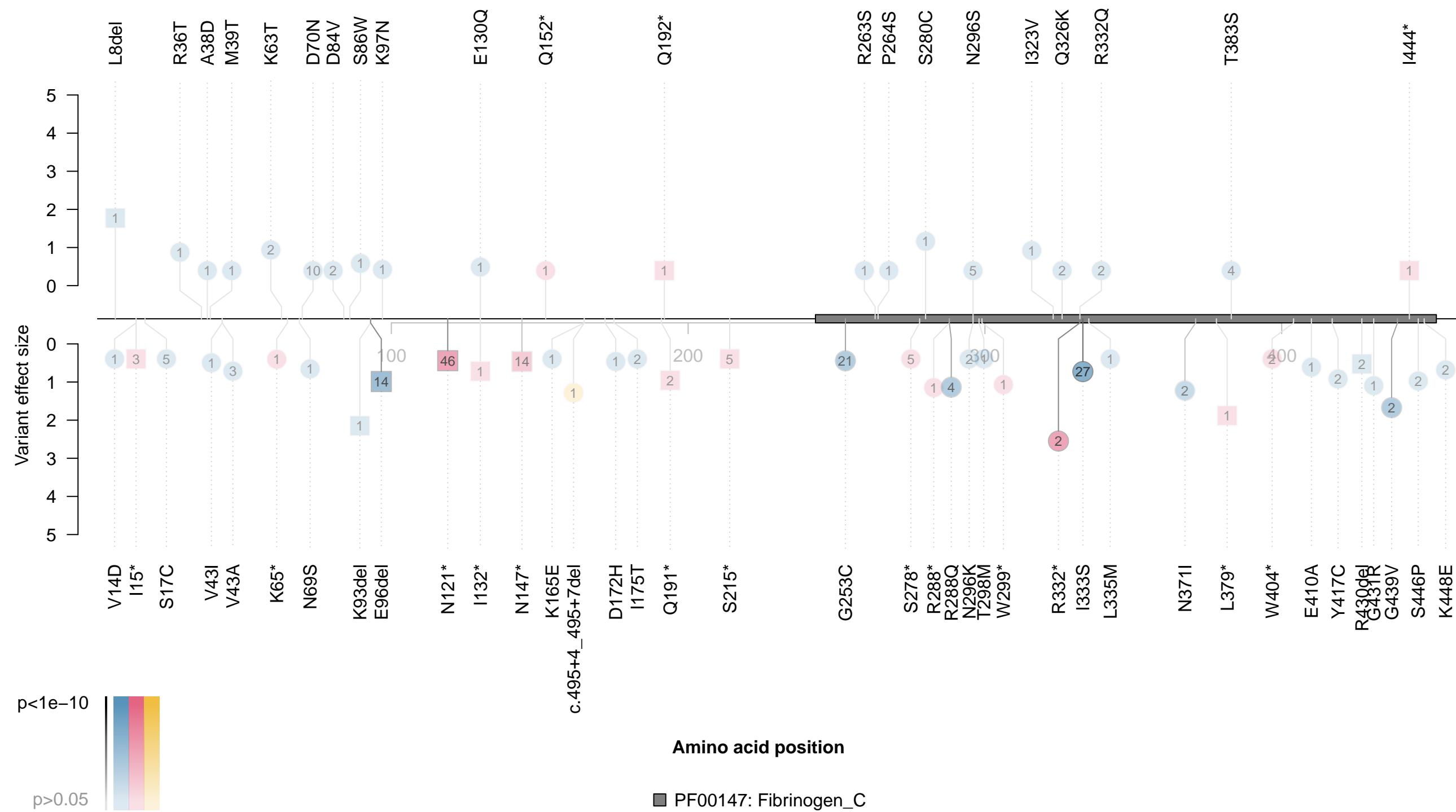
Gene=ANGPTL3; Chr=1; Phenotype=Cholesterol; Gene effect size=-0.66

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



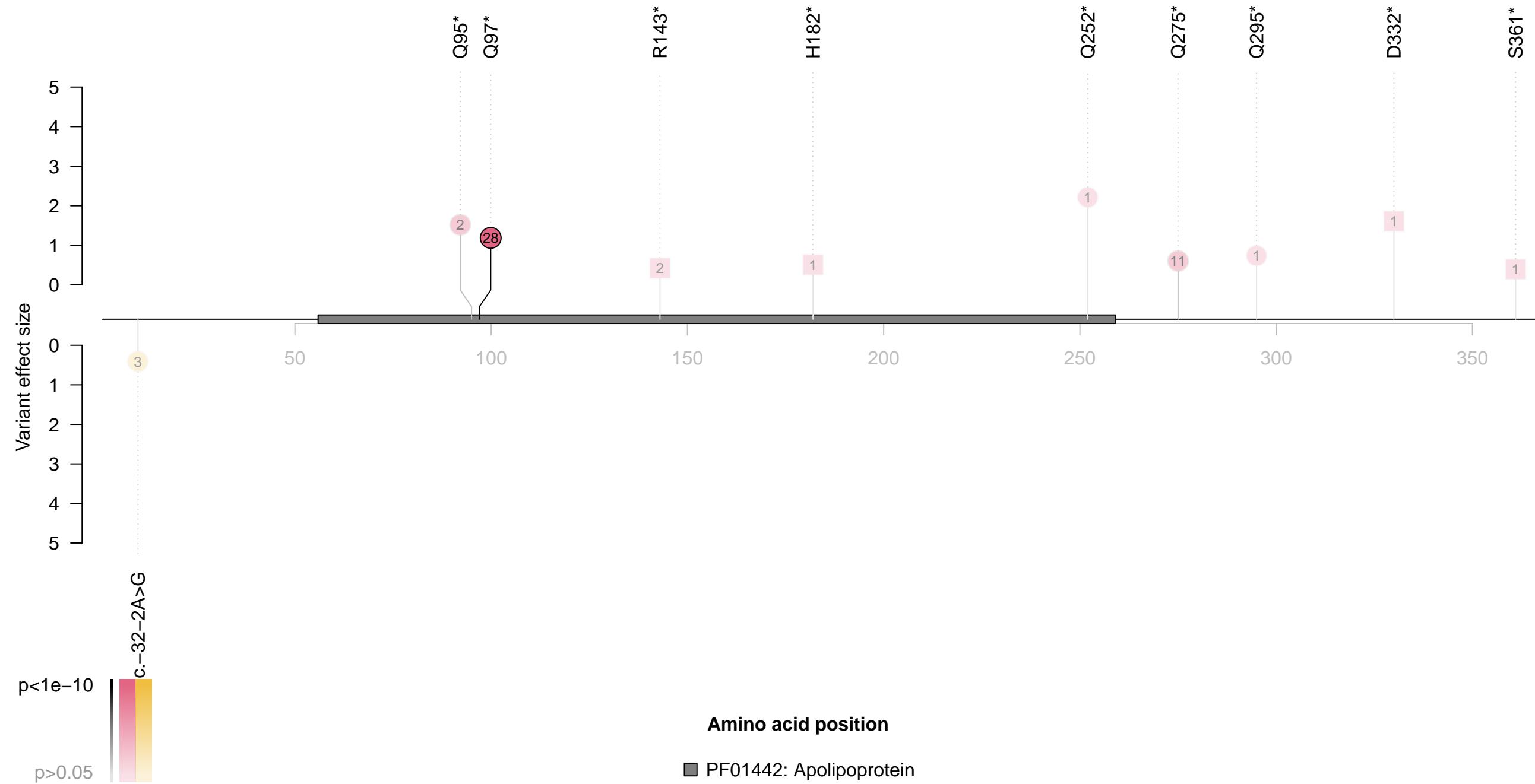
Gene=ANGPTL3; Chr=1; Phenotype=Triglycerides; Gene effect size=-0.49

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



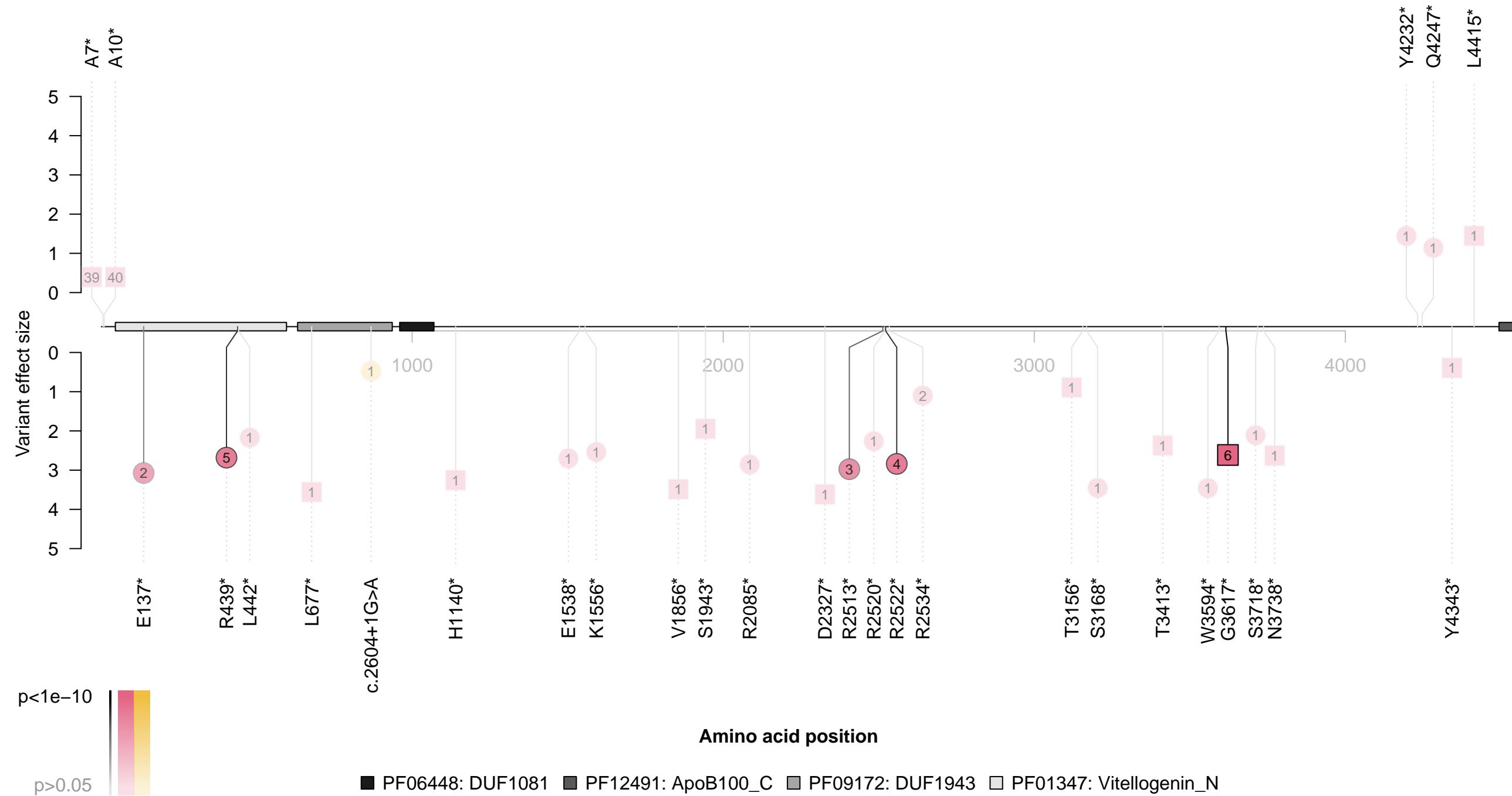
Gene=APOA5; Chr=1; Phenotype=Triglycerides; Gene effect size=1

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



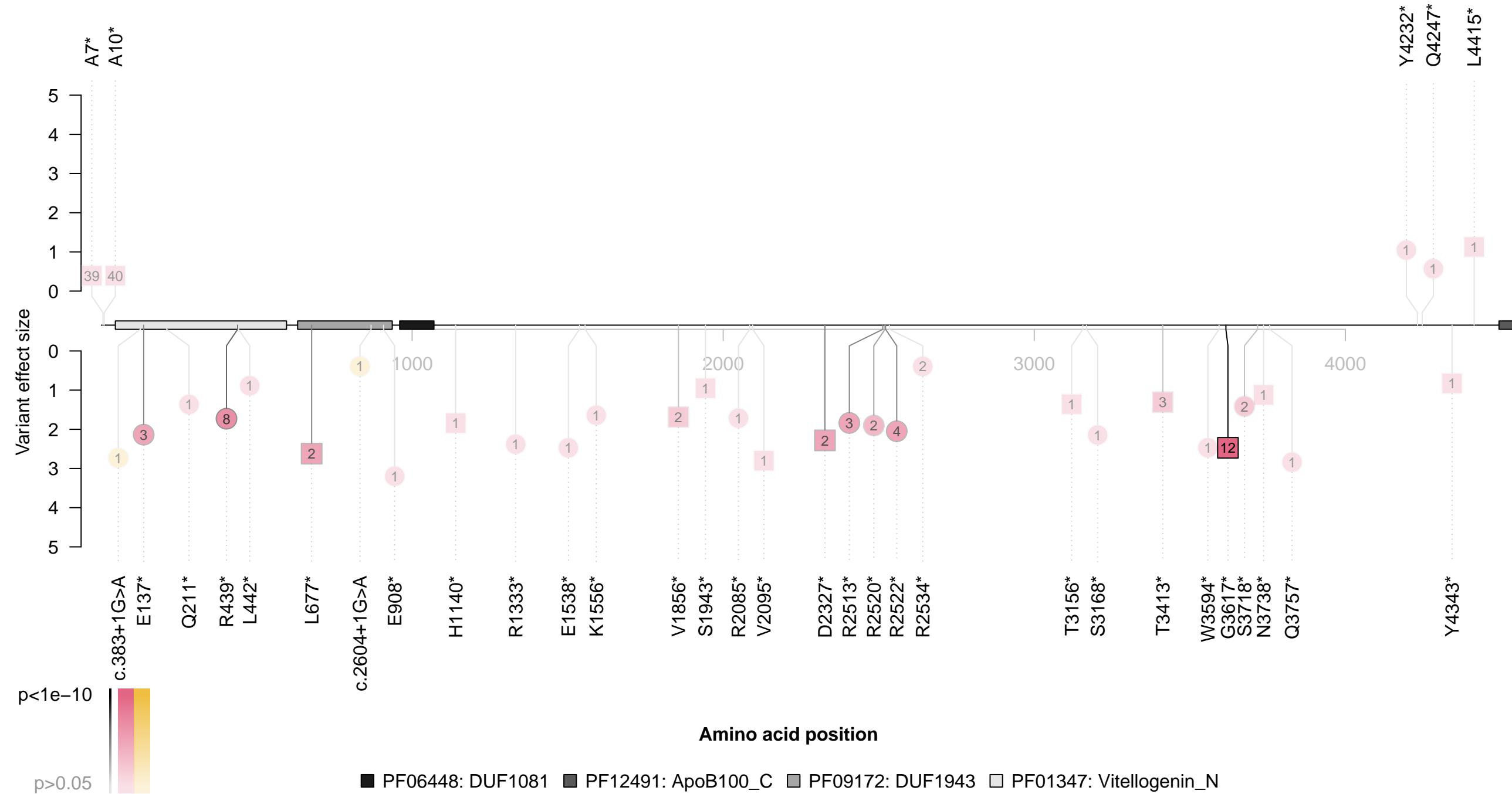
Gene=APOB; Chr=2; Phenotype=Apolipoprotein B; Gene effect size=-1.07

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



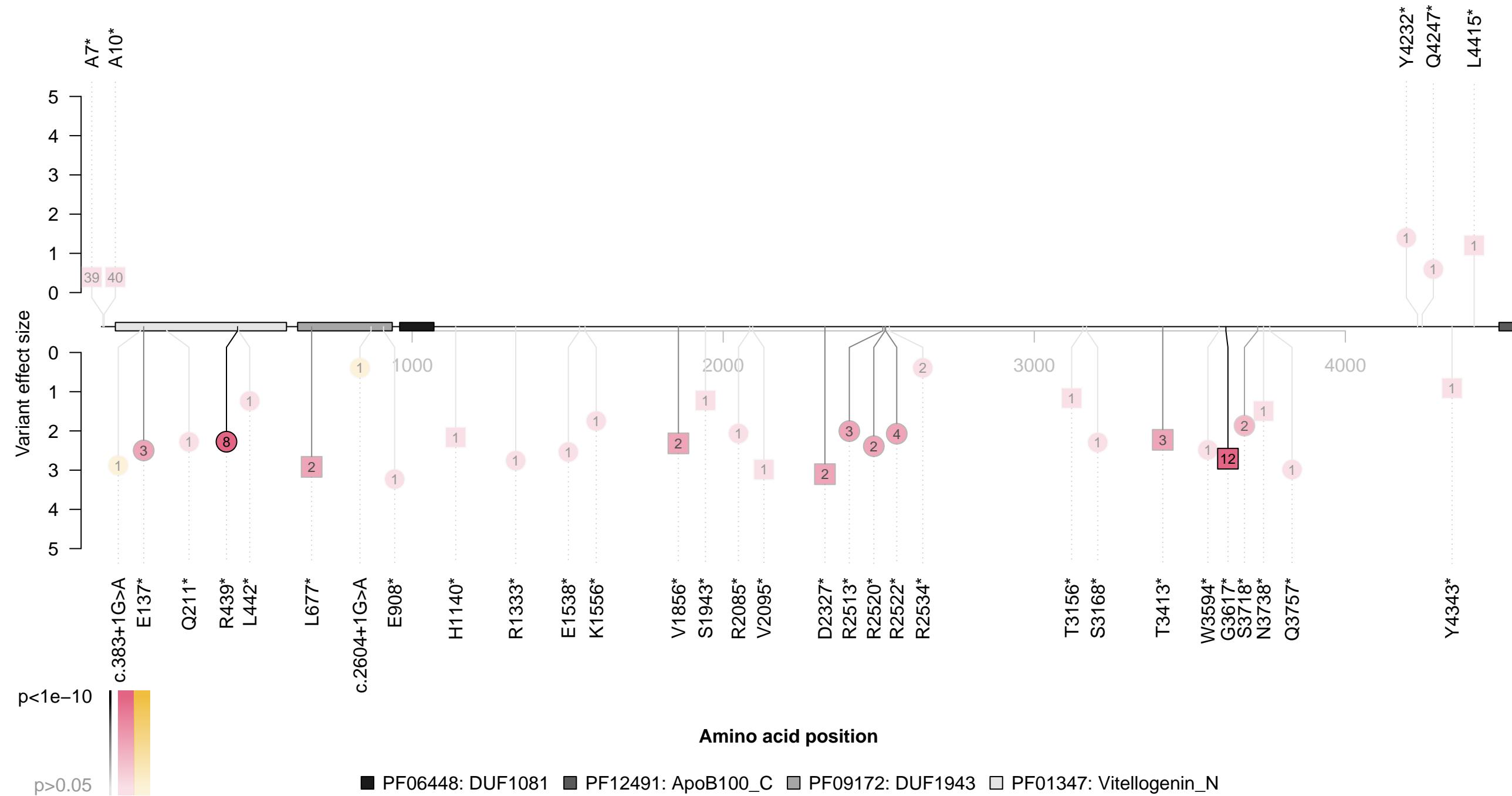
Gene=APOB; Chr=2; Phenotype=Cholesterol; Gene effect size=-1.06

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



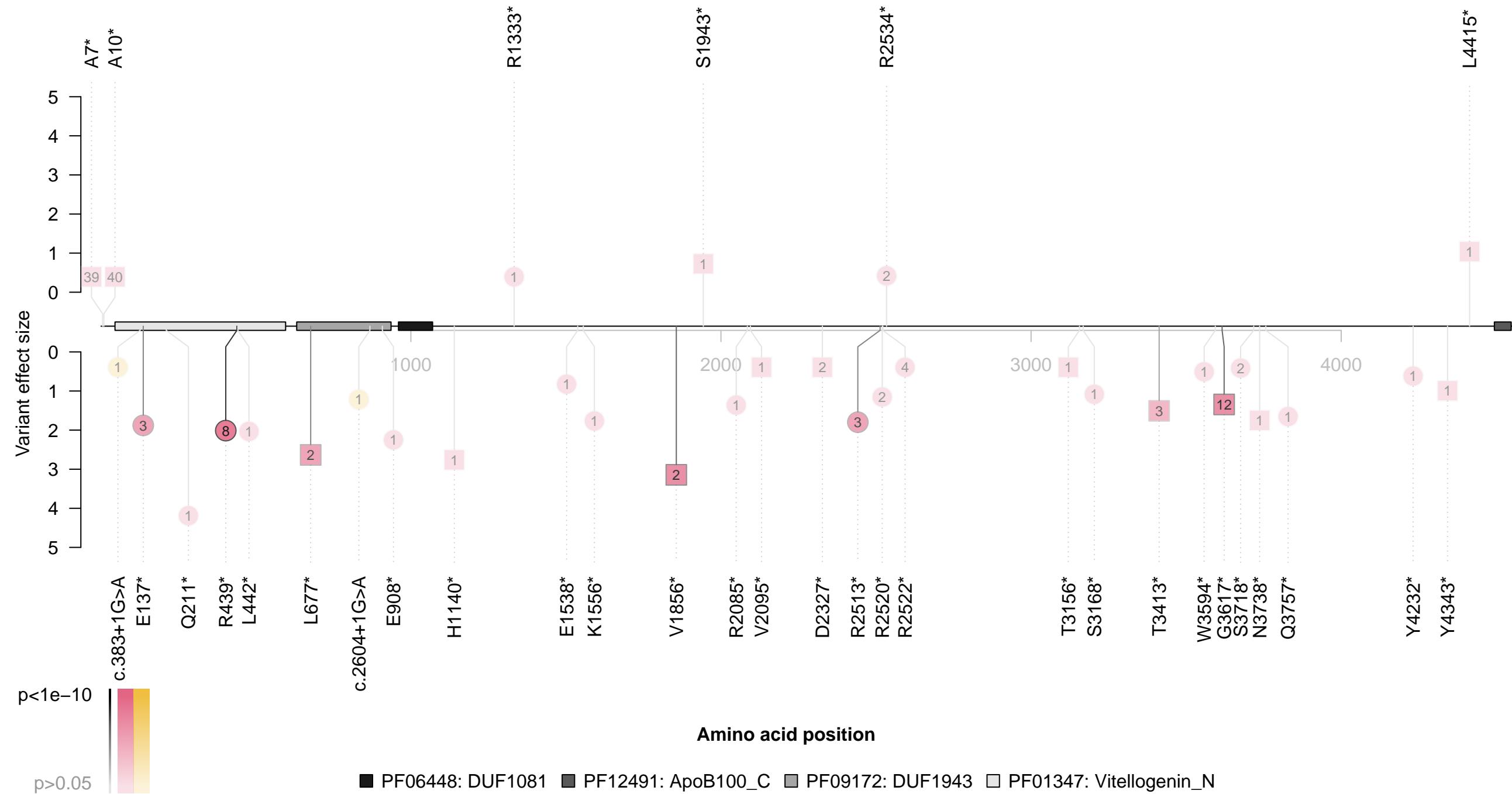
Gene=APOB; Chr=2; Phenotype=LDL direct; Gene effect size=-1.22

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



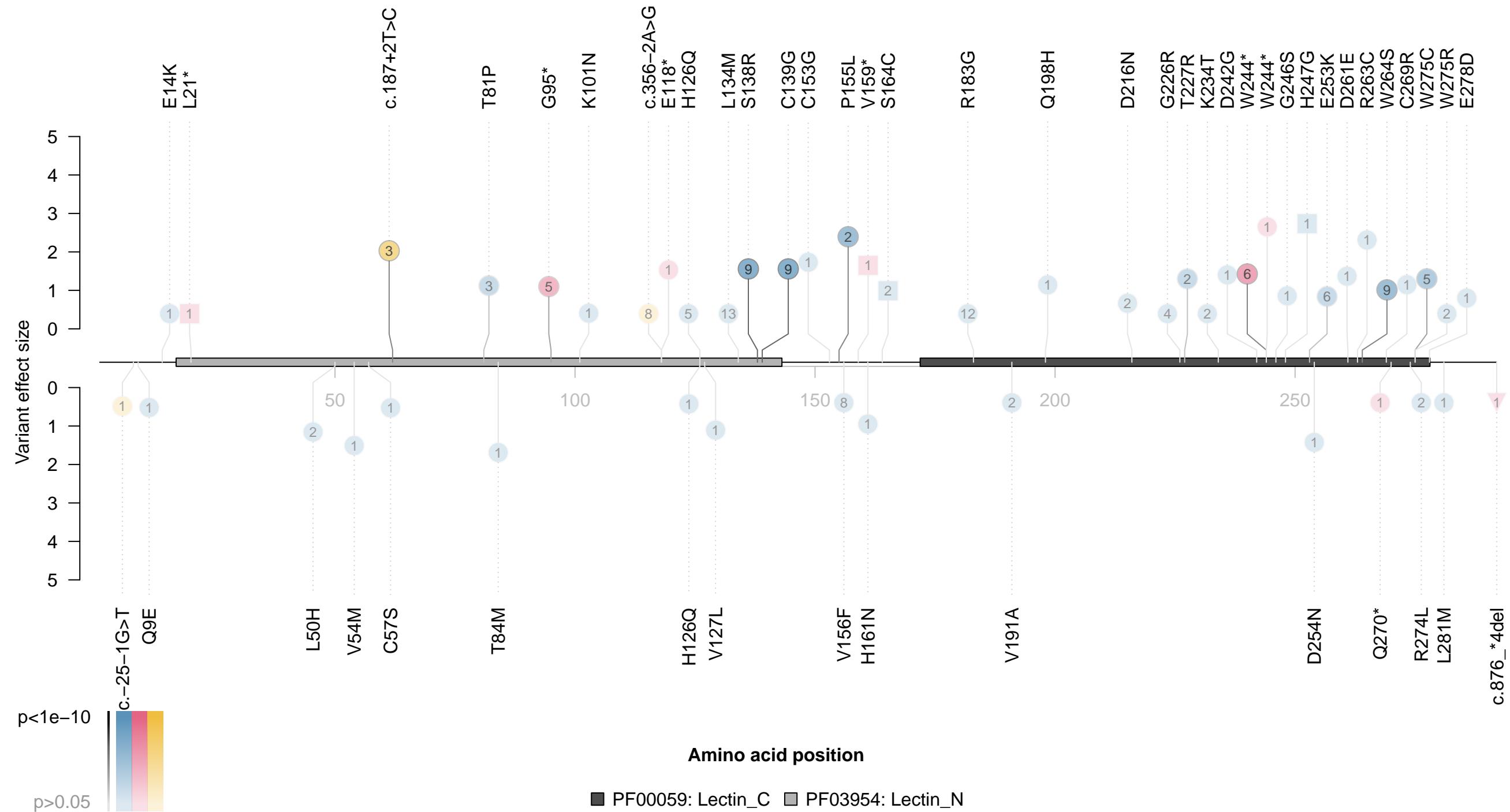
Gene=APOB; Chr=2; Phenotype=Triglycerides; Gene effect size=-0.81

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



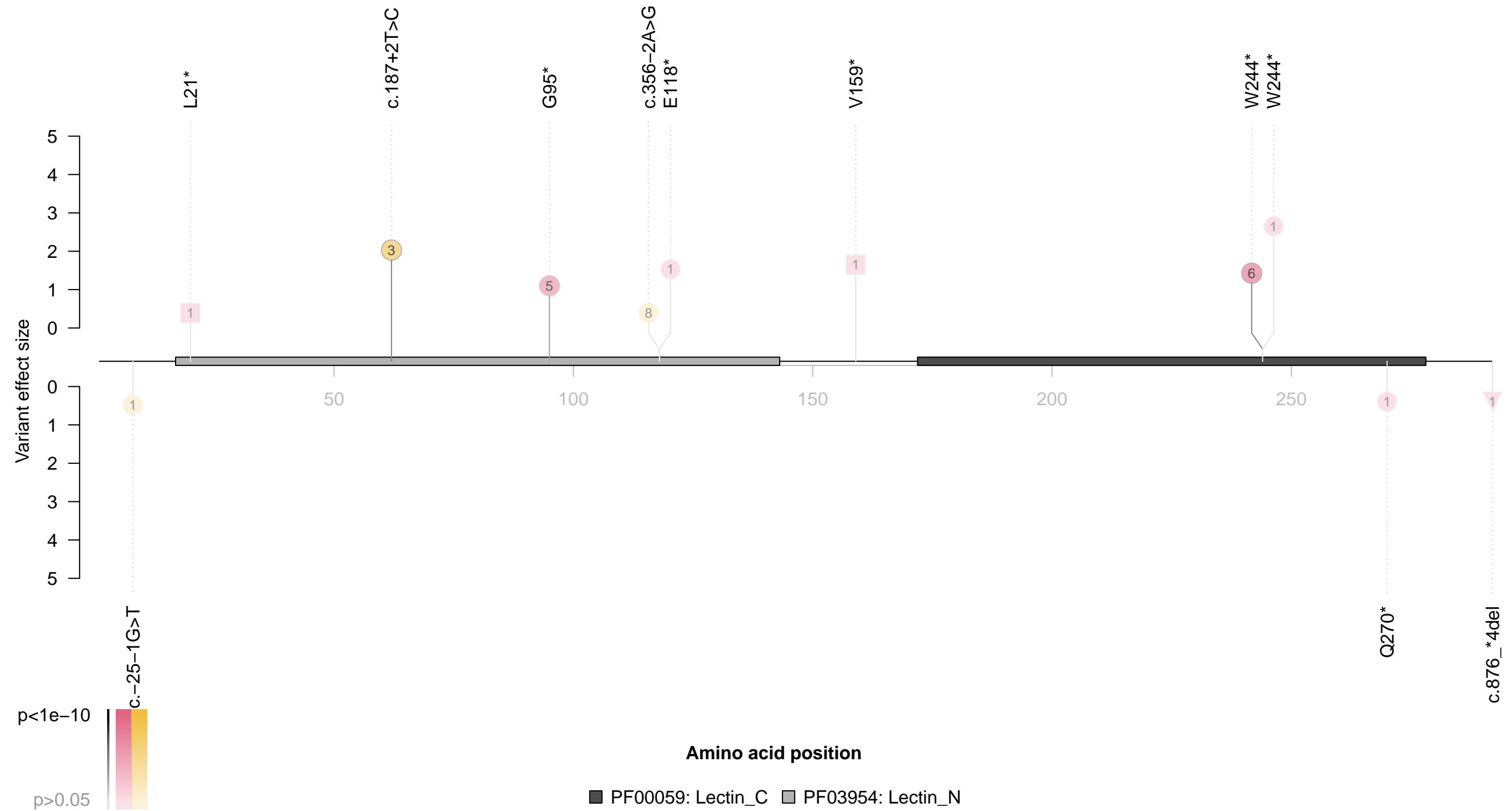
Gene=ASGR1; Chr=1; Phenotype=Alkaline phosphatase; Gene effect size=0.64

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



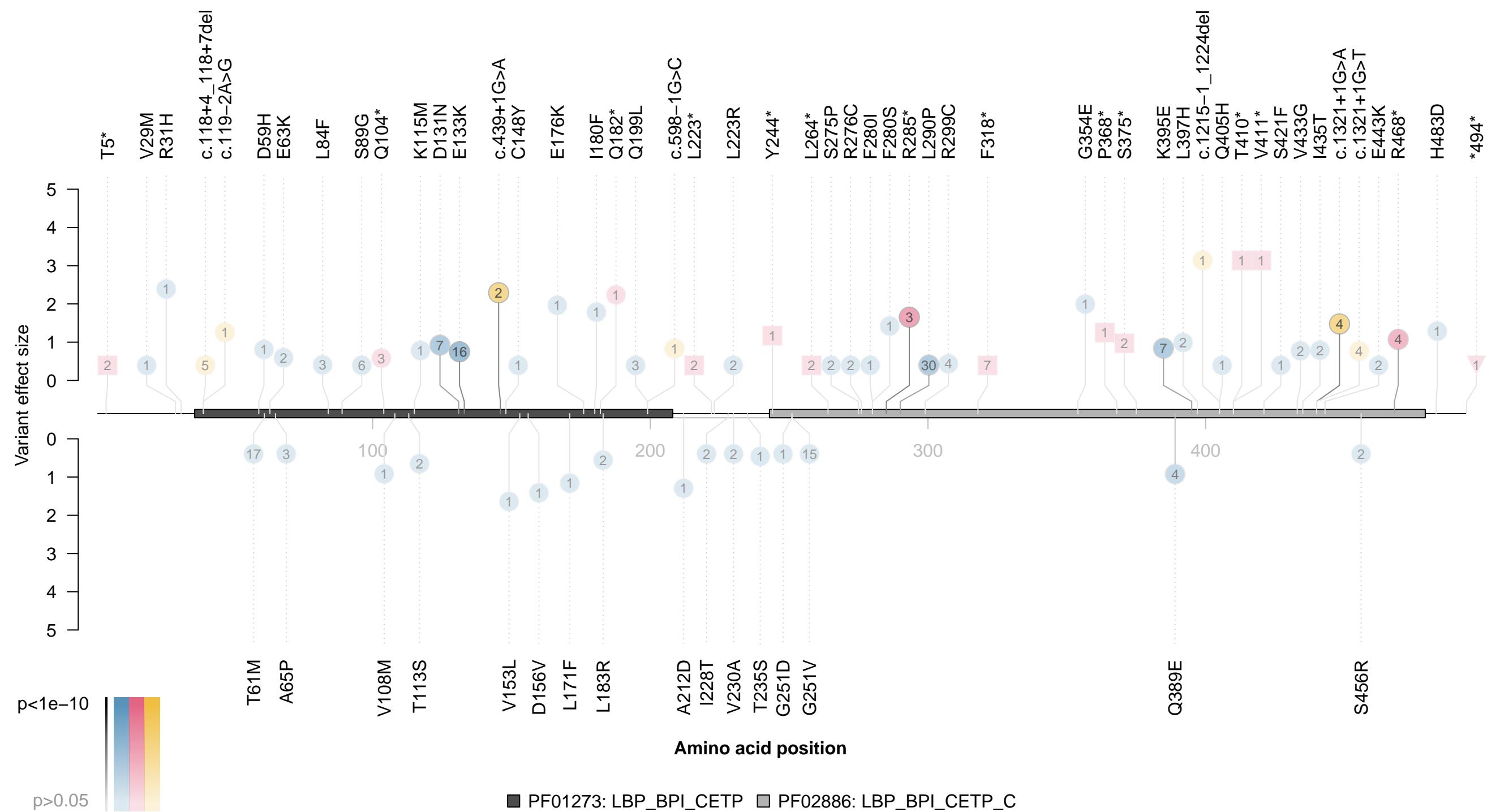
Gene=ASGR1; Chr=1; Phenotype=Alkaline phosphatase; Gene effect size=1.04

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



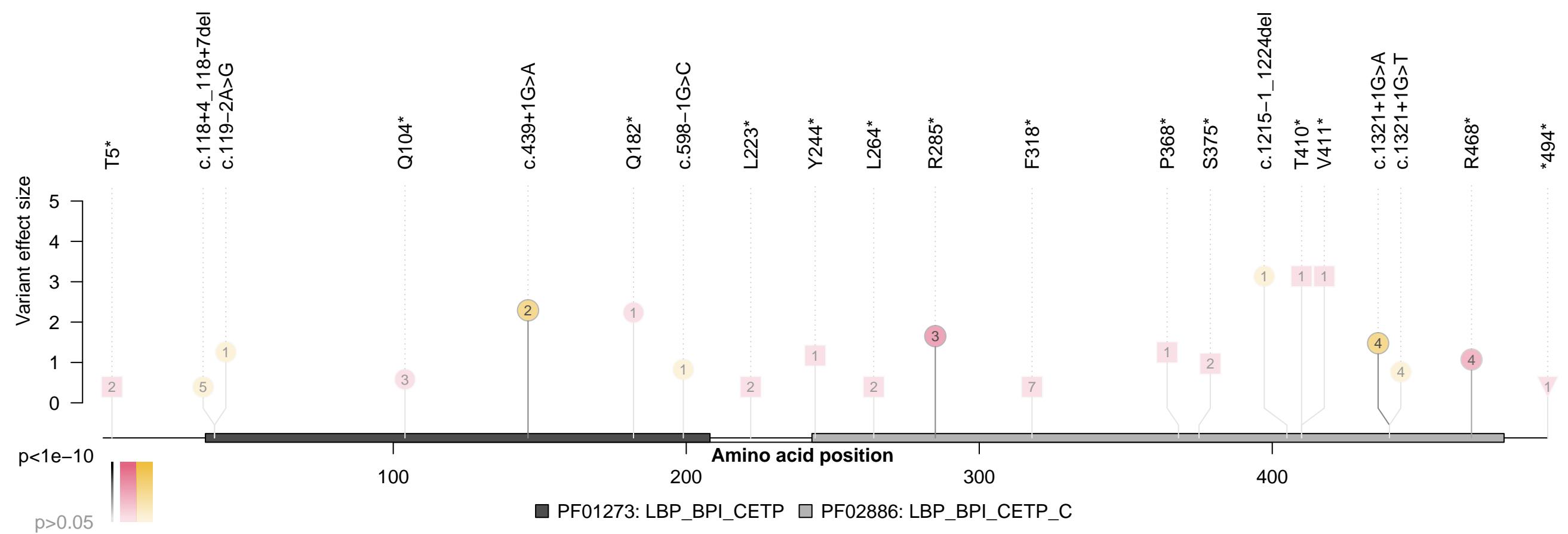
Gene=CETP; Chr=1; Phenotype=HDL cholesterol; Gene effect size=0.46

