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Hanna Ollila, Eilon Sharon, Ling Lin, Nicholas A Sinnott-Armstrong ...+84 more authors

Institutions: Stanford University, Peking University, Catholic University of Korea, University of Montpellier ...+27 more institutions

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1 Narcolepsy risk loci are enriched in immune cells and suggest autoimmune modulation of

2 the T cell receptor repertoire

3

Hanna M Ollila, Eilon Sharon, Ling Lin, Nasa Sinnott-Armstrong, Aditya Ambati, Ryan P Hillary, Otto 4 Jolanki, Juliette Faraco, Mali Einen, Guo Luo, Jing Zhang, Fang Han, Han Yan, Xiao Song Dong, Jing Li, 5 Jun Zhang, Seung-Chul Hong, Tae Won Kim, Yves Dauvilliers, Lucie Barateau, Gert Jan Lammers, Rolf 6 Fronczek, Geert Mayer, Joan Santamaria, Isabelle Arnulf, Stine Knudsen, May Kristin Lyamouri Bredahl, 7 Per Medbøe Thorsby, Giuseppe Plazzi, Fabio Pizza, Monica Moresco, Catherine Crowe, Stephen K Van 8 den Eeden, Michel Lecendreux, Patrice Bourgin, Takashi Kanbayashi, Rosa Peraita-Adrados, Francisco J 9 Martínez-Orozco, Antonio Benetó, Jacques Montplaisir, Alex Desautels, Yu-Shu Huang, Poul Jennum, 10 Sona Nevsimalova, David Kemlink, Alex Iranzo, Sebastian Overeem, Aleksandra Wierzbicka, Peter 11 Geisler, Karel Sonka, Makoto Honda, Birgit Högl, Ambra Stefani, Fernando Morgadinho Coelho, Vilma 12 Mantovani, Eva Feketeova, Mia Wadelius, Niclas Eriksson, Hans Smedje, Pär Hallberg, Per Egil Hesla, 13 David Rye, Zerrin Pelin, Luigi Ferini-Strambi, Claudio L Bassetti, Johannes Mathis, Ramin Khatami, Adi 14 Aran, Sheela Nampoothiri, Tomas Olsson, Ingrid Kockum, Markku Partinen, Markus Perola, Birgitte R 15 Kornum, Sina Rueger, Juliane Winkelmann, Taku Miyagawa, Hiromi Toyoda, Seik Soon Khor, Mihoko 16 Shimada, Katsushi Tokunaga, Manuel Rivas, Jonathan K Pritchard, Neil Risch, Zoltan Kutalik, Ruth 17 O'Hara, Joachim Hallmayer, Chun Jimmie Ye, Emmanuel Mignot 18 19 20 21 *Correspondence should be addressed to: Emmanuel Mignot, Director, Center For Sleep 22

Sciences and Medicine, 3165 Porter Drive, #2178, Palo Alto CA 94304, USA. (1)650-725-6517
(tel), (1)650-725-7341 (fax), mignot@stanford.edu.

1 Abstract

2	Type 1 narcolepsy (T1N) is a neurological condition, in which the death of hypocretin-producing
3	neurons in the lateral hypothalamus leads to excessive daytime sleepiness and symptoms of
4	abnormal Rapid Eye Movement (REM) sleep. Known triggers for narcolepsy are influenza-A
5	infection and associated immunization during the 2009 H1N1 influenza pandemic. Here, we
6	genotyped all remaining consented narcolepsy cases worldwide and assembled this with the
7	existing genotyped individuals. We used this multi-ethnic sample in genome wide association
8	study (GWAS) to dissect disease mechanisms and interactions with environmental triggers
9	(5,339 cases and 20,518 controls). Overall, we found significant associations with HLA (2 GWA
10	significant subloci) and 11 other loci. Six of these other loci have been previously reported (TRA,
11	TRB, CTSH, IFNAR1, ZNF365 and P2RY11) and five are new (PRF1, CD207, SIRPG, IL27 and
12	ZFAND2A). Strikingly, in vaccination-related cases GWA significant effects were found in HLA,
13	TRA, and in a novel variant near SIRPB1. Furthermore, IFNAR1 associated polymorphisms
14	regulated dendritic cell response to influenza-A infection in vitro (p-value = $1.92*10^{-25}$). A
15	partitioned heritability analysis indicated specific enrichment of functional elements active in
16	cytotoxic and helper T cells. Furthermore, functional analysis showed the genetic variants in TRA
17	and <i>TRB</i> loci act as remarkable strong chain usage QTLs for <i>TRAJ*24</i> (p-value = 0.0017),
18	$TRAJ^{*}28$ (p-value = 1.36*10 ⁻¹⁰) and $TRBV^{*}4-2$ (p-value = 3.71*10 ⁻¹¹⁷). This was further
19	validated in TCR sequencing of 60 narcolepsy cases and 60 DQB1*06:02 positive controls,
20	where chain usage effects were further accentuated. Together these findings show that the
21	autoimmune component in narcolepsy is defined by antigen presentation, mediated through
22	specific T cell receptor chains, and modulated by influenza-A as a critical trigger.

