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# Meta-analysis of genome scans and replication identify *CD6*, *IRF8* and *TNFRSF1A* as new multiple sclerosis susceptibility loci

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### **Abstract**

We report the results of a meta-analysis of genome-wide association scans for multiple sclerosis (MS) susceptibility that includes 2,624 subjects with MS and 7,220 control subjects. Replication in an independent set of 2,215 subjects with MS and 2,116 control subjects validates new MS susceptibility loci at TNFRSF1A (combined  $P = 1.59 \times 10^{-11}$ ), IRF8 ( $P = 3.73 \times 10^{-9}$ ) and CD6 ( $P = 3.79 \times 10^{-9}$ ). TNFRSF1A harbors two independent susceptibility alleles: rs1800693 is a common variant with modest effect (odds ratio = 1.2), whereas rs4149584 is a nonsynonymous coding polymorphism of low frequency but with stronger effect (allele frequency = 0.02; odds ratio = 1.6). We also report that the susceptibility allele near IRF8, which encodes a transcription factor known to function in type I interferon signaling, is associated with higher mRNA expression of interferon-response pathway genes in subjects with MS.

Multiple sclerosis is thought to emerge when genetically susceptible individuals encounter environmental triggers and initiate an inflammatory reaction against self-antigens in the central nervous system (CNS); these events result in recurring episodes of inflammatory demyelination and, in many cases, a progressive neurodegenerative process<sup>1</sup>. The genetic architecture underlying susceptibility to MS is complex, and there are no known mendelian forms. As seen with many other inflammatory diseases, the major histocompatibility complex (MHC) has long been associated with MS, and both class I and class II susceptibility alleles exist<sup>2,3</sup>. However, a recent genome-wide association study (GWAS) revealed the existence of multiple non-MHC MS susceptibility loci of modest effect<sup>4</sup>. The role of three such loci—*CLEC16A*, *IL2RA* and *IL7R*—has now been well validated by other investigators and by our own replication efforts<sup>5-7</sup>. Given the success of the GWAS approach in MS, we extended earlier gene discovery efforts by pooling together data from three separate genome-wide studies exploring the genetic architecture of MS and report three newly identified susceptibility loci for MS.

### **RESULTS**

### **GWAS** meta-analysis and replication

We conducted a meta-analysis of genome-wide data from (i) 895 subjects with MS genotyped in the original scan by the International MS Genetic Consortium<sup>4</sup>, (ii) 969 subjects with MS scanned by the GeneMSA consortium<sup>8</sup> and (iii) an unpublished set of data generated from 860 subjects with MS recruited at the Partners MS Center in Boston, Massachusetts. A detailed description of the component sample sets is presented in Table 1, and their clinical characteristics are outlined in Supplementary Table 1a online. As each of the studies used a different genotyping platform (Table 1), we used the phased chromosomes of HapMap samples of European ancestry (CEU)<sup>9</sup> and the MACH algorithm (see URLs section in Online Methods) to impute missing autosomal SNPs with a minor allele frequency >0.01 in each of the three datasets. This effort produced a dataset containing a common panel of 2.56 million SNPs in 2,624 subjects with MS and 7,220 healthy control subjects. We then implemented a meta-analysis method that combines the association results from each of the six strata of subjects outlined in Table 1, taking into account the imputation uncertainty for each SNP (see Online Methods)<sup>11</sup>. Overall, the degree of statistical inflation was modest (genomic inflation factor  $\lambda = 1.054$ ).

To organize the top results of the meta-analysis, we assembled SNPs into groups that were highly correlated with one another ( $r^2 > 0.5$ ), selecting the SNP with the most extreme evidence

of association (lowest P value) to serve as the representative tagging marker for that group. We list the top 100 independent loci with the lowest p values for association with susceptibility to MS, ranging from the CD58 locus (rs12025416,  $P = 4.74 \times 10^{-8}$ ) to the 14q31.3 locus (rs2022771,  $P = 4.89 \times 10^{-5}$ ) in Supplementary Table 2 online. Each locus is defined by a single tagging SNP and contains those polymorphisms that are in linkage disequilibrium (LD) with it. These 100 loci form the core of the SNP panel that was genotyped in the replication sample set (Table 1 and Supplementary Table 2). Given the preponderance of women over men among individuals affected with MS, we also conducted a secondary genome-wide regression analysis that included a term for gender and a term for subject source to account for the structure of our subject samples (see Online Methods). From this analysis, 41 of the top 50 loci with a term for gender were not redundant with known loci or loci selected by the primary analysis; thus, these 41 SNPs were also included in the replication panel.