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



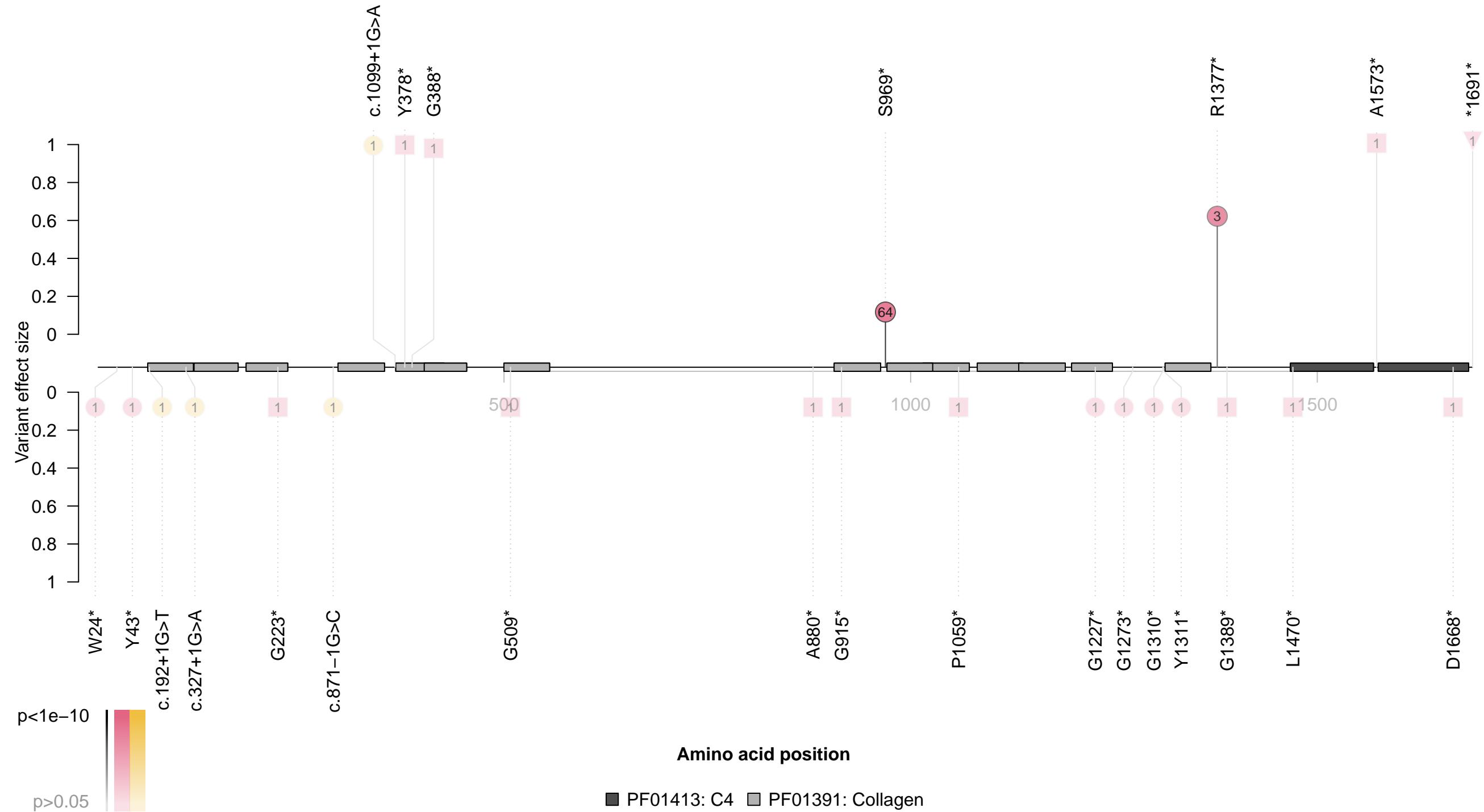
Gene=CETP; Chr=1; Phenotype=HDL cholesterol; Gene effect size=1.01

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



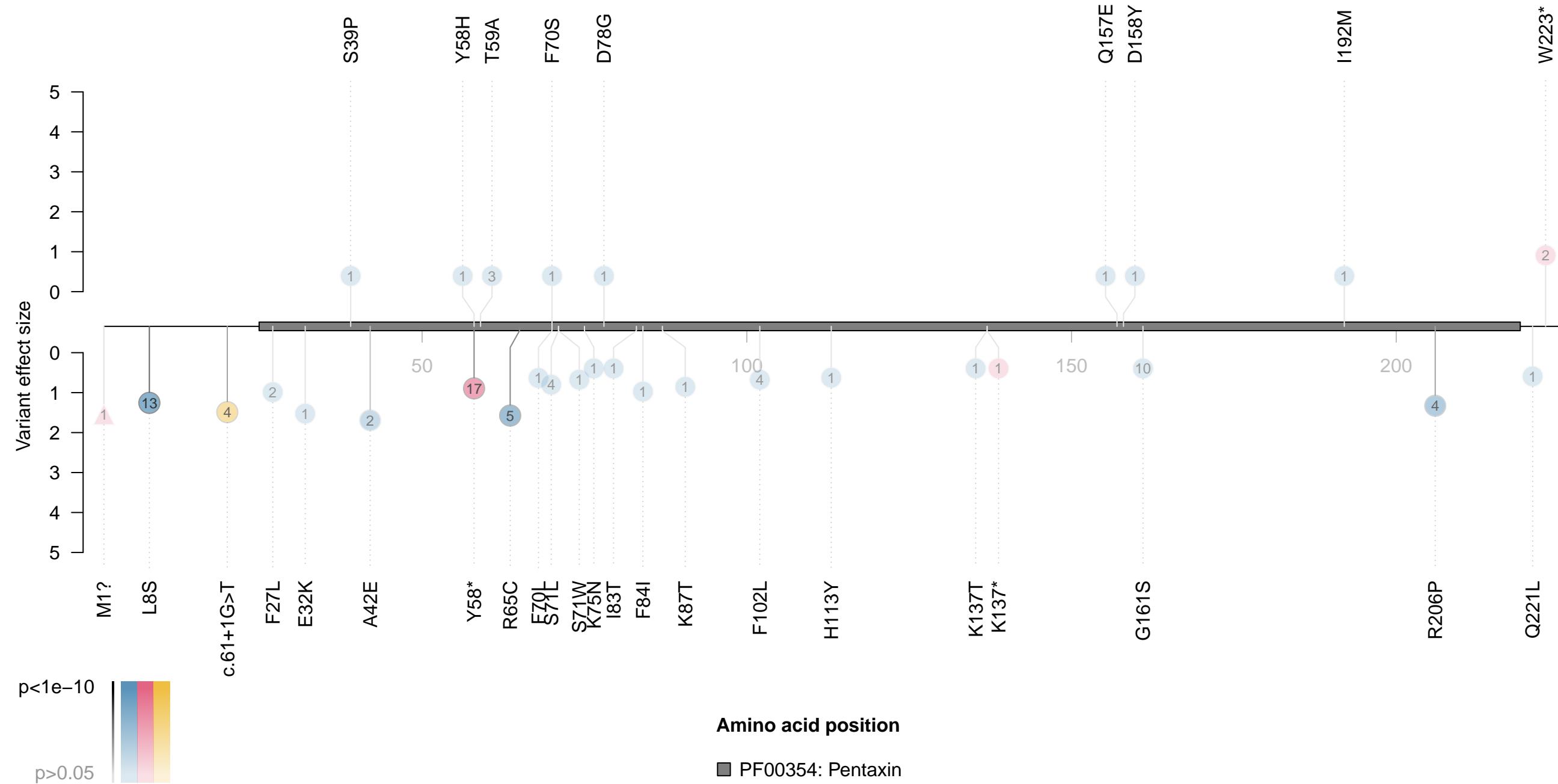
Gene=COL4A4; Chr=2; Phenotype=R31 Unspecified haematuria; Gene effect size=0.17

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



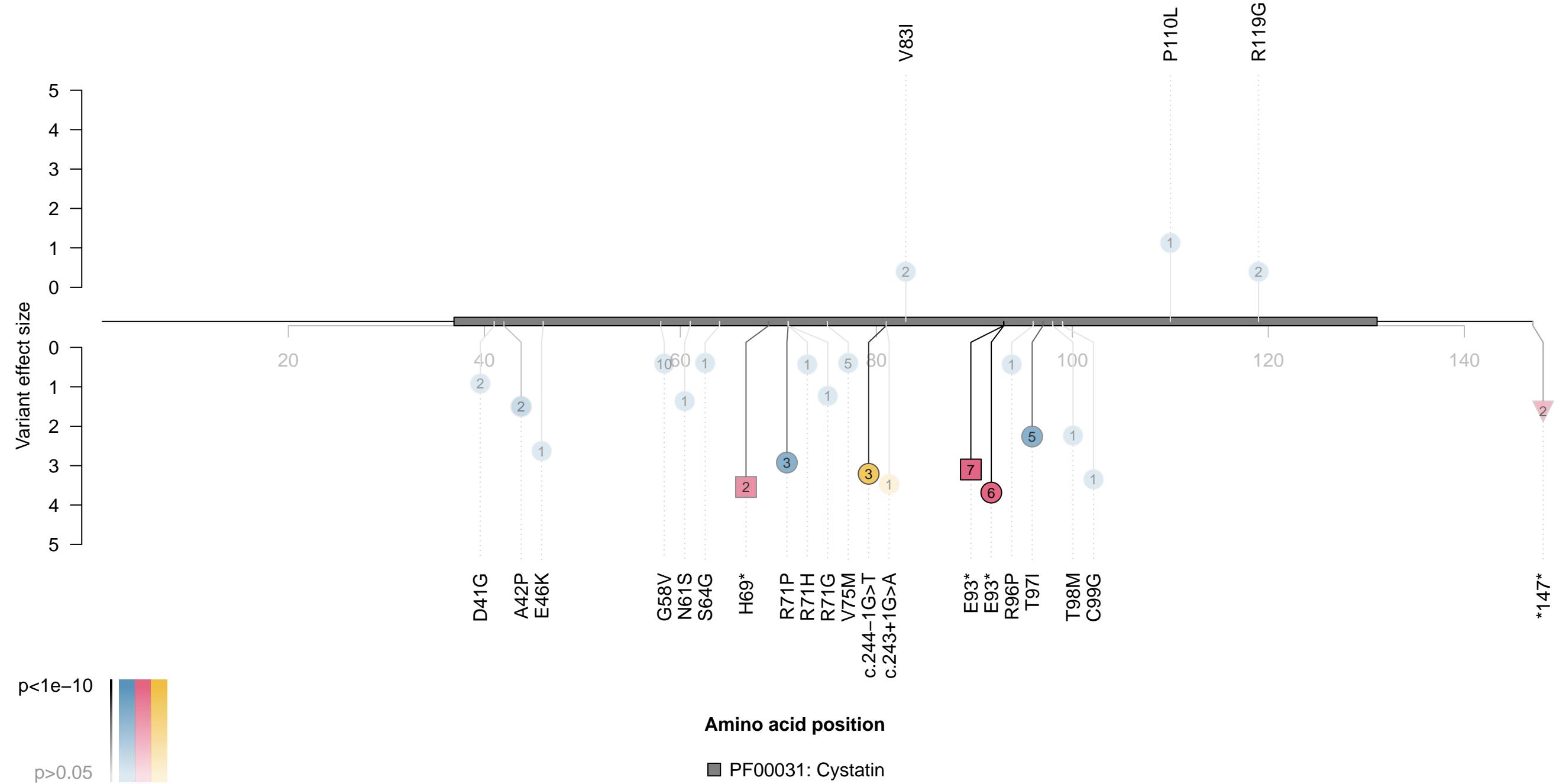
Gene=CRP; Chr=1; Phenotype=C-reactive protein; Gene effect size=-0.84

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



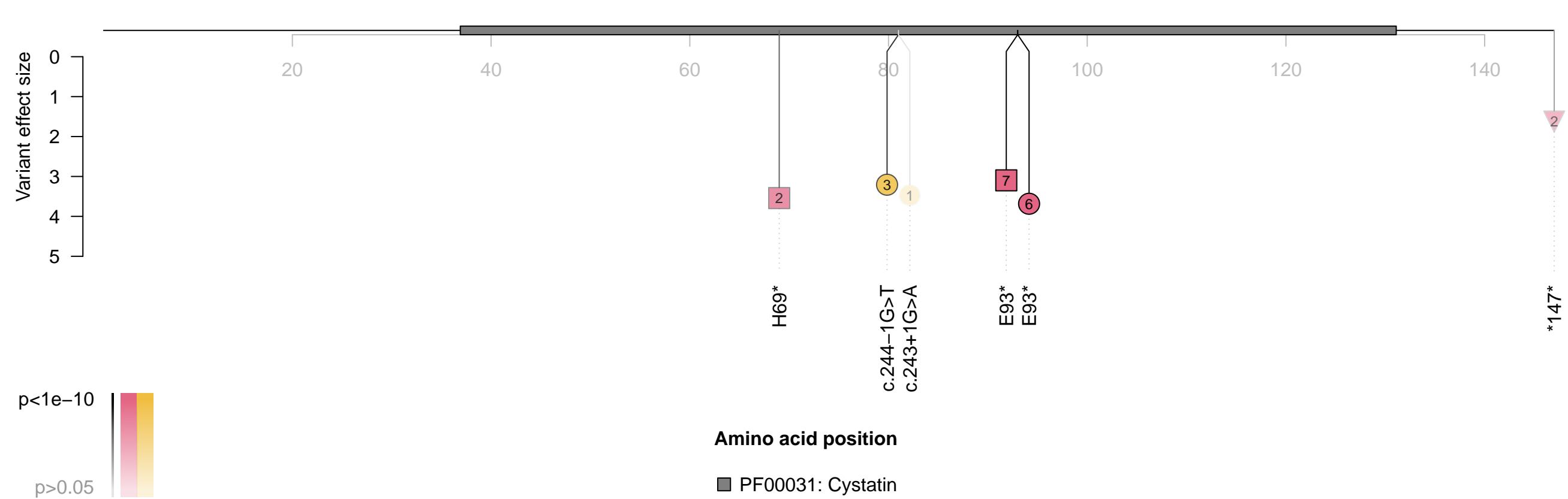
Gene=CST3; Chr=2; Phenotype=Cystatin C; Gene effect size=-1.66

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



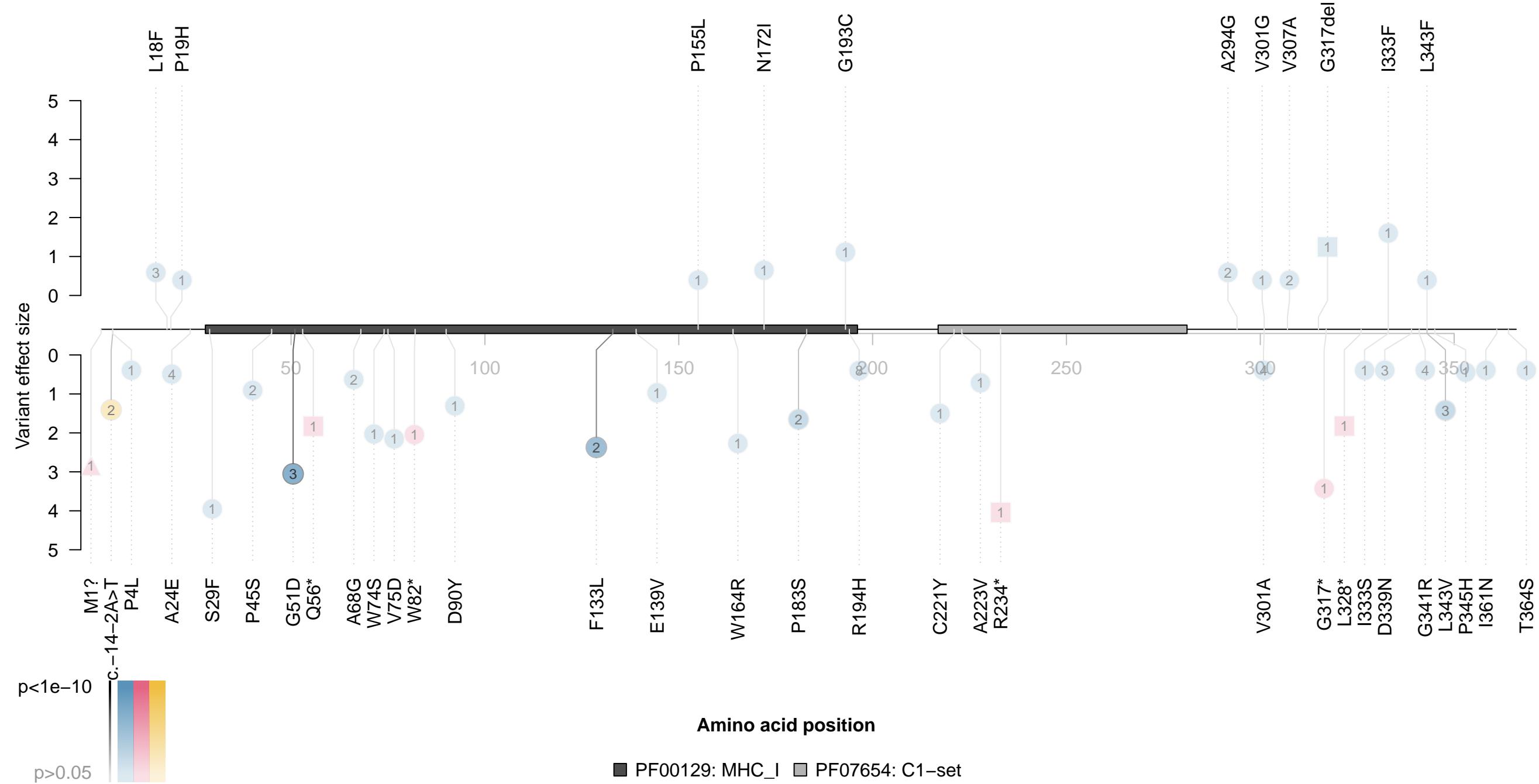
Gene=CST3; Chr=2; Phenotype=Cystatin C; Gene effect size=-2.69

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



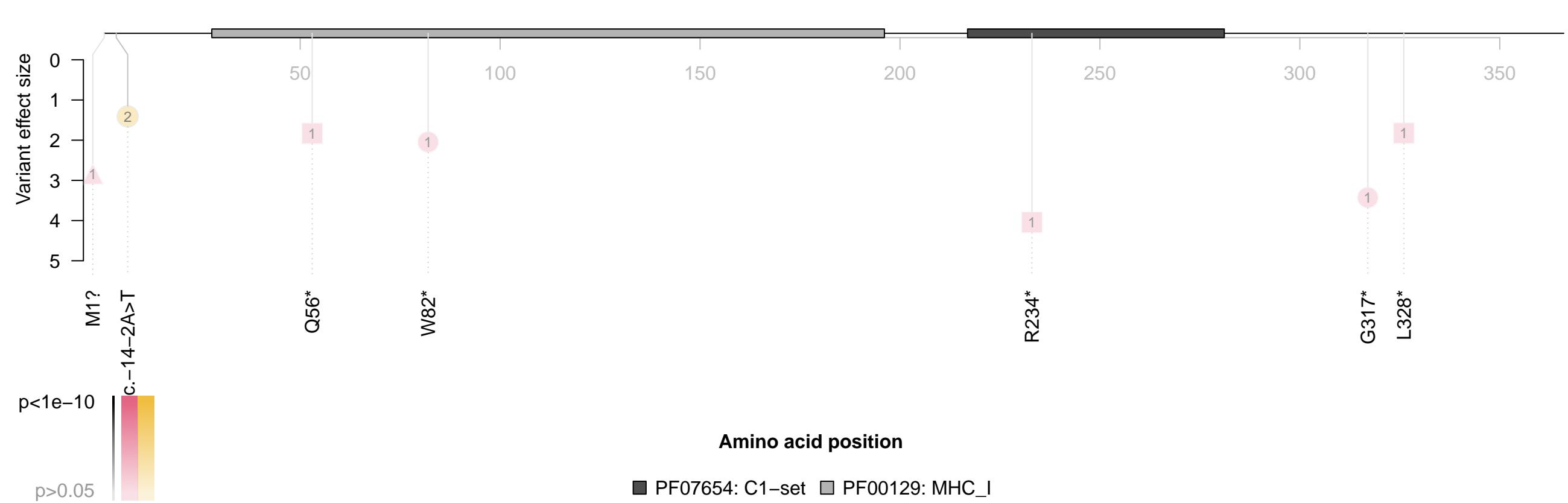
Gene=FCGRT; Chr=1; Phenotype=Albumin; Gene effect size=-0.84

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



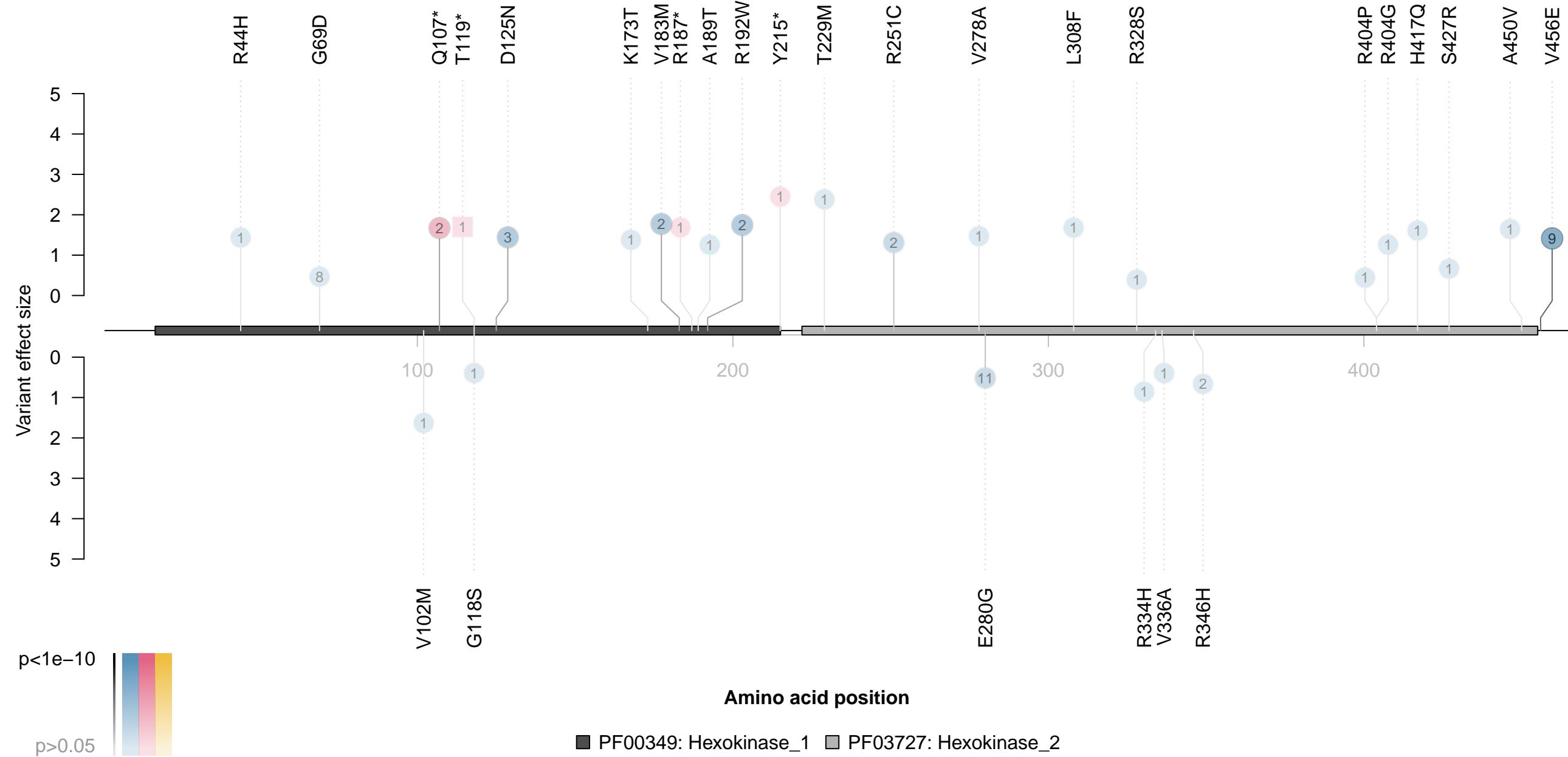
Gene=FCGRT; Chr=1; Phenotype=Albumin; Gene effect size=-2.37

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



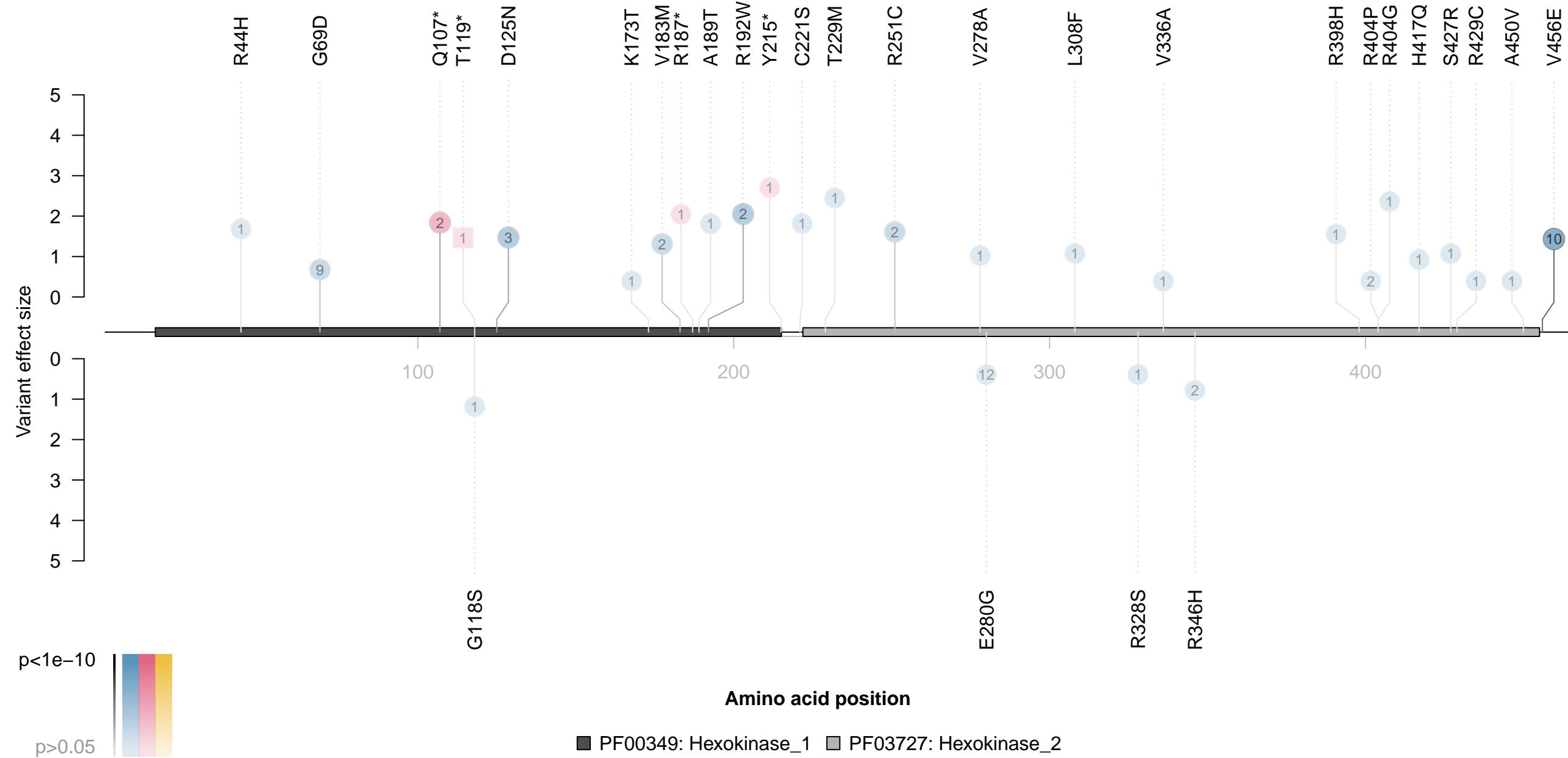
Gene=GCK; Chr=7; Phenotype=Glucose; Gene effect size=0.77

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



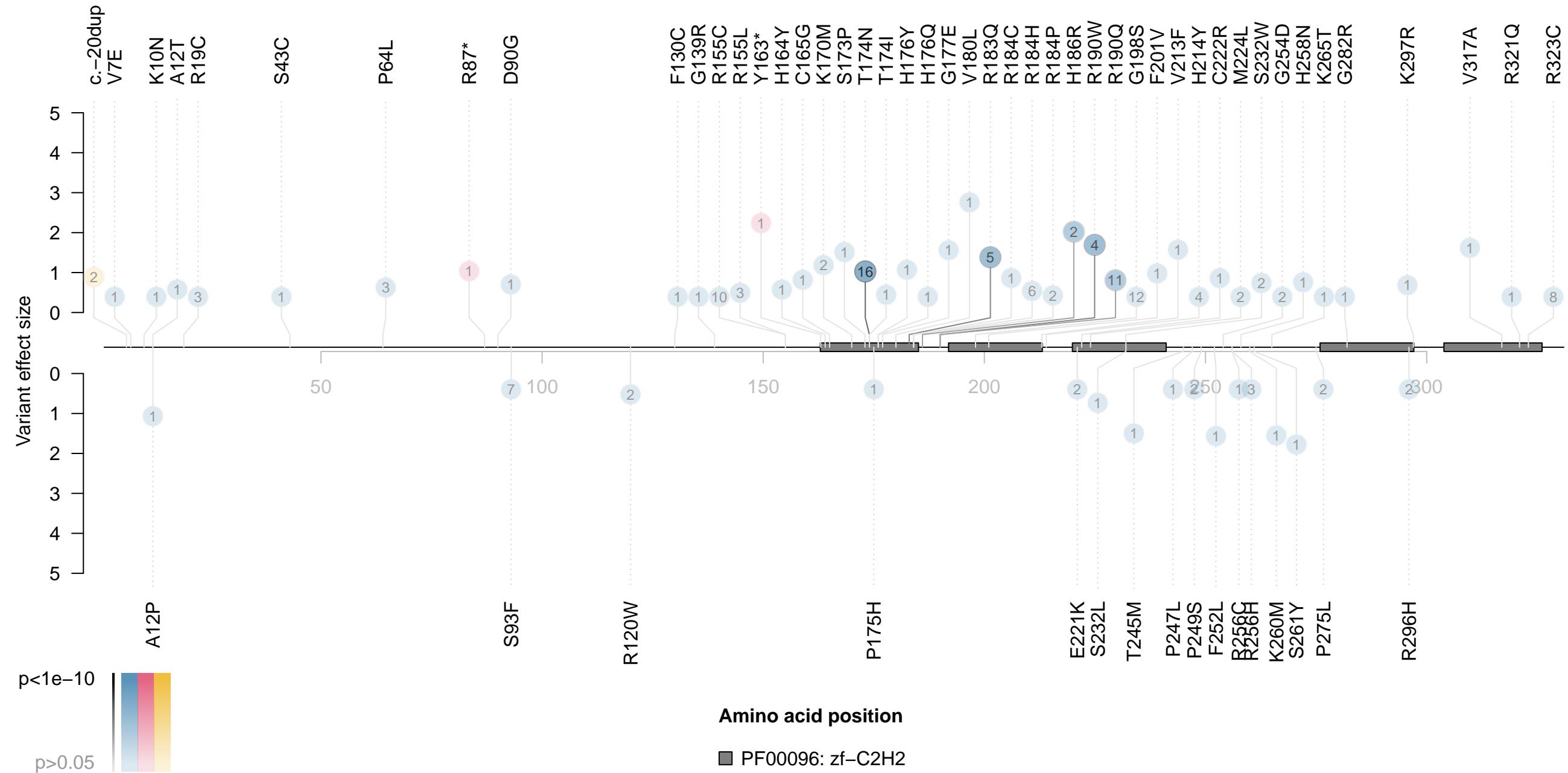
Gene=GCK; Chr=7; Phenotype=Glycated haemoglobin; Gene effect size=0.89

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



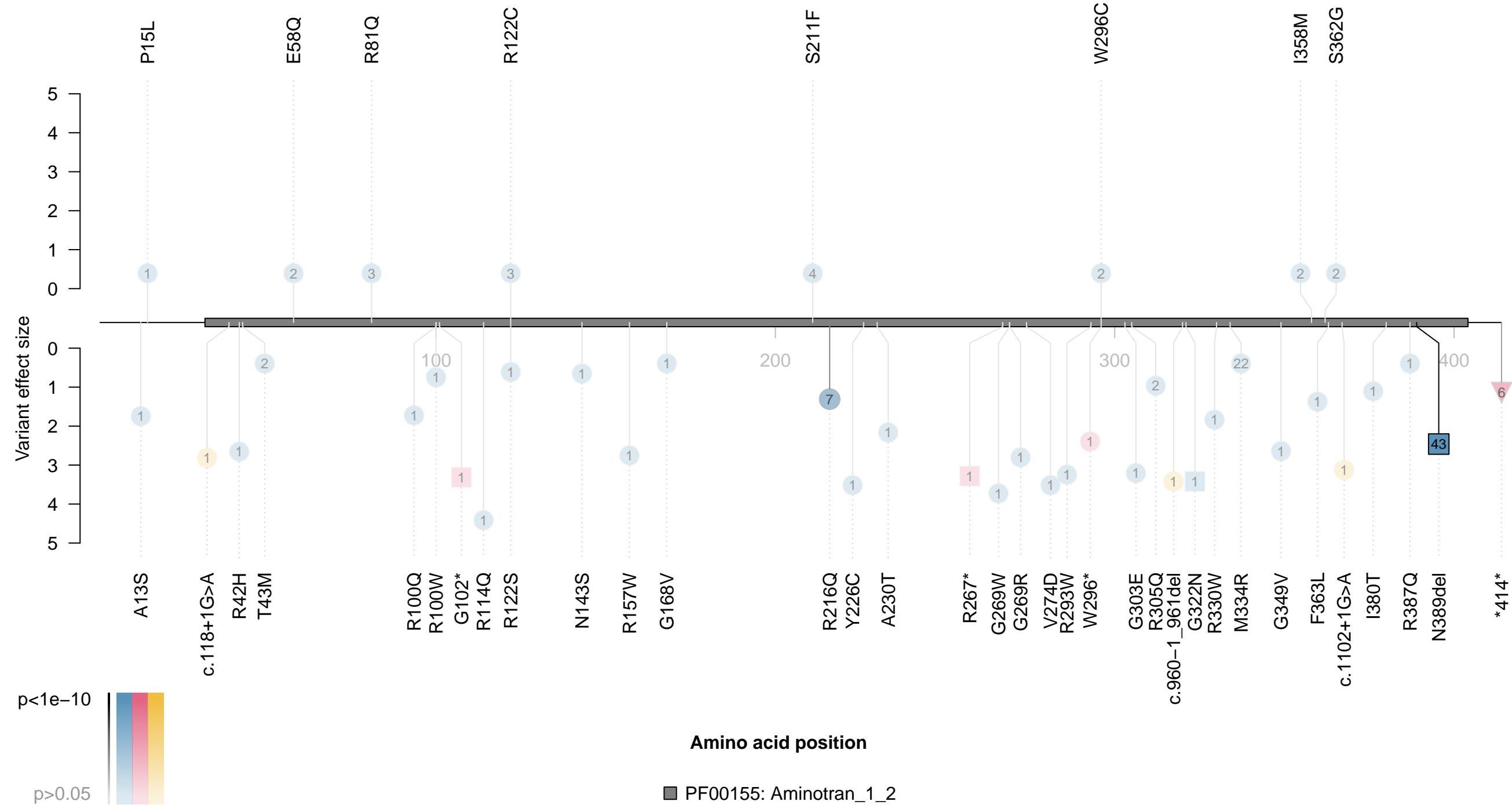
Gene=GFI1B; Chr=9; Phenotype=Mean platelet volume; Gene effect size=0.5

