

# Identification of a novel genetic locus associated with immune mediated thrombotic thrombocytopenic purpura

by Matthew J. Stubbs, Paul Coppo, Chris Cheshire, Agnès Veyradier, Stephanie Dufek, Adam P. Levine, Mari Thomas, Vaksha Patel, John O. Connolly, Michael Hubank, Ygal Benhamou, Lionel Gallicier, Pascale Poullin, Robert Kleta, Daniel P. Gale, Horia Stanescu, and Marie A. Scully

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# Identification of a novel genetic locus associated with immune mediated thrombotic thrombocytopenic purpura

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#### Appendices

Supplemental materials and methods (detailing full experimental outline) and supplemental results are detailed in the Supplemental Materials appendix.

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#### **AUTHOR CONTRIBUTIONS**

- MJ Stubbs designed research, recruited patients, performed research, collected data, analysed and interpreted data, wrote the manuscript.
- P Coppo designed research, recruited patients, analysed and interpreted data, wrote the manuscript.
- C Cheshire performed research, collected data, analysed and interpreted data, wrote the manuscript.
- A Veyradier designed research, recruited patients, analysed and interpreted data, wrote the manuscript.

- S Dufek performed research, collected data, analysed and interpreted data, wrote the manuscript.
- AP Levine performed research, collected data, analysed and interpreted data, wrote the manuscript.
- M Thomas designed research, recruited patients, analysed and interpreted data, wrote the manuscript.
- V Patel performed research, collected data, analysed and interpreted data, wrote the manuscript.
- JO Connolly designed research, wrote the manuscript.
- M Hubank designed research, wrote the manuscript.
- Y Benhamou designed research, recruited patients, wrote the manuscript.
- L Galicier designed research, recruited patients, wrote the manuscript.
- P Poullin designed research, recruited patients, wrote the manuscript.
- R Kleta designed research, performed research, analysed and interpreted data, wrote the manuscript.
- DP Gale designed research, performed research, analysed and interpreted data, wrote the manuscript.
- H Stanescu designed research, performed research, analysed and interpreted data, wrote the manuscript.
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#### Abstract

Immune Thrombotic Thrombocytopenic Purpura (iTTP) is an ultra-rare, lifethreatening disorder, mediated through severe ADAMTS13 deficiency causing multisystem micro-thrombi formation, and has specific HLA associations. We undertook a large genome wide association study to investigate additional genetically distinct associations in iTTP.

We compared two iTTP patient cohorts with controls, following standardised genome wide quality control procedures for SNPs and imputed HLA types. Associations were functionally investigated using expression quantitative trait loci (eQTL), and motif binding prediction software.

Independent associations consistent with previous findings in iTTP were detected at the HLA locus and in addition a novel association was detected on chromosome 3 (rs9884090, p-value of  $5.22 \times 10^{-10}$ , Odds Ratio (OR) = 0.40) in the UK discovery cohort. Meta-analysis, including the French replication cohort, strengthened the associations. The haploblock containing rs9884090 is associated with reduced protein O-glycosyltransferase 1 (POGLUT1) expression (eQTL P<0.05), and functional annotation suggested a potential causative variant (rs71767581). This work implicates POGLUT1 in iTTP pathophysiology and suggests altered post-translational modification of its targets may influence disease susceptibility.

#### 167 words

#### INTRODUCTION

Thrombotic Thrombocytopenic Purpura (TTP) is an ultra-rare, life-threatening illness, with an annual incidence of approximately 6/million, and with an untreated mortality approaching 90% (10-20% with prompt intervention). It can affect patients of any age, but often affects young adults (30-40 years) and is more common in women.<sup>(1)</sup> The initial diagnosis of TTP is based on clinical suspicion, but ADAMTS13 (a disintegrin and metalloproteinase with a thrombospondin type 1 motif, member 13) activity <10IU/dL confirms the diagnosis. Severe deficiency of ADAMTS13 results in failure to cleave ultra large von Willebrand Factor multimers (UL-VWF), crucial for normal haemostatic function and proteolytic regulation of VWF. ADAMTS13 deficiency in immune TTP (iTTP) is mediated through IgG autoantibodies.<sup>(2,3)</sup> The precipitant of the disease in most cases is unclear.<sup>(4)</sup>

As with many autoimmune diseases, HLA type is associated with the risk of developing iTTP, with HLA-DRB1\*11, HLA-DQB1\*03 and HLADRB3\* increasing risk, and HLA-DRB1\*04 and HLA-DRB4 (HLA-DR53) being protective in Europeans.<sup>(5,6,7)</sup> No genetic risk factors outside the HLA genes have previously been shown to be associated with iTTP.

We performed a genome wide association study in UK and French iTTP cohorts and identified association of alleles both within and beyond the HLA locus.

#### METHODS

#### COHORTS

As part of the UK TTP registry, patients were consented for DNA analysis (MREC: 08/H0810/54) (see Supplemental Materials). Patients on the UK TTP registry were screened for the clinical diagnosis, and confirmed with an ADAMTS13 level <10IU/dL at diagnosis (utilising FRETS methodology)<sup>(8)</sup> and the presence of an anti-ADAMTS13 autoantibody.<sup>(2,3)</sup> The French replication cohort TTP samples were obtained from the French Reference Centre for TMA (CNR-MAT) and informed consent was obtained from each patient with confirmed iTTP (see above criteria) (Institutional Review Board of Pitié Salpêtrière Hospital, ClinicalTrials.gov, NCT00426686). The European control genotypes were obtained from the Wellcome Trust Case Control Consortium (WTCCC), both the 1958 British Birth Cohort and National Blood Service control samples.<sup>(9)</sup> In addition, controls were used from the Illumina reference panel<sup>(10)</sup> and Oxford controls.<sup>(11,12)</sup>

#### GENOTYPING, QUALITY CONTROL AND IMPUTATION

TTP samples were genotyped on the Illumina Human Omni Express SNP chips and controls were genotyped on different SNP chips (see Supplementary Methodology). Pre-imputation quality control was performed in all data sets separately, and then in a combined cohort (Supplemental Figure 1). Quality control was performed for individuals and SNPs. Individuals were selected for further analysis by European ancestry principal component analysis (PCA) (see Supplemental Figure 2). Only SNPs present in all data sets were subsequently analysed.

Genome-wide imputation was performed on markers that had passed quality control, and were present in all datasets using Beagle (version 5.0) utilising the 1000 Genome Project Phase 3 as a reference panel.<sup>(13)</sup> In addition to standardised QC, only SNPs with a dosage  $R^2$  (DR2) >0.8 were included.

#### GWAS AND LOCI CHARACTERISATION

Genome wide association testing was performed using SNP & Variation Suite v8, using logistic regression with principal component correction.<sup>(14,15)</sup> The logistic regression p-values, odds ratios were calculated in addition to lambda inflation factors, and QQ plots are shown (Supplemental Figure 3). A standardised genome wide significance level of 5x10<sup>-8</sup> was applied.<sup>(15)</sup> For discovery and replication analysis meta-data please contact the authors.