To supplement the 141 susceptibility loci selected in an unbiased manner, we selected an additional 47 SNPs for replication using one of the following strategies (Supplementary Table 2). First, we screened all SNPs with a  $P < 10^{-3}$  in the meta-analysis and selected 32 loci that included candidate genes implicated in MS or pathologic inflammation according to a search of current literature. Second, we selected eight nonsynonymous coding SNPs (nscSNPs) with  $P < 10^{-3}$  in the meta-analysis that also had a P < 0.01 in an independent screen for nscSNPs in MS<sup>12</sup>. Finally, for reference, we included seven SNPs previously associated with MS at or near a genome-wide level of significance. The putative association of the rs10492972 marker in the KIF1B locus with MS susceptibility <sup>13</sup> was not known at the time the replication panel was designed. As this locus did not offer evidence of association in our meta-analysis (P =0.72), it was not included in the replication study. In all, we genotyped 188 SNPs in the replication samples from the UK and the US (Table 1 and Supplementary Table 1b), of which 180 SNPs provided high-quality data for subsequent Cochran-Mantel-Haenszel analysis as well as a joint analysis of the replication and meta-analysis results (Supplementary Table 3 online). The relative success of each of our SNP selection strategies is reported in Supplementary Table 3. We note that we do not have genome-wide estimates of ancestry for the subjects in the replication study, and therefore we cannot assess the level of population stratification that may exist within the separate UK and US strata of the replication samples.

Among the 180 SNPs that met quality-control criteria, we observed an excess of associations in the replication stage that was consistent with the direction of effect observed in the meta-analysis (Fig. 1). In Table 2, we present the top results of the replication analysis and the combined evidence for association of these loci. The known MHC class I and class II associations were detected in the replication samples: rs3135388 is the surrogate marker for the *HLA DRB1\*1501* risk allele and rs2523393 is a surrogate marker for the *HLA B\*4402* allele (Table 2 and Online Methods)<sup>14</sup>. Consistent with previous findings, the associations of *HLA B\*4402* and *HLA DRB1\*1501* were independent (Supplementary Table 4 online).

Outside the MHC, the previously validated associations with the *CLEC16A*, *IL2RA* and *IL7R* loci were observed (Table 2), and we now validate the *CD58* locus at a level of genomewide significance ( $P = 3.10 \times 10^{-10}$ ) (Table 2). The best *CD58* marker, rs2300747, was identified in earlier fine-mapping exercises in this locus<sup>15</sup> and is in strong linkage disequilibrium (LD) ( $r^2 = 0.73$  in HapMap CEU samples) with the *CD58* marker selected from the meta-analysis, rs12025416 ( $P = 1.16 \times 10^{-9}$ ) (Supplementary Table 3). Logistic regression revealed no evidence of an independent effect at rs12025416 in the replication samples (Supplementary Table 4). Thus, we see no evidence for allelic heterogeneity at the *CD58* locus in our data, and our previously identified *CD58* SNP (rs2300747) remains the best marker of a susceptibility allele within the *CD58* locus.

In the replication data, we found strong evidence for the presence of three previously unreported associations with genome-wide significance  $(P < 5 \times 10^{-8})$  in the joint analysis: they are located in the *TNFRSF1A* (rs1800693,  $P = 1.59 \times 10^{-11}$ ), *IRF8* (rs17445836,  $P = 3.73 \times 10^{-9}$ ) and CD6 (rs17824933,  $P = 3.79 \times 10^{-9}$ ) loci. All three loci were selected for replication in an unbiased manner on the basis of the results of the meta-analysis (Supplementary Table 2). The rs1800693[T] allele associated with increased risk of MS (odds ratio (OR) = 1.20, 95% confidence interval (CI) = 1.10-1.31, in the replication stage) is found within the sixth intron of TNFRSF1A, and thus we refer to this region as the TNFRSF1A locus. Another gene, PLEKHG6, is found within the block of LD that contains rs1800693, so, formally, either or both genes could be associated with MS susceptibility (Fig. 2a). However, none of the SNPs that are in LD with rs1800693 are located within the *PLEKHG6* gene region (Fig. 2a); future fine-mapping efforts and follow-up studies will be needed to definitively resolve the functional basis of this association. Nonetheless, current literature supports a role for TNFRSF1A, as it has previously been implicated in tumor necrosis factor-associated periodic syndrome (TRAPS). This rare syndrome consists of recurrent episodes of systemic inflammation with variable symptoms including fever, abdominal pain, myalgia, arthralgia, exanthema and ocular involvement <sup>16</sup>, and many affected individuals have been shown to have one of over 57 coding or noncoding mutations in TNFRSF1A (see URLs section in Online Methods). Most of these alleles are rare variants found in certain pedigrees, but a few less-penetrant alleles are segregating in European populations at < 0.05 frequency <sup>17,18</sup>. Notably, a number of subjects with demyelinating or demyelinating-like diseases have been recently reported to harbor such variants (such as the R92Q substitution), but the slight excess in the proportion of these polymorphisms in MS subjects was not significant <sup>16,19,20</sup>. In our meta-analysis, only the R92Q polymorphism (rs4149584, labeled R121Q in dbSNP) has been analyzed. It has substantial evidence of association with MS susceptibility in the meta-analysis (P = 0.0003) as well as the replication effort (P = 0.0042), and it is not in LD with rs1800693 ( $r^2 = 0.041$  in HapMap CEU samples), the common TNFRSF1A variant identified in our study (Table 2). Conditional analysis suggests that the two SNPs represent independent associations (Supplementary Table 4). Although a detailed investigation of common and rare variants in this locus is necessary to fully characterize MS-related effects, our study provides the first definitive link between the TNFRSF1A locus and susceptibility to demyelinating disease at both a high-frequency polymorphism of modest effect (rs1800693) and a low-frequency polymorphism of stronger effect (rs4149584). Altogether, rs1800693[T] and rs4149584[T] are excellent candidate risk alleles for other inflammatory diseases, particularly those with rheumatologic features.