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



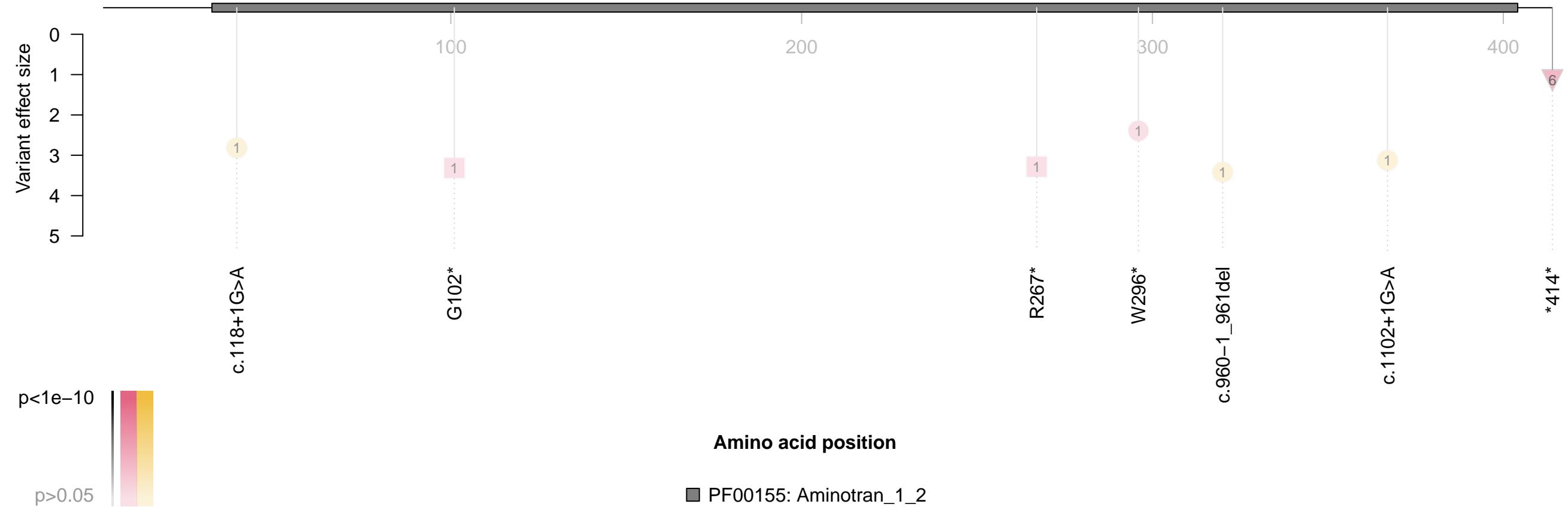
Gene=GOT1; Chr=1; Phenotype=Aspartate aminotransferase; Gene effect size=-1.45

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



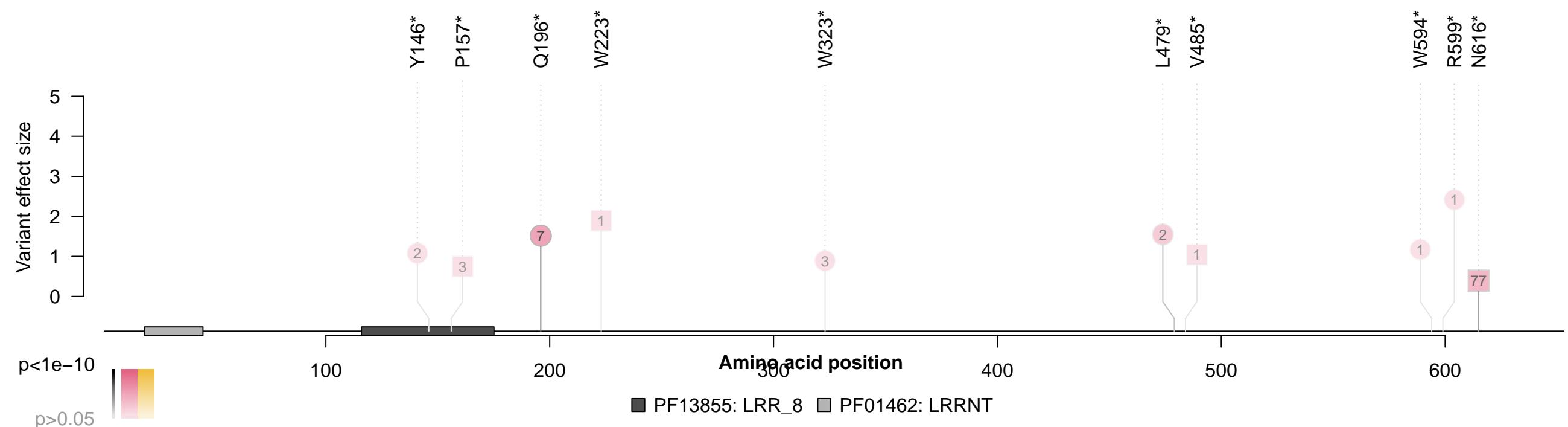
Gene=GOT1; Chr=1; Phenotype=Aspartate aminotransferase; Gene effect size=-2.15

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



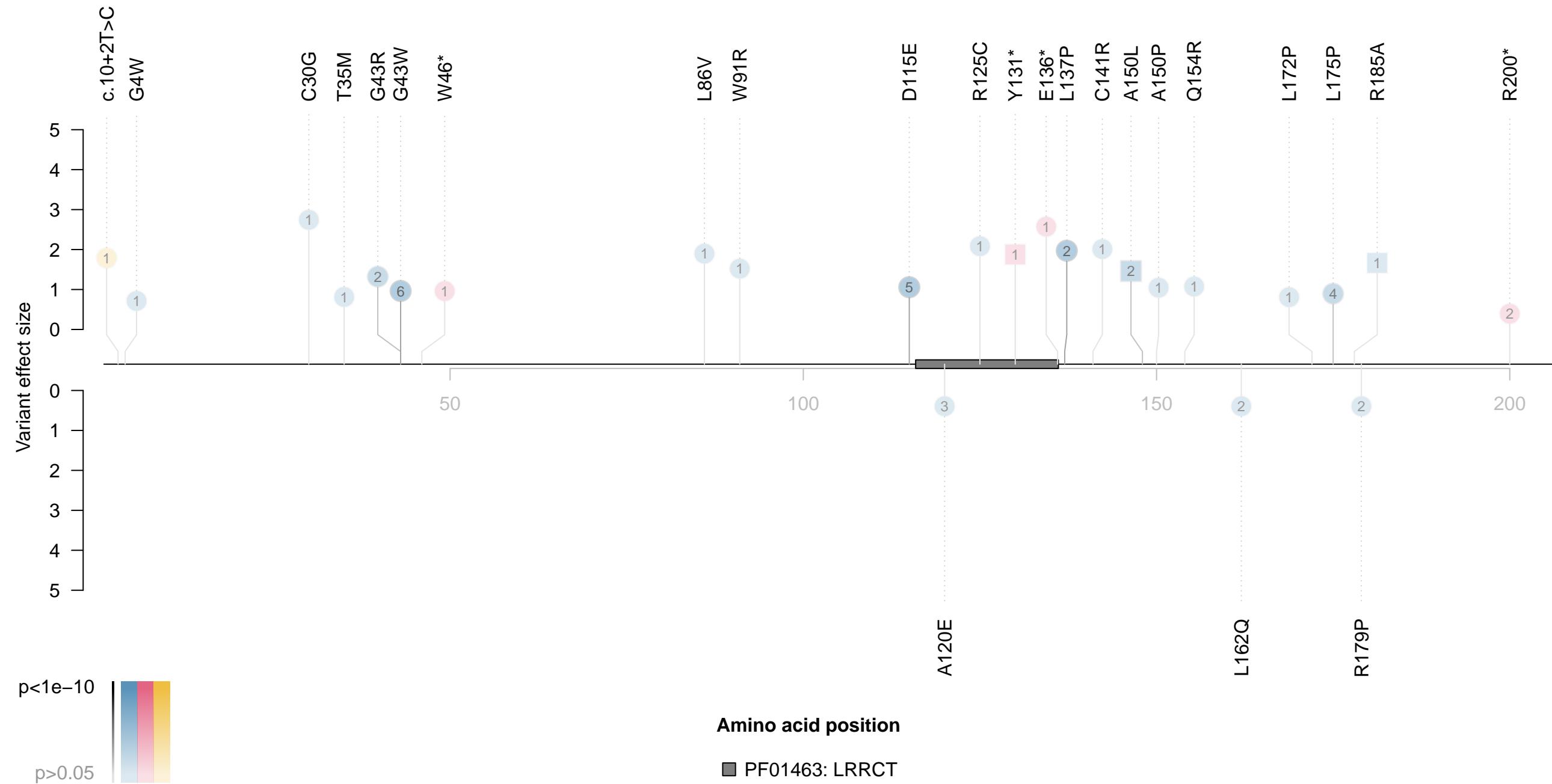
Gene=GP1BA; Chr=1; Phenotype=Mean platelet (thrombocyte) volume; Gene effect size=0.55

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



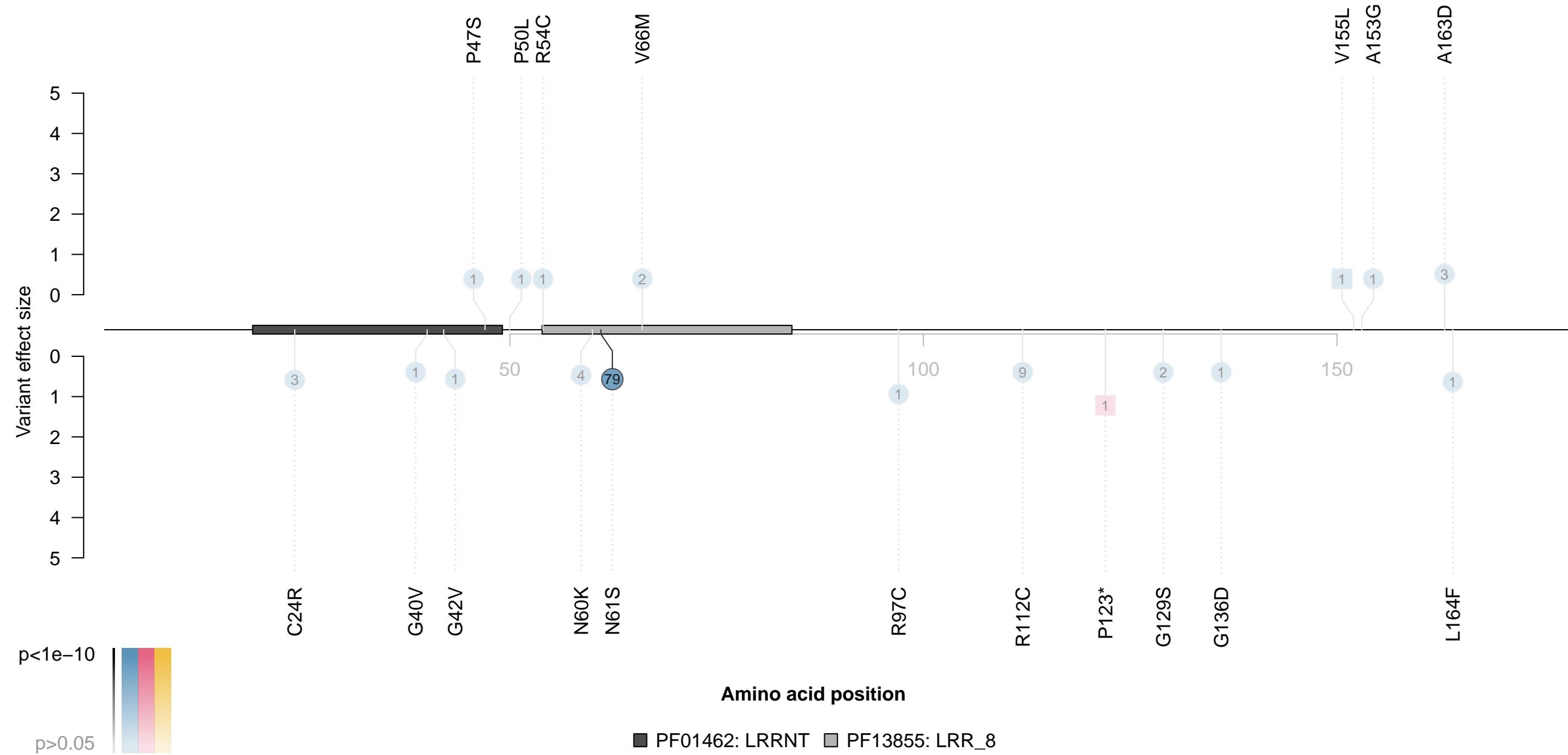
Gene=GP1BB; Chr=2; Phenotype=Mean platelet volume; Gene effect size=1.06

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



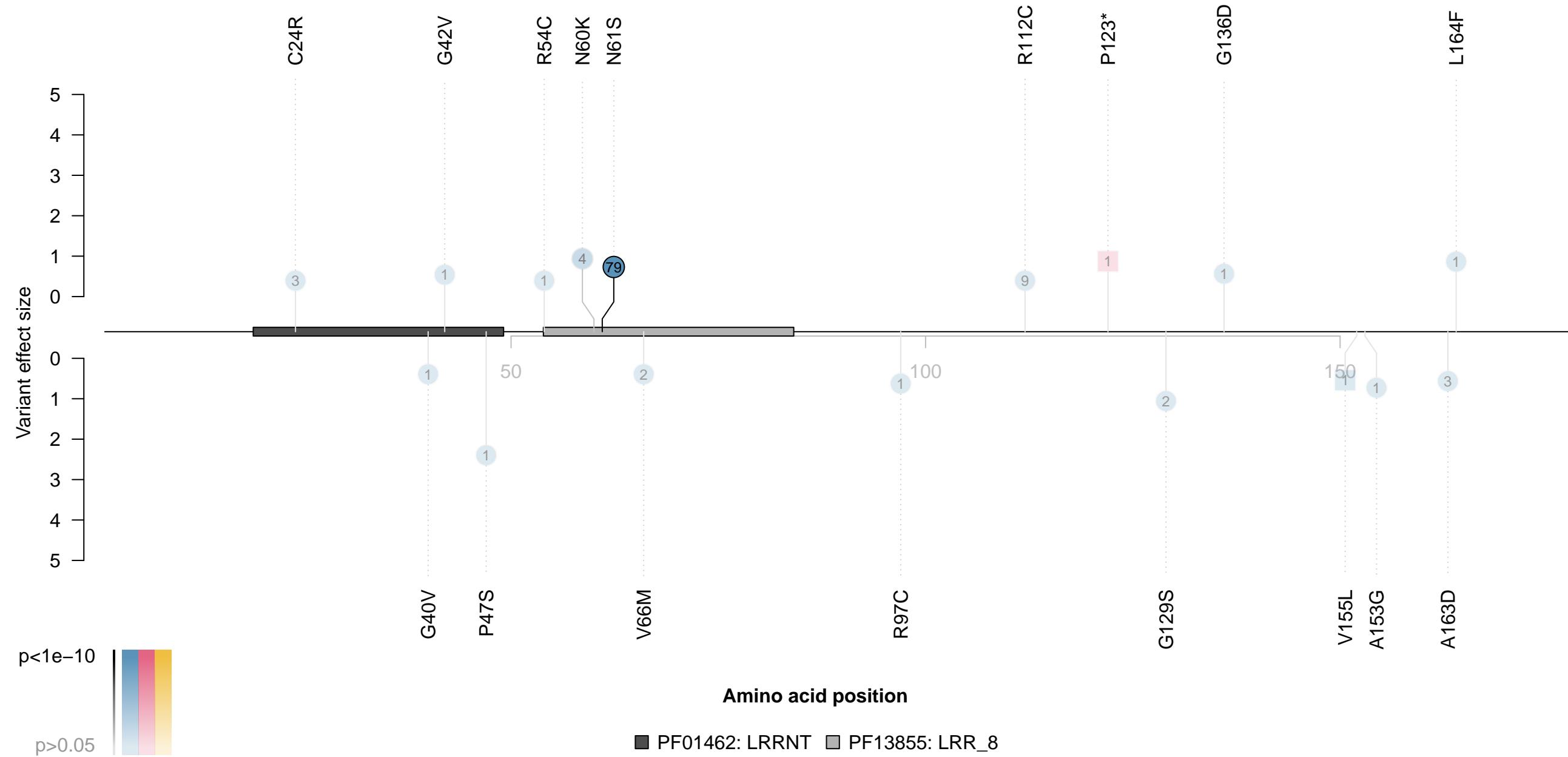
Gene=GP9; Chr=3; Phenotype=Platelet count; Gene effect size=-0.55

● missense ■ in-frame indel ○ splice ● stop gain ▲ stop lost ▲ start lost ■ frameshift



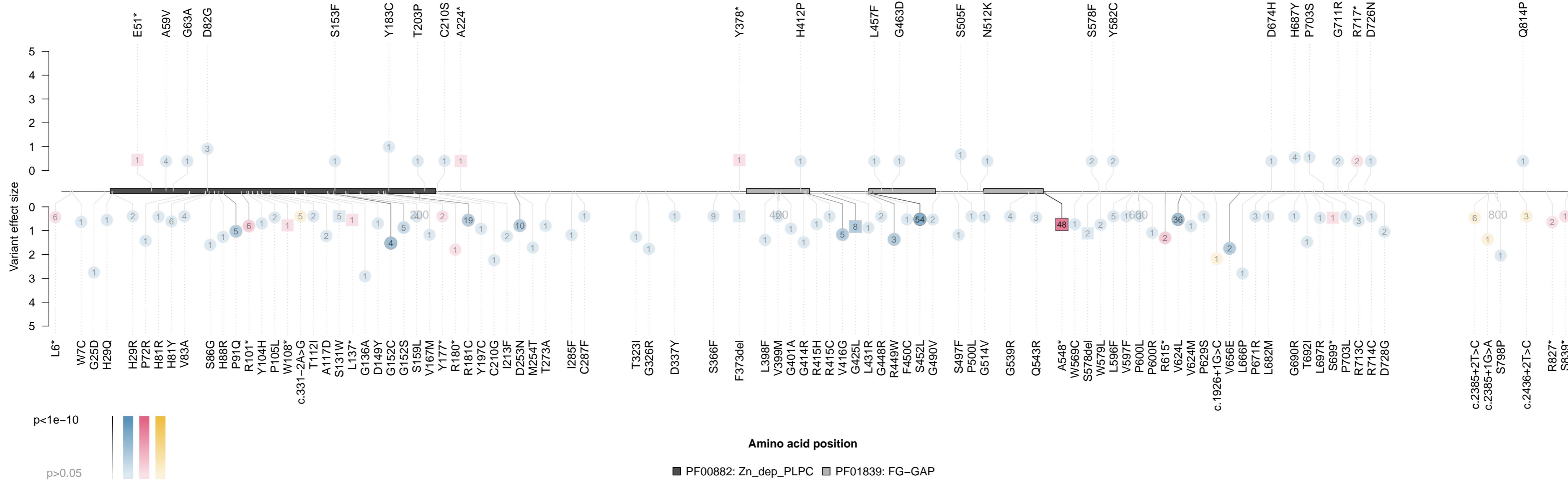
Gene=GP9; Chr=3; Phenotype=Mean platelet volume; Gene effect size=0.59

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



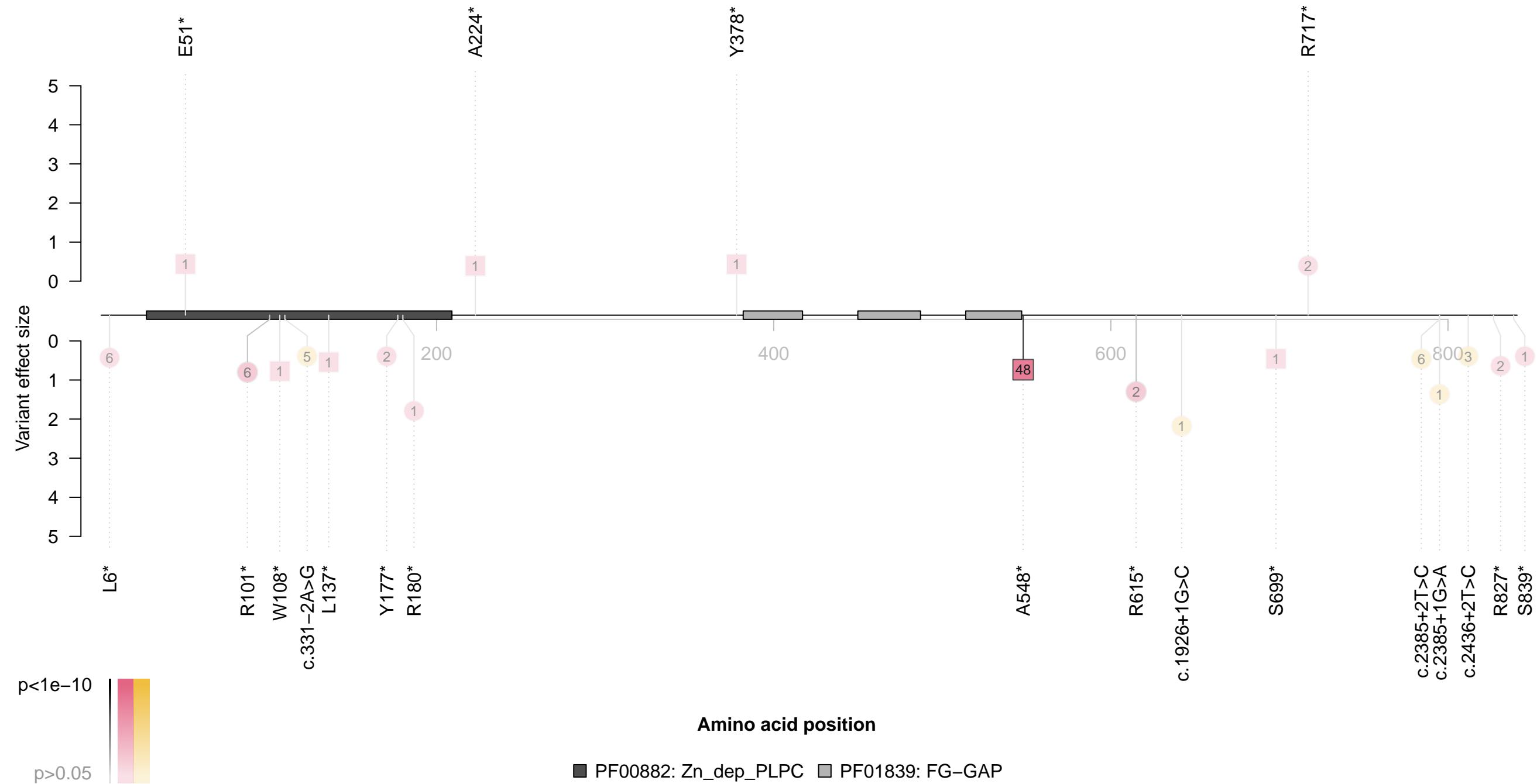
Gene=GPLD1; Chr=6; Phenotype=Alkaline phosphatase; Gene effect size=-0.64

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



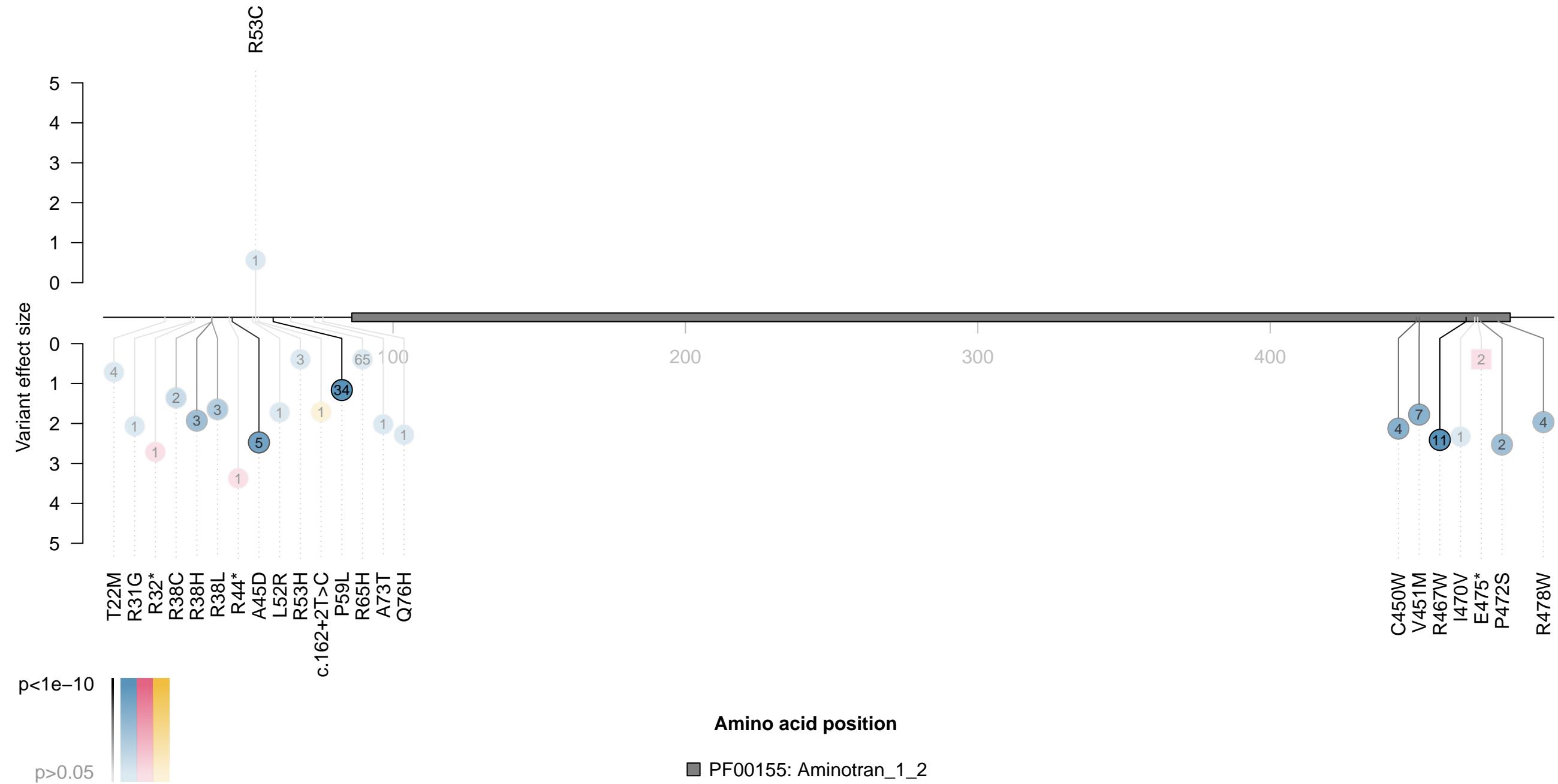
Gene=GPLD1; Chr=6; Phenotype=Alkaline phosphatase; Gene effect size=-0.71

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



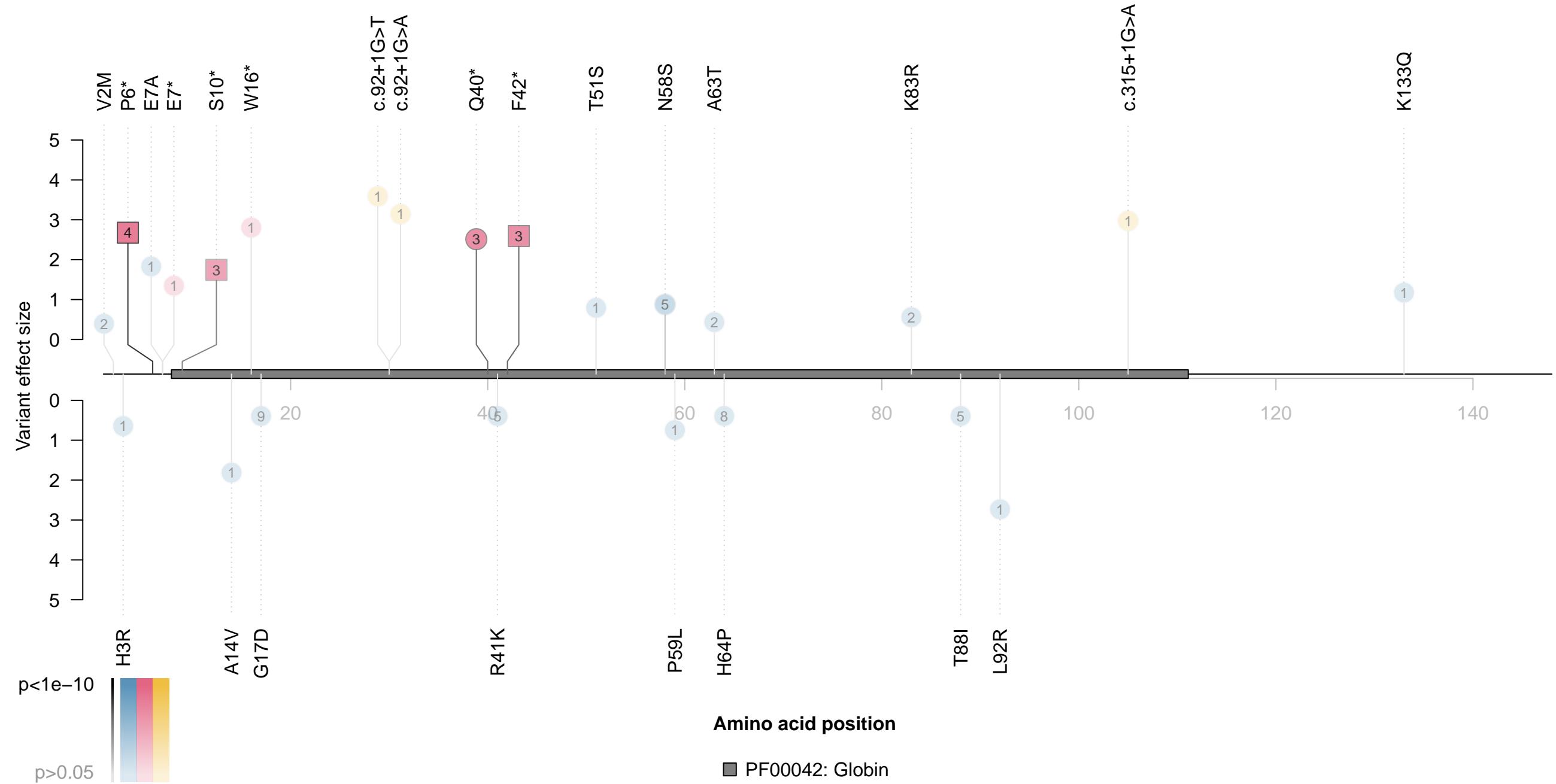
Gene=GPT; Chr=8; Phenotype=Alanine aminotransferase; Gene effect size=-1.01

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



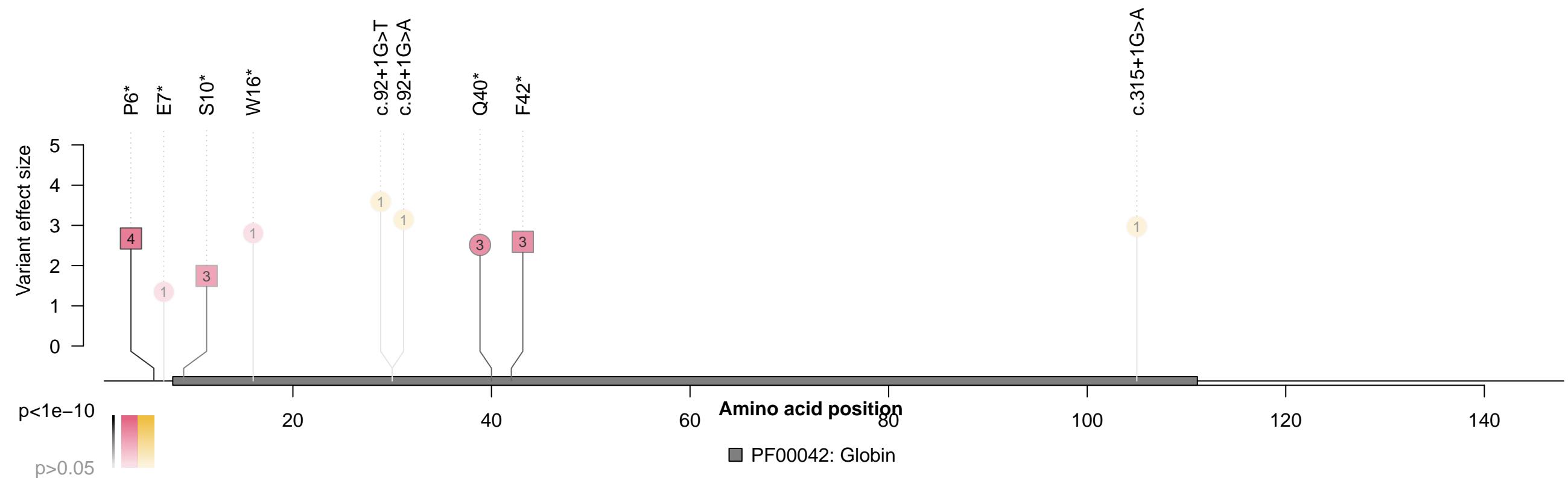
Gene=HBB; Chr=1; Phenotype=Red blood cell count; Gene effect size=0.68

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



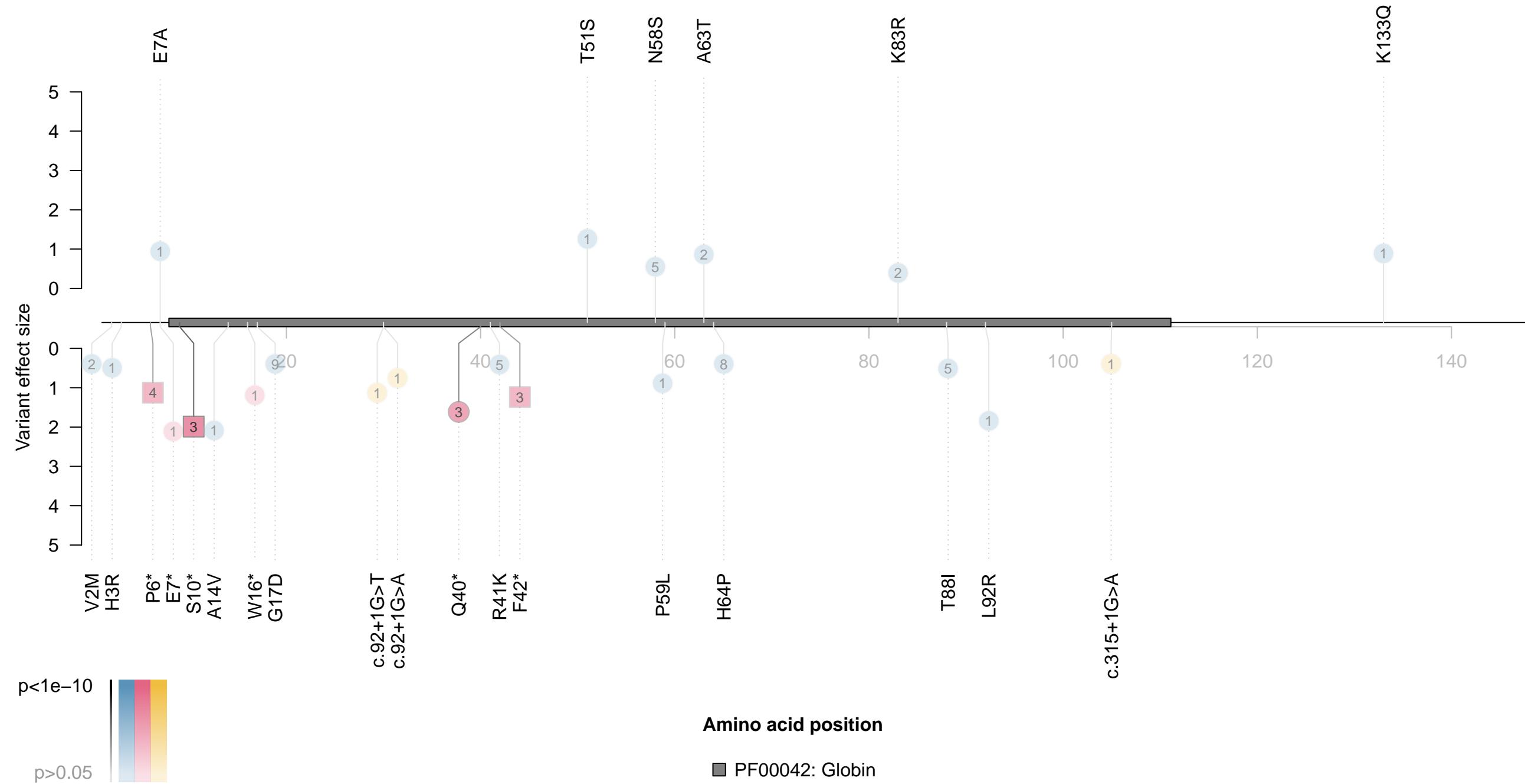
Gene=HBB; Chr=1; Phenotype=Red blood cell count; Gene effect size=2.51