23

1 Main Text

Type 1 narcolepsy (T1N) is a sleep disorder that affects 1/3,000 individuals across ethnic 2 groups¹⁻³. Onset is typically in childhood through early adulthood. Symptoms are caused by the 3 destruction of hypocretin/orexin neurons, a small neuronal subpopulation of the hypothalamus⁴. 4 Although the disease is considered autoimmune, the exact mechanism leading to hypocretin cell 5 death is still unclear. Indeed, T1N is strongly associated with alleles encoding the heterodimer 6 DQ0602 haplotype (HLA-DQA1*01:02~DQB1*06:02, 97% vs. 25%) across ethnic groups^{5,6}. 7 Other loci previously associated with the disease include T cell receptor (TCR) loci alpha (TRA) 8 and beta (TRB), receptors of HLA-peptide presentations, and other autoimmune associated 9 genes (CTSH, P2RY11, ZNF365, IFNAR1 and TNFSF4)⁷⁻¹⁰. 10 11 Triggers of T1N point to the immune system, including influenza and Streptococcus Pyogenes 12 infections^{9,11,12}, as well as immunization with Pandemrix®, an influenza-A vaccine developed 13 specifically against the H1N1 "swine flu" strain ¹³⁻²⁰ suggest a strong environmental modifier of 14 disease risk for narcolepsy. Increased T1N incidence following the Pandemrix® vaccination was 15 first seen in Northern Europe¹³⁻²⁰ with 8-fold increase in incidence in (0.79/100,000 to 16 6.3/100,000) in children. The specificity was striking, as increased T1N was later detected in all 17 countries where Pandemrix® was used, whereas countries using other pH1N1 vaccine brands 18 did not detect vaccination-associated increases in incidence¹³⁻²². 19

20

Despite the genetic and epidemiological evidence for T1N being an immune-system mediated 21 disease, only a few genetic risk factors have been found or characterized so far. Furthermore, the 22 functional consequence of these variants has remained unstudied. Therefore, we examine and 23 characterize genetic factors for T1N across multiple ethnic groups in a sample three times larger 24 than earlier studies finding novel mechanisms how these variants affect RNA expression and T 25 cell receptor chain usage. Our novel findings show that the autoimmune component in narcolepsy 26 is defined by antigen presentation, mediated through specific T cell receptor chains, and 27 modulated by influenza-A as a critical trigger. 28

1

2 **Results**

3	GWAS discovers five novel risk loci for narcolepsy. To discover novel narcolepsy loci, we first
4	meta-analyzed a large multiethnic cohort of 5,339 T1N cases and 20,518 controls consisting of
5	samples from nine independent cohorts across three ethnic groups. In addition to the strongest
6	associations in the HLA locus (minimum p-value<10 ⁻²¹⁶), we discovered additional 228 genome-
7	wide significant SNPs with no evidence of genomic inflation ²³ (λ =1.06) (meta-analysis p-value <
8	5x10 ⁻⁸ ; Fig. 1). These results confirmed six out of eight previously identified loci (<i>TRA</i> , <i>TRB</i> ,
9	CTSH, IFNAR1, ZNF365 and P2RY11), and identified five novel loci near CD207, SIRPG, IL27,
10	ZFAND2A and PRF1 (Fig. 1, Table 1, Supplementary Figs. 1-2). Further fine-mapping
11	suggested more than one signal in TRB, ZNF365, TRA, SIRPG and IFNAR1 loci (Supplementary
12	information). Furthermore, a GCTA gene based test ²⁴ showed association with three known
13	autoimmune or inflammatory disease genes with GPR25 ^{25,26} , C1ORF106 ²⁷ and PD-1 ^{28,29} ,
14	suggesting that additional variants remain to be discovered using larger sample sizes (see
15	Supplementary Tables 1-3) doubling the number of variants in T1N.
16	
	Next we examined the genetic architecture of T1N by calculating the parrow conce horitability