The association of rs17445836[A] (OR = 0.80, 95% CI = 0.72–0.89) is also new and is found in a region of elevated recombination rate and lower LD (Fig. 2b). On the centromeric side, this SNP is located within 61 kb of *IRF8* (interferon response factor 8; also known as interferon consensus sequence binding protein 1, *ICSBP1*), and we therefore refer to this association as being in the *IRF8* locus because the closest telomeric gene, *FOXF1*, is 526 kb away. As its name implies, IRF8 is one of the several transcription factors that regulate responses to type I interferons ( $\alpha$  and  $\beta$  interferons) by binding the interferon-stimulated response element (ISRE) (MIM601565). It has many roles that include involvement in B-cell germinal center development as well as macrophage cell function<sup>21,22</sup>.

The third locus contains the rs17824933[G] susceptibility allele (OR = 1.18, 95% CI = 1.07–1.30) and is bounded by two peaks of recombination (Fig. 2c) between which only one gene, CD6, is found. The excess of extreme results with modest LD ( $0.8 > r^2 > 0.5$ ) to rs17824933 at the telomeric end of the block of LD suggests that there may be an independent association within this locus. CD6, like CD58, is a molecule involved in T-cell costimulation and differentiation<sup>23,24</sup>; it may therefore have a role in modulating the activation and proliferation of T cells in the context of an inflammatory disease. In fact, these properties led to its targeting with a blocking monoclonal antibody in a clinical trial treating individuals with MS<sup>25</sup>. Finally,

the soluble form of CD6 may also function as a pattern recognition receptor and affects the serum level of TNF $\alpha$  in this context in mice<sup>26</sup>. Thus, the rs17824933[G] susceptibility allele found in the first intron of *CD6* may have functional repercussions that interact with those of the *TNFRSF1A* locus.

Four other loci with  $P < 10^{-4}$  in our joint analysis (Table 2) have previously validated associations with other inflammatory diseases and are therefore likely to be true MS susceptibility loci: IL12A, OLIG3-TNFAIP3, PTGER4 and RGS1. The putative IL12A and RGS1 MS susceptibility alleles are in strong LD with known celiac disease susceptibility alleles<sup>27</sup>, as is the PTGER4 MS allele and the known Crohn's disease allele<sup>28</sup> in this locus (Supplementary Table 5a online). On the other hand, the signal of association within the OLIG3-TNFAIP3 locus seems to be distinct from known associations to psoriasis, rheumatoid arthritis (RA) and systemic lupus erythematosus (SLE) (Supplementary Table 5a)<sup>29-32</sup>. Given the discovery of these strong candidate MS loci, we extended this comparative analysis to a larger number of loci by comparing our list of 100 top MS loci selected for replication (Supplementary Table 2) to the list of 76 Crohn's disease loci in which replication was attempted<sup>28</sup>. We found seven loci with substantial evidence of association in both diseases: these include not only loci with a validated role in one disease (IL12B and PTGER4 in Crohn's disease as well as IRF8 in MS) but also loci with suggested roles in both diseases (BCL2, NEDD4L, PPA2 and STAT3; Supplementary Table 5b).

### **Expression studies**

Given the newly discovered association to the IRF8 locus that contains an important transcription factor involved in responses to type I interferons, we explored its possible functional consequences by investigating a set of RNA data (Affymetrix U133 2.0 array) captured from the peripheral blood mononuclear cells (PBMCs) of 240 subjects of European ancestry with either remitting-relapsing MS (RRMS, n = 230) or a clinically isolated demyelinating syndrome (CIS, n = 10), many of which go on to develop MS (Supplementary Table 1c). These subjects can be classified into three categories; untreated subjects (n = 82), interferon  $\beta$  (IFN $\beta$ )-treated subjects (n = 94) and glatiramer acetate (GA)-treated subjects (n = 94) 64). We used an unbiased approach to assess these data for the hypothesis that the IRF8 locus may have a modest but broad effect on RNA expression from genes involved in interferon response. Specifically, we applied a gene set enrichment analysis (GSEA) methodology<sup>33</sup> to explore the results of a quantitative trait (eQTL) analysis correlating rs17445836 with our genome-wide RNA expression data from subjects with MS and CIS. As IRF8 is known to be an interferon-response gene, its function could be affected either by IFNB treatment or by GA treatment, which is reported to suppress IFNB expression (S. Zamvil, University of California, San Francisco, personal communication). Thus, we pursued this GSEA screen of RNA data separately in each of our three subject subsets (untreated, IFNβ-treated and GA-treated). Sixteen gene sets that meet our threshold of significance (an FDR q value < 0.05) have genes that are coordinately upregulated in the presence of the rs17445836[G] allele in both the untreated and the IFNB-treated subject subsets. Specifically, each of the 16 shared gene sets contain genes whose expression is coordinately enhanced under an additive model for rs17445836[G] association. In Table 3, we present the most associated of these 16 gene sets, that is, those gene sets that have an FDR q value < 0.001 in both sets of subjects. All eight of these most associated gene sets are primarily defined as being interferon-responding or are known to contain responses to type I interferons. Detailed results of each analysis are presented in Supplementary Table 6a,b online. Upregulation of interferon pathway genes in peripheral blood has previously been noted in ~50% of untreated subjects with MS<sup>34,35</sup>, so the overlap between the untreated and IFNβ-treated subsets suggests that these results are consistent with our current knowledge of pathophysiology in MS. The lack of replication of the results of the untreated group in the GA-treated group is intriguing; it could be due to the smaller size of this