Conditional analyses were undertaken using a full versus reduced regression model. Lead SNPs at each locus were used as conditional inputs to determine independence, with results plotted using Locus Zoom software.<sup>(16)</sup>

Imputation of HLA types was performed utilising SNP2HLA with previously genotyped markers.<sup>(17)</sup> Imputed HLA types were excluded if the R<sup>2</sup> (confidence) was <0.80. Conditional analyses were subsequently performed as described above.

Expression quantitative trait locus (eQTL) analysis was performed to associate identified SNPs with differential gene expression.<sup>(18)</sup> Additional markers in linkage disequilibrium with the lead SNP at the Chromosome 3 locus were identified by LDlink (https://ldlink.nci.nih.gov).<sup>(19)</sup> Functional annotation of the haploblock was performed using ChipSeq UCSC data via the genome browser (https://genome.ucsc.edu) . Binding sites of transcription factors (highlighted through genome annotation) were obtained from FactorBook<sup>(20)</sup>, and position weight matrix (PWM) binding motifs generated. Binding motifs were generated using Mast-Meme.<sup>(21)</sup>

#### RESULTS

#### DISCOVERY COHORT

Following quality control as outlined in the methods (Supplemental Figure 1) there were 241 TTP cases and 3200 controls in the UK discovery cohort. Following imputation and quality control 3,649,347 SNPs were available for analysis. Association testing was performed using a logistic regression model with PCA correction, and the genomic inflation factor (lambda) was 1.0239 (Supplemental Figure 3).

In the UK discovery cohort two peaks were identified (Figure 1) (Supplemental Figure 4) (lead SNPs summarised in Table 1). The peak with the strongest association corresponded to the class II HLA region on chromosome 6, with 1,017 SNPs reaching genome wide significance. The lead SNP rs28383233 located in the intergenic region between *HLA-DRB1* and *HLA-DQA1* (p=2.20x10<sup>-23</sup>, odds ratio 3.12, 95% Cl 2.49-3.93) (Table 1 and Figure 2).

Conditional analysis was performed on rs28383233 and the lead SNP following this was rs1064994 (within *HLA-DQA1*), with a p-value of 1.13x10<sup>-10</sup> (odds ratio 2.20, 95% CI 2.06-3.37). Following conditioning on both rs28383233 and rs1064994 no further markers reached significance within the class II HLA region, indicating that there are two detectable independent genetic associations with iTTP within the HLA region.

HLA imputation was performed on the UK discovery cohort, and following quality control, 95 imputed HLA alleles remained. HLA-DRB1\*11:01 was the allele most

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strongly associated with iTTP, with a p-value of 3.25x10<sup>-17</sup> (odds ratio 2.79, 95% CI 2.23-3.50). Following conditional analysis of HLA-DRB1\*1101, no other HLA types reached genome wide significance, but HLA-DQA1\*03:01 remained significant (with a HLA-only Bonferroni correction, P<5.26x10<sup>-4</sup>) at 1.49x10<sup>-6</sup> (odds ratio 0.47, 95% CI 0.33-0.65) suggesting that the protective effect of this allele is independent of HLA-DRB1\*11:01.

In addition to the class II HLA peak on chromosome 6, a novel association was observed on chromosome 3. 16 markers reached genome wide significance, with the lead SNP, rs9884090(A), having a p-value of 5.22x10<sup>-10</sup> (odds ratio 0.40, 95% CI 0.29-0.56) (Table 1 and Figure 3). Upon conditional analysis of the lead SNP no markers reached genome wide significance indicating one detectable signal at this locus. No statistical epistasis was seen between the chromosome 3 and chromosome 6 associations, with each association being independent. Five genes are annotated within this chromosome 3 haploblock: *ARHGAP31, TMEM39A, POGLUT1, TIMMDC1*, and *CD80*.

#### REPLICATION COHORT

Within the French replication cohort there were 112 cases and 2603 controls following quality control as outlined in the methods (Supplemental Figure 1 and 2). 3,649,546 SNPs were available for analysis, and association testing was performed using a logistic regression model with PCA correction, and lambda was 1.0830 (Supplemental Figure 5).

The association with the lead SNP in the chromosome 3 haploblock, rs9884090(A) was replicated with a p-value of 0.001 (odds ratio 0.52), and the two independent lead SNPs with the class II HLA peak on chromosome 6 were also replicated (Table

2). The locus zoom plots are shown (Supplemental Figures 6-8). Imputed HLA type analysis was also consistent with the UK discovery cohort with HLA-DRB1\*11:01 and HLA-DQA1\*03:01 representing two independent HLA signals.

In addition, a meta-analysis was performed combining the UK and French cohorts (cases 241/112, controls 3200/2603 respectively), which demonstrated strengthening of the previously observed signal (rs9884090 p= $1.60 \times 10^{-10}$ , OR 0.47, rs28383233 p= $1.22 \times 10^{-42}$ , OR 3.70, rs1064994 p= $5.03 \times 10^{-25}$ , OR 2.89) (Table 3 and Supplemental Figure 9).

#### EQTL AND FUNCTIONAL DNA ANALYSIS

Expression quantitative trait loci (eQTL) data from the Genotype Tissue Expression Project and Blood eQTL Browser for the lead SNP at the chromosome 3 locus (rs9884090) demonstrated significant reduction in expression of *POGLUT1* with the protective allele in the majority of tissues tested, including blood cells (p<0.001).<sup>(18,22)</sup>

LD-link identified 20 markers found to be in tight linkage disequilibrium (R<sup>2</sup> and D' >0.80) with rs9884090 contained within the chromosomal region (see supplemental Table 1).<sup>(19)</sup> All markers were functionally annotated with information from the UCSC Genome Browser (Human Assembly GRCh37/hg19)<sup>(23,24)</sup> (see Supplemental Table 1). One variant was particularly noted, rs71767581 (Ch3, 119187422 AC/-del), which is a 2 base pair deletion in the promoter of *POGLUT1*. This may be functionally important as the haploblock identified is associated with reduced expression in POGLUT1. Upon analysis of ChipSeq data in UCSC Genome Browser 14 transcription factors were predicted to bind at this site (see Supplemental Table 2), adding further evidence that rs71767581 may be functionally important for POGLUT1 expression.