Next we examined the genetic architecture of T1N by calculating the narrow sense heritability 17 explained by the typed variants. GCTA estimated the observed scale heritability to be h2_{SNP}[ci] 18 =0.403 [0.015] 30 and the population heritability to be h2_{SNP}[ci]= 0.231 [0.0088] assuming a 19 prevalence estimate of 0.03%^{1,2}. One third of observed heritability was mediated by genetic 20 variation within the extended MHC region and similar to other pediatric autoimmune diseases ³¹. 21 Narcolepsy shares variants with autoimmune diseases. We next examined genome-wide 22 shared genetic correlation with other traits excluding variants at the extended HLA locus. ³² Note 23 that we performed this analysis using samples of Whites as reflecting the genetic makeup of the 24 population for which public data is available. The strongest correlations were seen between T1N 25 and autoimmune diseases (Wilcox signed rank p-value = 0.031). Of all autoimmune traits 26

examined using LD Score Regression³³, the shared heritability was largest with type-1 diabetes (T1D) (r_0 =0.3261 (se=0.1015), p-value = 0.0013).

3

We next examined whether genome wide significant T1N associations are shared with other
autoimmune diseases, suggesting shared mechanisms at single loci. Significant associations in
T1N were compared with autoimmune disease associations using published studies and GWAS
central³⁷⁻³⁹. Most notably, co-localization of signals using coloc anaysis ⁴⁰ was found at *IL27*between T1N and both ankylosing spondylitis (posterior probability [pp] = 0.96) and Crohn's
disease (pp=0.93).

We also discovered strong overlap between T1N and T1D at CTSH pp=0.998 and SIRPG 11 pp=0.999, as well as evidence for partial sharing at IL27 pp=0.71, while signals were independent 12 for P2RY11 (pp=0.02). T1D is also the only autoimmune trait besides narcolepsy where any 13 association was seen near the TRA locus, although the T1D signal (rs7145202, beta = 0.1, p-14 value = $4*10^{-6}$)⁴¹ is independent from the narcolepsy signal (r²<0.5) and located ~100 kb 15 upstream of the TRA loci per se. While previous studies have shown either a small increase or no 16 increased risk for autoimmune diseases in T1N patients, ³⁴⁻³⁶ we found statistical evidence of 17 global genetic correlation between T1N and other autoimmune diseases and co-localization of 18 individual associations. 19

20

Genetics of vaccination-triggered narcolepsy. We have previously shown that both influenza 21 infections and, in rare cases, immunization with Pandemrix® can trigger narcolepsv^{13,18,19,42,43}. 22 The baseline for narcolepsy in unvaccinated vs. Pandemrix® vaccinated individuals was 23 0.7/100,000 vs. 9/100,000 person years with on average 10-fold increase in risk ^{13,18,19,42-44}. We 24 therefore recruited Pandemrix® vaccination-related narcolepsy cases in five countries and 25 examined the genetic load for narcolepsy (Table 2). All Pandemrix® vaccination cases were 26 carriers also for HLA-DQB1*06:02. Weighted genetic risk score (GRS) excluding HLA showed a 27 strong association in Pandemrix® vaccination related narcolepsy in each sub cohort (p<0.01 for 28

all cohorts) and with combined vaccination related narcolepsy sample (p-value = 7.96×10^{-10}).

² (Table 2, and Supplementary Table 8 and Supplementary Figs. 3-4).

3

Similarly to GRS evidenced shared signal, we found GWA significant signal with HLA-4 DQB1*06:02, TRA rs1154155 and a variant between SIRPB1-SIRPG locus (rs76958425, OR= 5 2.49 [1.82 - 3.41], p-value = 1.12*10-8, Table 2) not present in regular cases (rs76958425, p-6 value=0.15, beta = -0.0694, OR=0.93). The overall association of GRS and two shared loci 7 indicate that vaccination related narcolepsy is fundamentally the same disorder as idiopathic T1N. 8 9 Functional analyses highlight effects on immune cells. Analysis using GARFIELD⁴⁵ showed 10 the variants with p-value<0.00001 have a 5.9-fold enrichment for missense variants and 5.3 fold 11 enrichment for 5'UTRs (Fig.2, Supplementary Figs 5-7). Further, many associated variants in 12 Table 1 are in tight linkage with non-synonymous substitutions in the corresponding genes, such 13 as variants in CTSH (rs2289702 G11R), TRA (rs1483979, F8L), PRF1 (rs35947132, A91V), 14 SIRPG (rs6043409, V263A), CD207 (rs13383830, N288D and rs57302492, K313I, r2 =1) and 15 IL27 (rs181206 L119P) as well as variants marking different HLA-alleles. 16 17 We confirmed that variants within CTSH are also important in the predisposition of T1N. Among 18 immune cells, CTSH is only expressed in Class II positive antigen presenting cells (B cells, 19 dendritic cells and monocytes), and is known to process antigen for HLA presentation, thus 20 furthering a role for HLA-DQ presentation in T1N. Of note, we also observed a sub threshold 21 association with another cathepsin gene, CTSC (rs3888798, C allele frequency =0.06), OR = 22 1.276 [1.169-1.394] p-value = 5.8×10^{-8}), which was not associated with vaccination related 23 narcolepsy (rs3888798, OR=0.76, p-value= 0.336). 24