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



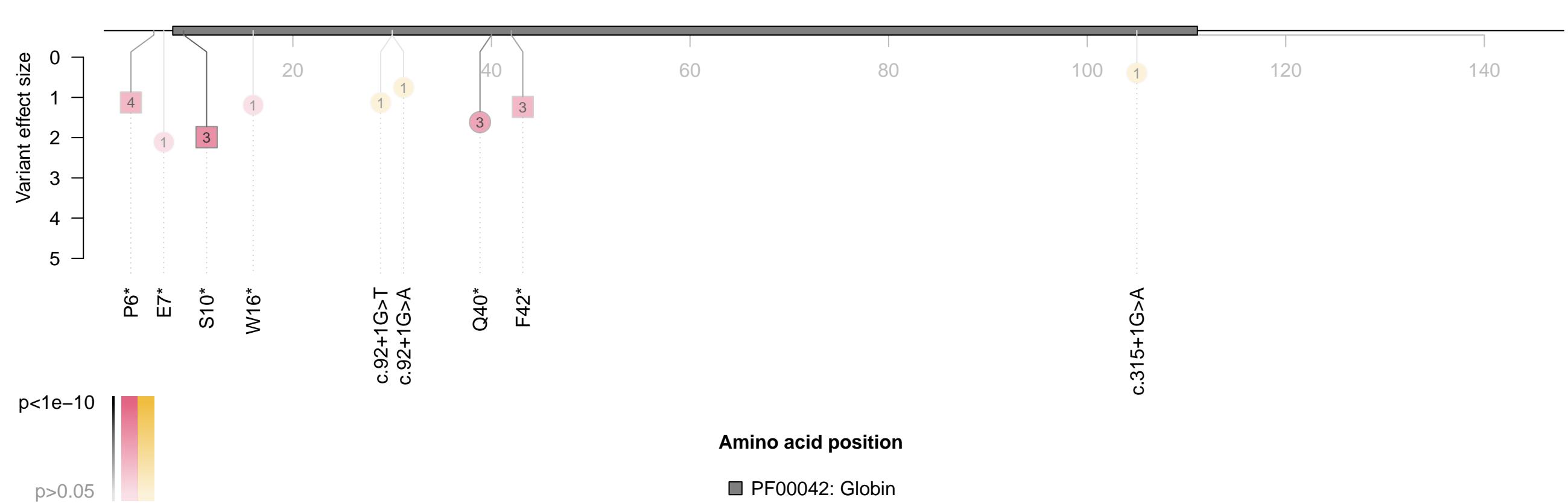
Gene=HBB; Chr=1; Phenotype=Haemoglobin concentration; Gene effect size=-0.54

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



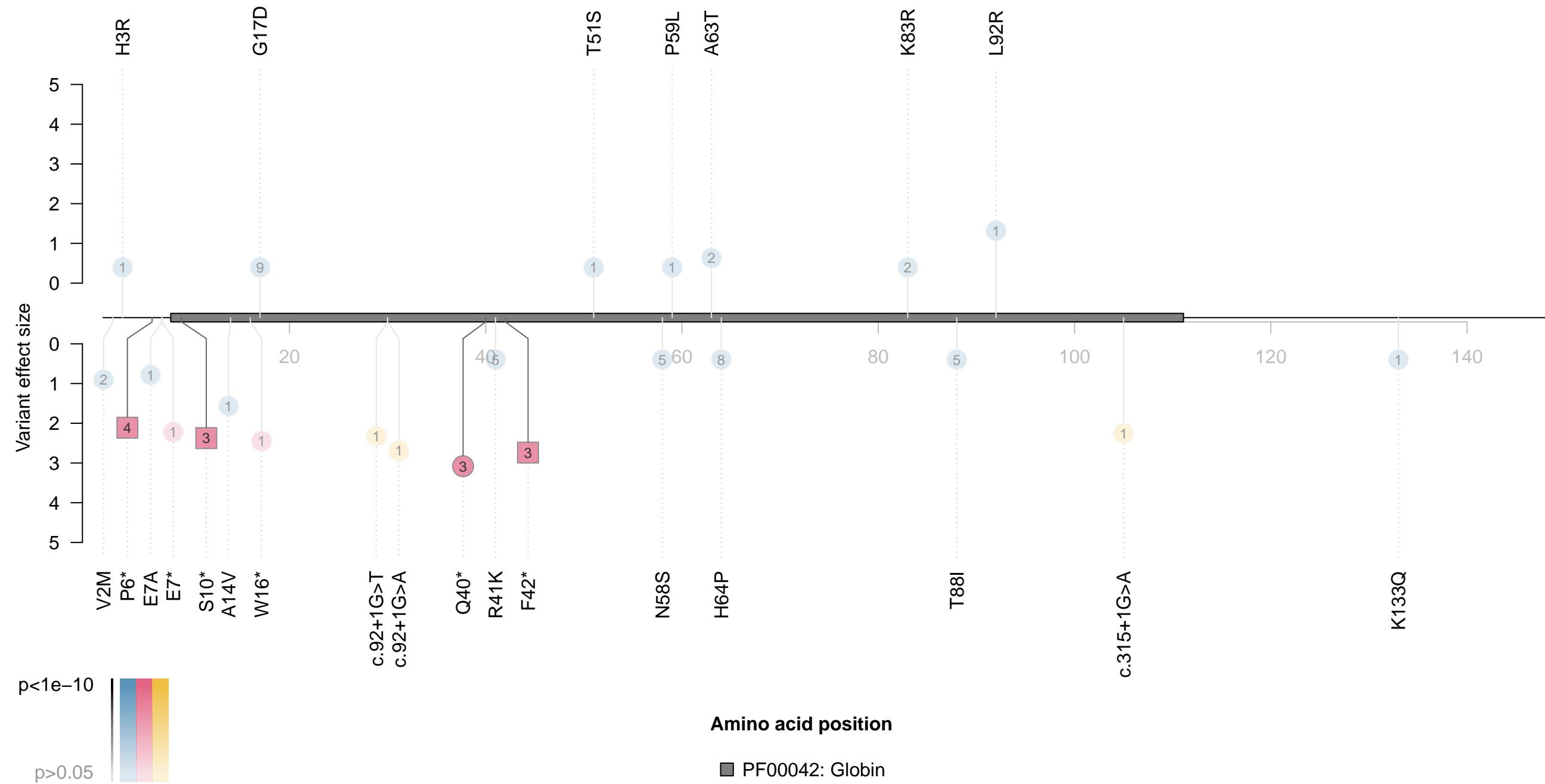
Gene=HBB; Chr=1; Phenotype=Haemoglobin concentration; Gene effect size=-1.42

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



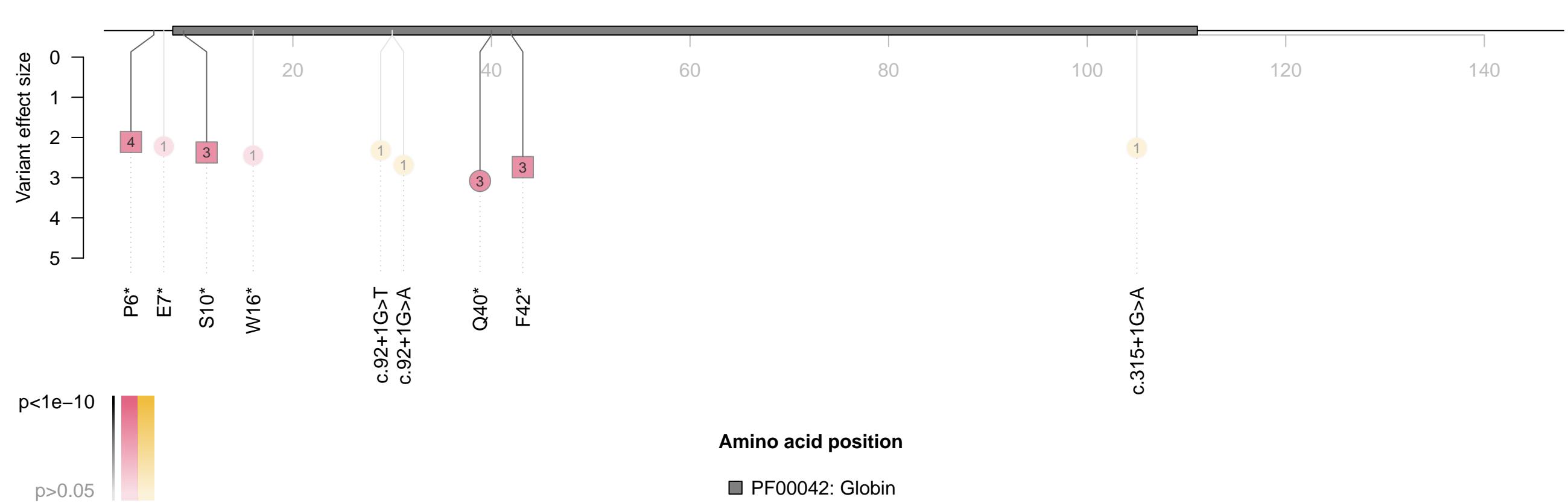
Gene=HBB; Chr=1; Phenotype=Mean corpuscular volume; Gene effect size=-0.78

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



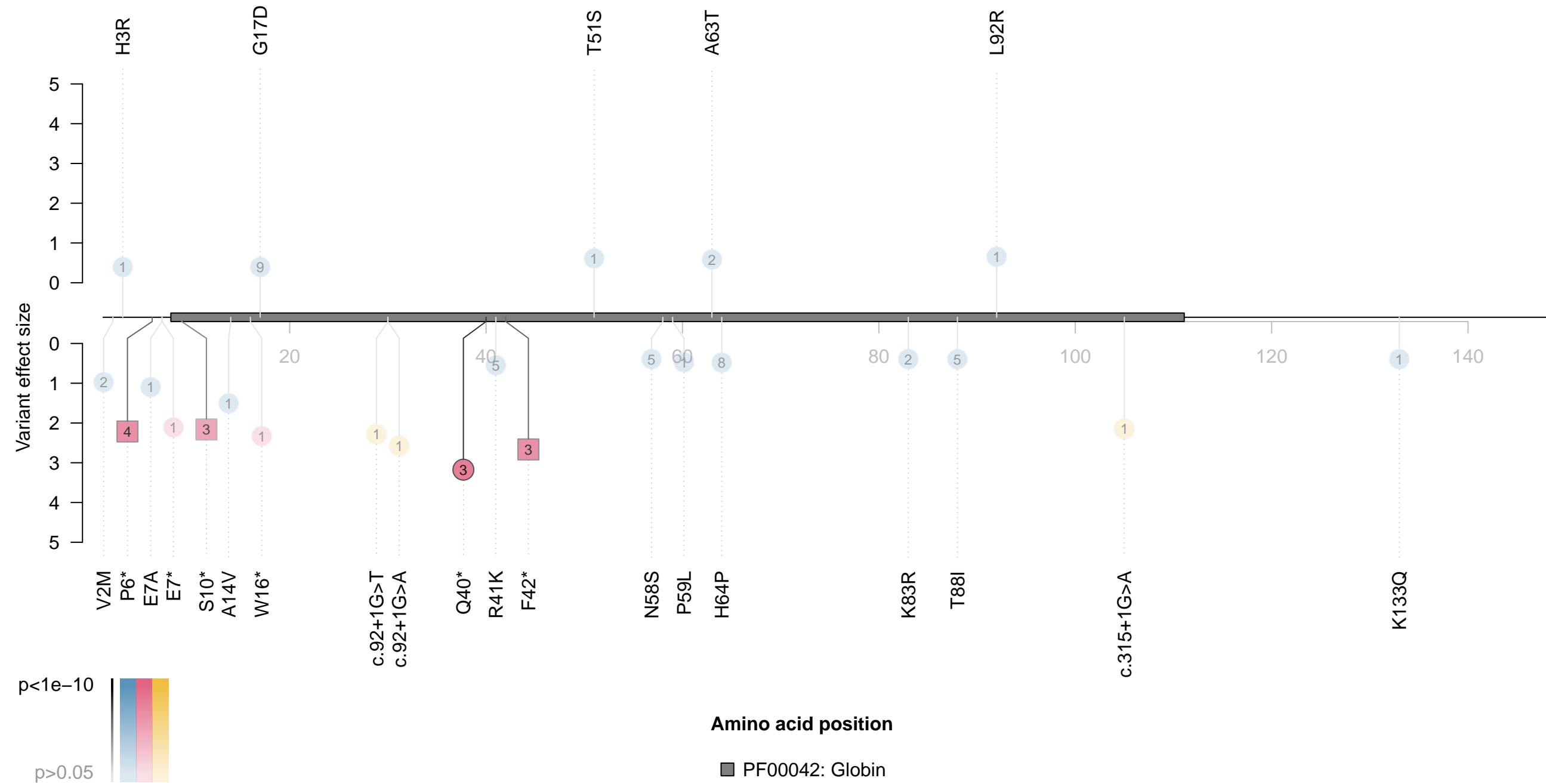
Gene=HBB; Chr=1; Phenotype=Mean corpuscular volume; Gene effect size=-2.51

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



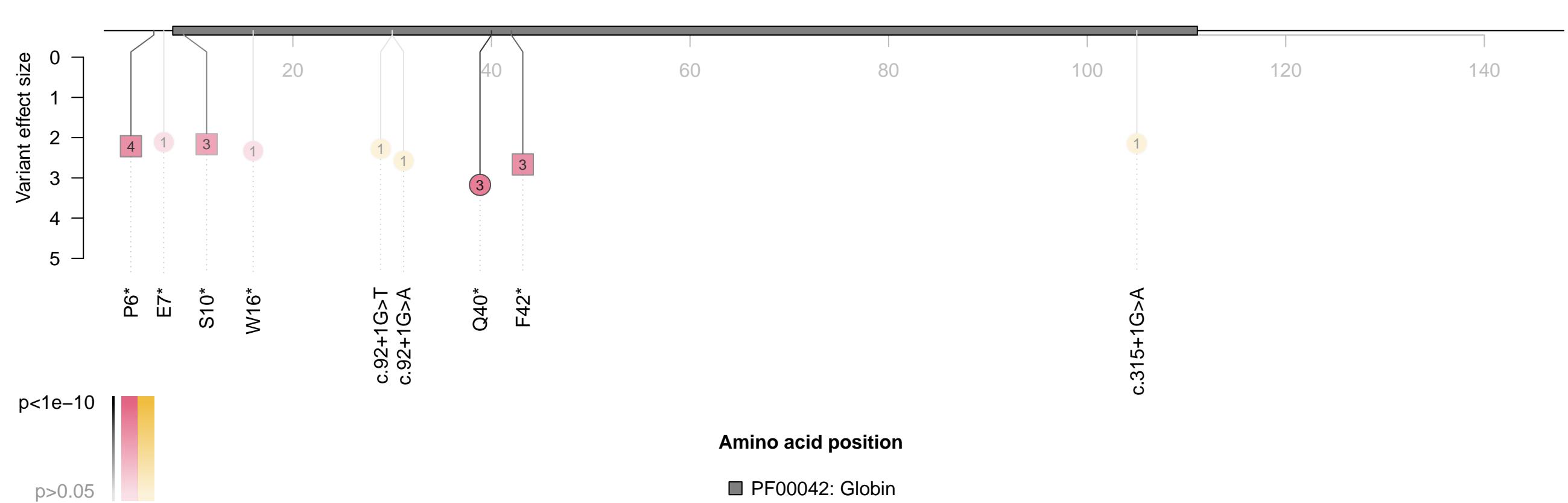
Gene=HBB; Chr=1; Phenotype=Mean corpuscular haemoglobin; Gene effect size=-0.94

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



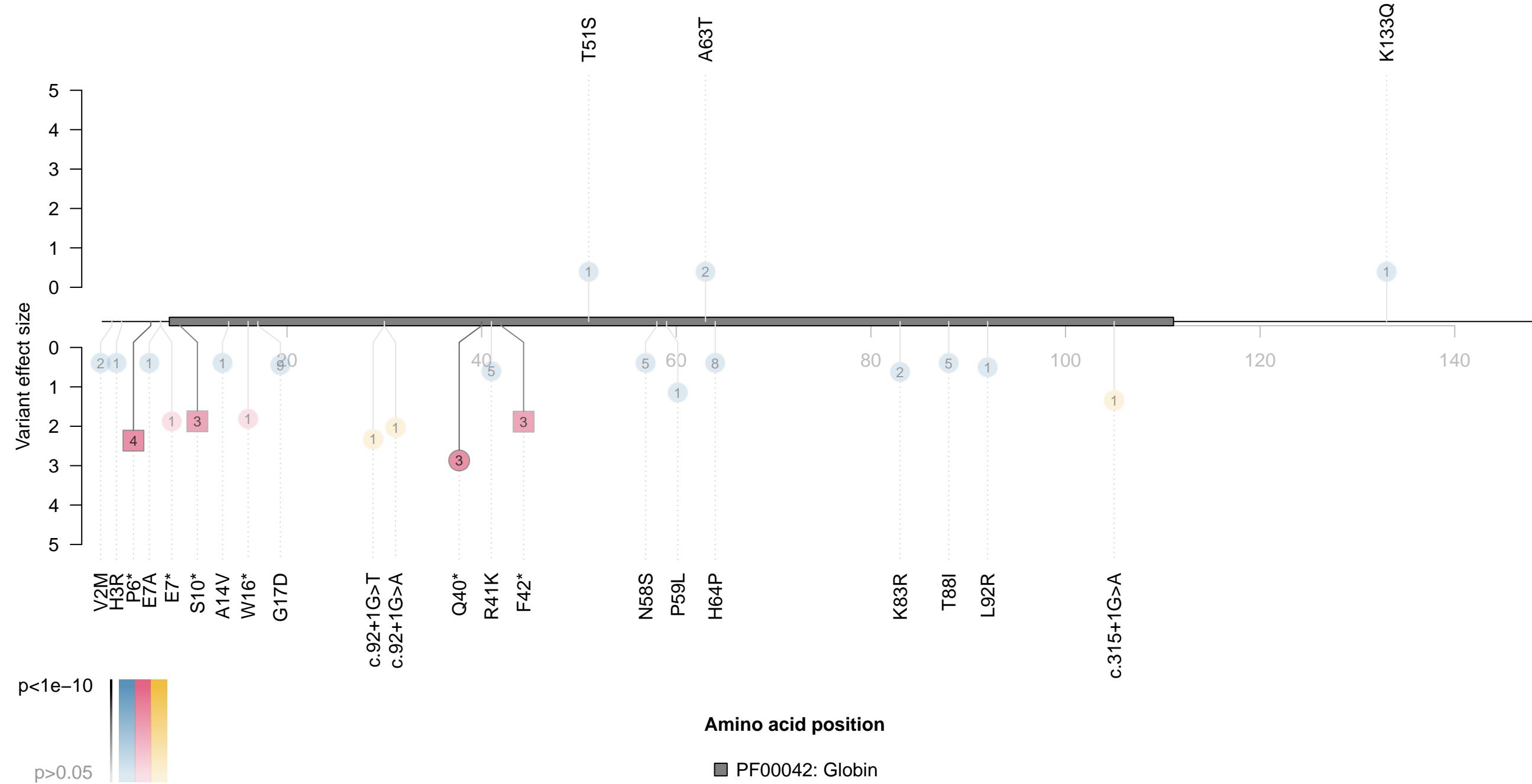
Gene=HBB; Chr=1; Phenotype=Mean corpuscular haemoglobin; Gene effect size=-2.49

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



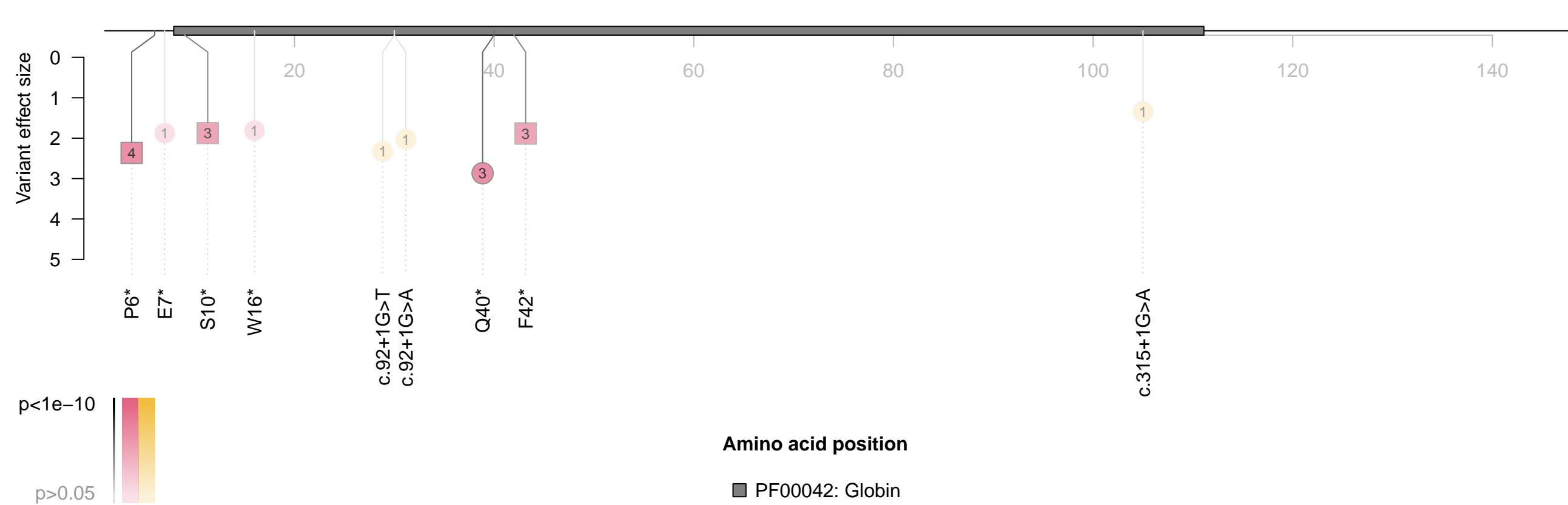
Gene=HBB; Chr=1; Phenotype=Mean corpuscular haemoglobin concentration; Gene effect size=-0.9

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



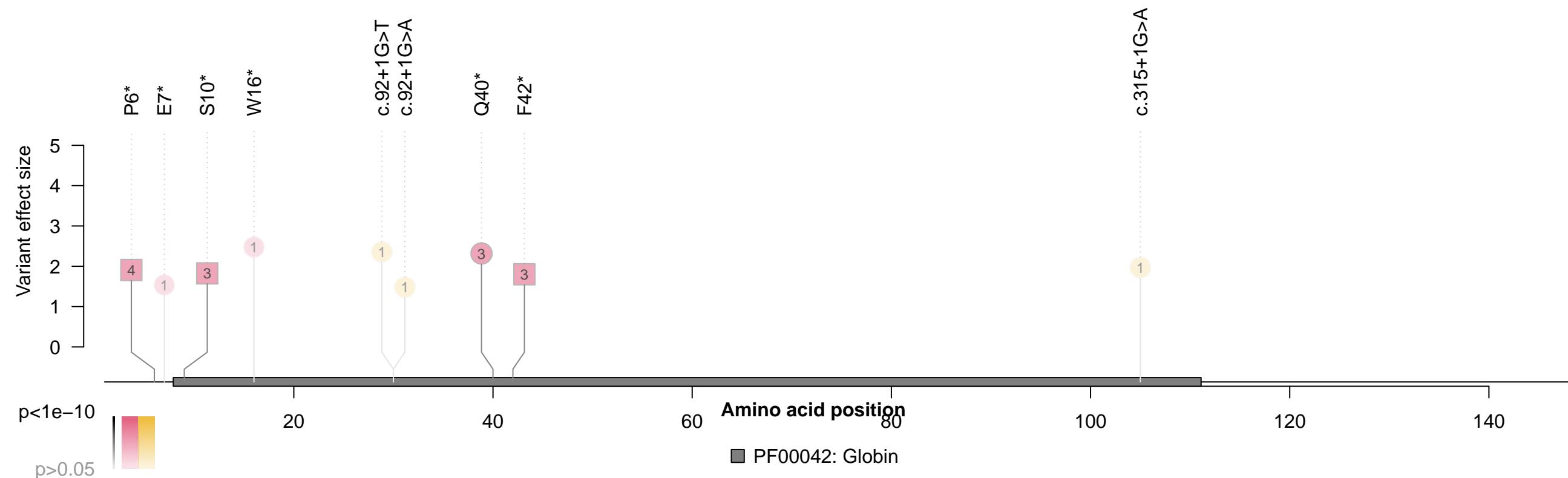
Gene=HBB; Chr=1; Phenotype=Mean corpuscular haemoglobin concentration; Gene effect size=-2.18

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



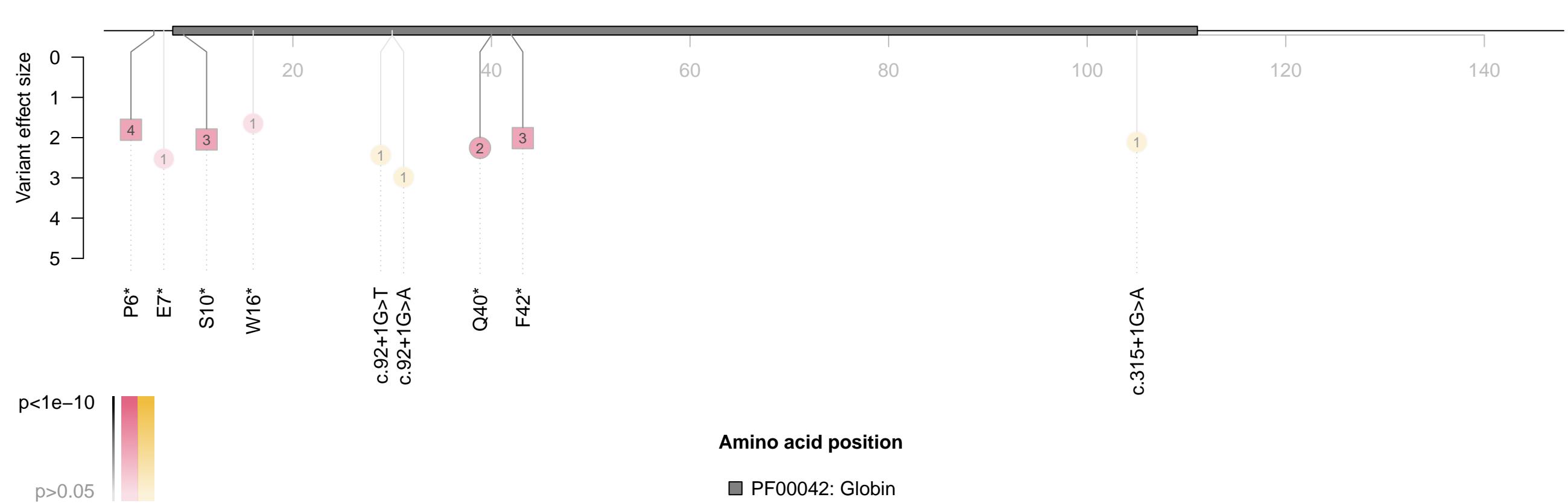
Gene=HBB; Chr=1; Phenotype=Red blood cell distribution width; Gene effect size=2

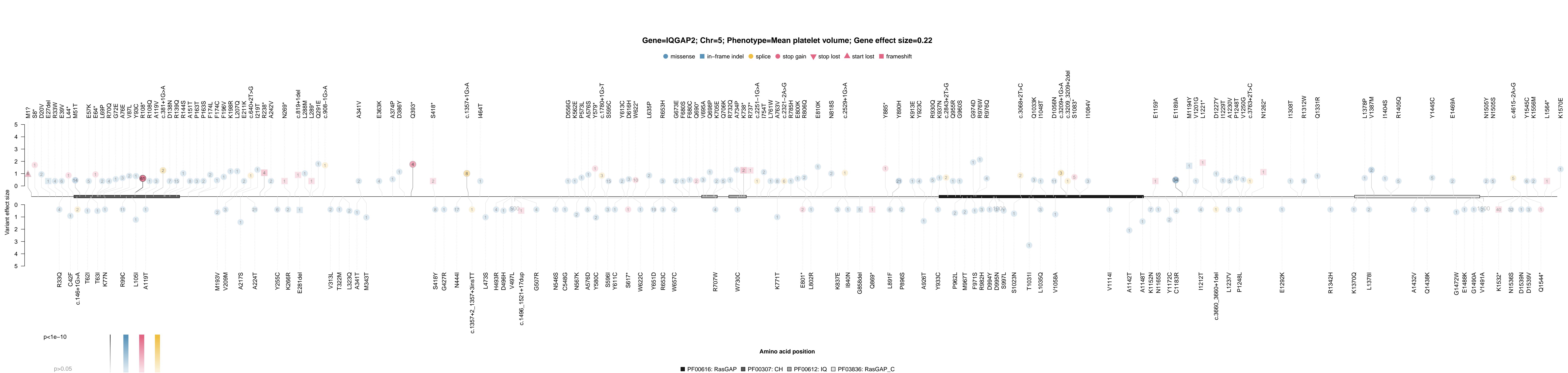
● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



Gene=HBB; Chr=1; Phenotype=Mean spheroid cell volume; Gene effect size=-2.11

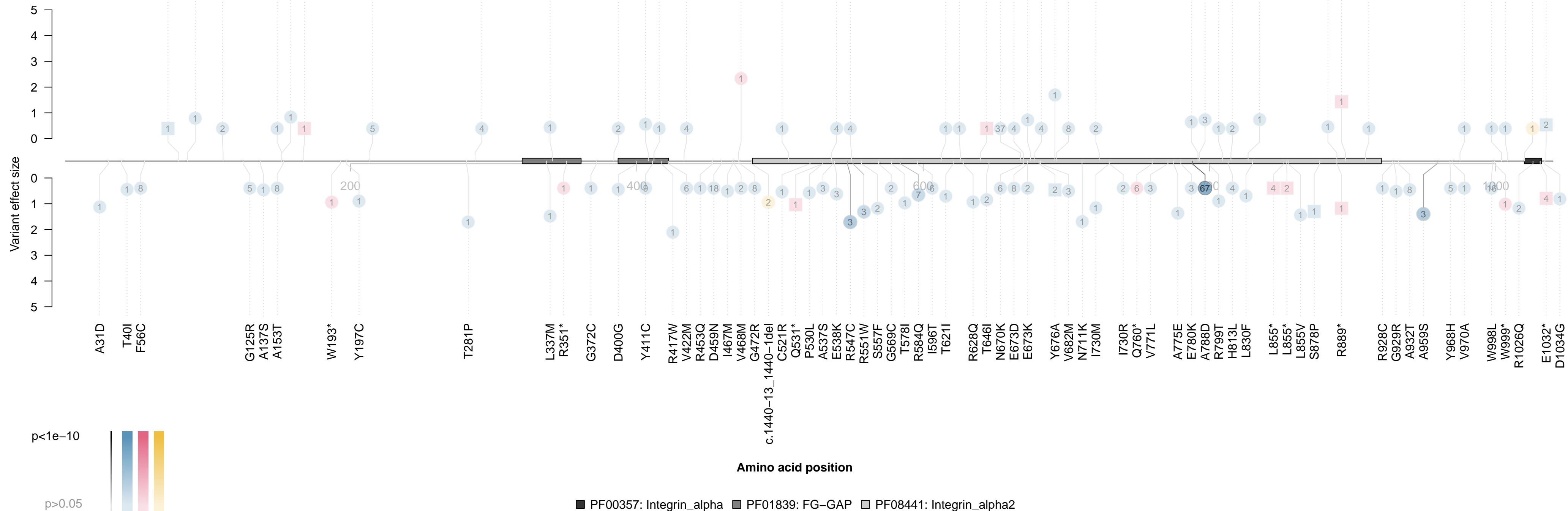
● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift





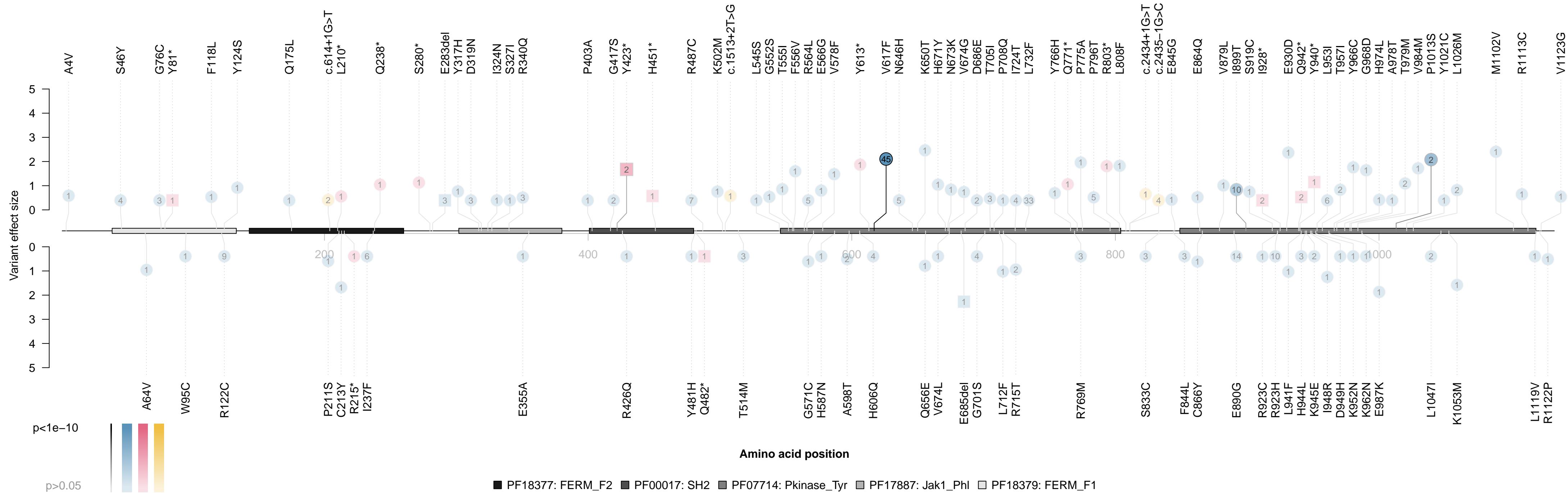
Gene=ITGA2B; Chr=1; Phenotype=Platelet count; Gene effect size=-0.29

● missense ■ in-frame indel ○ splice ● stop gain ▽ stop lost ▲ start lost ■ frameshift