#### DISCUSSION

This genome wide association study, involving 2 European populations, is the first to be performed in iTTP and shows consistent evidence of association at loci on chromosome 6 and chromosome 3. The associated alleles on Chromosome 6 lie within the HLA region and imputation of HLA types and conditional analyses indicated independent association between HLA-DRB1\*11:01 (OR 2.79; p=3.25x10<sup>-17</sup>) and HLA-DQA1\*03:01 (OR 0.47; p=1.49x10<sup>-6</sup>, post conditional analysis), which are consistent, and in linkage with previously published risk and protective associations with iTTP at this locus.<sup>(5–7)</sup> A recent case-control study comparing frequency of alleles only at immune loci in 190 Italian TTP patients and 1255 controls identified the HLA variant rs6903608, (in addition to HLA-DQB1\*05:03) as conferring a 2.5 fold increase of developing TTP.<sup>(25)</sup>

Here we also identified a novel association of iTTP with alleles on chromosome 3 tagged by the lead SNP rs9884090. Five genes are located within the associated haploblock: *ARHGAP31*, *TMEM39A*, *POGLUT1*, *TIMMDC1*, and *CD80*. *ARHGAP31* (Rho GTPase Activating Protein 31) is associated with the autosomal dominant condition Adams-Oliver Syndrome (OMIM 100300).<sup>(26)</sup> Mutations within *ARHGAP31* have been implicated with abnormal vascular development and VEGF (vascular endothelial growth factor) angiogenesis.<sup>(27)</sup> Little is understood regarding the function of *TMEM39A* (transmembrane protein 39A). While variants have been implicated in autoimmune disease such as systemic lupus erythematosus<sup>(28,29)</sup> and multiple sclerosis<sup>(30,31)</sup>, understanding of its function is lacking. *TIMMDC1* is a membrane embedded mitochondrial complex factor, and is associated with mitochondrial disorders.<sup>(32)</sup> The protein encoded by the *CD80* gene functions as a membrane receptor being activated by CTLA-4 or CD28, both of which are T-cell

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receptors. The downstream mechanisms are T-cell proliferation and cytokine production. CD80 and its receptors have been associated with focal segmental glomerulosclerosis<sup>(33)</sup> and systemic lupus erythematosus.<sup>(34),(35)</sup> POGLUT1 (Protein O-Glucosyltransferase 1) is mutated in Dowling-Degos Disease-4 (an autosomal dominant genodermatosis with progressive and disfiguring reticulate hyperpigmentation and muscular dystrophy, OMIM 615696) and POGLUT1 has been shown to catalyse O-glycosylation of epidermal growth factor (EGF)-like repeats.<sup>(36,37)</sup> EGF-like repeats are well conserved structures, and highly represented with proteins involved in coagulation.<sup>(38,39)</sup> In-vitro work has demonstrated POGLUT1 binds and glycosylates specific coagulation factors including Factor VII and Factor IX <sup>(37,40)</sup>

The haploblock identified in this analysis of iTTP (which is tagged by rs9884090(A)) is associated with significantly decreased *POGLUT1* expression by eQTL.<sup>(41)</sup> Several other genetic variants contained within this haploblock have been associated with other autoimmune diseases, and the majority of these variants have been shown to be in linkage with our lead variant rs9884090 (see Supplemental Results), supporting the findings described here.<sup>(28,29,31,42,43,44)</sup> eQTL analysis is a robust tool, that can associate gene expression with specific genetic variants. Our analysis found rs9884090(A) to have a reduced frequency in iTTP, and rs9884090(A) was shown to be associated with significantly decreased *POGLUT1* expression in different eQTL resources.<sup>(18,22)</sup> In order to locate the underlying genetic variant implicated in this reduced *POGLUT1* expression we used LD-link to identify additional variants, and located a 2-bp deletion with the *POGLUT1* upstream promoter region that is in tight linkage disequilibrium with the lead associated variant (R2/D'>0.80). As

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expression of *POGLUT1* leads to altered post-translational modification (Oglycosylation) of key POGLUT1 targets to reduce the risk of iTTP. The evidence we present supports POGLUT1 as the gene of interest, but we cannot exclude other genes within the associated haploblock. The pathway through which POGLUT1's effects could be mediated remains to be determined. Given there are several reported variants with this haploblock associated with different autoimmune disease, it is likely the downstream functional consequences medicated through POGLUT1 influence immune-regulatory pathways which may generally increase the risk of other autoimmune disease, in addition to iTTP, and may provide insights into potential therapies.<sup>(45–56)</sup>

In summary, we have identified a novel genetic variant, rs9884090(A), in two independent populations, which is associated with reduced risk of iTTP. Utilising linkage disequilibrium we have identified a functional variant in tight LD with the lead SNP in the POGLUT1 promoter site and eQTL demonstrates reduced POGLUT1 expression associated with this variant. We therefore hypothesise this leads to altered O-glycosylation on POGLUT1 targets. Whilst the exact role of POGLUT1 in the pathophysiology of iTTP requires further downstream functional analysis, this work represents an important step forward in our understanding of iTTP.

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# TABLES

rsID (position)	Minor Allele / Major Allele	MAF Cases / MAF Controls	Logistic Regression p- value	Odds Ratio (95% CI)
<b>rs9884090</b> (ch3:119116150)	A/G	0.08/0.19	$P = 5.22 \times 10^{-10}$	0.40 (0.29- 0.56)
<b>rs28383233</b> (ch6:32584153)	G/A	0.64/0.40	$P = 2.20 \times 10^{-23}$	3.12 (2.49- 3.93)
<b>rs1064994</b> (ch6:32611195)	C/T	0.25/0.11	$P = 1.13 \times 10^{-10}$	2.20 (2.06- 3.37)

**Table 1** - Lead SNPs identified in the UK discovery cohort. Displayed are Minor/Major Alleles, Minor Allele Frequencies (MAF), logistic regression p-value (corrected for PCA stratification), and Odds Ratio (with 95% confidence intervals). Genomic positions refer to Human Assembly GRCh37/hg19.

rsID (position)	Minor Allele / Major Allele	MAF Cases / MAF Controls	Logistic Regression p- value	Odds Ratio (95% CI)
rs9884090	A/G	0.10/0.18	P = 0.001	0.52 (0.34-
(ch3:119116150)	///	0.10/0.10	1 = 0.001	0.81)
rs28383233	G/A	0.68/0.40	$P = 3.87 \times 10^{-9}$	2.57 (1.87-
(ch6:32584153)				3.53)
rs1064994	C/T	0.42/0.11	$P = 5.015 \times 10^{-10}$	2.86 (2.06-
(ch6:32611195)			9	3.99)

**Table 2** – French cohort replication of lead SNPs identified in the UK discovery cohort. Displayed are Minor/Major Alleles, Minor Allele Frequencies (MAF), logistic regression p-value (corrected for PCA stratification), and Odds Ratio (with 95% confidence intervals). Genomic positions refer to Human Assembly GRCh37/hg19.

rsID (position)	Minor Allele /	MAF Cases /	Logistic	Odds Ratio
	Major Allele	MAF Controls	Regression p-	(95% CI)
			value	
rs9884090	A/G	0.08/0.19	$P = 1.60 \times 10^{-10}$	0.47 (0.36-
(ch3:119116150)				0.60)
rs28383233	G/A	0.64/0.41	$P = 1.22 \times 10^{-42}$	3.70 (2.81-
(ch6:32584153)				4.03)
rs1064994	C/T	0.22/0.11	$P = 5.03 \times 10^{-25}$	2.89 (2.39-
(ch6:32611195)				3.49)