25

In *PRF1*, the leading variant rs35947132 causes an amino acid change A91V that acts as a
 hypomorph and disrupts cytotoxicity of the immunological HLA class I synapse^{46,47}. This
 relatively rare variant (allele frequency 0.03 in Whites) has been shown to prevent perforin, a

protein expressed only by natural killer (NK) and cytotoxic (CD8⁺) T cells, to form functional
 complexes, thus preventing cytotoxic cells from destroying target cells^{46,48}. These findings
 indicate direct involvement of cytotoxic T cells, most likely CD8⁺ T cells, in hypocretin cell
 destruction.

5

In addition, we discovered associations is in signal-regulatory protein gamma SIRPG (rs6110697, 6 V263A) a receptor-type transmembrane glycoprotein known to interact with CD47, an anti-7 autophagy signal for the immune system that has shown success in cancer immunotherapy⁵⁹. 8 9 Although V263 is conserved in all SIRP family members, it is also located within an alternate exon. Unlike other members of the SIRP family, SIRPG is almost exclusively expressed in CD4⁺ 10 and CD8⁺ T cells. Furthermore, the SNP is also a strong eQTL in thymus and whole blood⁶⁰. 11 Interestingly, vaccination-associated cases displayed an additional GWAS significant association 12 with rs76958425, a strong QTL for SIRPB1, another SIRP family member known to interact with 13 CD47. This association is not present in the overall narcolepsy sample (rs76958425, beta = -14 0.0694138,OR=0.93, p=0.15). SIRPB1 is mostly expressed in antigen presenting cells and has 15 been shown to modulate neuronal killing in Alzheimer's disease⁶¹, suggesting it could also be 16 important for hypocretin-cell survival, though it may play a role in the modulation of T cell 17 population survival. 18

19

One of the strongest novel factors associated with narcolepsy is rs2409487 in the IFNAR1 gene, 20 a gene mediating interferon α/β inhibition of virus replication type 1 interferon response 21 associated with T1N. We observed that this SNP is a strong eQTL for IFNAR1 expression in 22 various tissues in GTEx⁶⁸. In addition, a different lead variant (e.g. rs2284553) has been 23 associated with other autoimmune diseases. IFNAR1 controls dendritic cell responses to viral 24 infections, notably influenza A⁶⁹. We therefore examined IFNAR1 expression in DC following 25 H1N1 infection (PR8 delta NS1) finding that our predisposing SNP (rs2409487) is a major eQTL 26 for this effect (p-value = 1.92*10⁻²⁵, beta =0.140), and in perfect LD with the leading variant for the 27 signal (rs6517159, D'=1, r^2 =0.995, coloc pp = 0.964 **Supplementary Fig. 8**). The findings 28

suggest that rs2409487 in *INFAR1* mediates predisposition to T1N by modulating response to

2 Influenza-A infection.

3

Overlap of risk with cell-type specific chromatin regions. We examined whether associations 4 with narcolepsy were enriched genome-wide on specific enhancer elements using stratified LD 5 score regression on Epigenome Roadmap cell type specific annotations (n=216 cell types)⁷¹. 6 Partitioned heritability by functional categories enriched in the hematopoietic cell lines 7 (Supplementary Fig. 2b and 2c, Supplementary Fig 8.). Consistent with our model, association 8 9 was driven by CD4⁺ T cells, with leading effects in CD3+ primary H3K27ac, CD4+/CD25-/IL17-PMA&ionomycin stimulated primary H3K4me1, and CD4+/CD25- primary H3K4me1 (each 10 enriched over 35-fold in predicted heritability per SNP). Additional effects were seen in Th17 11 CD4⁺ T cells and CD8⁺ T cells, confirming the importance of these cell types in narcolepsy. 12 Importantly, no enrichment was seen in neuronal cell types. While immune cells have been 13 suggested to play a role in the predisposition to T1N⁷², these novel findings show that the effects 14 are specific to both helper and cytotoxic T cells, and that individual variants genome-wide are 15 substantially enriched in specific T cell lineages predisposing to T1N. 16