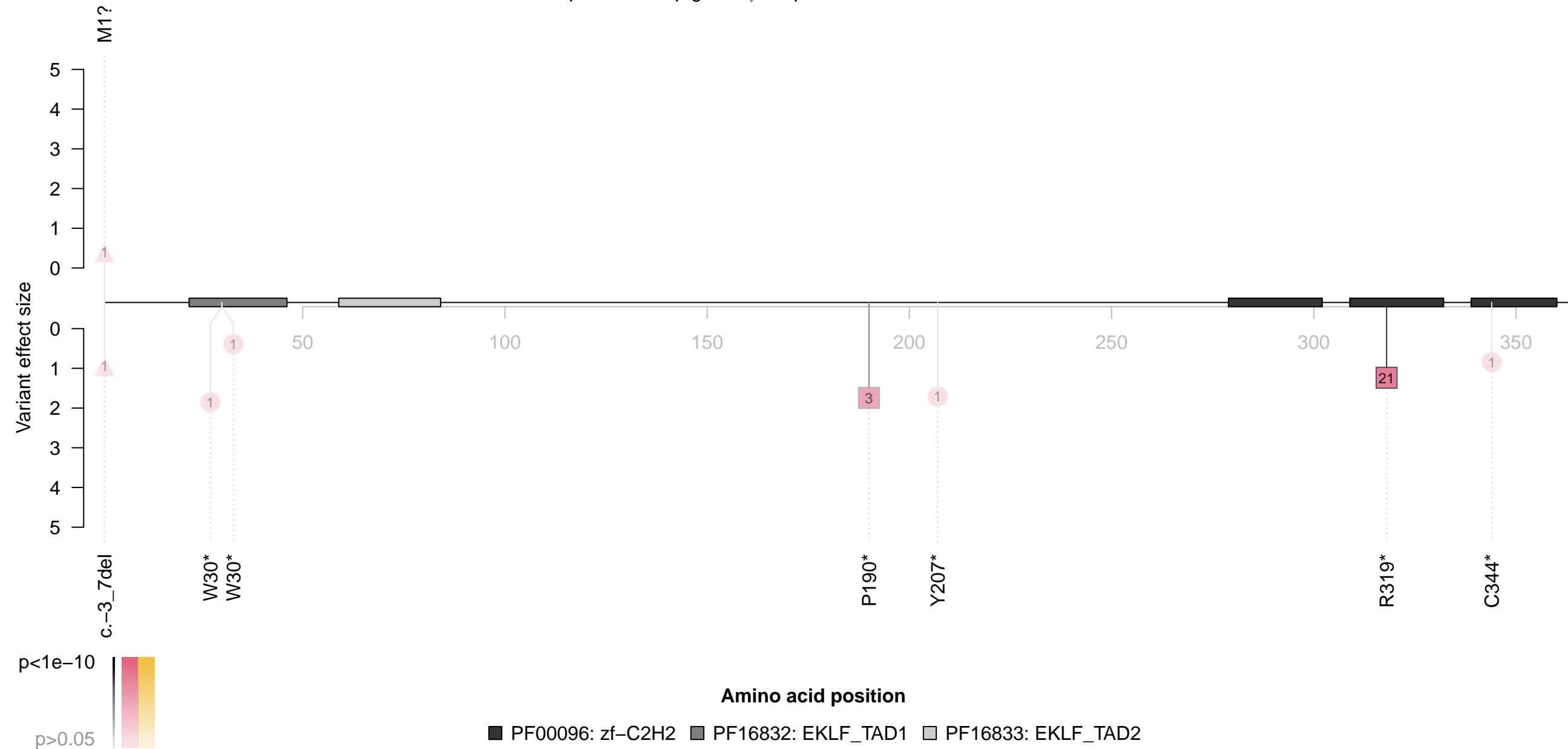
Gene=JAK2; Chr=9; Phenotype=Platelet crit; Gene effect size=0.49

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



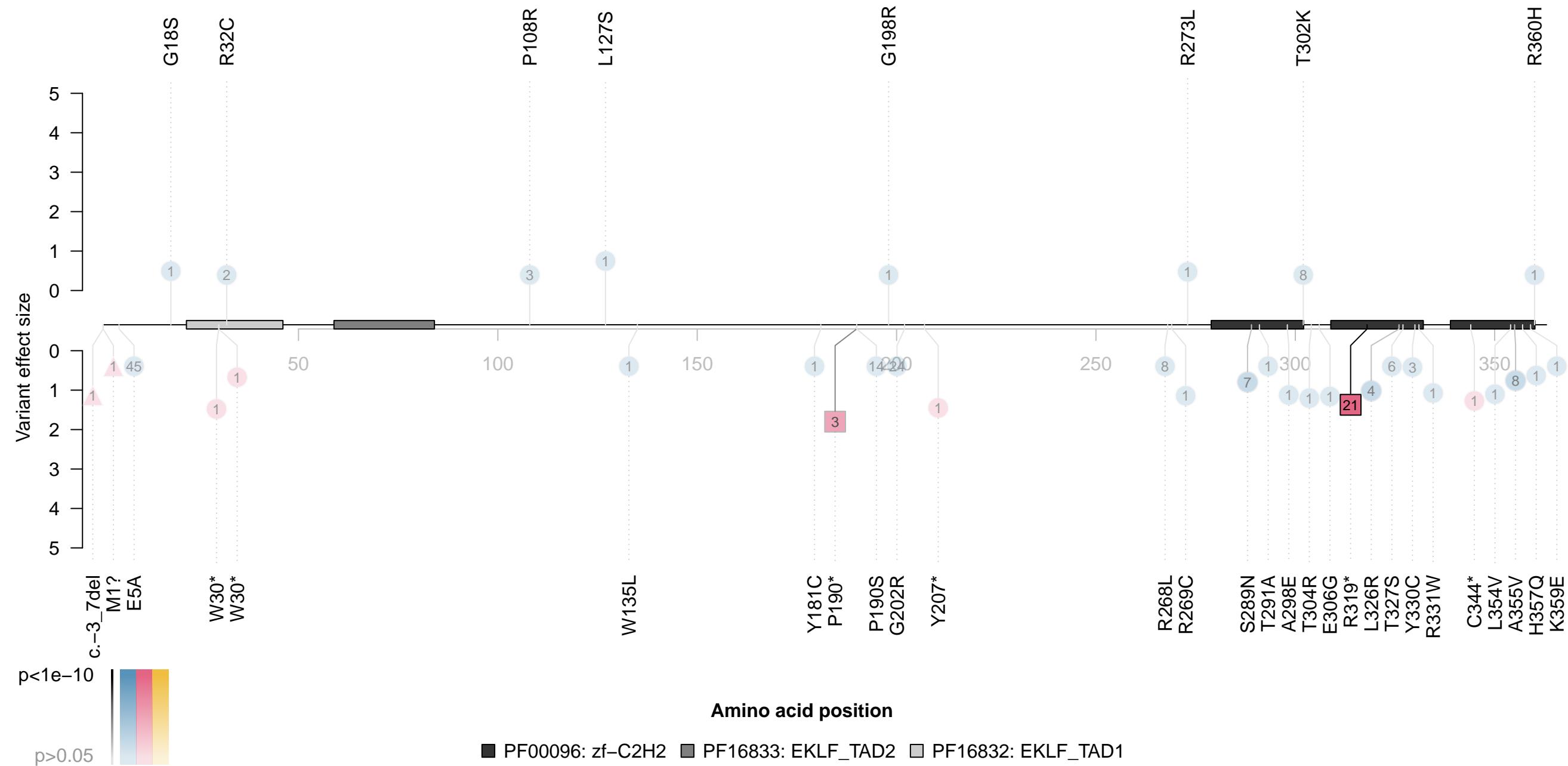
Gene=KLF1; Chr=1; Phenotype=Mean corpuscular volume; Gene effect size=-1.27

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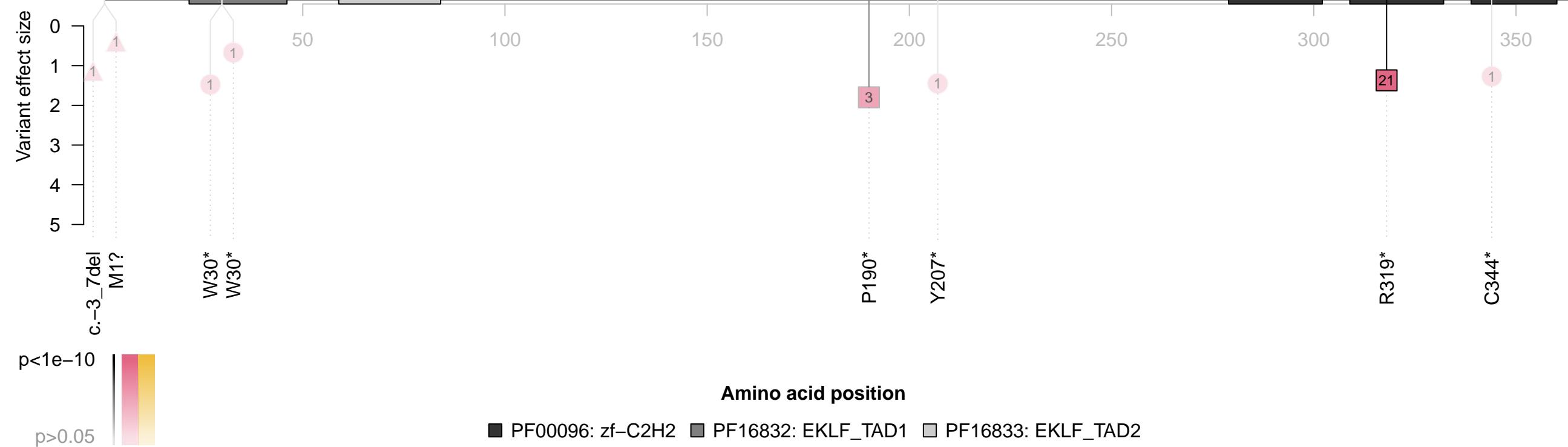
Gene=KLF1; Chr=1; Phenotype=Mean corpuscular haemoglobin; Gene effect size=-0.4

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



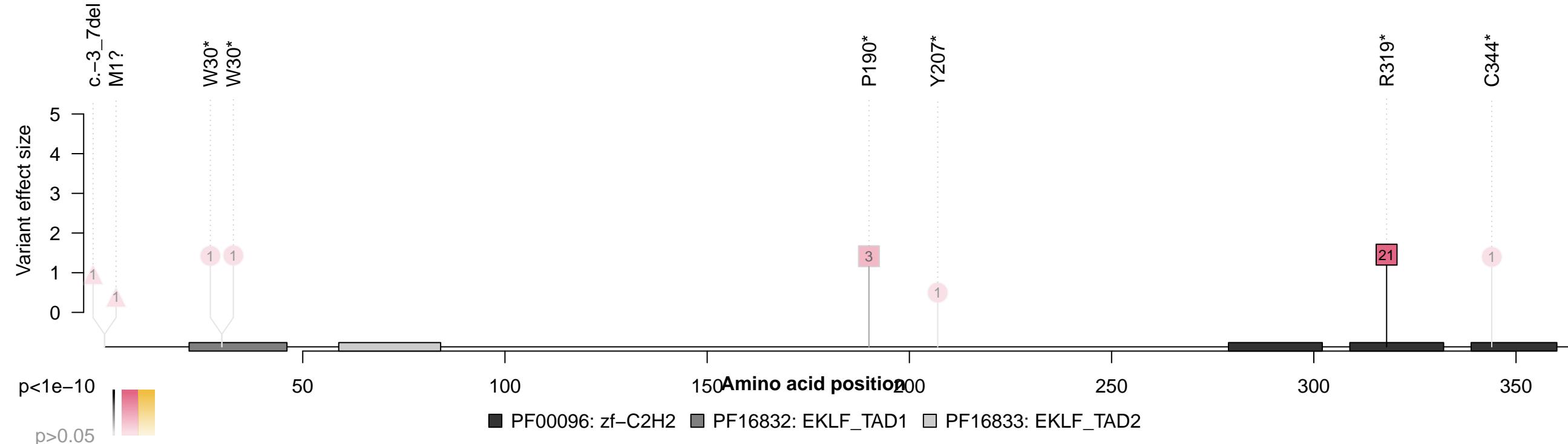
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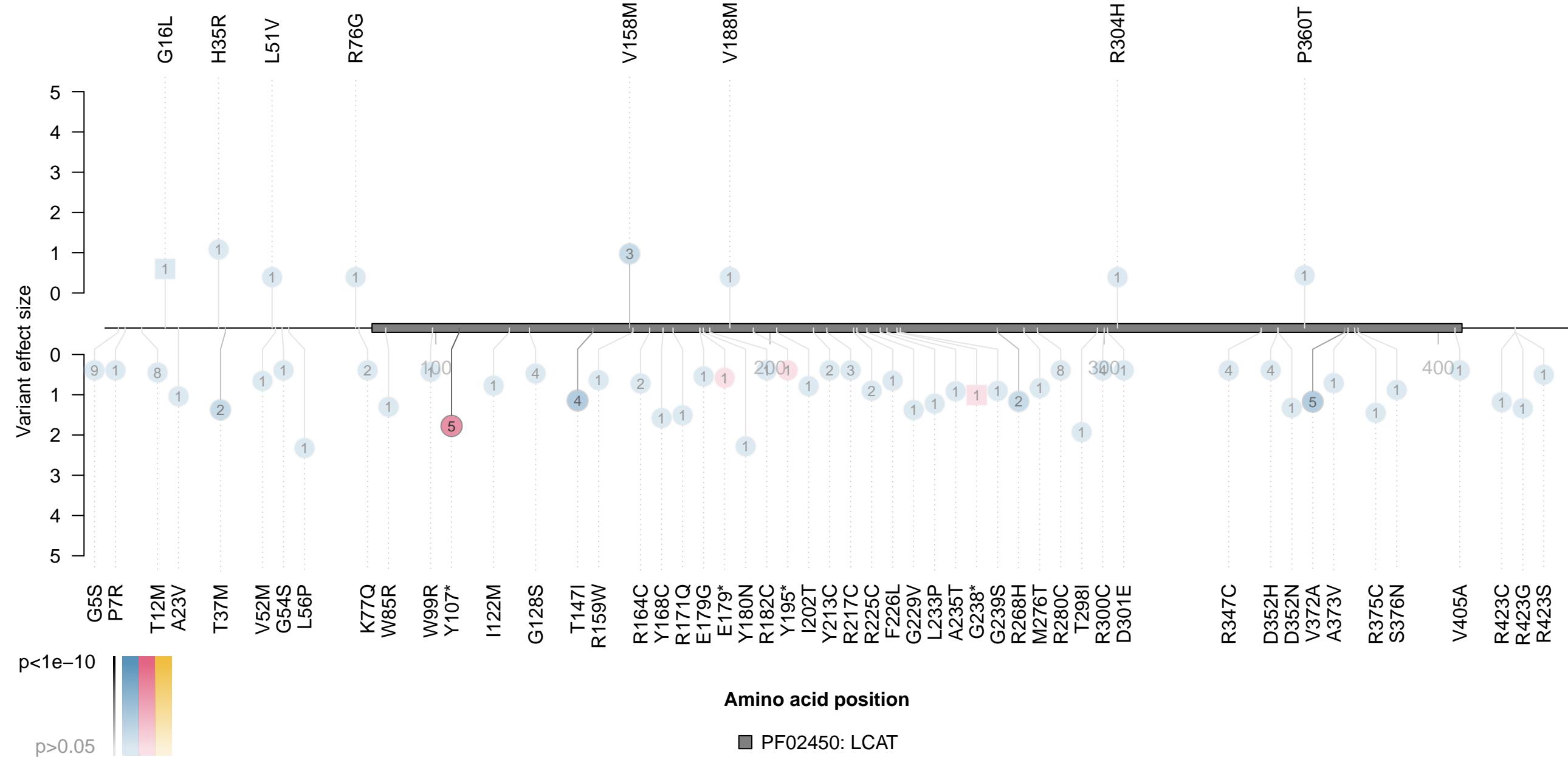
Gene=KLF1; Chr=1; Phenotype=Red blood cell distribution width; Gene effect size=1.39

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



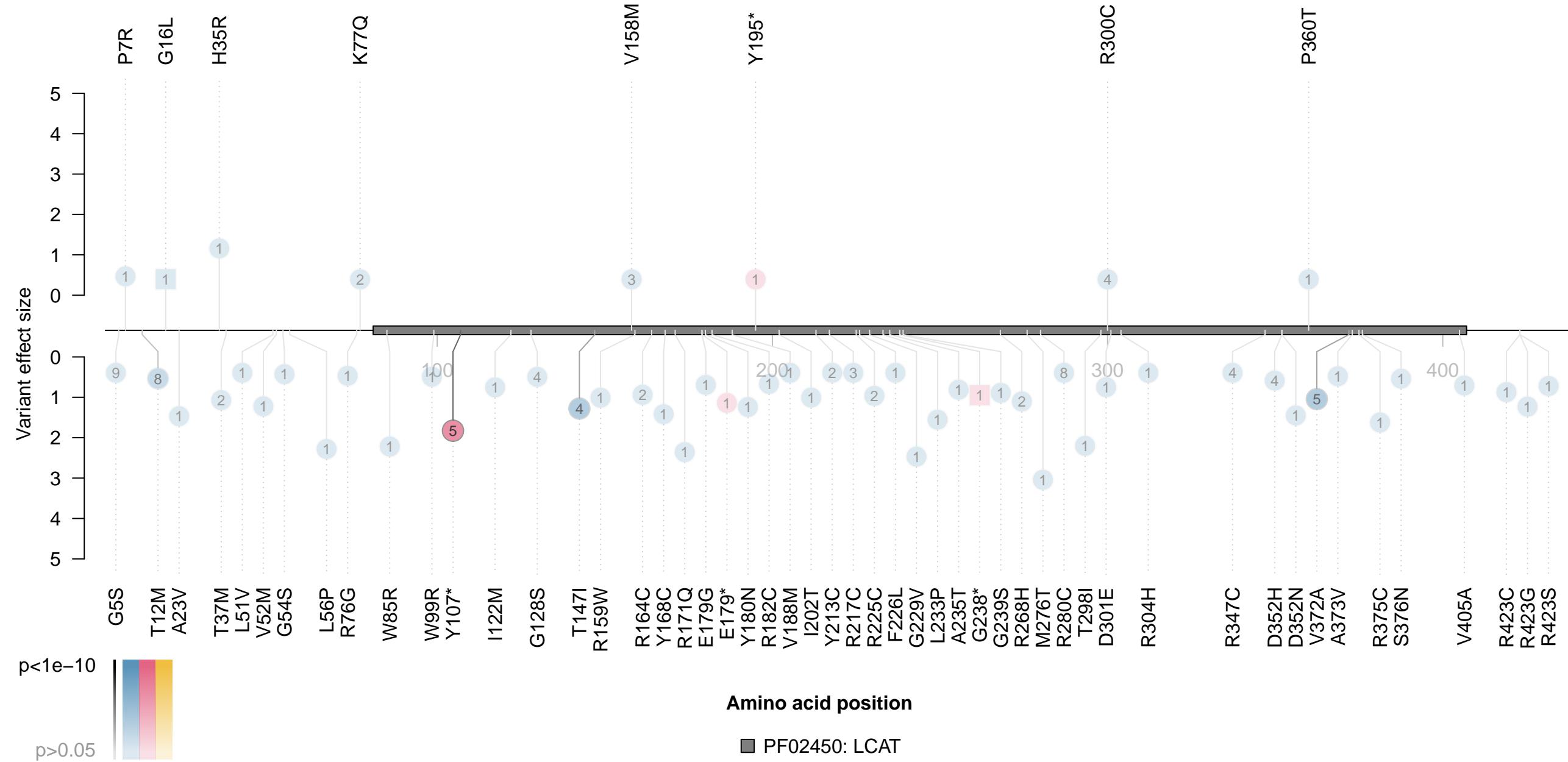
Gene=LCAT; Chr=1; Phenotype=Apolipoprotein A; Gene effect size=-0.66

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



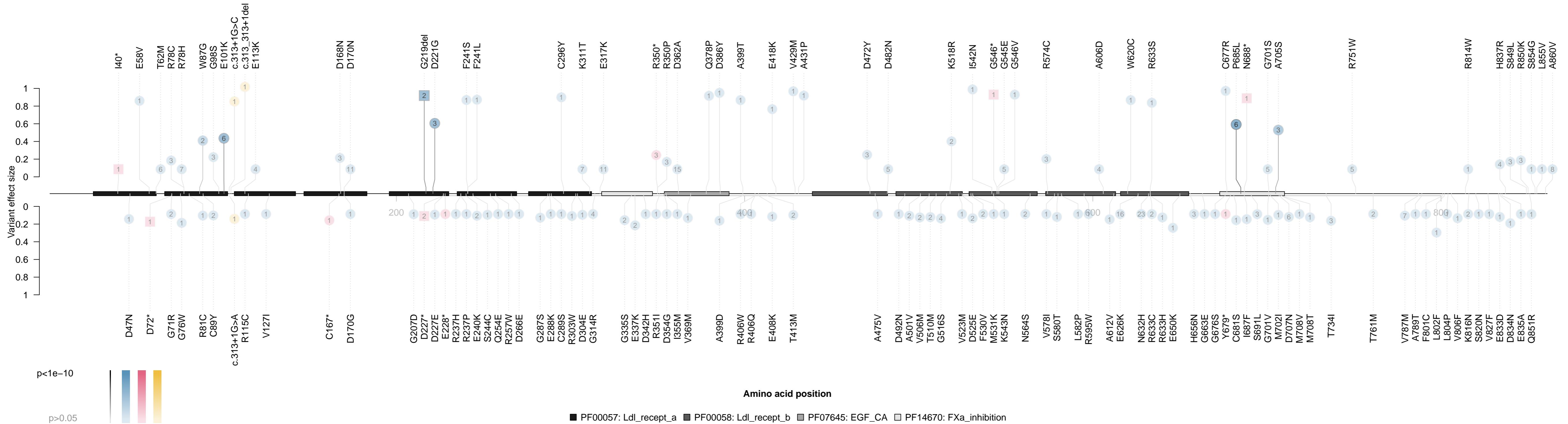
Gene=LCAT; Chr=1; Phenotype=HDL cholesterol; Gene effect size=-0.78

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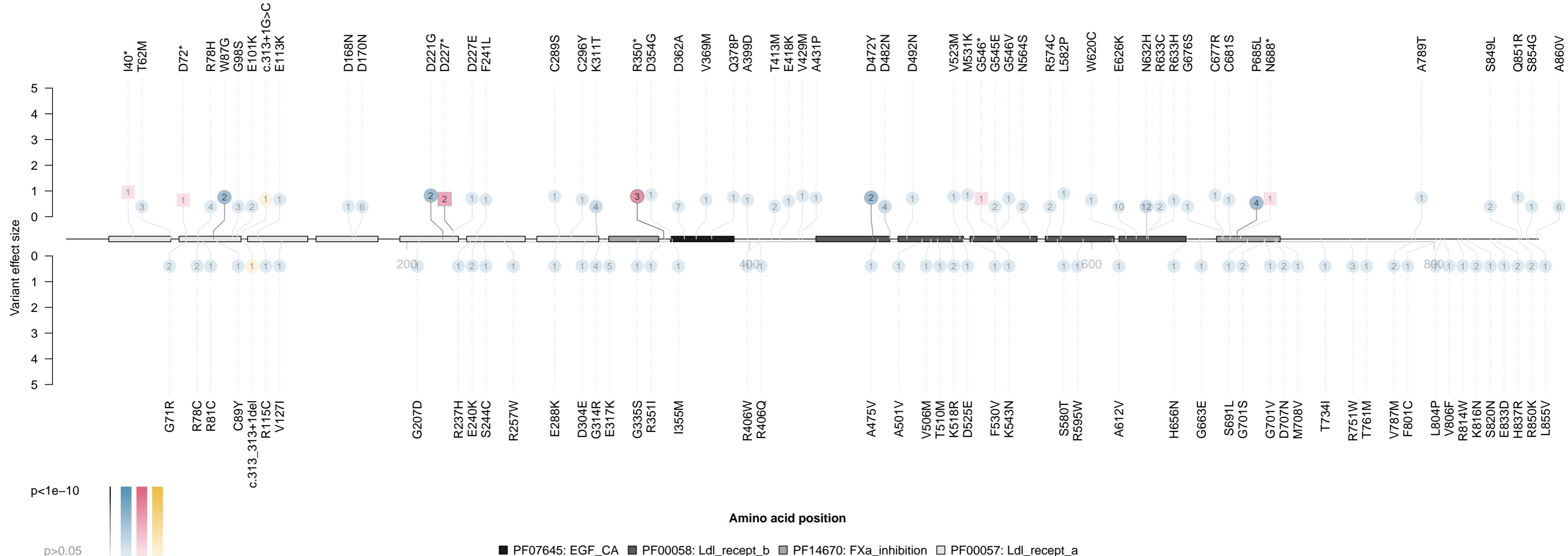
Gene=LDLR; Chr=1; Phenotype=E78.0 Pure hypercholesterolaemia; Gene effect size=0.08

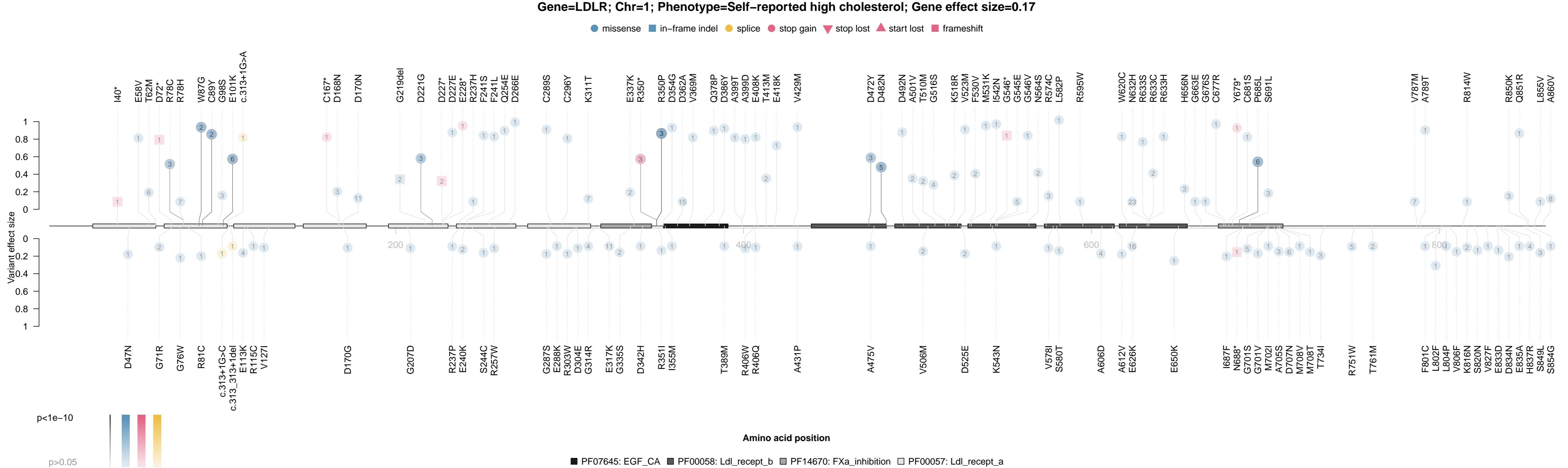
● missense ■ in-frame indel ○ splice ● stop gain ▽ stop lost ▲ start lost ■ frameshift



Gene=LDLR; Chr=1; Phenotype=Cholesterol lowering medication; Gene effect size=0.19

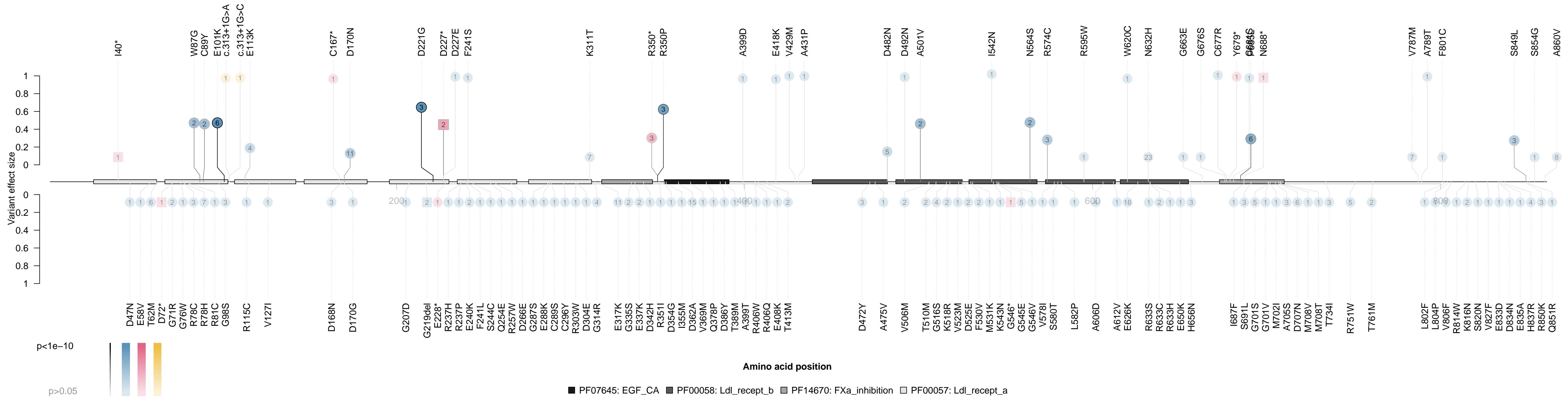
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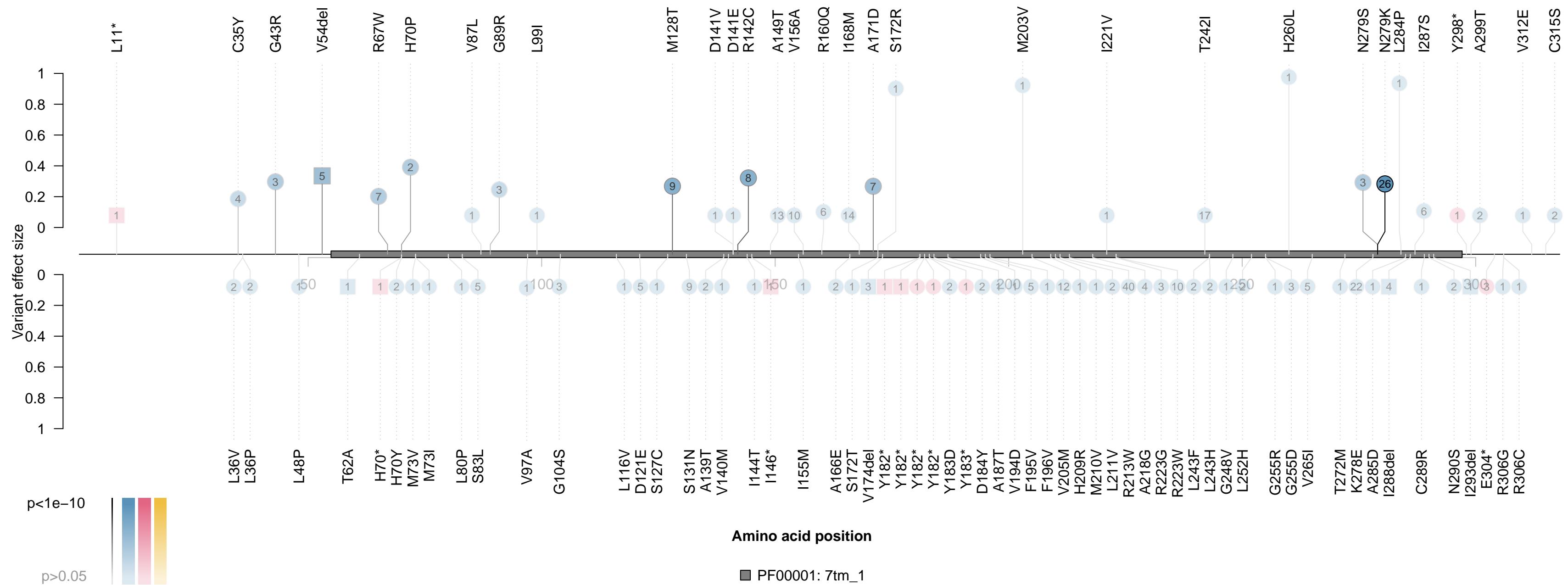
Gene=LDLR; Chr=1; Phenotype=Treatment/medication code: atorvastatin; Gene effect size=0.09

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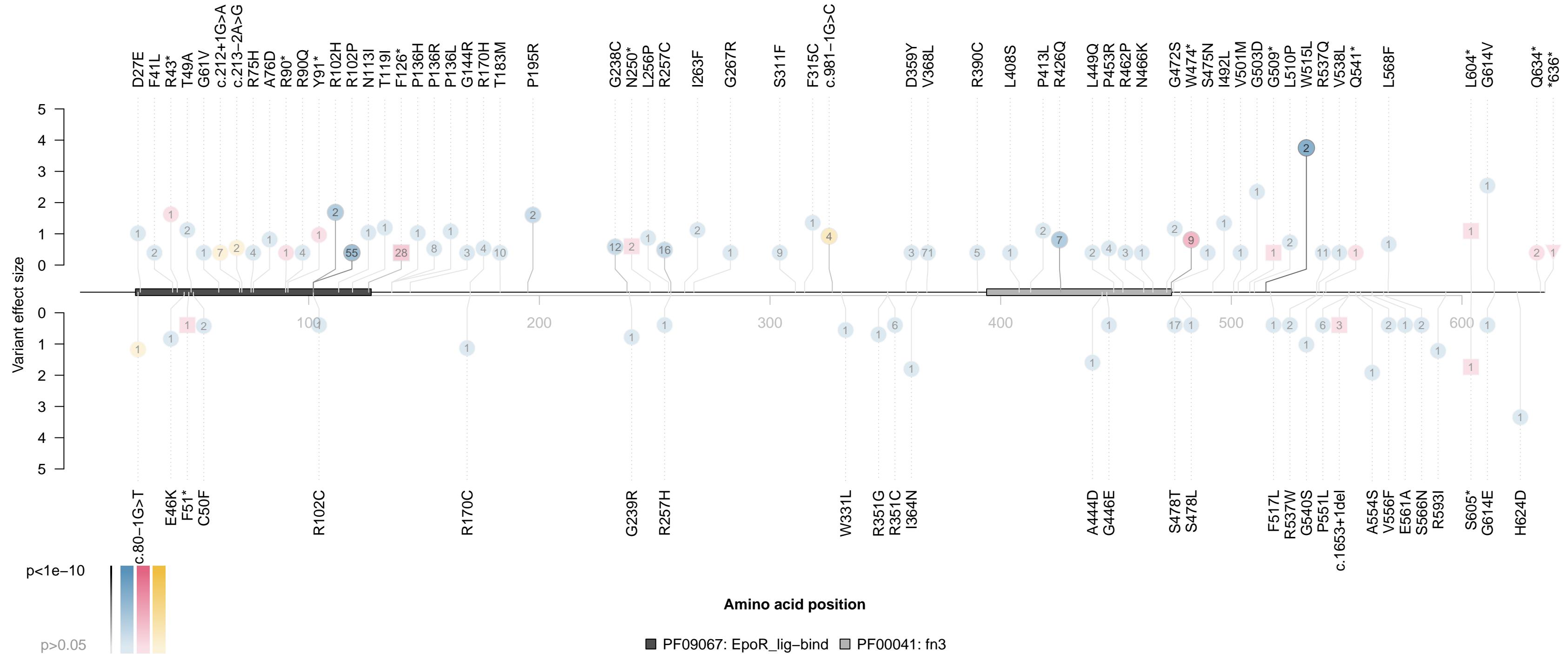
Gene=MC1R; Chr=1; Phenotype=Hair colour: Red; Gene effect size=0.07