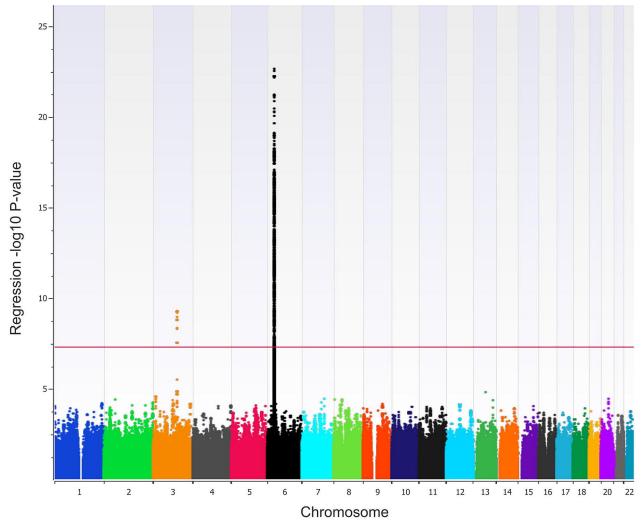
**Table 3** – Meta-analysis combining UK and French Cohorts, showing lead SNPs identified in the UK discover cohort. Displayed are Minor/Major Alleles, Minor Allele Frequencies (MAF), logistic regression p-value (corrected for PCA stratification), and Odds Ratio (with 95% confidence intervals). Genomic positions refer to Human Assembly GRCh37/hg19.

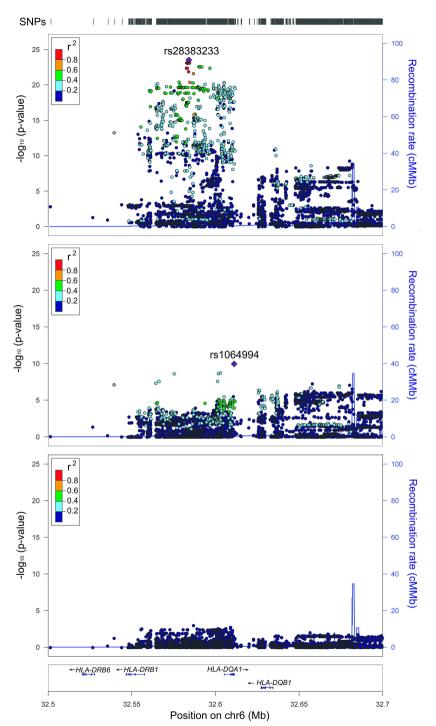
#### FIGURE LEGENDS

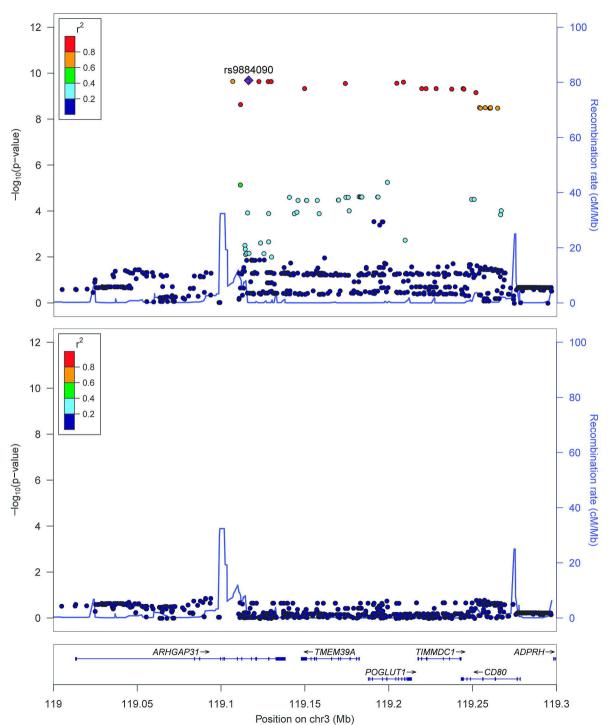
**Figure 1** – Manhattan plot of genome wide association analysis comparing UK iTTP discovery cohort compared with controls. The X axis shows chromosome location, and the Y axis shows negative logarithmic p-values. Standardised genome wide significant  $5x10^{-8}$  is depicted by the red line. The HLA peak is visualised on chromosome 6 (black), in addition to the novel chromosome 3 association (orange).

**Figure 2** – Locus zoom plots of the chromosome 6 peak in the UK discovery cohort. The upper plot (a) shows the unconditioned analysis with the lead SNP rs28383233, and the middle plot (b) shows analysis conditioned on the lead SNP rs28383233, revealing independent association with rs1064994. The lower plot (c) shows analysis conditioned on both rs28323233 and rs1064994. Genomic positions refer to Human Assembly GRCh37/hg19.

**Figure 3** – Locus zoom plots of the chromosome 3 peak in the UK discovery cohort. The upper plot (a) shows the unconditioned analysis and the lower plot (b) shows associations of the same markers when conditioned on the lead SNP, rs9884090. Genomic positions refer to Human Assembly GRCh37/hg19.







# SUPPLEMENTARY MATERIALS

# SUPPLEMENTARY METHODOLOGY

# COHORTS

TTP cases were collected as described in the main paper between 2012 and 2017, with UK TTP cases (discovery cohort) and French TTP cases (replication cohort).

- UK TTP cases, n=413
- French TTP cases, n=200

The control cohorts include the 1958 British Birth Cohort and National Blood Service control samples, in addition to reference genotypes from the Illumina reference panel (HapMap Ethnicity controls) and Oxford controls.<sup>(1–5)</sup>

- Illumina Ethnicity Cohort, n=90
- Oxford Cohort, n=432
- British Birth Cohort, n=2867
- National Blood Service Cohort, n=2737

# GENOTYPING

Samples were genotyped on the following SNP chips;

- UK TTP cases HumanOmniExpress-12v1\_H and 24v102\_A1
- French TTP cases HumanOmniExpress- 24v102\_A1

Controls were genotyped on the following SNP chips;

- Illumina Reference Illumina HumanOmniExpress-12v1\_C
- Oxford controls Illumina HumanOmniExpress-12v1\_J
- British Birth Cohort Human1-2M0DuoCustom\_v1\_A.
- National Blood Service Cohort Human1-2M0DuoCustom\_v1\_A

Genotypes were re-encoded using in-house software to genomic forward for further analysis.<sup>(6)</sup>

# QUALITY CONTROL

Quality control was performed using SNP & Variation Suite<sup>(7)</sup> PLINK version 1.90<sup>(8)</sup> and PRIMUS.<sup>(9)</sup>

Strict quality control per sample was performed, excluding individuals with call rate (CR) <0.90, duplicated samples/related individuals (sample identity by state (IBS) >0.1875), sample heterozygosity rate >3SD, in addition to excluding individuals not of European ancestry by principal component analysis (PCA) filtering.

Case Sample Quality control is summarised below;

- **UK TTP Cohort** 241 UK TTP patients were included for subsequent analysis, from 413 samples genotyped.
- French TTP Cohort 112 French TTP patients were included for subsequent analysis, from 200 samples genotyped.