17

Risk variants in T cell receptor loci modulate \alpha\beta T cell receptor repertoire. T1N is the only 18 autoimmune disease with significant association in HLA and T cell receptor (TCR) loci (TRA and 19 TRB). TCR molecules are formed through VDJ somatic recombination at the genomic level, a 20 process that allows for substantial TCR sequence diversity. The recombinant T cell clones are 21 later subjected to negative and positive selection in the thymus in order to optimize pathogen 22 responses while avoiding auto-reactivity. As a consequence, most of TCR binding diversity is 23 ensured by selection in the context of specific HLA molecules. TCR α and β chains heterodimerize 24 to form biologically functional molecules that recognize peptides presented by the Major 25 histocompatibility complex (MHC) encoded by the highly variable classical HLA genes. On one 26 hand, T1N is associated with the DQB1*06:02 allele of the MHC class II β subunit and the highly 27 linked DQA1*01:02 allele of MHC class II α subunit. On the other hand, T1N is strongly 28

associated with TCR α and b chains. Notably, this association is also seen in cases with

vaccination-triggered narcolepsy (Table 2). This suggests that T1N is directly linked with

³ autoimmunity that is mediated by T-cell activation.

4

Clearly the strong association of T1N with the HLA locus will affect the presented epitope and the 5 TCR repertoire⁷³, however how does the association with TRA and TRB affect the TCR 6 repertoire? In the TRB region, association peaks over 32 SNPs (from hg19 chr7:142025523-7 142248636) over a 22kb segment. The association signal within TRA locus spans over several J 8 9 genes over 18 kb, with 5 SNPs (rs1154155, rs1483979, rs3764159, rs3764160) in perfect LD across ethnic groups. Among TRA SNPs, rs1483979, a SNP changing F8L in the peptide 10 recognizing groove of CDR3 region of TRA J24 is an obvious candidate defining two J24 alleles 11 we denote as J24*01 and J24*02 respectively. We next examined the effects of these SNPs on 12 T-cell receptor V or J gene chain usage using RNA sequencing in 895 individuals⁷³. Strikingly. 13 rs1154155 with TRA J28 expression in total RNA sequencing from blood (p-value=1.36*10⁻¹⁰, 14 beta = -0.212, Fig. 3) with the same lead variants that associated with narcolepsy and posterior 15 probability for shared variant was pp=0.958 suggesting that rs1154155 in T1N predisposition 16 mediates its action through effects on TRA J28 repertoire (See supplementary Table S5 for all 17 rs1154155 effects). J24 usage is also among the top associations for rs1154155 effects. 18 although in this case correlation is opposite and the associated SNP increases usage (p-19 value=0.0017, beta=0.104, pp=0.54). Associations with multiple target variants within the same 20 haplotype have been defined with complex traits with both regulatory and non-coding effects 21 before and are likely to have a role in T1N predisposition⁷⁴. 22

23

To further investigate the mechanism of the TRA variants specifically on CD4⁺ T cells, which are the most likely causal cell type because of their interactions with DQB1*0602, we performed T cell receptor sequencing of CD4⁺ memory T cells in 40 individuals with T1N and 61 DQ0602 matched controls (**Fig. 3**). Although we found no significantly over-represented T cell clones, we discovered a similar effect of rs1154155 on J28 usage in CD4+ in T1N and healthy controls (beta

1	= -0.32, p-value<0.001, Fig. 3). Furthermore, the effect was stronger in individuals with T1N that
2	had significantly lower expression level of TRA J28 than healthy controls (beta = - 0.20, p-value =
3	0.027). Similarly, the effect of rs1154155 on J24 usage was also similar population cohort (beta =
4	0.33, p-value<0.001). We also confirmed that these effects were <i>cis</i> mediated, and the ratio of
5	J24*01 (F) over J24:02(L) was only 0.4 in heterozygotes, indicating lower allele specific
6	expression with F-narcolepsy associated alleles, with similar effects in other T cell subpopulations
7	(Supplementary Fig. 10). The findings suggest that the predisposition to T1N is mediated either
8	by decreasing usage of TRA J28, or by increasing TCR recognition through J24*01, although in
9	this case the effect would be mitigated by decreased expression of this allele.
10	
11	Within the TRB region, rs1108955 was the leading variant for TRBV4-2, TRBV3-1 and TRBV2
12	expression (Supplementary Table 6). While it has been observed that individual variants can
13	affect multiple target genes ⁷⁵ , the strongest evidence was seen with TRBV4-2. The leading T1N
14	variant was in perfect LD with the lead variant for TRBV4-2 expression, and the association of
15	same variants for eQTLs in TRB expression for TRBV4-2, TRBV3-1 and TRBV2 pp>0.95 with
16	strongest evidence for TRBV4-2 usage pp=0.99 (Supplementary Fig. 11).
17	
18	We finally examined whether usage of specific TRAJ, TRAV, TRBJ or TRBV genes in $CD4^+T$
19	cells was associated with seasonal influenza vaccination (12 cases versus 5 cases) or with
20	narcolepsy case/control status (59 narcolepsy cases versus 47 DQ0602 controls). Unique T cell
21	receptor gene usage was not associated with influenza vaccination (Appendix 1, Table 1-16).
22	However, we did see a statistically significant difference between narcolepsy and controls with
23	TRBJ1-3*01 usage (p=0.0012, beta=0.00425). Similarly, although TRAJ28 was the second most
24	significantly associating clone between narcolepsy and control with both protective and
25	predisposing clones the association was not statistically significant (p<0.0001, corrected p=1,
26	Appendix 1. Table 23 and Table 24). These findings are in line with usage effects seen with
27	narcolepsy risk variants.