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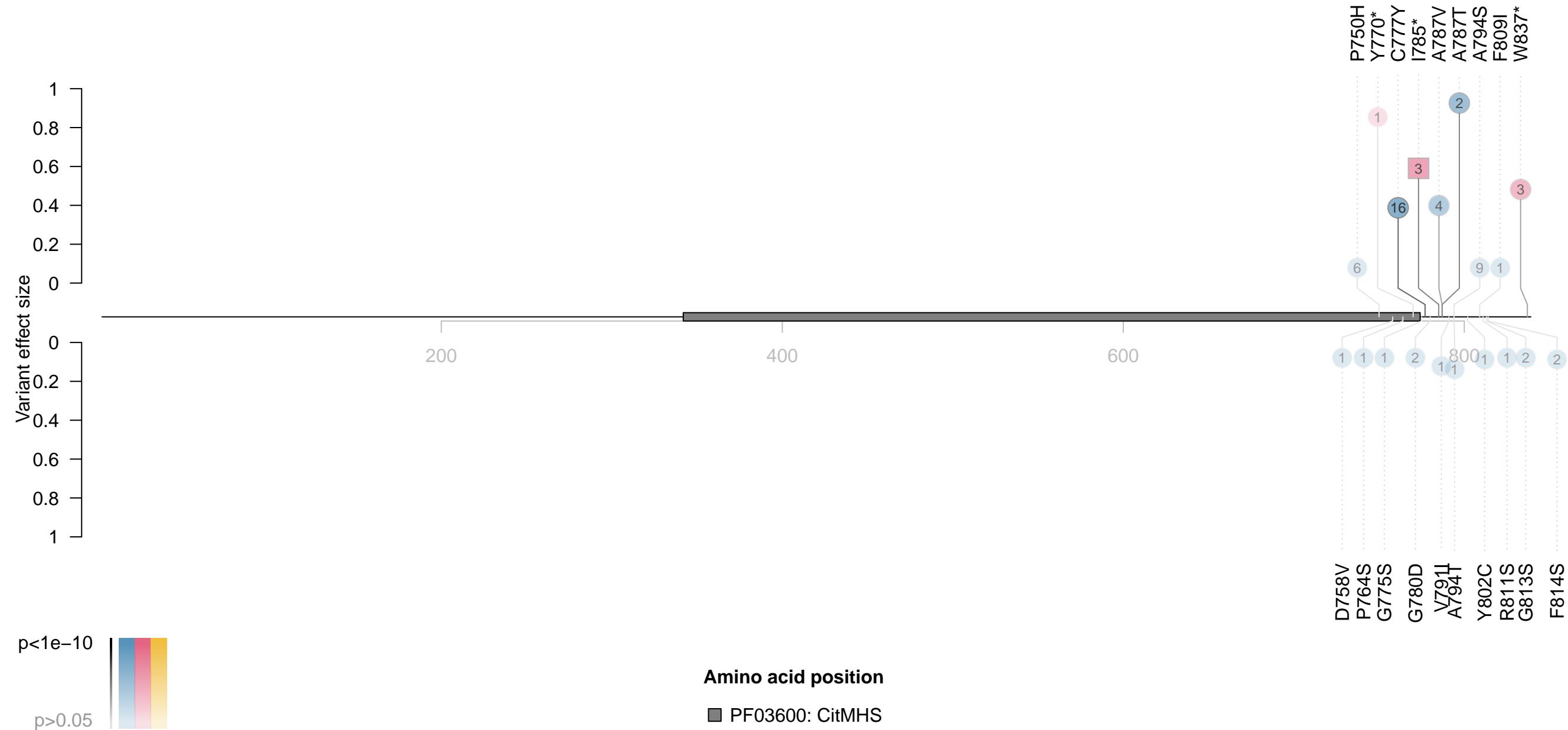
Gene=MPL; Chr=1; Phenotype=Platelet count; Gene effect size=0.3

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



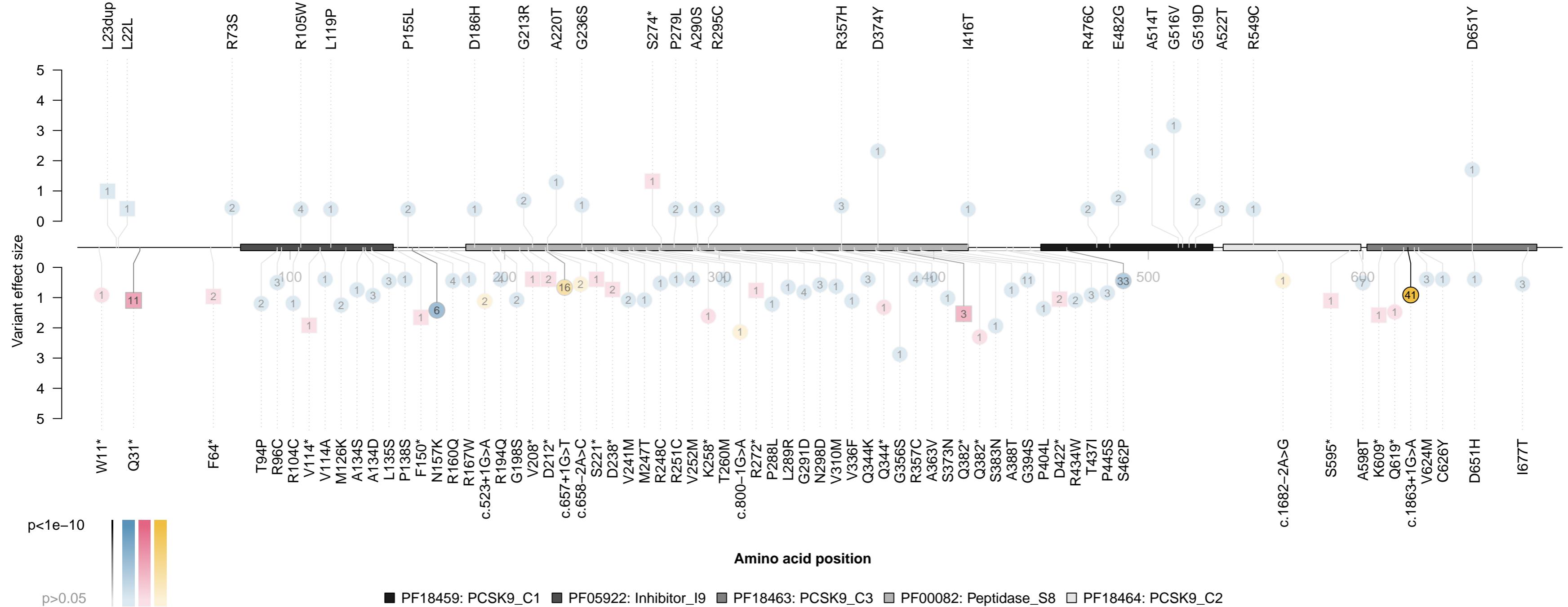
Gene=OCA2; Chr=1; Phenotype=Hair colour: Blonde; Gene effect size=0.24

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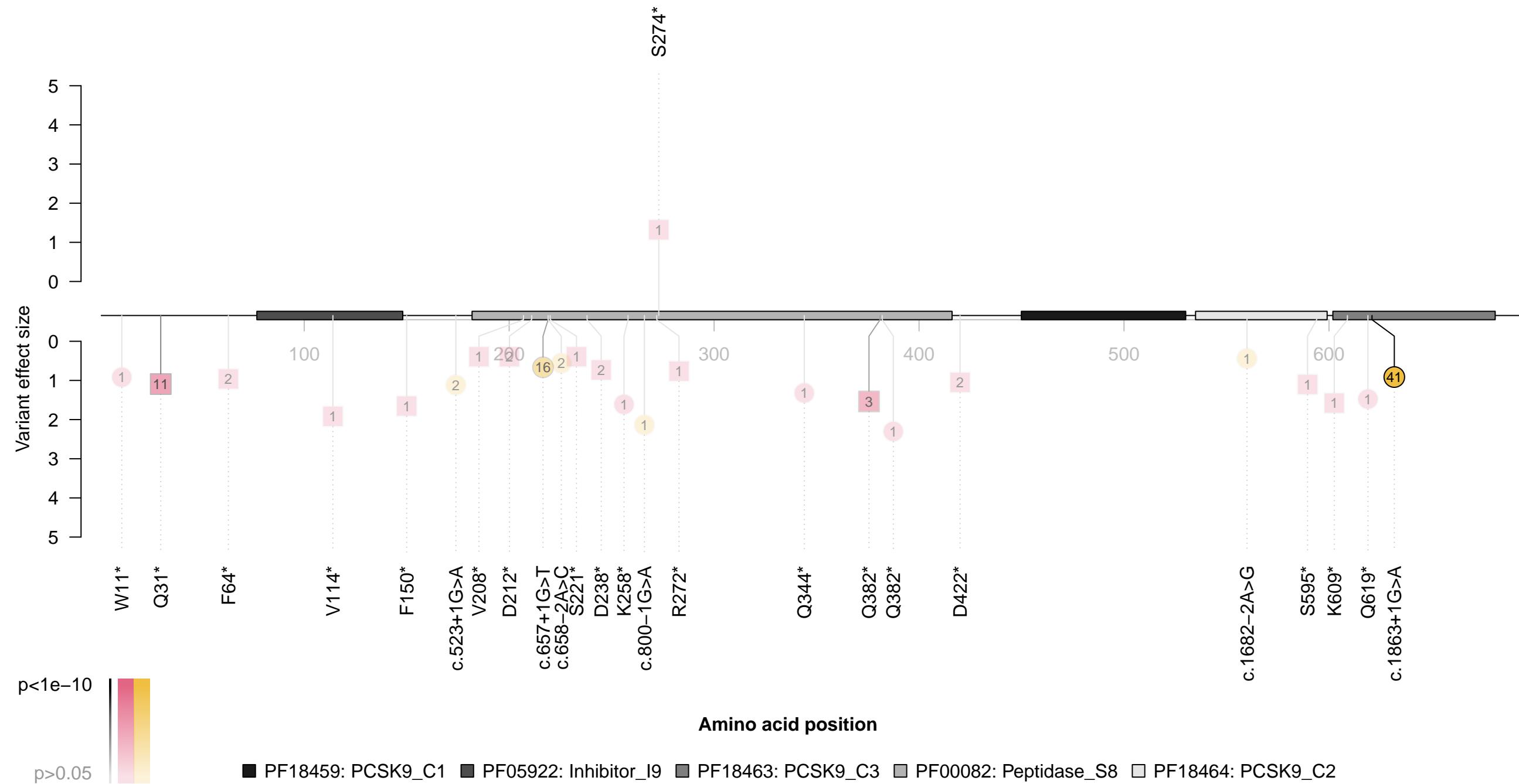
Gene=PCSK9; Chr=1; Phenotype=Apolipoprotein B; Gene effect size=-0.6

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



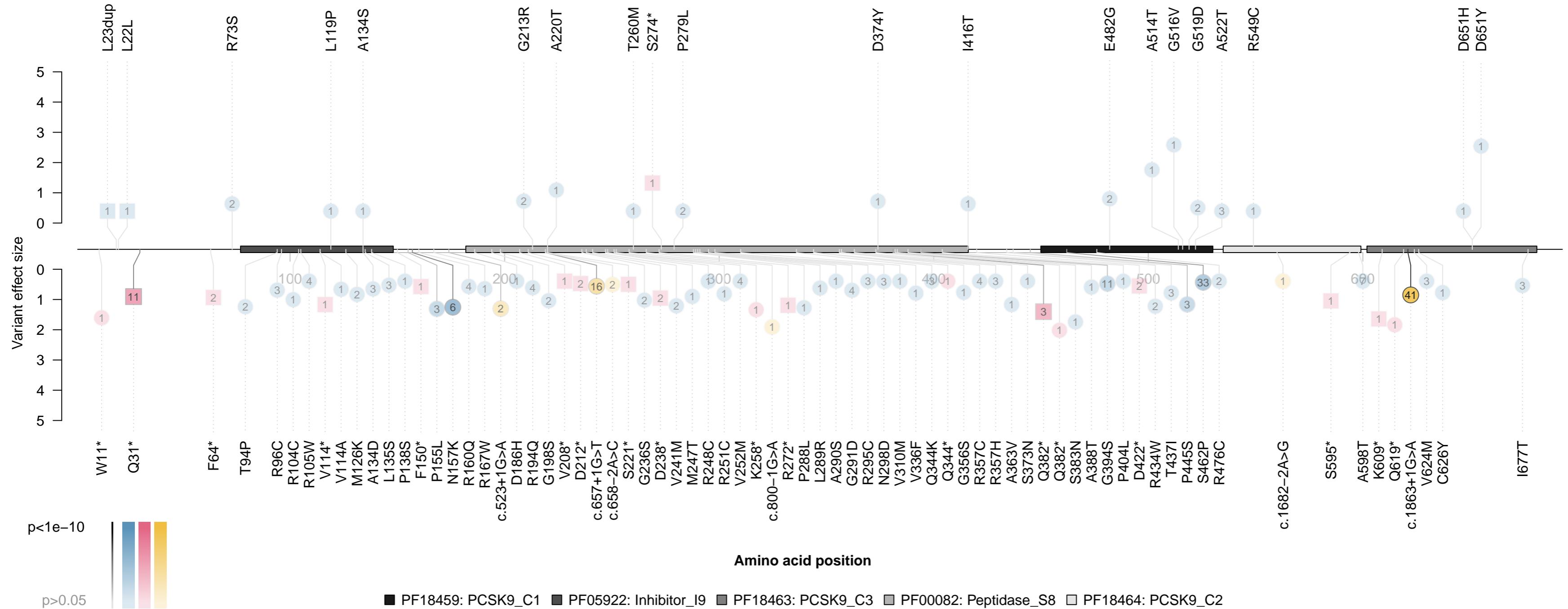
Gene=PCSK9; Chr=1; Phenotype=Apolipoprotein B; Gene effect size=-0.99

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



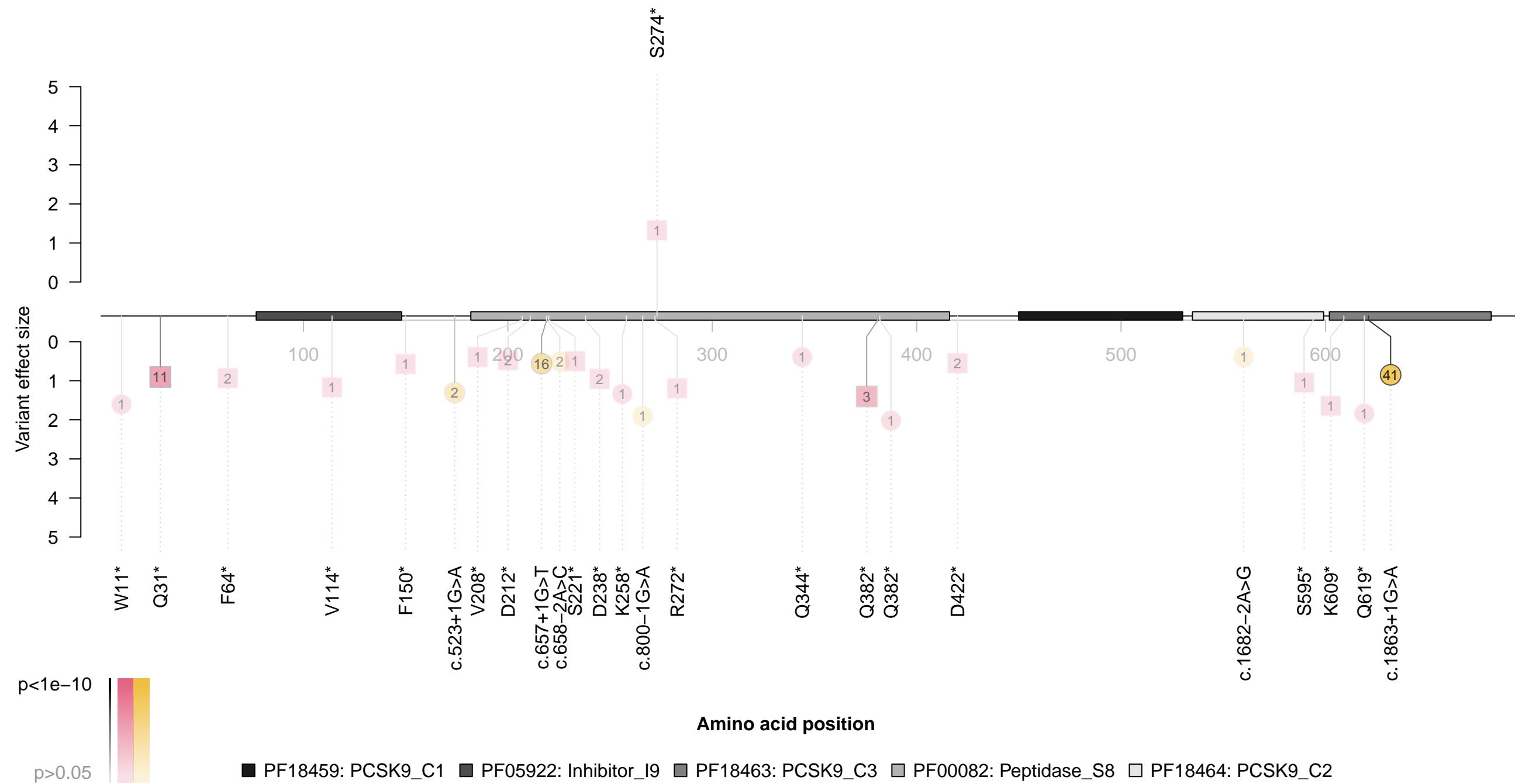
Gene=PCSK9; Chr=1; Phenotype=Cholesterol; Gene effect size=-0.59

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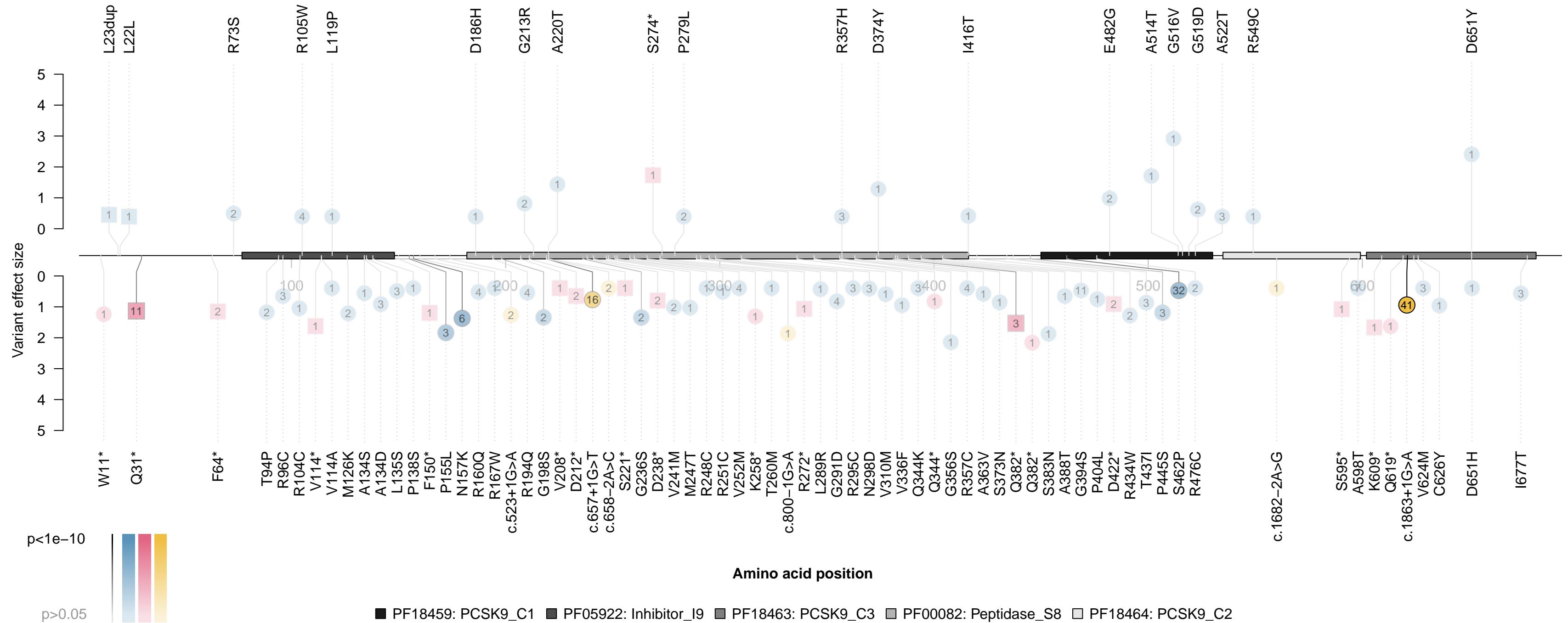
Gene=PCSK9; Chr=1; Phenotype=Cholesterol; Gene effect size=-0.9

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



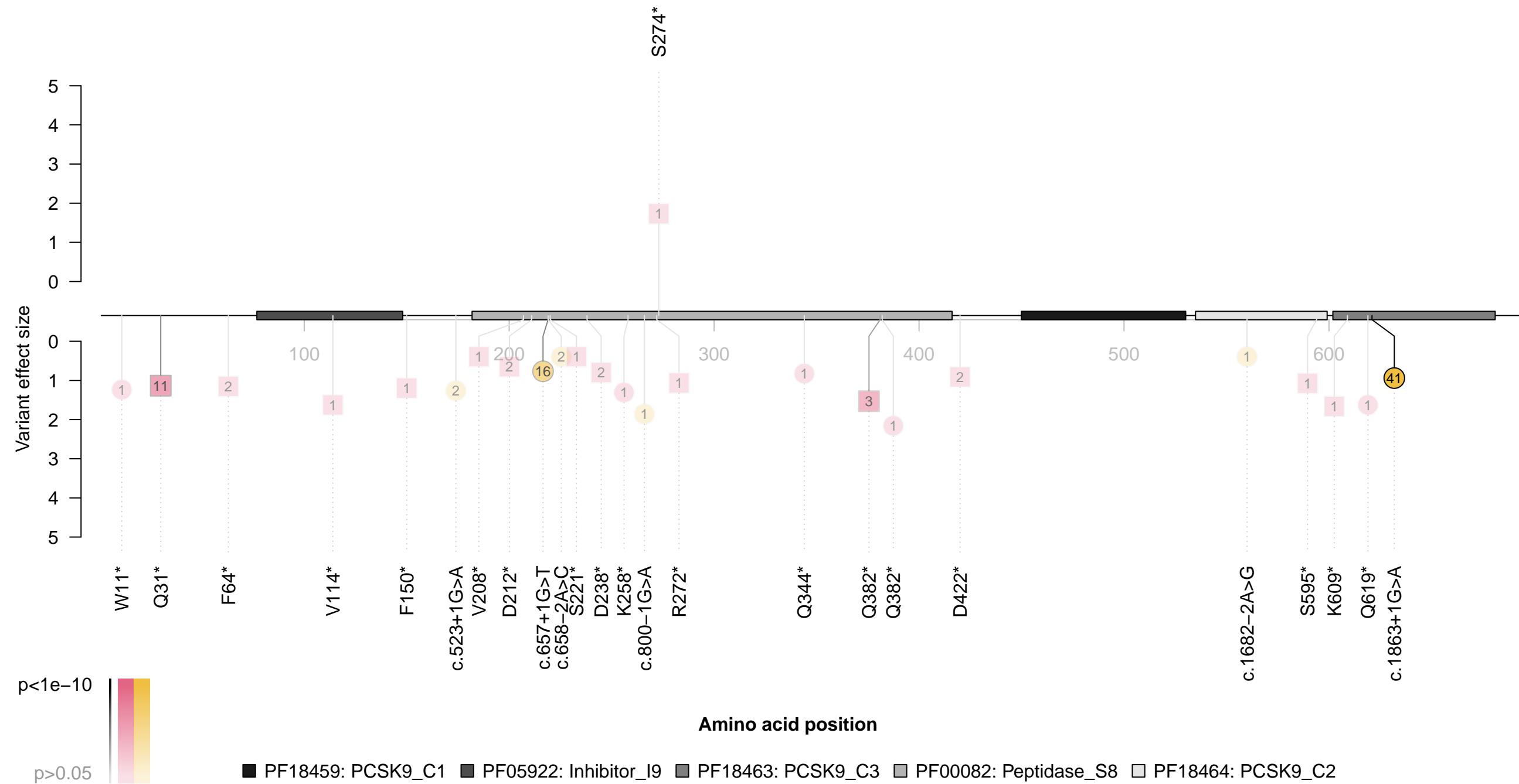
Gene=PCSK9; Chr=1; Phenotype=LDL direct; Gene effect size=-0.64

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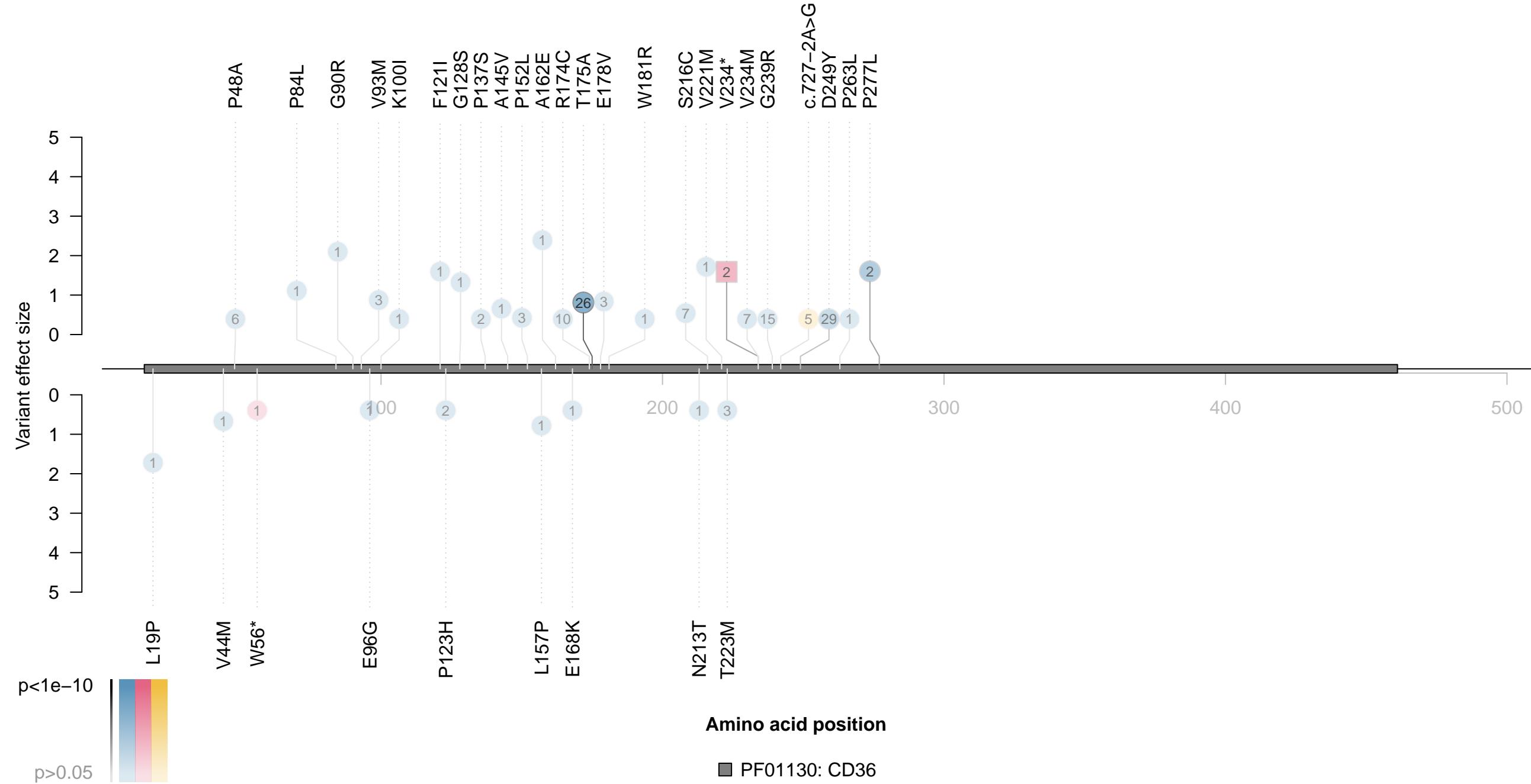
Gene=PCSK9; Chr=1; Phenotype=LDL direct; Gene effect size=-1.02

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



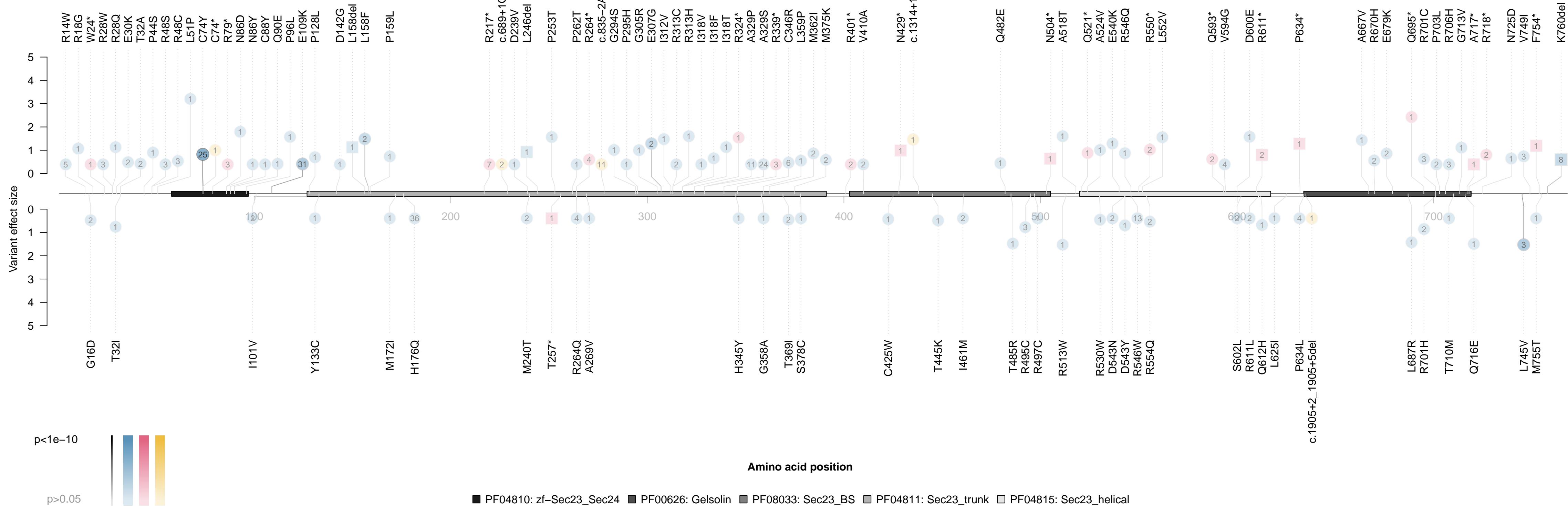
Gene=SCARB1; Chr=1; Phenotype=HDL cholesterol; Gene effect size=0.5

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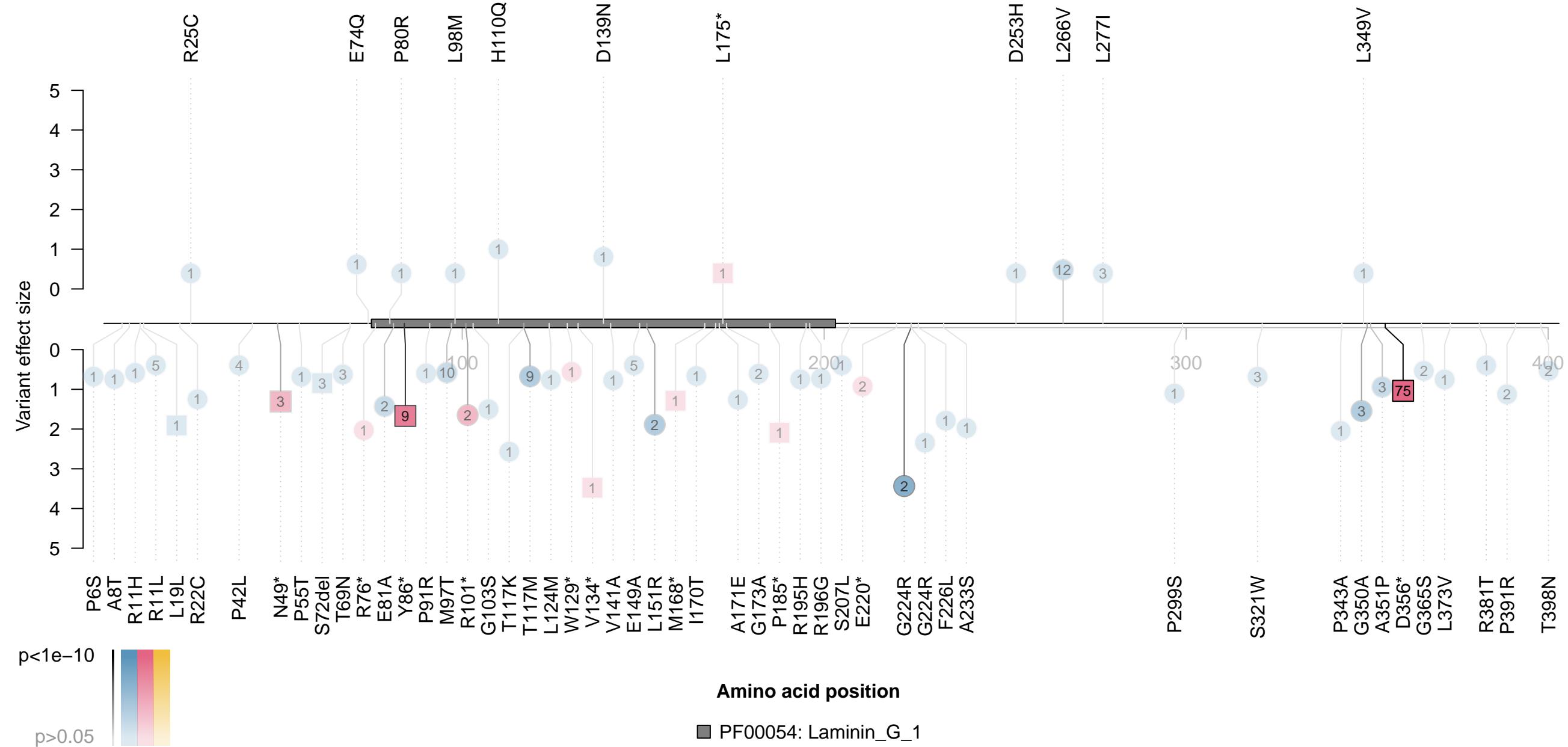
Gene=SEC23B; Chr=2; Phenotype=Red blood cell distribution width; Gene effect size=0.34

● missense ■ in-frame indel ○ splice ● stop gain ▽ stop lost ▲ start lost ■ frameshift



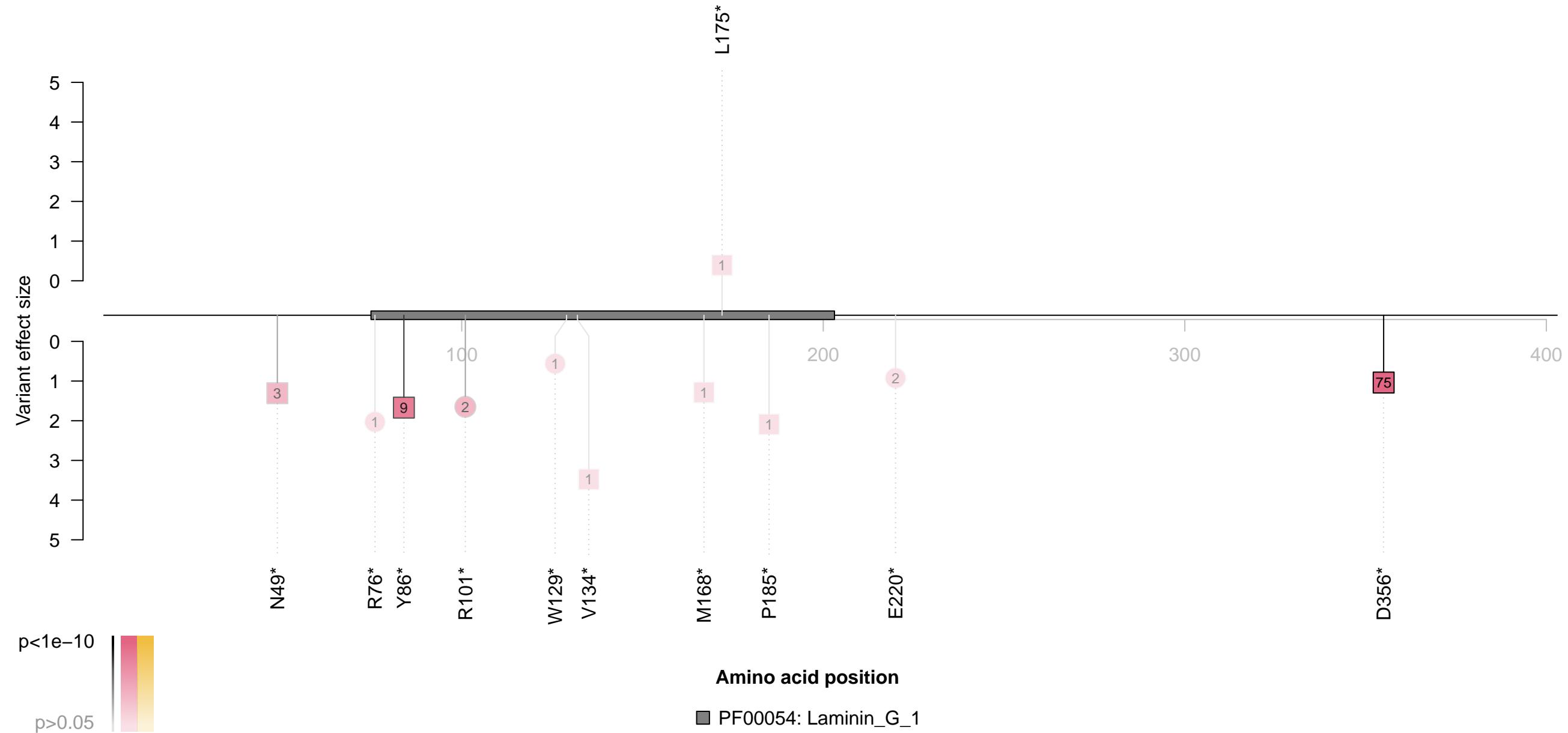
Gene=SHBG; Chr=1; Phenotype=SHBG; Gene effect size=-0.9