Control Sample Quality control is summarised below;

- Illumina Ethnicity Controls 58 individuals were included for subsequent analysis, from 90 samples genotyped.
- **Oxford Controls** 381 individuals were included for subsequent analysis, from 432 samples genotyped.
- British Birth Cohort 2761 individuals were included for subsequent analysis, from 2867 samples genotyped.
- National Blood Service Cohort 2603 individuals were included for subsequent analysis, from 2737 samples genotyped.

Quality control was performed per SNP, and SNPs were excluded with that had a CR<0.99, an allele count (AC) >2, minor allele frequency (MAF) <0.05, and Hardy Weinberg Equilibrium (HWE) p<0.001, non-autosomal markers, in addition to ambiguous SNPs.

Case SNP Quality Control is summarised below;

• UK TTP Cohort - QC was performed on 675,533 SNPs, and post QC 521,046 SNPs remained.

• French TTP Cohort - QC was performed on 675,533 SNPs, and post QC 490,032 SNPs remained.

Control SNP Quality Control is summarised below;

- Illumina Ethnicity Controls QC was performed on 711,320 SNPs, and post QC 531,093 SNPs remained.
- Oxford Controls QC was performed on 712,878 SNPs, and post QC 567,947 SNPs remained.
- British Birth Cohort QC was performed on 1,066,003 SNPs, and post QC 722,672 SNPs remained.
- National Blood Service Cohort QC was performed on 1,066,003 SNPs, and post QC 736,251 SNPs remained.

The UK and French datasets were combined with separate control datasets, and the above per-SNP QC performed on the merged datasets

- UK Discover Cohort The UK TTP cohort (n=241) was combined with control datasets (Illumina Ethnicity, Oxford and British Birth cohorts) (n=3200) for overlapping SNPs (n=337,088).
- French Replication Cohort The French TTP cohort (n=112) was combined with control datasets (National Blood Service cohort) (n=2603) for overlapping SNPs (n=334,756).

# IMPUTATION

Genotype data was imputed using Beagle version 5.0, utilising the 1000 Genome European CEU reference population (Supplemental Figure 1 for QC).<sup>(10)</sup> Cases and controls were imputed together using individuals and markers that had previously passed stringent QC. Following imputation filtering was performed using bcftools<sup>(11)</sup> (https://samtools.github.io/bcftools/bcftools.html), and markers with a Dosage R-squared (DR2) less than 0.80 were removed, and imputed genotype data was also re-filtered per SNP using SNP & Variation Suite,<sup>(7)</sup> details listed below:

• The UK TTP cohort and control data sets were imputed, with indels and SNPs with DR2<0.80 excluded. Post QC 3,649,349 remained for analysis, and

further QC SNP's were excluded, CR<0.99, AC>2 (n=0), MAF<0.05, HWE p<0.001.

The French TTP cohort and control data was imputed, and indels and SNPs with DR2<0.80 were excluded. Post QC n=3,649,546 remained for analysis, and further QC SNP's were excluded, CR<0.99, AC>2, MAF<0.05 and HWE p<0.001.</li>

# GENOME WIDE ASSOCIATION TESTING

Genome wide association testing was performed using SNP & Variation Suite, using logistic regression with correction of 10 principal components.<sup>(12–14)</sup> The logistic regression p-values, odds ratios were calculated in addition to Lambda inflation factors. A standardised genome wide significance level of 5x10<sup>-8</sup> was applied.<sup>(15)</sup> Meta-analysis was performed by combining the independent cohorts and subsequently undertaking analysis by logistic regression with 10 principal component correction.

# CONDITIONAL ANALYSIS

To investigate for independent signal conditional analysis was undertaken using a full versus reduced regression model in SVS. Lead SNPs were used as conditional inputs to determine independence, with results plotted using Locus Zoom software.<sup>(16)</sup>

# HLA IMPUTATION

HLA imputation was performed utilising SNP2HLA to impute HLA types using previously genotyped markers.<sup>(17)</sup> Imputed HLA types were excluded if the DR2 (confidence) was <0.80. Conditional analysis was subsequently performed, using the previously described method. To validate our HLA imputation, we compared imputed HLA types in a subset of serologically HLA typed individuals (n=17), and found a concordance of >80%.

# EXPRESSION QUANTITATIVE TRAIT LOCUS

Expression quantitative trait locus analysis was performed subsequently to associate identified SNPs with differential gene expression.<sup>(18)</sup> Reduced POGLUT1 expression associated with our haploblock was the most significant, and frequently reported

association, and the only gene with expression reduced across different platforms.<sup>(18,19)</sup>

# LD-LINK

Additional markers in linkage disequilibrium with our lead SNP were identified by LDlink (https://ldlink.nci.nih.gov).<sup>(20)</sup> LD between variants rs71767581 and rs9884090 was supported using the NIHR BioResource-Rare Diseases dataset, comprising whole genome sequences from 6,588 European individuals.<sup>(21)</sup>

# FUNCTIONAL ANNOTATION

Functional annotation of the haploblock was performed using the UCSC genome browser (https://genome.ucsc.edu)<sup>(22,23)</sup>, to identify functional important variants. Functional annotations, Chip-Seq data and expression data to identify functionally important variants such as missense variants or regulatory variants.

# FACTOR BOOK

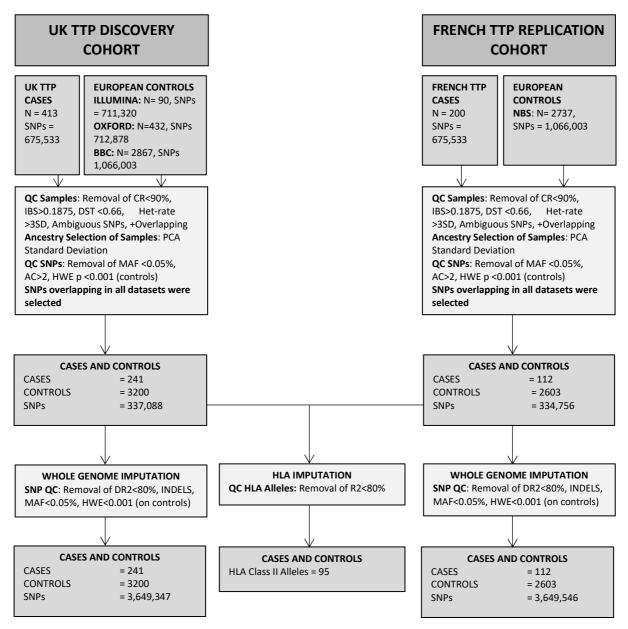
Binding sites of transcription factors that were identified through functional annotation in the region of interest, with potential functional importance were obtained from FactorBook.<sup>(24)</sup> Searching for specific cells lines (HEPG2) the position weight matrix (PWM) binding motifs of transcription factors of interest were identified, to be analysed alongside genetic variants derived from UCSC genome browser.