To summarize, the finding that specific TRA and TRB variants associate with narcolepsy suggests specificity for the autoimmune pathology through the T cell receptors. The colocalization of signal at the population sample with expression suggests a direct effect on the specific usage of TRAJ28 expression coding effect on TRAJ24 (F8L) variation as well as TRBV4-2 gene expression. This was also is seen specifically in T cell receptor sequencing in CD4+ T cells and is stronger in patients (p<0.05) suggesting for direct causal effect for disease pathophysiology through expression and autoantigen recognition.

Multi-loci association of narcolepsy within the HLA region. The strongest association in narcolepsy is within the HLA locus. Strikingly, T1N is one of the few diseases where nearly all affected individuals carry at least one copy of exactly the same HLA allele, DQB1*06:02^{5,6}. To fine map this association, we imputed HLA haplotypes using HIBAG ⁷⁶ and HLA IMP:02⁷⁷. We then performed ethnic specific HLA association and combined them using fixed effects metaanalysis. As expected^{5,6}, the strongest association was with the DQA1*01:02~DQB1*06:02 (DQ0602) haplotype.

16

To look for additional independent signal, we performed conditional analysis using stepwise 17 forward regression. We detected (1) a strong protective effect of DQA1*01:01 and DQA1*01:03 18 alleles (OR=0.30, p-value< 10^{-15} and OR =0.30, p-value< 10^{-20} , respectively) with combined 19 protective OR=0.41, p-value< 10^{-40} ; (2) predisposing effects for DQB1*03:01 and DQA1*01:02 20 across ethnic groups as shown before ^{5,6,78,79}(OR=1.36, p-value<5*10⁻⁸ and OR=1.68 p-21 value<5*10⁻⁸, respectively) (**Supplementary table 7**). The protective effects of DQA1*01:01 and 22 DQA1*01:03 have been suggested to be mediated via heterodimerization with DQB1*06:02, 23 indirectly reducing *cis* encoded DQA1*01:02/DQB1*06:02 (DQ0602) heterodimer availability^{5,79}. 24 25 Controlling for both DQB1 and DQA1 effects, a strong protective association was seen with 26

²⁷ DPB1*04:02 allele (p-value<10⁻²⁰) whereas smaller predisposing effect was found with

²⁸ *DPB1*05:01* allele, a mostly Asian subtype (p-value <10⁻³). Finally, after adjusting for the DQ and

- DP effects significant associations were seen at HLA class I with A*11:01, B*51:01, B*35:01 and
- ² *B*35:03* and with *A*03:01* (p-value <0.01, Supplementary table 7). These findings confirm and
- extend results of two previously publications^{6,81}, with effects of B*51:01 likely secondary to LD
- 4 with A*11:01 in whites.

1 Discussion

In this study, we explored genetic risk for narcolepsy and potential disease mechanisms of 2 identified genetic risk factors. The strongest associations were seen with the HLA region. In 3 addition, we confirmed six previously described risk loci (TRA, TRB, CTSH, IFNAR1, ZNF365 and 4 P2YR11) and discovered five novel associations in PRF1, CD207, SIRPG, IL27 and ZFAND2A. 5 Analysis of functional consequences of these loci in a multi-ethnic sample discovered remarkable 6 association with immune loci evidenced by individual associations and partitioned heritability 7 enrichment. A notable example is the effect of both missense and regulatory variants in the TRA 8 and TRB regions that had a substantial effect on the T cell receptor chain usage. All these 9 findings strongly suggest specific risk factors in genes controlling immune reactions. 10 11 Two loci in addition to the HLA region were implicated in vaccination-associated narcolepsy 12 (TRA, SIRPB1). Findings indicate that although genetic factors predisposing to regular and 13 vaccine-triggered narcolepsy are largely shared, there are slight differences. These findings may 14 reflect a primary role for genetic factors in immune response per se versus infection and immune 15 response in other cases. A detailed analysis of the loci where the leading variants for T1N are 16 located suggests both antigen presentation and recognition. Indeed, the majority of variants have 17 effects in antigen presenting cells (HLA, CTSH), e.g. dendritic cells (IFNAR1, CD207), T cells 18 (TRA, TRB, P2YR11, SIRPG), e.g. T helper cells (HLA-DQ, HLA-DP, IL27), and cytotoxic T cells 19 (HLA-A, PRF1), sketching a remarkably narrow disease pathway (Fig. 4). Accordingly, a direct 20 effect of TRA and TRB associations with T cell receptor expression was seen; TRA lead variant 21 22 was an eQTL for TRAJ28 and TRAJ24 expression whereas strongest eQTL effect for TRB lead variant was seen with TRBV4-2. The effect was accentuated in T1N cases, suggesting for the 23 first time that specific T cell receptor chains such as TRAJ24, TRAJ28 and TRBV4-2 are strong 24 risk factors for narcolepsy and potentially causal factors recognizing and binding the autoantigen. 25 This association is unique to T1N and has not to our knowledge been seen with other 26 autoimmune diseases. 27