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



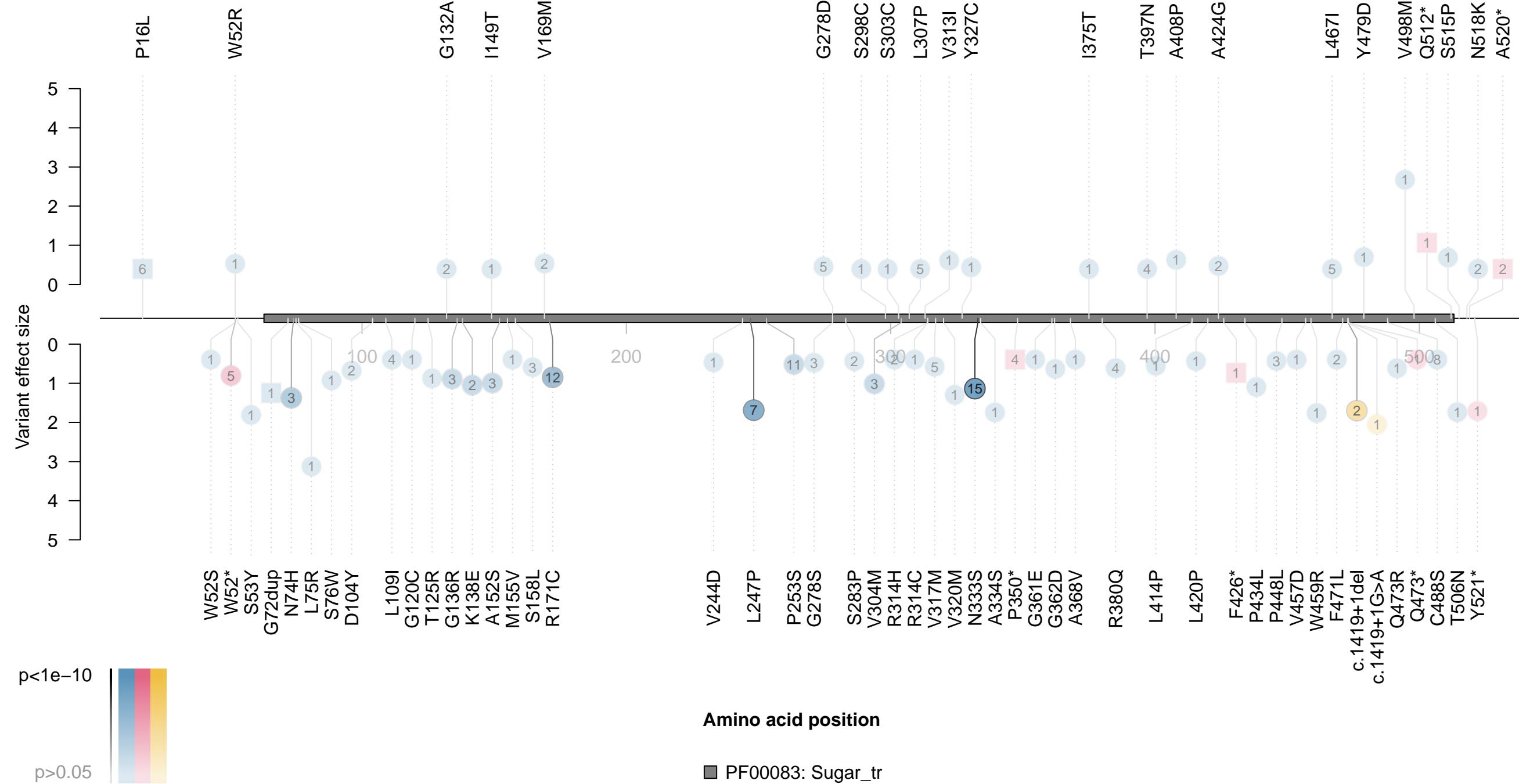
Gene=SHBG; Chr=1; Phenotype=SHBG; Gene effect size=-1.2

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



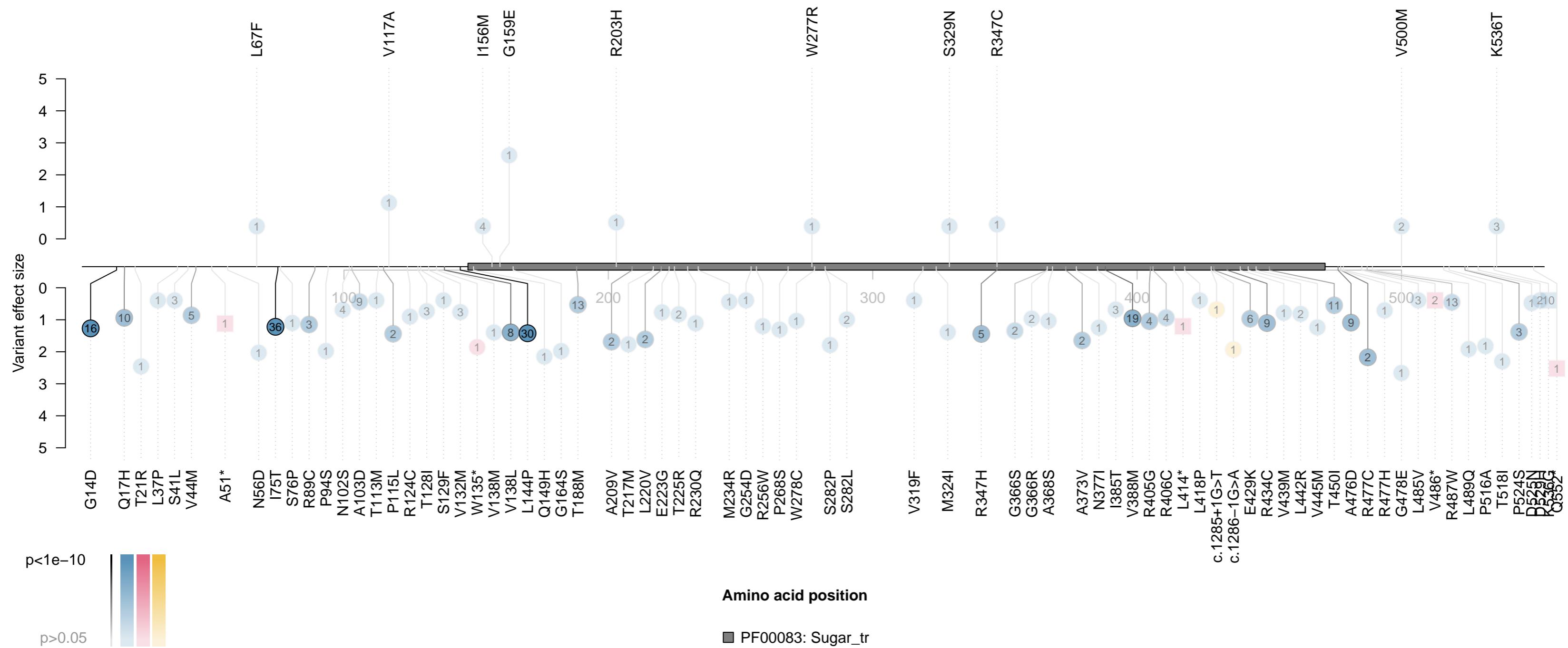
Gene=SLC2A9; Chr=4; Phenotype=Urate; Gene effect size=-0.6

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



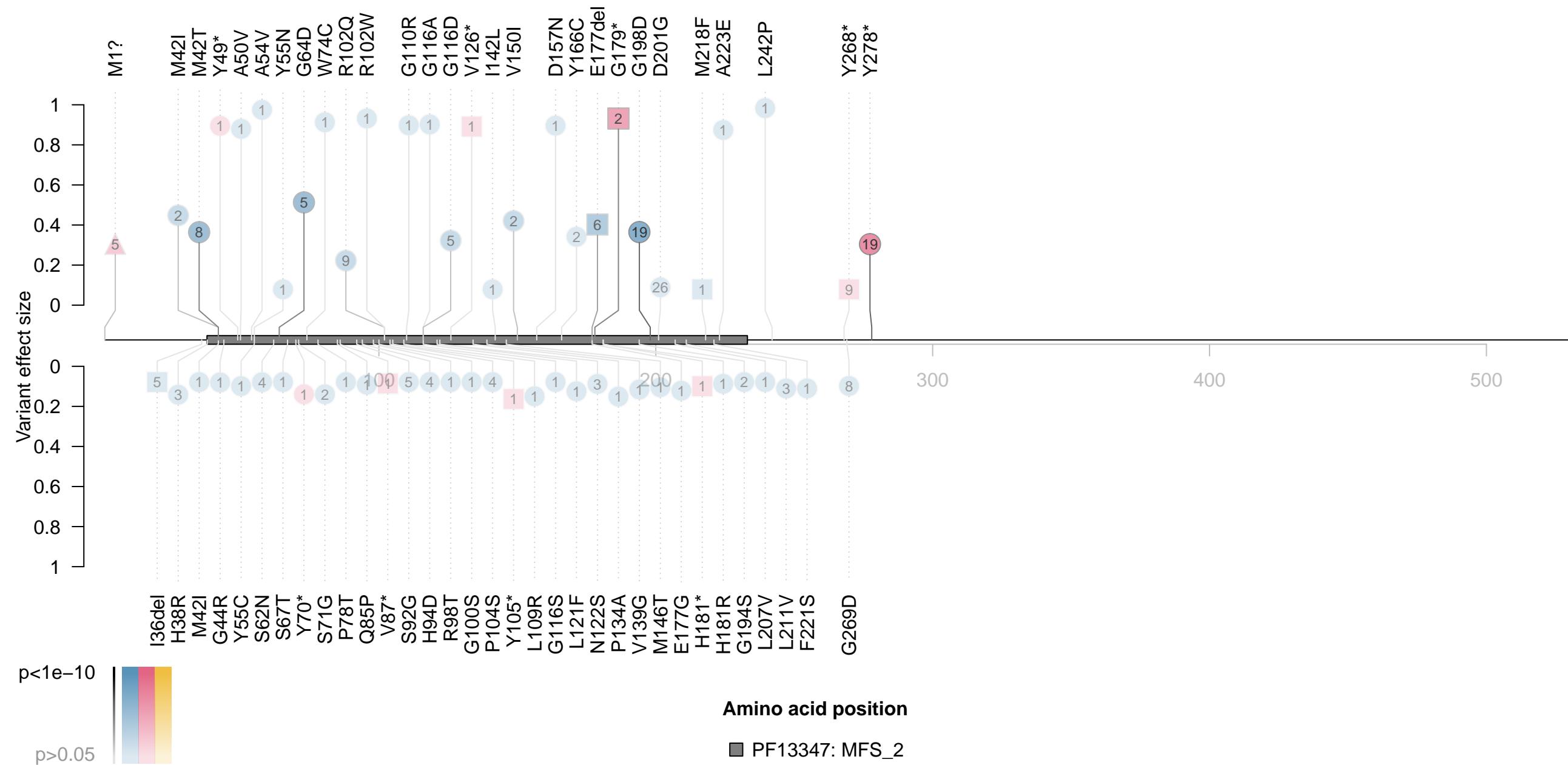
Gene=SLC22A12; Chr=1; Phenotype=Urate; Gene effect size=-1.02

● missense ■ in-frame indel ● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



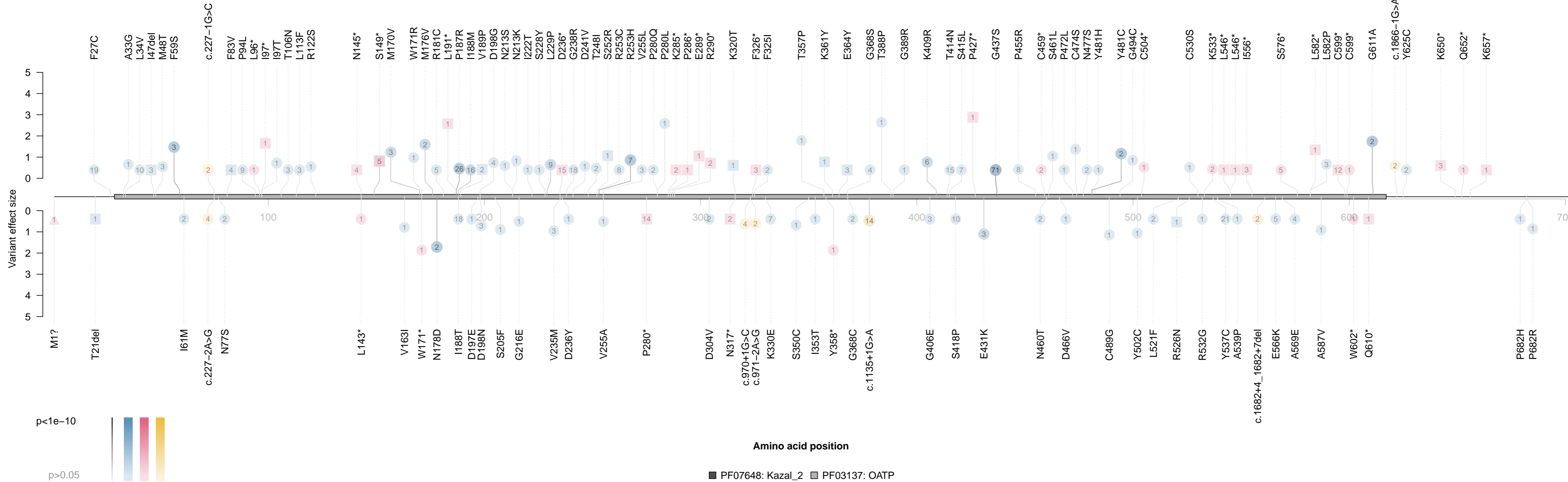
Gene=SLC45A2; Chr=5; Phenotype=Hair colour: Blonde; Gene effect size=0.19

● missense ■ in-frame indel ○ splice ● stop gain ▲ stop lost ▲ start lost ■ frameshift



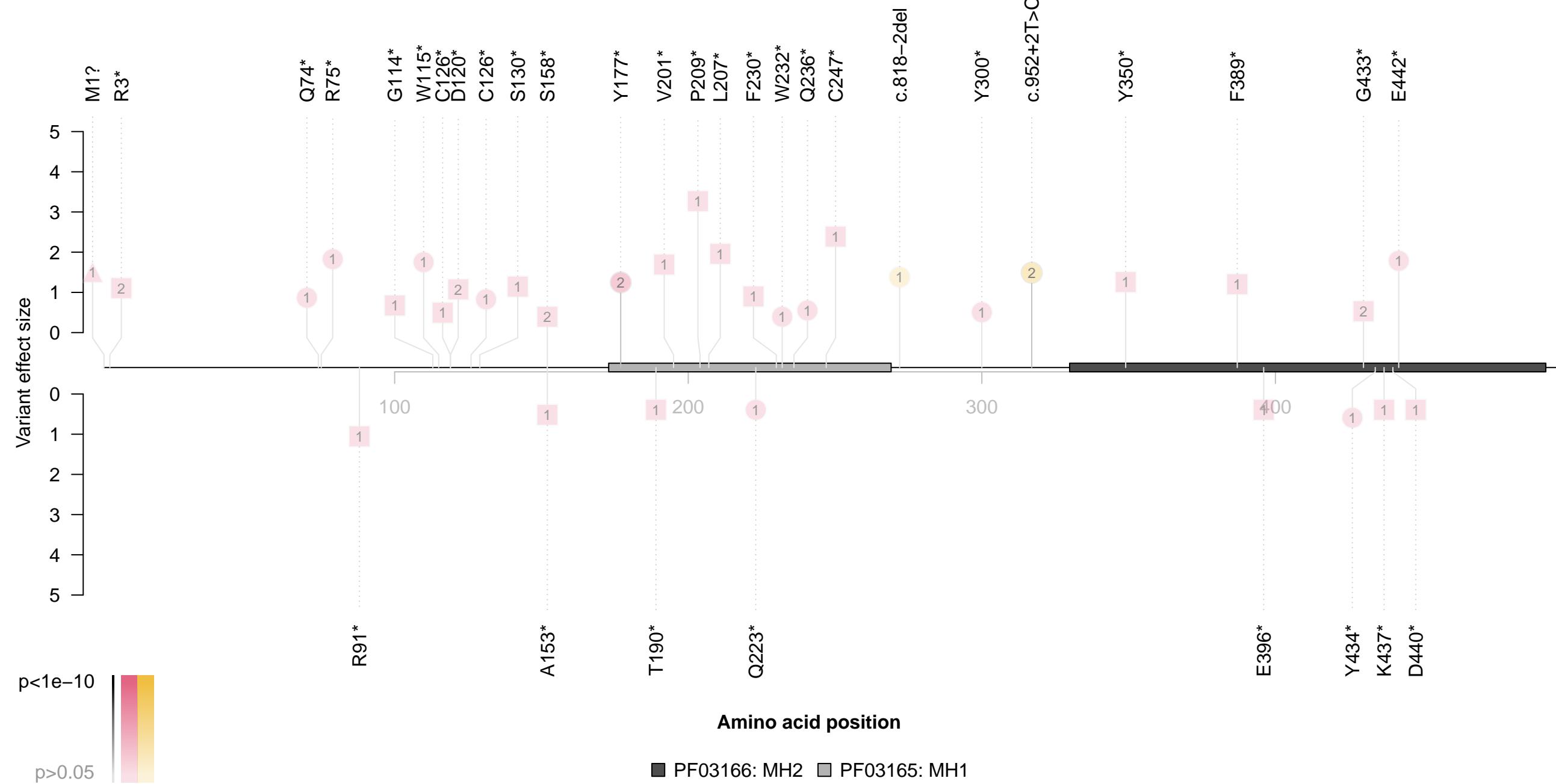
Gene=SLCO1B3; Chr=1; Phenotype=Total bilirubin; Gene effect size=0.25

● missense ■ in-frame indel ○ splice ● stop gain ▽ stop lost ▲ start lost ■ frameshift



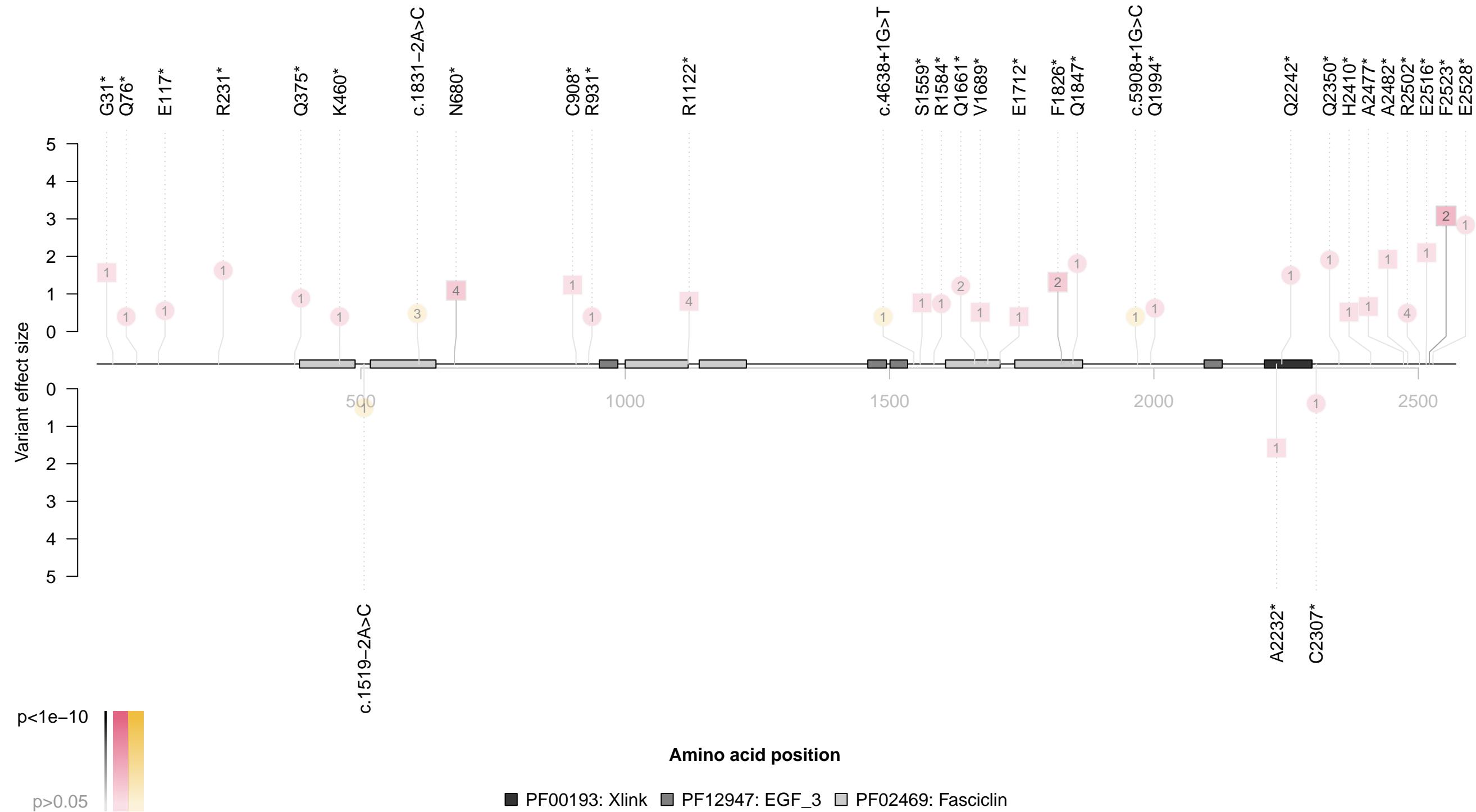
Gene=SMAD6; Chr=1; Phenotype=6mm weak meridian (right); Gene effect size=0.93

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



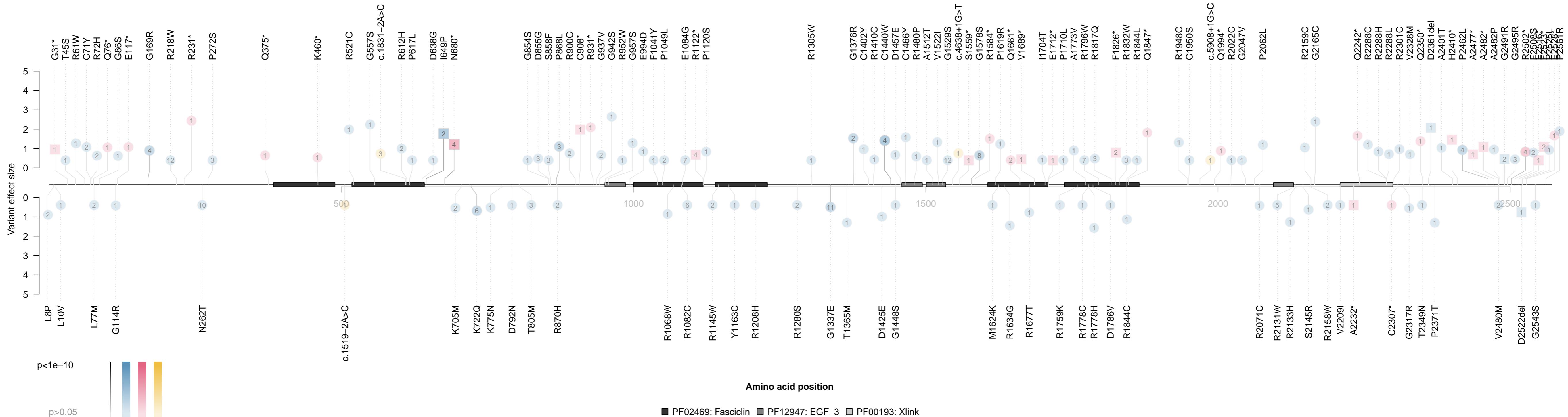
Gene=STAB1; Chr=3; Phenotype=Median T2star in caudate (left); Gene effect size=0.93

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



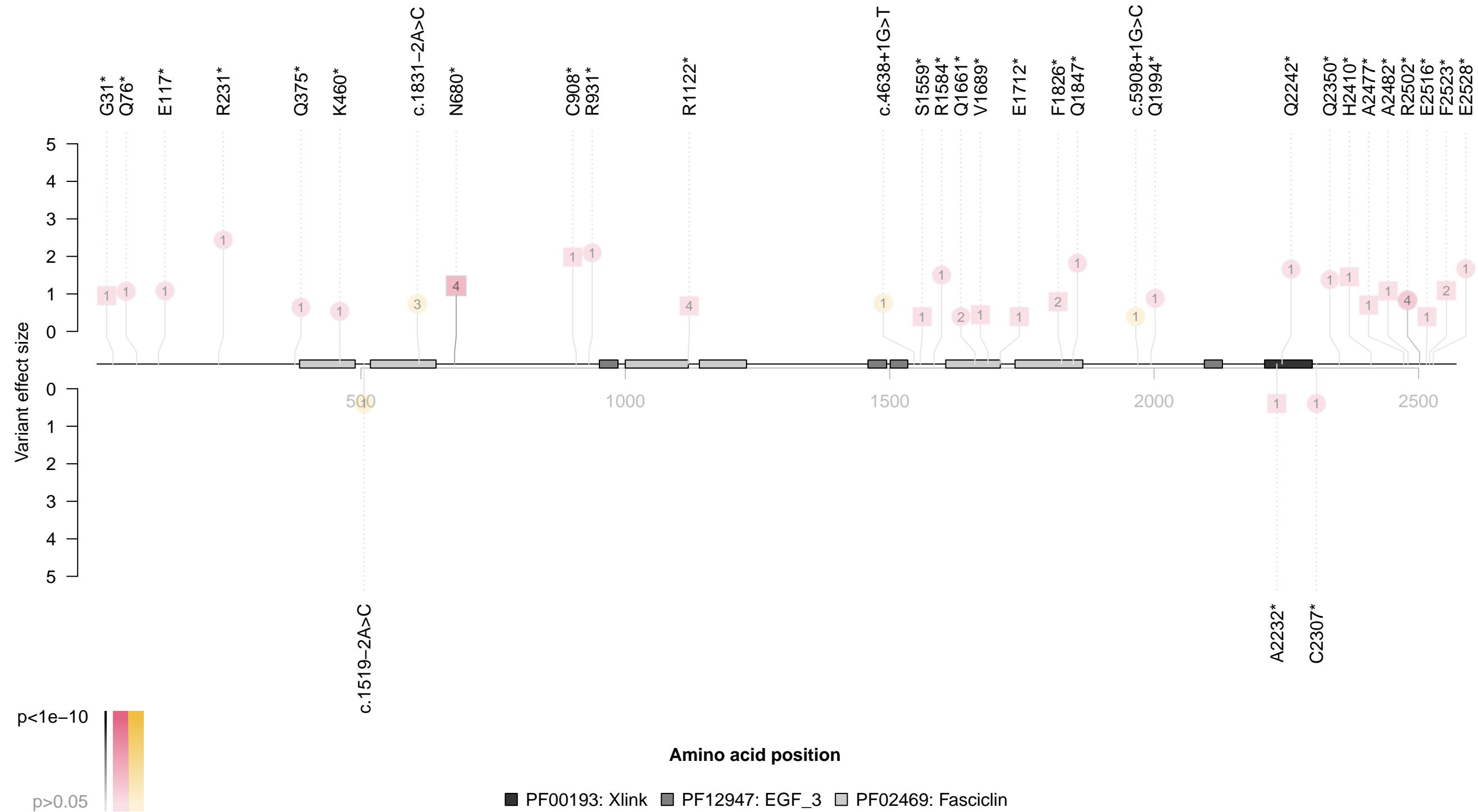
Gene=STAB1; Chr=3; Phenotype=Median T2star in putamen (left); Gene effect size=0.39

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



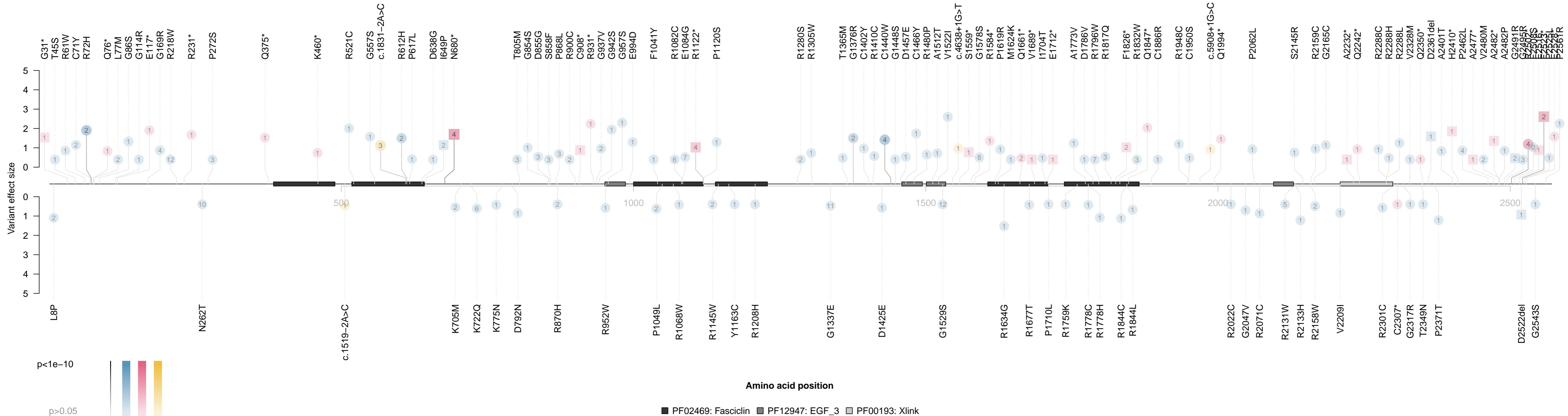
Gene=STAB1; Chr=3; Phenotype=Median T2star in putamen (left); Gene effect size=0.94

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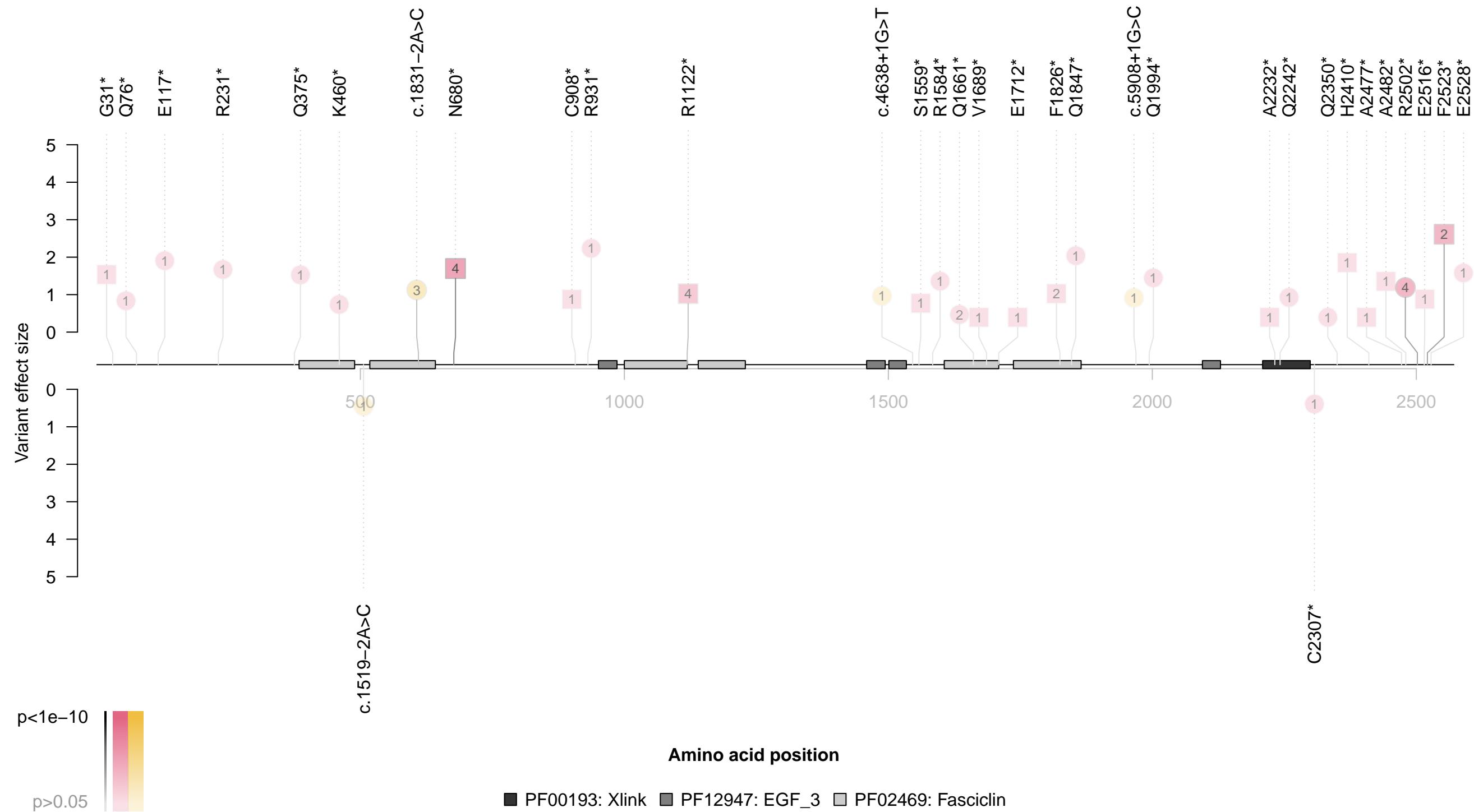
Gene=STAB1; Chr=3; Phenotype=Median T2star in putamen (right); Gene effect size=0.44

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



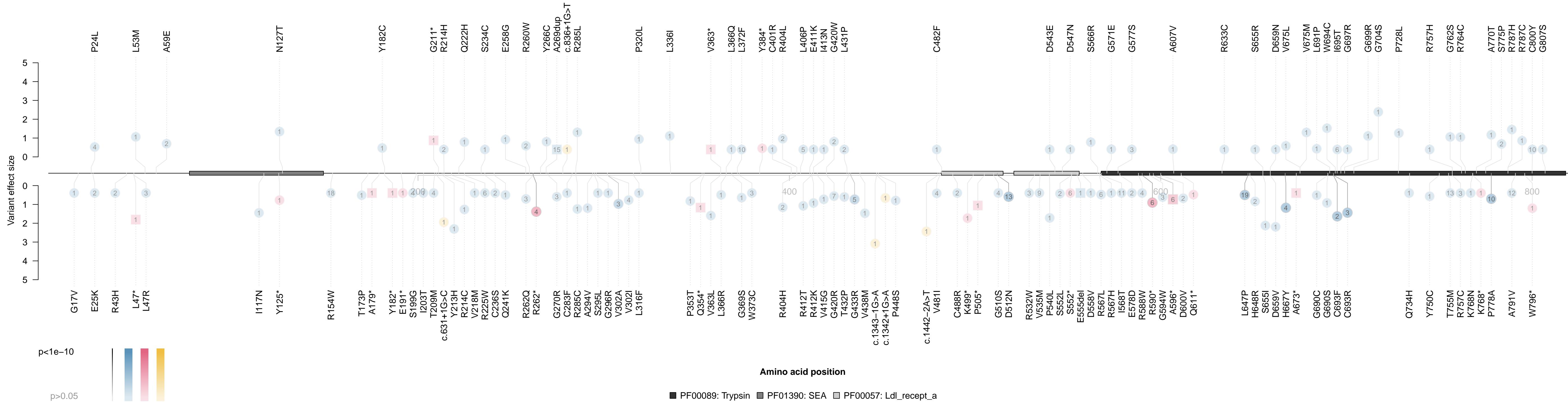
Gene=STAB1; Chr=3; Phenotype=Median T2star in putamen (right); Gene effect size=1.16