# MAST/MEME

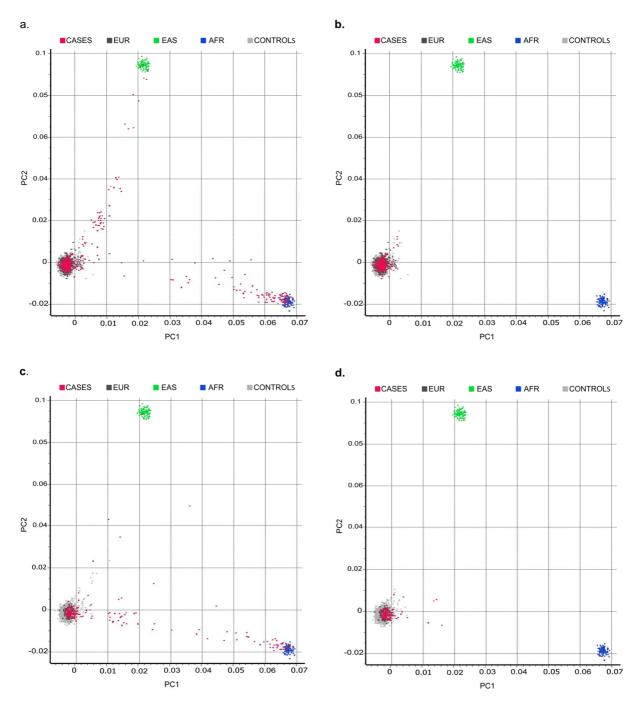
PWM binding motifs that were obtained from factor book were analysed along-side haploblock genetic variants, obtained from UCSC. A 80bp DNA sequence (40bp flanking, listed below) were analysed for potential DNA-transcription factor binding).<sup>(25)</sup>

- Variant Sequence: TATGCTAATTGCAACCTTTGGGGGTCTAACCGTGCTGT -/- ACACACACACACACACACACACACACACACACACATGCTCA

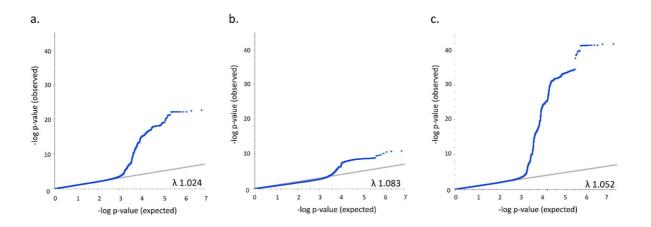
# **SUPPLEMENTARY FIGURES / RESULTS**



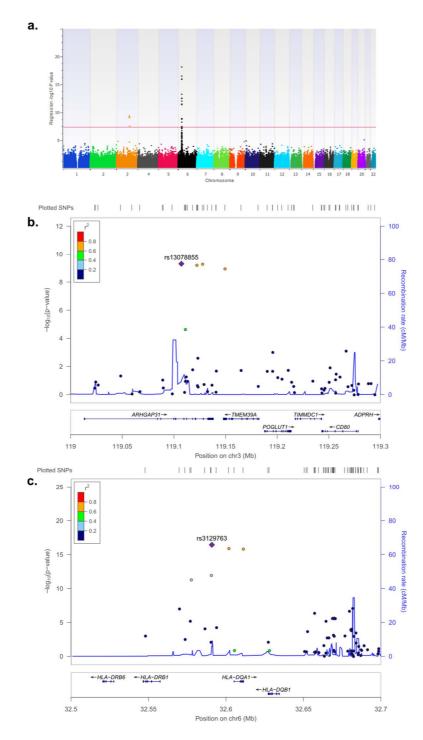
**Supplemental Figure 1** – Summary of Quality Control in UK Discovery Cohort and French Replication Cohort.



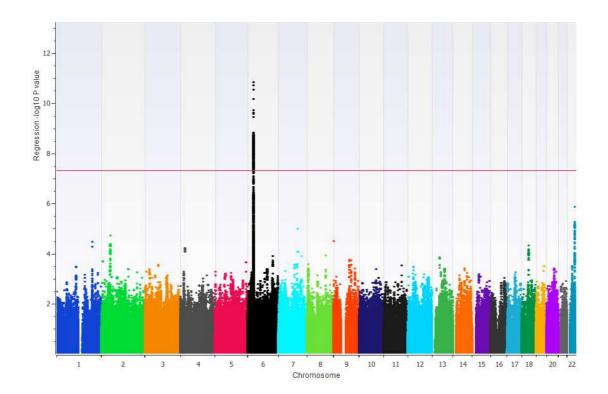
**Supplemental Figure 2** – Principal Component Analysis in UK and French Cohorts. Cases are shown in red, and control genotypes in grey, and controls with known genetic ancestry are shown in black (EUR, European), blue (AFR, African) and green (EAS, East Asian). a. UK discovery cohort (without ethnicity ancestry filtering) and b. UK discovery cohort following ethnicity ancestry filtering applying 8.0 standard deviations to the principal component data to select cases with European ancestry. c. French replication cohort (without ethnicity ancestry filtering) and d. French replication cohort following ethnicity ancestry filtering applying 8.0 standard deviations to the principal component data to select cases with European ancestry.



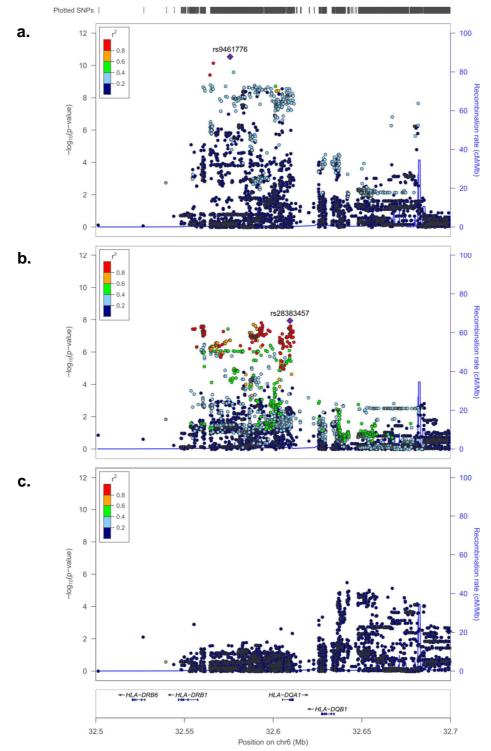
**Supplemental Figure 3** – QQ plots, observed against expected p-values, for a. UK discovery population, b. French replication cohort, and c. Combined Analysis.