In addition, a strong functional connection with Influenza A infection in dendritic cells was found at 1 IFNAR1, furthering the role of this virus as a common trigger for the disease. We also discovered 2 associations with ZNF365 and ZFAND2A, ubiguitously expressed transcription factors with, in the 3 case of ZNF365, strong known associations with other autoimmune diseases^{82,83}. The 4 ZFAND2A association (also called Arsenite-inducible RNA-associated protein AIRAP) is unique 5 to narcolepsy, and was opposite in post vaccination cases, an effect that could suggest 6 differential effects on influenza infection and immune response modulation. The ZFAND2A 7 associated SNP, is in perfect linkage disequilibrium ($r^2=1$) with a very large number of SNPs over 8 9 a 250 kb region that encompasses and regulates many genes. Of possible interest in this region is GPR146, a gene highly enriched in unstimulated macrophages and dendritic cells, whose 10 reduced expression is associated with the INF_Y response and suppresses HCMV replication in 11 infected dendritic cells⁸⁴. We were able to examine for the effects of these variants in post 12 Pandemrix® cases. TRA association was particularly strong, suggesting involvement of T cell 13 receptor oligoclonallity in autoantigen recognition. 14

15

Based on these observations, we propose that narcolepsy is the result of an autoimmune process 16 triggered primarily by influenza-A on an HLA-DQA1*01:02~DQB1*06:02 (DQ0602) background. 17 The involvement of influenza-A is likely to explain why the genetic associations we found are 18 universal. Indeed, influenza is one of few viruses that act worldwide on a seasonal basis. The 19 universal association is especially clear for DQ0602 as it is found with different HLA-DRB1 20 alleles, DRB1*15:01 in White (Europe and USA) and Asians (China, Korea, Japan and India), but 21 DRB1*15:03 or DRB1*11:01 in Blacks (confusion of ancestral continent of origin and sample 22 location?) ^{5.6}. The primacy of DQ0602 over DRB1*15:01 is also demonstrated by the fact 23 DRB1*15:01~ DQA1*01:03~DQB1*06:01 haplotype is not associated with narcolepsy in China 24 and by the fact additional DQ effects are mostly mediated by DQA1 alleles that interact in trans 25 with DQB1*06:02. In contrast to narcolepsy, other autoimmune diseases commonly have 26 different HLA associations or disease presentations across countries, and resulting HLA 27 associations are more complex. Type 1 diabetes, for example, is well known to be primarily 28

associated with HLA-DQ in Whites whereas DRB1*04:05 specific effects are evident in Japan
 where the disease is rare^{83,85,86 77}.

3

Other autoimmune diseases, unlike narcolepsy, are also associated with a plethora of 4 autoantibodies and known autoantigen targets. For example Insulin, GAD, IA-2 and ZNT8 are 5 involved in T1D and β -cell antigen targeting, suggest that these other diseases involve multiple B 6 and T cell mechanisms and antigens, likely explaining the weaker and more complex HLA effects 7 and a lack of association with any specific TCR polymorphisms. It is our hypothesis that the 8 strong effects of TCR polymorphisms in narcolepsy likely represent the fact autoimmunity in this 9 disease is oligoclonal and limited to one or a few hypocretin cell antigen epitopes. These epitopes 10 may bind DQ0602 specifically and involve a few $\alpha\beta$ TCR receptors containing TRAJ24, TRAJ28 or 11 TRBV4-2 (Fig 4). Other groups have suggested involvement of TRIB2, prostaglandins and 12 HCRTR2⁸⁷⁻⁹¹. However, these associations have not been universal. Systematic studies of T-cell 13 reactivity with TCR identification in the context of DQ0602 and flu or autoantigen epitopes are 14 ongoing in various laboratories to address this issue. 15