subject subset (n = 64) and/or the suppression of IFN $\beta$  expression by GA. Further validation experiments in these subject subsets are needed to confirm our observations and explore the interactions of these MS treatments with the effect of the rs17445836[G] allele.

To control for potential bias in our analysis method, we repeated this investigation of the quantitative trait analysis results using the Ingenuity Pathways Analysis software suite (see URLs section in Online Methods). Here, using the same set of quantitative trait analysis results, we find significant co-regulation, relative to the rs17445836[G] allele, of genes within Ingenuity Systems' predefined "canonical interferon signaling pathway" among both untreated subjects (P = 0.001) and IFN $\beta$ -treated subjects (P = 0.01) (Fig. 3). The GA-treated subjects do not have a significant co-regulation of genes in this pathway. We have also repeated the GSEA and Ingenuity analyses using the best markers for MS susceptibility in the CD6, CD58 and TNFRSF1A loci that were validated in this meta-analysis; none of these three loci show significant co-regulation within the interferon pathway (data not shown) relative to the best susceptibility marker in each locus. In addition, we examined a publicly available dataset generated from a different cell type (EBV-transformed B cells) for the effect of the rs17445836 [G] susceptibility allele on interferon response but did not observe this association in the small sample of HapMap cell lines of European ancestry (data not shown)<sup>36</sup>. Our data therefore suggest that both at baseline and during chronic exposure to exogenous INFB the rs17445836 [G] susceptibility allele may have a widespread but specific effect on gene expression in PBMC from subjects with MS, particularly within the interferon response pathway in which IRF8 is known to function (Fig. 3).

Only one probe in our RNA dataset provided information on the *IRF8* gene itself, and this probe shows no evidence of correlation between rs17445836[G] and *IRF8* expression. Thus, the mechanism by which rs17445836[G] influences gene expression remains unknown at this time, and more comprehensive studies of the expression of *IRF8* and its RNA isoforms in specific cell populations are needed to address this question.

### **DISCUSSION**

Our current data suggest that dysregulation of interferon responses may be one of the early events that contribute to the onset of MS. Upregulation of interferon responses has been noted not only in a subset of MS subjects  $^{34,35}$ , but also in subjects with other inflammatory diseases (dermatomyositis  $^{37}$ , rheumatoid arthritis and SLE  $^{38,39}$ ), and may reflect a shared feature of autoimmunity. However, the role of interferons in the onset of MS remains to be better defined. In addition, other pathways may also be affected by the *IRF8* variant, such as a gene set defined in response to TNF $\alpha$  stimulation that is coordinately upregulated in untreated MS subjects with the rs17445836[G] allele of *IRF8* (FDR q value <  $10^{-4}$ , Supplementary Table 6a). This observation suggests a link between the functional consequences of the *IRF8* locus and those of the newly identified *TNFRSF1A* locus.

The possible role of the TNFRSF1A alleles in multiple sclerosis is informed by functional data from human studies. The TNF $\alpha$  pathway is implicated in MS susceptibility as a result of observations from human clinical data: treatment with monoclonal antibodies to TNF $\alpha$  may trigger acute episodes of CNS inflammation in subjects with MS<sup>40</sup>. A phase II clinical trial with a TNFRSF1A:IgG1 fusion protein (lenercept) also reported increased clinical attacks, although these occurred in the absence of enhanced disease activity on magnetic-resonance imaging and disability<sup>41</sup>. Furthermore, demyelinating lesions are a possible adverse event in subjects with Crohn's disease or rheumatoid arthritis treated with monoclonal antibodies to TNF $\alpha$ <sup>42</sup>. Thus, genetic and functional data now merge and suggest that dysregulation of the TNF $\alpha$  pathway has a role in the onset of MS, with diminished TNF $\alpha$  activity being associated with onset of CNS inflammatory lesions in clinical data. The suggested association of the

OLIG3-TNFAIP3 locus fits within this theme, as may the association of CD6: soluble CD6 may function as a pattern recognition receptor and influence circulating levels of  $TNF\alpha^{26}$ . With its observations relating to responses to class I interferons and  $TNF\alpha$ , this study focuses our attention on dysregulation within the innate immune system in MS susceptibility. Dysfunction of the innate immune system, an important first line of defense against pathogens, has long been noted in immunopathology studies of MS. This history has contributed to the longstanding hypothesis of a viral or microbial trigger for MS, with the best evidence residing with the Epstein Barr Virus (EBV), and we must now consider our new associations in the context of such environmental risk factors<sup>43</sup>.