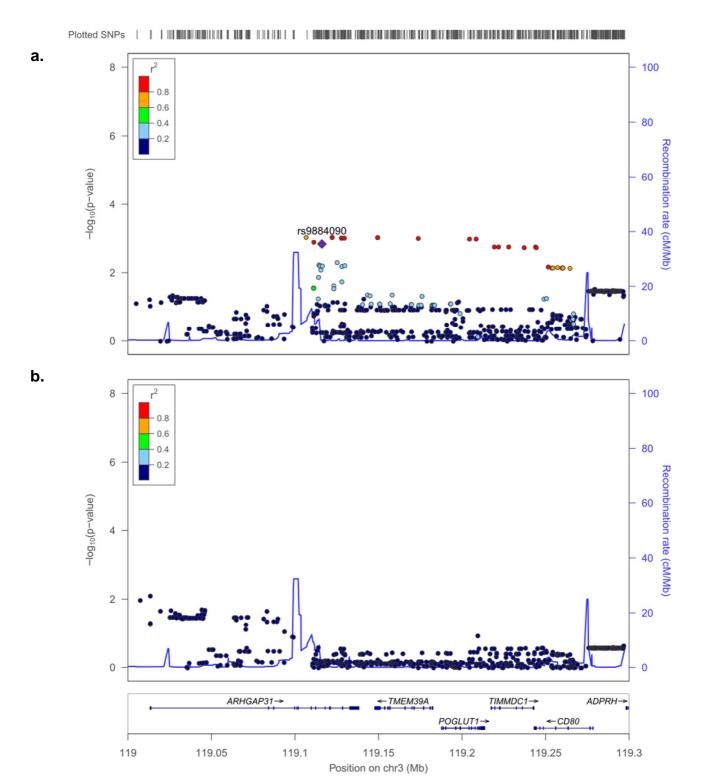
**Supplemental Figure 4 – UK Cohort Directly Genotyped GWAS -** (a) Manhattan plot of genome wide association test for directly genotyped SNPs only, comparing UK cases against controls, utilising the logistic regression method, corrected for top 10 principal components for stratification. The X axis shows chromosome location, and the Y axis shows logarithmic p-values. Standardised genome wide significant 5x10<sup>-8</sup> is depicted by the red line. Locus zoom plot for the UK discovery cohort (visualising only directly genotyped SNPs) are shown for (b) chromosome 3 and (c) and chromosome 6 peak. The X axis shows chromosome location, and the left Y axis shows logarithmic p-values (logistic regression), and the right Y axis shown the recombination rate (shown as the blue line) (Human Assembly GRCh37/hg19).



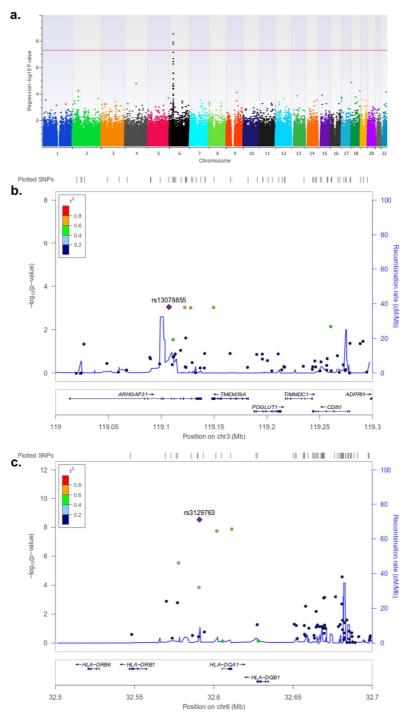
**Supplemental Figure 5 – French Cohort Imputed GWAS** – Manhattan plot of genome wide association test comparing French Replication cohort compared against controls, utilising the logistic regression method, corrected for top 10 principal components for stratification, in all imputed SNPs. The X axis shows chromosome location, and the Y axis shows logarithmic p-values. Standardised genome wide significant  $5x10^{-8}$  is depicted by the red line. The HLA peak is visualised on chromosome 6 (black).



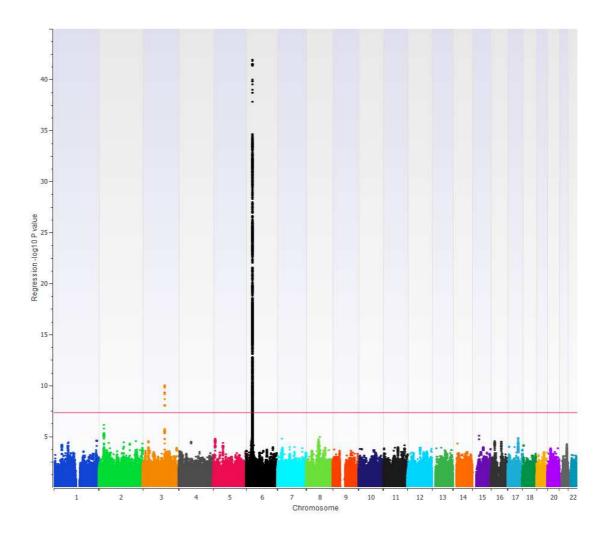
Supplemental Figure 6 – Locus zoom plot of the chromosome 6 peak in the French replication cohort. Genomic area displayed is 32.5 Mb to 32.7 Mb on chromosome 3 (Human Assembly GRCh37/hg19). The X axis shows chromosome location, and the left Y axis shows logarithmic p-values (logistic regression), and the right Y axis shown the recombination rate (shown as the blue line). a. shows the unconditional analysis with the lead SNP rs9461776, b. shows conditional analysis conditioned on rs9461776, revealing an independent association signal, lead SNP rs28383457, and c. shows analysis conditioned on conditioned on rs9461776 and rs28383457.



Supplemental Figure 7 – Locus zoom plot of the chromosome 3 peak in the French Replication cohort. Genomic area displayed is 119.0 Mb to 119.3 Mb on chromosome 3 (Human Assembly GRCh37/hg19). The X axis shows chromosome location, and the left Y axis shows logarithmic p-values (logistic regression), and the right Y axis shown the recombination rate (shown as the blue line). a. shows the unconditional analysis with the lead SNP rs9884090. b shows the same region containing the same markers, following conditioning on rs9884090 (identified from the UK discovery cohort analysis).



**Supplemental Figure 8 – French Cohort Directly Genotyped GWAS -** (a) Manhattan plot of genome wide association test for directly genotyped SNPs only, comparing French cases against controls, utilising the logistic regression method, corrected for top 10 principal components for stratification. The X axis shows chromosome location, and the Y axis shows logarithmic p-values. Standardised genome wide significant 5x10<sup>-8</sup> is depicted by the red line. Locus zoom plot for the French replication cohort (visualising only directly genotyped SNPs) are shown for (b) chromosome 3 and (c) and chromosome 6 peak. The X axis shows chromosome location, and the left Y axis shows logarithmic p-values (logistic regression), and the right Y axis shown the recombination rate (shown as the blue line) (Human Assembly GRCh37/hg19).



**Supplemental Figure 9 – GWAS Meta-Analysis of UK and French Cohorts -**Manhattan Plot of Genome wide association tests for the meta-analysis of UK and French combined cohorts, utilising the logistic regression method, corrected for top 10 principal components for stratification. The X axis shows chromosome location, and the Y axis shows logarithmic p-values. Standardised Genome wide significant 5x10<sup>-8</sup> is displayed in as the red line. The HLA peak is visualised on chromosome 6 (black, grey), in addition to the novel chromosome 3 association (orange, grey).