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



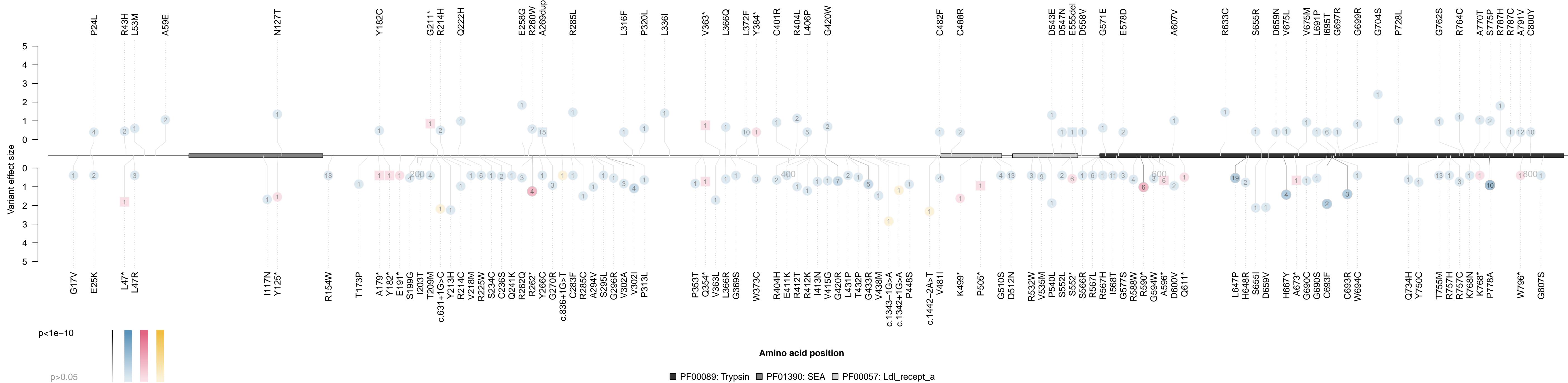
Gene=TMPRSS6; Chr=2; Phenotype=Mean corpuscular volume; Gene effect size=-0.29

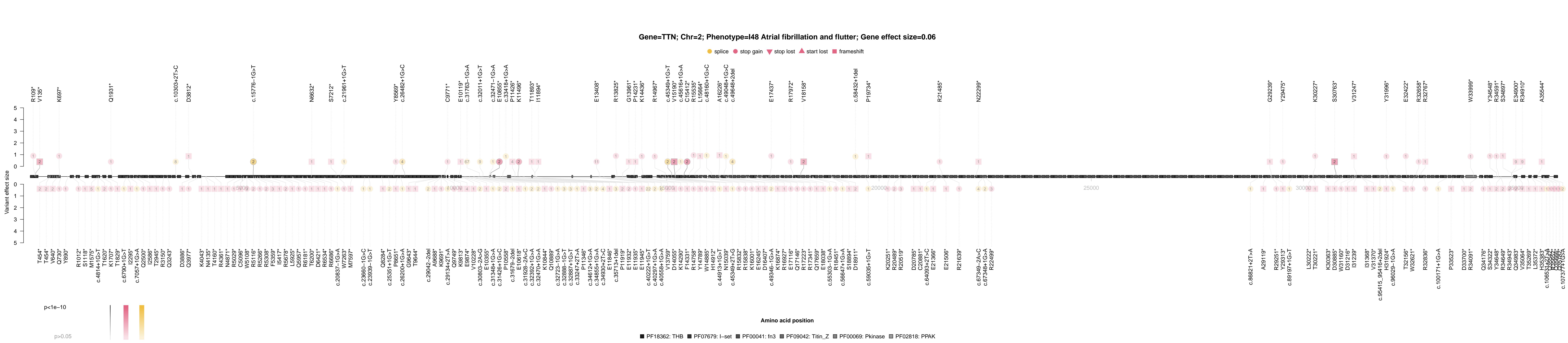
● missense ■ in-frame indel ○ splice ● stop gain ▲ stop lost ▲ start lost ■ frameshift



Gene=TMPRSS6; Chr=2; Phenotype=Mean corpuscular haemoglobin; Gene effect size=-0.33

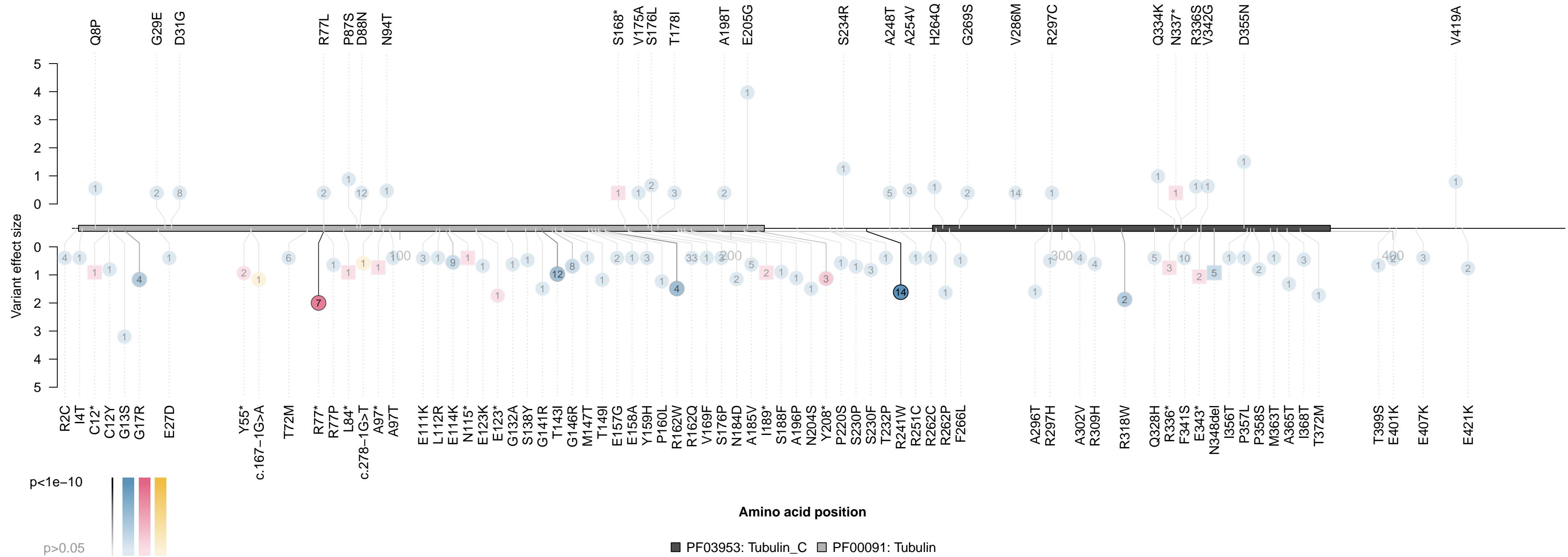
● missense ■ in-frame indel ○ splice ● stop gain ▽ stop lost ▲ start lost ■ frameshift





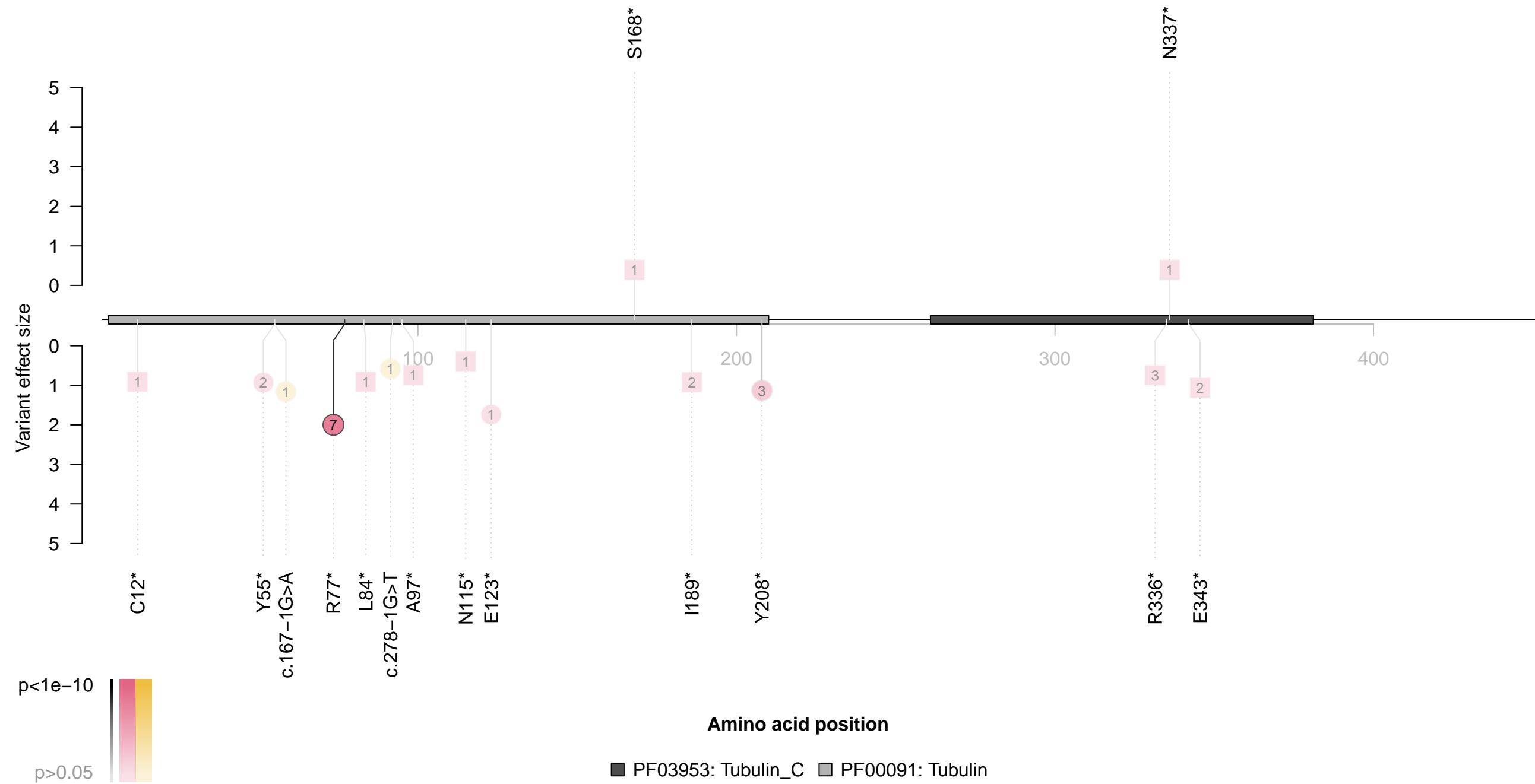
Gene=TUBB1; Chr=2; Phenotype=Platelet count; Gene effect size=-0.48

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



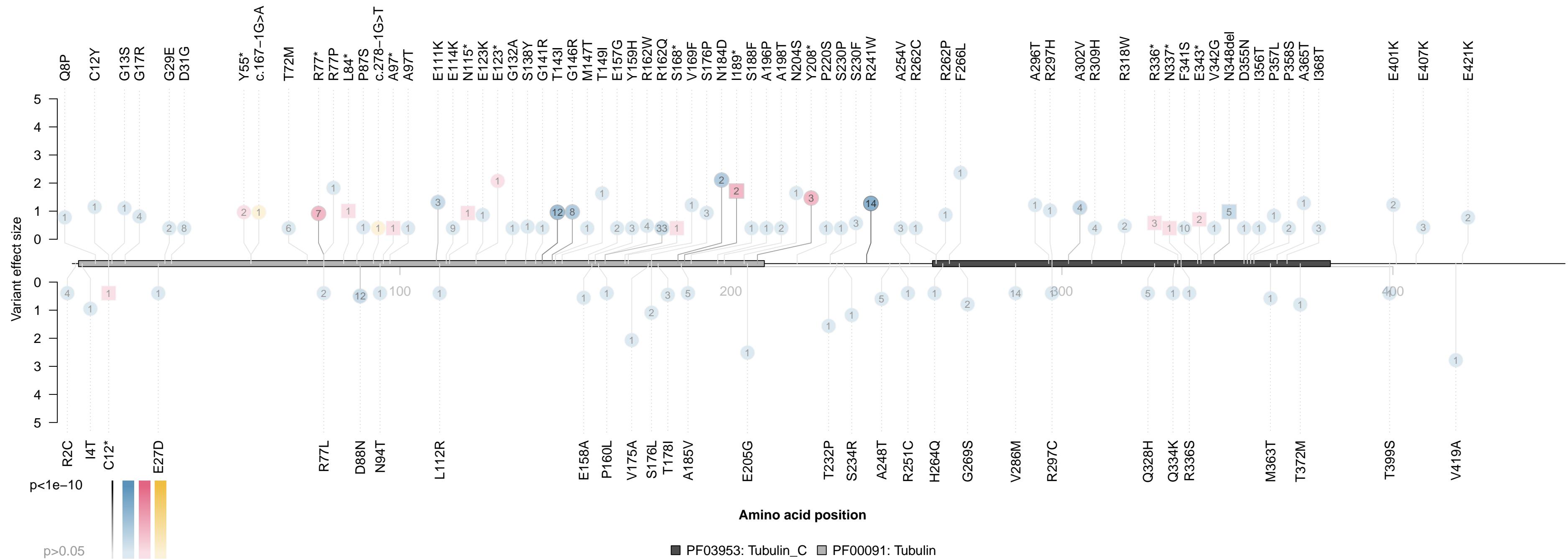
Gene=TUBB1; Chr=2; Phenotype=Platelet count; Gene effect size=-1.14

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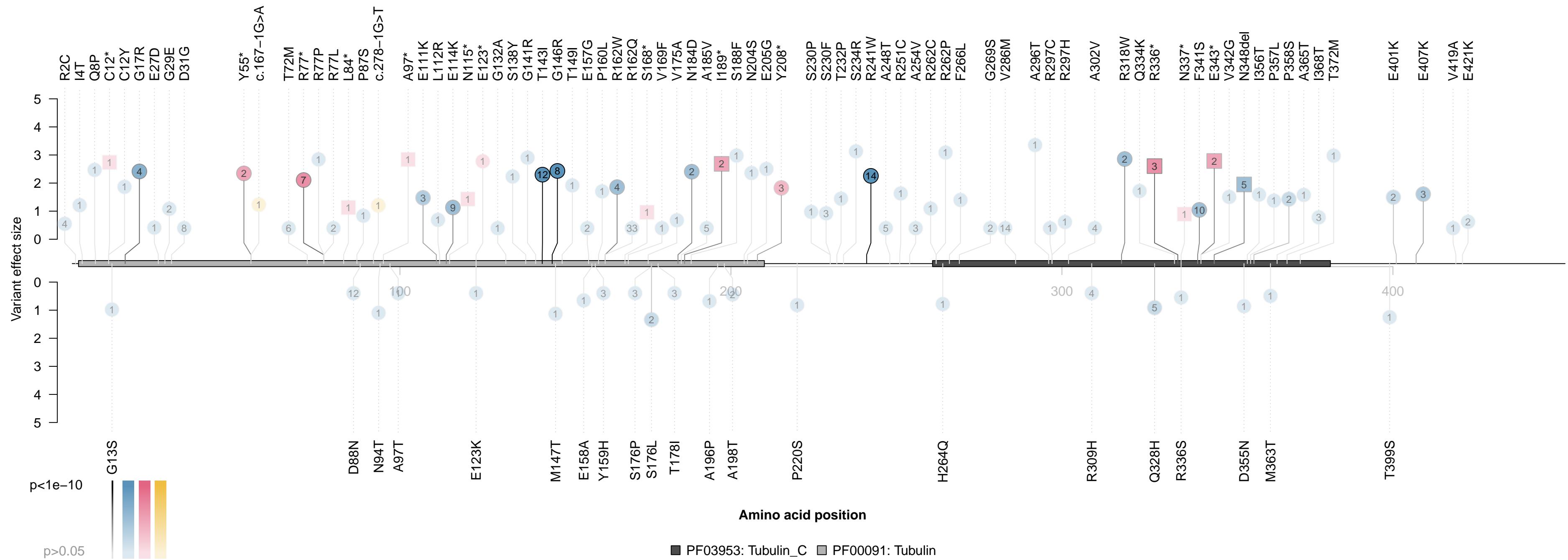
Gene=TUBB1; Chr=2; Phenotype=Mean platelet (thrombocyte) volume; Gene effect size=0.4

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



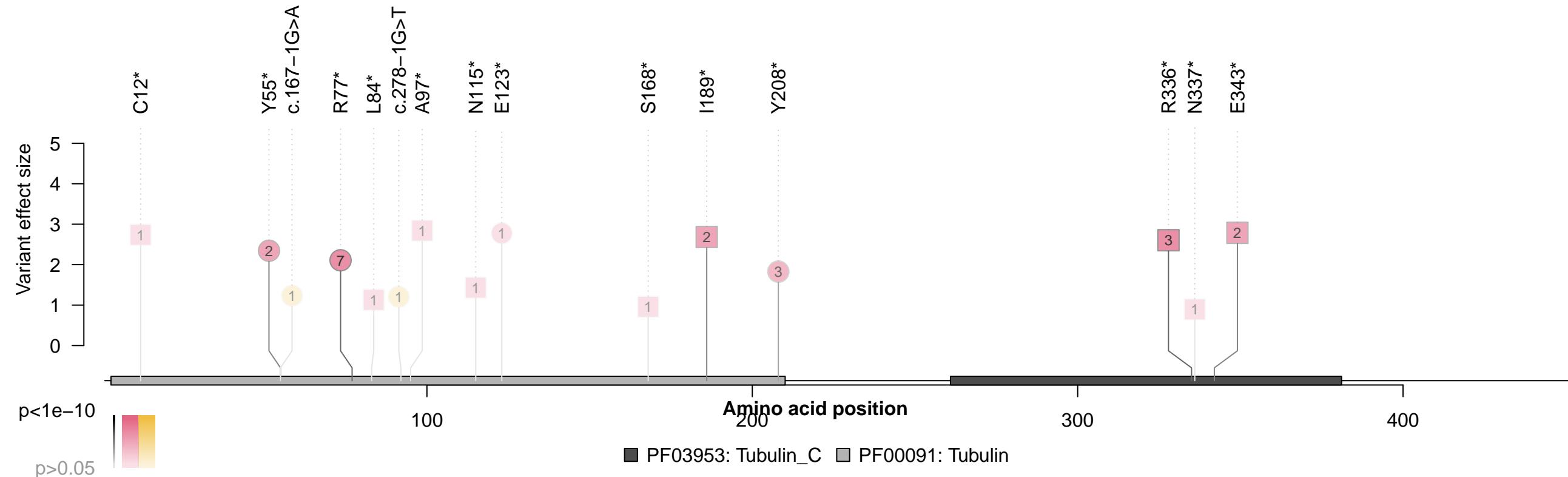
Gene=TUBB1; Chr=2; Phenotype=Platelet distribution width; Gene effect size=0.96

● missense ■ in-frame indel ○ splice ● stop gain ▲ stop lost ▲ start lost ■ frameshift



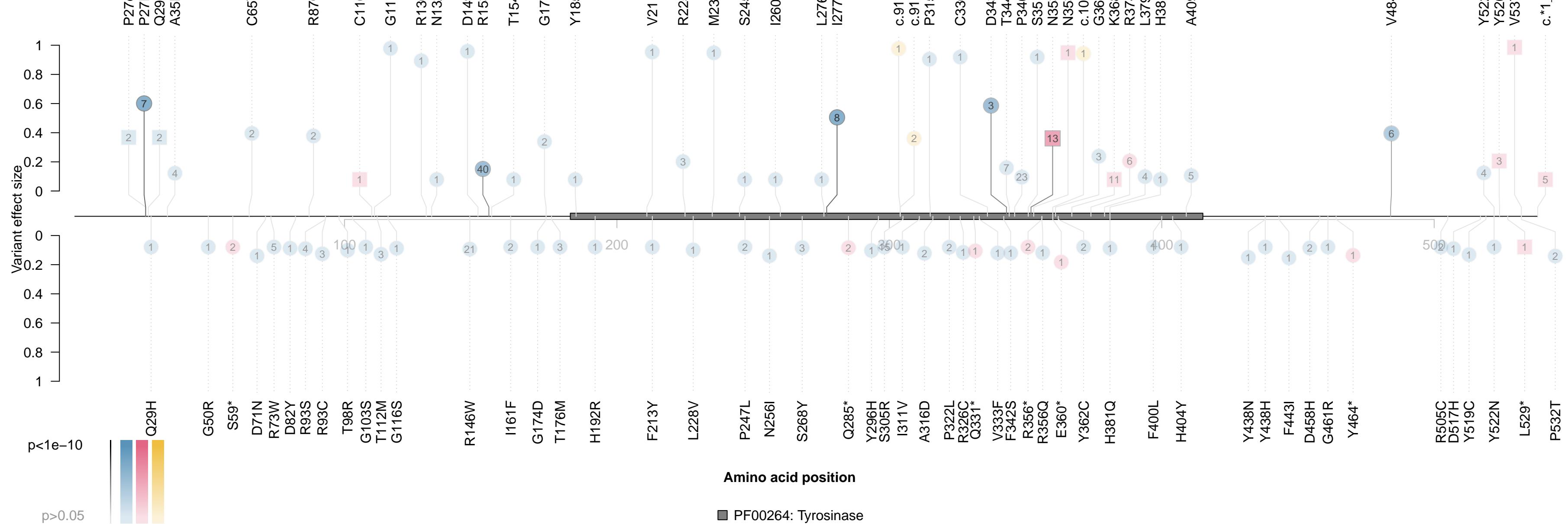
Gene=TUBB1; Chr=2; Phenotype=Platelet distribution width; Gene effect size=2.13

● splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



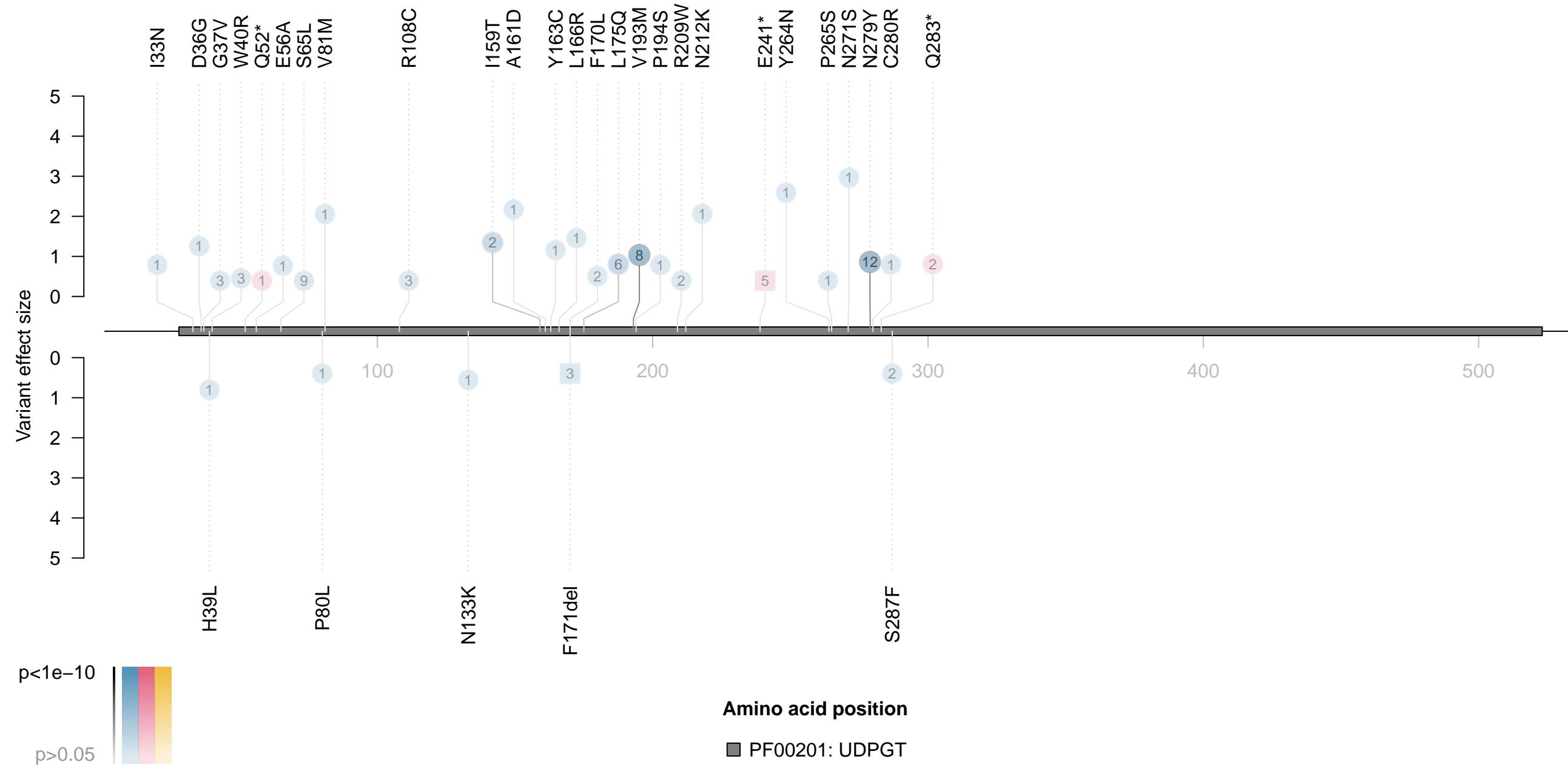
Gene=TYRP1; Chr=9; Phenotype=Hair colour: Blonde; Gene effect size=0.12

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



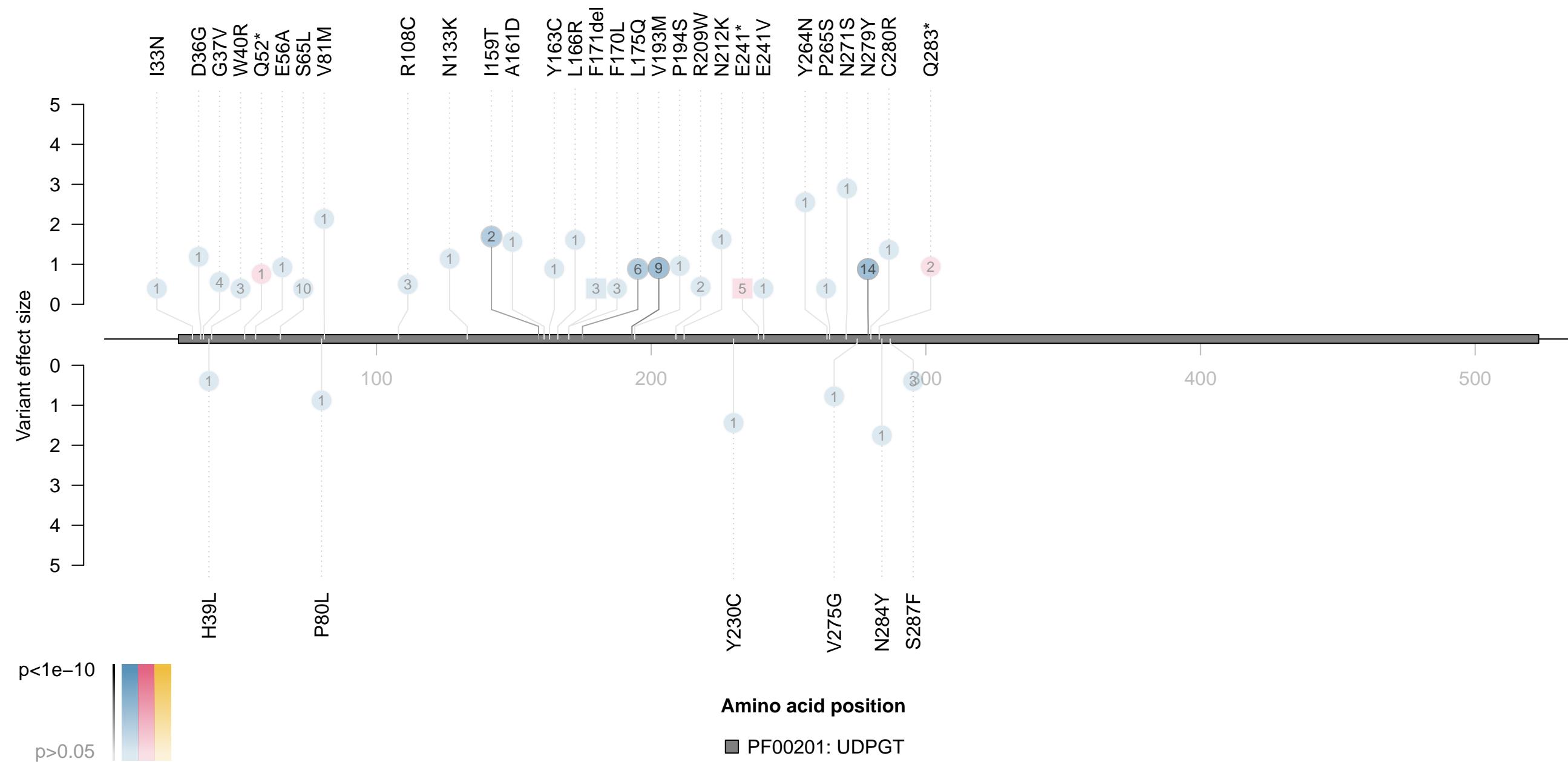
Gene=UGT1A1; Chr=2; Phenotype=Direct bilirubin; Gene effect size=0.77

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



Gene=UGT1A1; Chr=2; Phenotype=Total bilirubin; Gene effect size=0.75

● missense ■ in-frame indel ○ splice ● stop gain ▼ stop lost ▲ start lost ■ frameshift



Supplementary Figure 3. Distribution of effects of rare variants on phenotypes in genes with statistically significant associations. Plots show the effect sizes of rare damaging variants on the phenotypes. The legend shows the gene, its associated phenotype, and the Effect Size (β). The effect size is computed from the gene-based collapsing model, in which individuals were coded as either having or not having a qualifying variant. A positive value indicates that variant carriers have, on average, higher values for the phenotype, while a negative value indicates that variant carriers have lower values. The amino acid positions are shown on the x-axis, with the PFAM domain highlighted. The y-axis displays the beta of each individual variant, with negative values shown below and positive values above the horizontal axis. Variants are indicated according to their consequence as shown and labeled according to their amino acid change or splice site variation. The number inside the circle is the number of people carrying that variant. Darker lines connecting the variants to the gene and darker-filled shapes indicate more significant p-values for the association. The cohort used is the UKB all ethnicities cohort.

Supplementary Table 1. Van Hout et al. comparison.

Gene	Phenotype	Van Hout p	Our p	N carriers	N expected case carriers	FET p	Replication?	Reason not replicated
<i>TUBB1</i>	Platelet distribution width	2.50E-23	2.50E-23	25			Yes	N/A
<i>KALRN</i>	Mean platelet thrombocyte volume	2.70E-23	3.90E-01	1			No	Lead Van Hout SNP MAF>0.1%
<i>IQGAP2</i>	Mean platelet thrombocyte volume	1.10E-19	7.80E-15	167			Yes	N/A
<i>KLF1</i>	Mean corpuscular haemoglobin	1.70E-16	5.00E-15	27			Yes	N/A
<i>KLF1</i>	Mean corpuscular volume	4.00E-14	6.90E-14	27			Yes	N/A
<i>KLF1</i>	Red blood cell erythrocyte distribution width	1.50E-13	1.50E-14	27			Yes	N/A
<i>IL33</i>	Eosinophil percentage	5.40E-12	7.90E-01	85			No	Lead Van Hout SNP MAF>0.1%
<i>ASXL1</i>	Red blood cell erythrocyte distribution width	2.40E-11	3.30E-06	126			No	Unclear, appears due to difference in variant calls used for indels
<i>MLH1</i>	Z85.0, Personal history of malignant neoplasm of digestive organs	3.50E-11	5.30E-26	6	0	3.64E-07	No	Too few expected carriers for regression, and Fisher's exact not significant
<i>PKD1</i>	N18, Chronic kidney disease (CKD)	2.90E-10	N/A	N/A	N/A	N/A	No	Outside of GIAB high confidence regions
<i>IL33</i>	Eosinophil count	3.30E-10	5.30E-01	85			No	Lead Van Hout SNP MAF>0.1%
<i>COL6A1</i>	Corneal resistance factor mean	3.60E-10	1.30E-05	10			No	Some variants outside of GIAB high confidence regions
<i>HBB</i>	Red blood cell erythrocyte count	1.70E-09	1.20E-01	1			No	Too few carriers in this population subset
<i>TUBB1</i>	Platelet count	2.10E-09	5.60E-10	25			No	Difference in p-value cutoff
<i>ASXL1</i>	Platelet distribution width	4.70E-09	8.00E-08	126			No	Unclear, appears due to difference in variant calls used for indels
<i>GMPR</i>	Mean corpuscular haemoglobin	1.10E-08	1.60E-02	7			No	Lead Van Hout SNP MAF>0.1%
<i>TTN</i>	I42, Cardiomyopathy	1.40E-08	3.90E-15	9	1	2.96E-06	No	Too few expected carriers for regression, and Fisher's exact not significant

<i>MEPE</i>	Heel bone mineral density	1.40E-08	3.30E-05	106			No	Unclear, appears due to difference in variant calls used for indels
<i>COL6A1</i>	Corneal hysteresis mean	2.10E-08	7.00E-05	10			No	Some variants outside of GIAB high confidence regions
<i>TUBB1</i>	Mean platelet thrombocyte volume	2.40E-08	2.10E-07	25			No	Small difference in p-value
<i>PIEZ01</i>	I83.9, Asymptomatic varicose veins of lower extremities	2.70E-08	2.30E-15	19	4	7.16E-06	No	Too few expected carriers for regression, and Fisher's exact not significant
<i>CALR</i>	D47, Other neoplasms of uncertain behavior of lymphoid, hematopoietic and related tissue	4.10E-08	7.60E-12	2	2	2.06E-05	No	Too few expected carriers for regression, and Fisher's exact not significant
<i>HBB</i>	Red blood cell erythrocyte distribution width	5.80E-08	1.80E-02	1			No	Too few carriers in this population subset
<i>GP1BA</i>	Mean platelet thrombocyte volume	6.40E-08	8.40E-09	88			No	Difference in p-value cutoff
<i>CHEK2</i>	Platelet crit	7.90E-08	7.60E-01	55			No	Lead Van Hout SNP MAF>0.1%

The p-values from Van Hout et al. are from an analysis of unrelated European ancestry individuals from the UKB cohort with a MAF cutoff of 1%. The p-values shown for our analysis are from the linear mixed model (LMM) analysis of the European UKB cohort, including relatives, with a 0.1% MAF cutoff and a restriction to Genome in a Bottle (GIAB) high-confidence regions. The number of carriers in our analysis is shown for quantitative traits, and for binary traits the number of case carriers and expected number of case carriers (given overall prevalence) is shown separately. Fisher's exact test (FET) is performed for binary traits as well.

Supplementary References

1. Rentzsch, P., Witten, D., Cooper, G. M., Shendure, J. & Kircher, M. CADD: predicting the deleteriousness of variants throughout the human genome. *Nucleic Acids Res.* **47**, D886–D894 (2019).
2. Kircher, M. *et al.* A general framework for estimating the relative pathogenicity of human genetic variants. *Nat. Genet.* **46**, 310–315 (2014).
3. Itan, Y. *et al.* The mutation significance cutoff: gene-level thresholds for variant predictions. *Nat. Methods* **13**, 109–110 (2016).
4. Lee, S. *et al.* Optimal unified approach for rare-variant association testing with application to small-sample case-control whole-exome sequencing studies. *Am. J. Hum. Genet.* **91**, 224–237 (2012).
5. Hail Team. Hail 0.2.21-f16fd64e0d77. <https://github.com/hail-is/hail/releases/tag/0.2.21>
6. Long, T. *et al.* Whole-genome sequencing identifies common-to-rare variants associated with human blood metabolites. *Nat. Genet.* **49**, 568–578 (2017).
7. Girard, S. L. *et al.* Mutation burden of rare variants in schizophrenia candidate genes. *PLoS One* **10**, e0128988 (2015).