Given the nearly 3:1 preponderance of women in all of our cohorts, we also need to better understand the impact of gender on MS susceptibility. Our secondary analysis that includes a term for gender was conducted for this reason and was successful in highlighting the role of the CXCR4 locus ( $P = 1.37 \times 10^{-7}$ ) (Supplementary Table 3). Although this locus was selected for replication on the basis of the secondary gender analysis, it showed strong evidence of replication in our primary replication analysis without a term for gender. The results of the secondary analysis of the replication data that includes gender as a covariate are shown in Supplementary Table 7 online. The top results of this analysis generally mirror those of the primary replication analysis.

Overall, most validated and strongly suggested MS susceptibility loci (CD6, CD58, CLEC16A, HLA-B, HLA-DRB1, IRF8, IL2RA, IL7R, IL12A, OLIG3-TNFAIP3, PTGER4, RGS1 and TNFRSF1A) have well-known and primarily immunologic functions. This is particularly true for our newly validated loci (CD6, IRF8 and TNFRSF1A) that were selected for replication in an unbiased manner. In addition, many of these MS susceptibility loci have validated roles in other inflammatory diseases. Thus, we inform the ongoing debate of the relative roles of neurodegeneration and inflammation in the onset of MS by reporting a preponderance of current genetic evidence in favor of early immune dysregulation that may trigger secondary neurodegenerative processes. A definitive evaluation of this question awaits a more complete map of genetic susceptibility factors and a more comprehensive understanding of the functions of the associated genes in different cell types. This search for further susceptibility loci is also guided by the important observation that a less common variant (frequency of ~2% in European populations) of stronger effect has now been associated with susceptibility to MS in the TNFRSF1A locus. This suggests that future investigations of complex traits in MS will have to target this class of low-frequency alleles, which are typically only poorly interrogated by the current set of genome-wide SNP genotyping platforms.

### **METHODS**

Methods and any associated references are available in the online version of the paper at http://www.nature.com/naturegenetics/.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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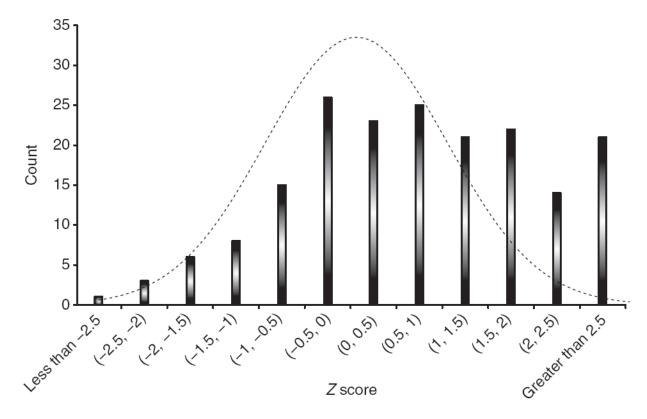


Figure 1. Enrichment of associations in the replication stage that are consistent with the meta-analysis. Plot shows a histogram of the absolute values of the replication study Z scores from the 180 SNPs included in the replication analysis (see Supplementary Table 3 for detailed results). In this case, the direction of the association reflects consistency with the results of the meta-analysis: a positive Z score is in the same direction in both the meta-analysis and the replication analysis while a negative Z score highlights the fact that the two analyses are discordant. An excess of concordant, highly significant associations is noted. A null distribution is plotted to highlight this enrichment.

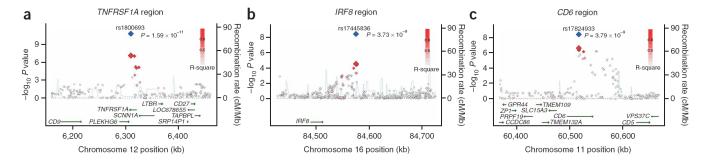


Figure 2.

Three previously unidentified loci, TNFRSF1A, IRF8 and CD6, with genome-wide level of evidence of association to MS. (a) Illustration of the TNFRSF1A locus, with the local recombination rate plotted in light blue over this 200-kb chromosomal segment centered on rs1800693. Each diamond represents one SNP found in this locus, and the most associated SNP in the meta-analysis, rs1800693, is marked by a red diamond. A blue diamond is used to represent the level of evidence associated with rs1800693 in the joint analysis that includes the replication data. The color of each circle is defined by the extent of LD with rs1800693: red  $(r^2 > 0.8)$ , orange  $(0.8 > r^2 > 0.5)$ , gray  $(0.5 > r^2 > 0.3)$  and white  $(r^2 > 0.3)$ . Physical positions are based on build 36 of the human genome, rs1800693 is located in an intron of TNFRSF1A. (b) Illustration of the IRF8 locus, with the most associated SNP in this locus, rs17445836, highlighted by red (meta-analysis result) and blue (joint analysis result) diamonds. Here, we also present all SNPs found within a 200-kb window centered on rs17445836 and define SNP colors based on LD to rs17445836. (c) Illustration of the CD6 locus, with the most associated SNP in this locus, rs17824933, highlighted by red (meta-analysis result) and blue (joint analysis result) diamonds. Here, we also present all SNPs found within a 200-kb window centered on rs17824933 and define SNP colors based on LD to rs17824933. In this case, CD6 is the only gene found in the large block of LD that contains the association to MS susceptibility. Linkage disequilibrium maps are presented for all three loci in Supplementary Figure 1a-c online.