RS_ID	Location	Alleles	MAF	Distance	D'	R2	Functional
	(GRCh37/hg19)						Annotation ARHGAP31
rs9884090	chr3:119116150	(G/A)	0.1364	0	1	1	INTRON
13300-030	01110.110110100		0.1004	0			ARHGAP31
rs9834901	chr3:119111870	(T/C)	0.1364	-4280	1	1	INTRON
							ARHGAP31
rs12494314	chr3:119122820	(T/C)	0.1364	6670	1	1	INTRON
							ARHGAP31
rs2305249	chr3:119128398	(G/A)	0.1364	12248	1	1	EXON (SYNON)
							ARHGAP31
rs9855065	chr3:119130141	(G/A)	0.1364	13991	1	1	INTRON
rs3732421	chr3:119150089	(A/G)	0.1364	33939	1	1	TMEM39A 3'UTR
							POGLUT1
rs7650774	chr3:119205050	(T/C)	0.1364	88900	1	1	INTRON
rs12695386	chr3:119209027	(T/C)	0.1364	92877	1	1	POGLUT1 CTCF
							TMEM39A
rs12636784	chr3:119174383	(A/G)	0.1313	58233	1	0.95	INTRON
rs2293370	chr3:119219934	(G/A)	0.1515	103784	1	0.88	TIMMDC1 TFBS
							TIMMDC1 EXON
rs1131265	chr3:119222456	(G/C)	0.1515	106306	1	0.88	(SYNONYMOUS)
	-h0-440000500		0 4 5 4 5	440050		0.00	TIMMDC1
rs9843355	chr3:119228508	(G/A)	0.1515	112358	1	0.88	INTRON TIMMDC1
rs144104218	chr3:119237726	(AAC/-)	0.1515	121576	1	0.88	INTRON
15144104210	01113.119237720	(AAC/-)	0.1515	121570	1	0.00	TIMMDC1
rs62264485	chr3:119237798	(C/A)	0.1515	121648	1	0.88	INTRON
1002201100			0.1010	121010		0.00	TIMMDC1
rs35264490	chr3:119238753	(A/-)	0.1515	122603	1	0.88	INTRON
							CD80 EXON
rs57271503	chr3:119244593	(G/A)	0.1515	128443	1	0.88	ENHANCER
rs13092998	chr3:119245044	(G/T)	0.1515	128894	1	0.88	CD80 INTRON
rs3830649	chr3:119246385	(G/-)	0.1515	130235	1	0.88	CD80 INTRON
rs71767581	chr3:119187433	(AC/-)	0.1364	71283	0.91	0.84	POGLUT1 TFBS
							TMEM39A EXON
rs1132200	chr3:119150836	(C/T)	0.1162	34686	1	0.83	(MISSENSE)

**Supplemental Table 1** – Additional SNP's identified from LD-Link, found to be in Linkage disequilibrium with rs9884090 (lead chromosome 3 haploblock 3, identified through GWAS). SNP's with  $R^2$  and D' >0.80 are shown. Functional annotations (derived from UCSC) are also included.

Transcription Factors				
TCF12				
GATA1				
JUND				
CHD1				
MYBL2				
TEAD4				
STAT5A				
POLR2A				
NR3C1				
RELA				
REST				
YY1				
E2F6				
PHF8				

**Supplemental Table 2** – Transcription factors, identified from UCSC that have ChipSeq tracts overlaying the proposed functional variant rs71767581.

## **Supplemental Results**

Several other SNPs within the haploblock containing rs9884090 have also been implicated with other autoimmune disease. Previously published SNPs were analysed for linkage with rs9884090 (D' and R<sup>2</sup>) using LD-link (with 1000G European CEU reference panel)<sup>(20)</sup> and also searched for any evidence of eQTL using GTEX, particularly indicating any evidence of altered POGLUT1 expression. The LD (D' and R2 shown) and also eQTL data is shown below for different autoimmune disease. Notably the eQTL data was not included in the for the majority of the initial studies.

SNPs associated with Multiple Sclerosis

rs1132200, D' 1.0 R<sup>2</sup> 0.83, Reduced POGLUT1 expression on eQTL analysis.<sup>(26,27)</sup>

SNPs associated with Systemic Lupus Erythematosus

- rs1132200; D' 1.0 R<sup>2</sup> 0.83, Reduced POGLUT1 expression on eQTL analysis.<sup>(28)</sup>
- rs12494314, D' 1.0, R<sup>2</sup> 1.0, Reduced POGLUT1 expression on eQTL analysis (in addition to TIMMDC1).<sup>(29)</sup>
- rs12493175, D' 1.0, R<sup>2</sup> 0.04, Reduced POGLUT1 on eQTL analysis.(30)
- rs13062955,D' 1.0, R<sup>2</sup> 0.04, No eQTL data available.<sup>(30)</sup>

SNPs associated with Autoimmune Thyroid Disease

- rs12492609, D' 1.0, R<sup>2</sup> 0.036, No eQTL data available.<sup>(31)</sup>
- rs7629750, D' 1.0, R<sup>2</sup> 0.27, No eQTL data available.<sup>(31)</sup>

SNPs associated with Primary Biliary Cholangitis

rs2293370, D' 1.0, R<sup>2</sup> 0.88, Reduced POGLUT1 expression on eQTL analysis, which was reported in the published paper.<sup>(32)</sup>

The above results demonstrate that the majority of SNPs associated with different autoimmune disease within this haploblock have evidence of strong linkage with rs9884090, and where available eQTL demonstrates altered POGLUT1 expression.

## SUPPLEMENTAL WEBLINKS

- WTCCC<sup>(1)</sup>
  WTCCC Available from the European Genome Archive, http://www.wtccc.org.uk
- Golden Helix, SNP and Variation Suite (SVS)<sup>(7)</sup>
  Details of SVS available from http://www.goldenhelix.com (Bozeman)
- PLINK<sup>(8)</sup> Software available from http://www.cog-genomics.org/plink/1.9
- PRIMUS<sup>(9)</sup> Primus available from http://primus.gs.washington.edu/primusweb/index.html
- Beagle<sup>(10)</sup> Software available from http://faculty.washington.edu/browning/beagle/
- Locus Zoom<sup>(16)</sup>
  Locus Zoom web platform access via http://locuszoom.org
- SNP2HLA<sup>(17)</sup> SNP2HLA software available from http://software.broadinstitute.org/mpg/snp2hla
- LD-LINK<sup>(20)</sup> LD-link online platform available from https://ldlink.nci.nih.gov
- UCSC genome browser<sup>(22,23)</sup> UCSC Genome browser available from https://genome.ucsc.edu
- FACTOR BOOK<sup>(24)</sup> Factor book online software available at www.factorbook.org
- MASTMEME<sup>(25)</sup> Mast-Meme online software available at https://meme-suite.org

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