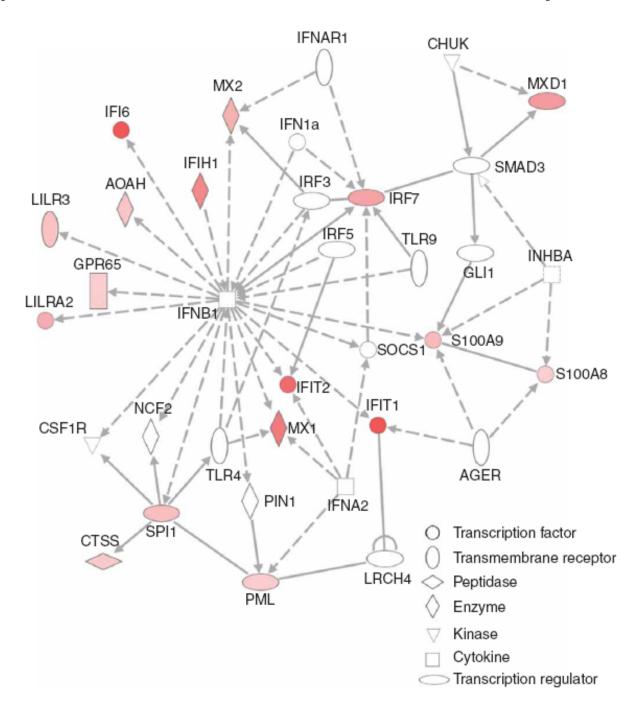


Figure 3. Interferon response genes are coordinately upregulated relative to the rs17445836[G] allele of *IRF8*. Using the Ingenuity Pathways Analysis software suite, we illustrate the network of genes in the "interferon signaling pathway" whose expression is found to be correlated with the rs17445836[G] allele in untreated MS subjects. The diagram highlights those genes in this pathway whose expression are upregulated (red) in the presence of the rs17445836[G] allele. The magnitude of each gene's association is reflected by the intensity of the color, with brighter red indicating a stronger correlation between rs17445836[G] and RNA expression. A white color denotes a gene found in the associated pathway but which failed to meet a nominal P < 0.05 threshold for association of its RNA expression with rs17445836[G]. The shapes of each

gene symbol denote the class of that gene as defined by the Ingenuity Pathways application: horizontal oval, transcription regulator; vertical oval, transmembrane receptor; rectangle, G protein–coupled receptor; horizontal diamond, peptidase; vertical diamond, enzyme; triangle, kinase; square, cytokine; circle, other.

# NIH-PA Author Manuscript Table 1 Sample sets used in the meta-analysis and replication studies

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,			Meta-analys	Meta-analysis sample collections				
Stratum	IMSGCUK	IMSGC US	ВWН	Gene MSA CH	Gene MSA NL	Gene MSA US	Total	
Number of cases Number of controls	453 2,950 <sup>a</sup>	342 $1,679^b$	860 1,720 <sup>C</sup>	230 232 <sup>d</sup>	$253$ $208^d$	486 431 <sup>d</sup>	2,624	
Genotyping platform	Affy 500K	Affy 500K	Affy 6.0	Illumina 550	Illumina 550	Illumina 550		
			Replication sample collections	ole collections				
Stratum			NS			UK	Í	
Collection	ВWН	wu	ACP	UCSF	RUSH	nc	1958 BC	Total
Number of cases Number of controls	228 407 <sup>e</sup>	152	597 35	407	0 489	831	0 1,030	2,215

In each pair of matched cases and controls, all subjects are genotyped using the same genome-wide platform.

 $^{\it q}$  Wellcome Trust Case Control Consortium–healthy control subjects.

 $^{b}$ NIMH–healthy control subjects.

 $^c$ MIGen study—healthy control subjects and subjects with a history of early myocardial infarction & BWH healthy control subjects.

 $^d$ Gene MSA–healthy control subjects recruited at the respective subject recruitment sites for this MS study.

BWH controls—these subjects of European ancestry recruited in the Boston area include (1) unaffected spouses from our MS Genetics collections (n = 14), (2) the BWH PhenoGenetic Project subjects (n = 292), and healthy subjects from the HPCGG collection (n = 101) (see Online Methods for details). These subjects do not overlap with BWH control subjects used in the meta-analysis. 1958 BC, 1958 birth cohort; ACP, Accelerated Cure Project; BWH, Brigham & Women's Hospital; CH, Switzerland; IMSGC, International MS Genetics Consortium; NL, Netherlands; RUSH University; UC, University of Cambridge, UK; UCSF, University California, San Francisco; UK, United Kingdom; US, United States; WU, Washington University, St. Louis. De Jager et al.

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Page 16

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Table 2

Results of the replication and combined analysis

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										Replication study	on study			
٠	SNP	A1	A2	ВР	$\chi^2$	MAF_US	MAF_UK	OR	F67	195	$P_{ m replication}$	$P_{ m meta}$	$P_{ m Joint}$	Locus
	Previously published MS loci	shed MS Ic	ıci											
	rs3135388	Ą	Ö	32521029	335.10	0.22	0.21	2.75	2.46	3.07	$7.35\times10^{-75}$	$7.44 \times 10^{-164}$	$3.80\times10^{-225}$	HLA-DRB1
	rs2523393	Ŋ	A	29813638	30.55	0.41	0.41	0.78	0.72	0.85	$3.26\times10^{-8}$	$3.36\times10^{-11}$	$1.04\times10^{-17}$	HLA-B
	rs2300747	Ö	Α	116905738	14.31	0.12	0.11	0.77	89.0	0.88	$1.55\times10^{-4}$	$2.44\times10^{-7}$	$3.10\times10^{-10}$	CD58
	Vat 0	C	Н	6139051	7.87	0.24	0.25	0.87	0.79	96.0	0.0050	$1.52\times10^{-6}$	$9.33\times10^{-8}$	IL2RA
	Gene 1215981181	∢	C	11074189	8.42	0.31	0.29	0.87	08.0	96.0	0.0037	$1.30\times10^{-5}$	$1.77\times10^{-7}$	CLEC16A
	t. At 2864689s1	Т	C	rs6897932 T C 35910332	5.60	0.25	0.27	68.0	0.81	86.0	0.0180	$7.71\times10^{-6}$	$1.67\times10^{-6}$	IL7R
	Newly ident	l loci with g	genome-w	ide level of evidence										
	rs1800693	C	Н	6310270	17.57	0.45	0.42	1.20	1.10	1.31	$2.77\times10^{-5}$	$7.52\times10^{-8}$	$1.59\times10^{-11}$	TNFRSFIA
	rs4149584 snu	Т	C	6312904	8.20	0.022	0.018	1.58	1.15	2.17	0.0042	0.00035	$5.25\times10^{-6}$	$TNFRSFIA^a$
	rs17445836di.	∢	Ð	84575164	17.40	0.19	0.22	0.80	0.72	0.89	$3.03\times10^{-5}$	$3.05\times10^{-5}$	$3.73\times10^{-9}$	IRF8
	rs17824933 ava	Ŋ	C	60517188	10.39	0.25	0.23	1.18	1.07	1.30	0.0013	$2.32\times10^{-7}$	$3.79\times10^{-9}$	CD6
	Newly ident	l loci with	suggestive	evidence										
	in Is 12882300	Τ	C	136692725	15.75	0.39	0.46	0.84	0.77	0.92	0.000517	$7.23\times10^{-5}$	$1.37\times10^{-7}$	CXCR4
	rs6896969 Md A C 40460	∢	C	40460183	4.58	0.38	0.40	0.91	0.83	0.99	0.0324	$1.44\times10^{-7}$	$2.40\times10^{-7}$	$PTGER4^b$
	2009 00106/1sı	Ŋ	Н	122222678	3.86	0.24	0.22	1.11	1.00	1.22	0.0495	$2.74\times10^{-7}$	$7.21\times10^{-7}$	<i>МРНОЅРН9</i>
	rs1250540 O	Ŋ	A	80706013	5.91	0.35	0.40	1.12	1.02	1.22	0.0151	$9.89\times10^{-6}$	$1.59\times10^{-6}$	ZMIZI
	rs4680534 op	C	Н	161181639	6.18	0.37	0.36	1.12	1.02	1.22	0.0129	$6.80\times10^{-6}$	$5.58\times10^{-6}$	$IL12A^b$
	rs2760524 9	∢	Ö	190797171	5.88	0.16	0.17	0.87	0.77	0.97	0.0153	$1.07\times10^{-4}$	$9.77\times10^{-6}$	$RGSI^b$
	rs9321619	Ŋ	A	137916101	7.78	0.47	0.46	0.89	0.81	96.0	0.0053	$9.34\times10^{-4}$	$1.71\times10^{-5}$	$OLIG3$ - $TNFAIP3^b$

he rs4149584 nonsynonymous coding SNP was genotyped after the replication effort was concluded; given the result at rs1800693 and suggestive evidence of association at rs4149584 in the metaalysis, we genotyped rs4149584 separately in the replication sample set. The two SNPs have independent effects on MS susceptibility (Supplementary Table 4).

, major allele; BP, physical location of the SNP in build 36; MAF, minor allele frequency in US and UK strata; L95/U95, lower and upper bounds of the 95% confidence interval for the OR. At each cus, the OR is stated relative to the minor allele. Here, we list all loci with evidence of genome-wide significance  $(P < 5 \times 10^{-8})$  as well as loci with suggestive results, which are defined as either (i) IFAIP3, psoriasis, rheumatoid arthritis and systemic lupus erythematosus. MS association results for the associated SNP in another disease are reported in Supplementary Table 5. A1, minor allele; hese loci have previously validated associations with other inflammatory diseases at a genome-wide level of significance: PTGER4, Crohn's disease; IL12A and RGSI, celiac disease; OLIG3-

oint  $P < 1 \times 10^{-6}$  or (ii) a joint  $P < 1 \times 10^{-4}$  and evidence of association to another inflammatory disease.

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Gene set enrichment analysis pathways with coordinated RNA expression relative to the IRF8 rs17445836[G] susceptibility allele

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Gene set         Size         NES         FDR q         Size           TAKEDA_NUP8_HOXA9_10D_UP         27         2.8         <10^4         20           TAKEDA_NUP8_HOXA9_16D_UP         19         2.7         <10^4         15           TAKEDA_NUP8_HOXA9_3D_UP         29         2.7         <10^4         30           TAKEDA_NUP8_HOXA9_8D_UP         24         2.7         <10^4         18           IFNA_HCMV_6HRS_UP         21         <10^4         18           RADAEVA_IFNA_UP         16         2.2         <10^4         17           DER_IFNB_UP         17         2.2         <10^4         17           REOVIRUS_HEX293_UP         23         5 × 10^4         29           21         7 × 10^4         29         29			Untreated			IFNβ-treated	
A9_10D_UP       27       2.8       <10^4	Gene set	Size	NES	FDR q	Size	NES	FDR q
A9_16D_UP       19 $2.7$ $<10^{-4}$ A9_3D_UP       29 $2.7$ $<10^{-4}$ A9_8D_UP       24 $2.7$ $<10^{-4}$ IP       23 $<10^{-4}$ IF       2.2 $<10^{-4}$ UP       23 $<10^{-4}$ UP       23 $<10^{-4}$	TAKEDA_NUP8_HOXA9_10D_UP	27	2.8	<10 <sup>-4</sup>	20	3.0	<10 <sup>-4</sup>
A9_3D_UP       29       2.7 $<10^{-4}$ A9_8D_UP       24       2.7 $<10^{-4}$ IP       21       2.3 $<10^{-4}$ IP       2.2 $<10^{-4}$ UP       2.3 $<10^{-4}$ UP       2.1 $<7\times10^{-4}$	TAKEDA_NUP8_HOXA9_16D_UP	19	2.7	<10 <sup>-4</sup>	15	2.8	$<10^{-4}$
A9_8D_UP 24 2.7 $<10^{-4}$ IP 2.3 $<10^{-4}$ If 2.2 $<10^{-4}$ UP 2.4 $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10^{-4}$ $<10$	TAKEDA_NUP8_HOXA9_3D_UP	29	2.7	<10 <sup>-4</sup>	30	3.0	$<10^{-4}$
TP 2.3 $<10^{-4}$ 16 2.2 $<10^{-4}$ 17 2.2 $5\times10^{-4}$ UP 23 2.1 $7\times10^{-4}$	TAKEDA_NUP8_HOXA9_8D_UP	24	2.7	<10 <sup>-4</sup>	18	2.8	<10 <sup>-4</sup>
$16   2.2   <10^{-4}$ $17   2.2   5 \times 10^{-4}$ UP $23   2.1   7 \times 10^{-4}$	IFNA_HCMV_6HRS_UP	21	2.3	<10 <sup>-4</sup>	15	2.5	<10 <sup>-4</sup>
	RADAEVA_IFNA_UP	16	2.2	<10 <sup>-4</sup>	17	2.8	<10 <sup>-4</sup>
23 2.1 $7 \times 10^{-4}$	DER_IFNB_UP	17	2.2	$5\times 10^{-4}$	20	2.4	$1\times 10^{-4}$
	REOVIRUS_HEK293_UP	23	2.1	$7\times 10^{-4}$	29	2.7	<10 <sup>-4</sup>

subjects who had a diagnosis of CIS at the time of sampling, the same results are returned. "Size" reports the number of genes that are coordinately regulated within each gene set; "NES" is the "normalized "TAKEDA" prefix are defined as sets of genes upregulated after transformation of CD34<sup>+</sup> hematopoietic cells with the NUP98/HOXA9 fusion protein that is found in certain translocations associated with myelodysplastic syndromes and acute myeloid leukemia. This fusion protein is known to strongly upregulate interferon  $\beta$  expression and, hence, interferon response pathways. Supplementary Tables This table presents only those gene sets with an FDR q value < 0.001 in both the analysis of untreated subjects and that of IFN $\beta$ -treated subjects. When the analysis was repeated after excluding the ten enrichment score," an outcome parameter of the gene set enrichment method; "FDR q-val" reports a measure of significance corrected for the number of gene sets tested. Of note, the gene sets with a 6a and 6b present the detailed results of our analyses.