16

In this study, perforin, a gene of critical importance to NK and CD8⁺ T cell cytotoxicity was 17 strongly protective of narcolepsy, whether or not it was triggered by vaccination. In the context of 18 compound null heterozygotes of the perforin gene, A91V has been is associated with late onset 19 hemophagocytic lymphohistiocytosis (HLH) type 2⁴⁹, a recessive disorder associated *PRF1* null 20 alleles. HLH type 2 is characterized by excessive T cell activation that may involve abnormal 21 reactivity to viral pathogens ⁵⁰or decreased CD8+ T cytotoxic pruning of dendritic cells⁵¹. 22 Interestingly, Prf1 knock-out mice do not develop the syndrome unless infected with viruses such 23 as murine lymphocytic chorio-meningitis virus or murine cytomegalovirus, a phenomenon 24 involving CD8⁺ T cells and increased IFN γ^{50} . Other perforin-damaging mutations have also been 25 anecdotally associated with susceptibility to multiple sclerosis⁵² and T1D⁵³. Importantly, the allele 26 associated with narcolepsy impairs cytotoxicity and cell killing, suggesting that the effect of the 27 variant on cytotoxicity may be targeting hypocretin cells directly. 28

1

Although it is conceivable NK cells could be involved, the most likely explanation is involvement 2 of CD8⁺ T cell in hypocretin cell killing in collaboration with CD4⁺ T cells or microglia. This was 3 also supported by CTSC association, an enzyme of critical importance to cytotoxic CD8⁺ 4 activation of pro-granzymes⁵⁸. Bernard-Valnet et al.⁹² used transgenic mice with expression of a 5 neoantigen in hypocretin neurons, and found that infusion of CD8⁺ T cell targeting the neoantigen 6 were able to cause hypocretin cell destruction while infusion of neoantigen-specific CD4⁺ T cell 7 alone was insufficient, although CD4⁺T cells migrated closely to the target neurons. These earlier</sup>8 9 experiments together with genetic association with PRF1 variants suggest a direct role of CD8+T cells in hypocretin cell destruction. CD8+ mediation of cell killing has also been suggested by 10 observation of a CD8 T cell infiltrate in a paraneoplastic anti-Ma2 encephalitis case with 11 symptomatic hypocretin cell destruction ⁹³. 12 13 In summary, although the culprit autoantigen has not been identified, genetic data indicate 14

autoimmunity in T1N with strongest genetic overlap with T1D, another organ-specific autoimmune 15 disease suggesting shared pathophysiology. A particularity of the disease is involvement of 16 polymorphisms such as in IFNAR1 that regulate response to influenza-A infection, a result that 17 complement epidemiological studies indicating seasonality of disease onset⁴² and increased 18 incidence that has occurred following vaccination with Pandemrix® in Europe ^{13,18,19}. Other 19 genetic factors implicate dendritic processing of antigens, presentation by DQ0602 to CD4⁺T 20 cells and subsequent cell killing of hypocretin neurons by CD8⁺ cells, with likely involvement of 21 only a few autoantigen epitopes and a restricted number of T-cell receptors. The lack of 22 detectable autoantibodies has made objective demonstration of autoimmunity challenging, but will 23 likely made the eventual discovery of the culprit T cell antigen even more informative to our 24 understanding of T cell immunity in the brain. 25

1 Methods

2	Study subjects: 5,339 unrelated individuals with type 1 narcolepsy ^{8,9} , and 20,518 ethnicity-
3	matched controls were included in the study. In addition, 245 individuals with vaccination related
4	narcolepsy and 18862 controls were recruited in Finland (N=76 cases and 2796 controls),
5	Sweden (N=39 and 4894 controls), Norway (N=82 cases and 429 controls), and United Kingdom
6	and Ireland (N=48 cases and 10743 controls) ^{13,16,94,95} . All cases had documented immunization
7	with Pandemrix®. All cases had narcolepsy with clear-cut cataplexy and were DQB1*06:02
8	positive, or had narcolepsy with documented low hypocretin-1 in the cerebrospinal fluid. Informed
9	consent in accordance with governing institutions was obtained from all subjects. The research
10	protocol was approved by IRB Panels on Medical Human Subjects at Stanford University, and by
11	respective IRB panels in each country providing samples for the study.
12	
13	Genotyping: Subjects were genotyped using Affymetrix Affy 5.0, Affy 6.0 ⁸ , Affymetrix Axiom
14	CHB1 ⁹ , Affymetrix Axiom EUR, Axiom EAS, Axiom LAT, Axiom AFR, Axiom PMRA and Human
15	Core Exome chip platforms. Genotypes were called with Affypipe ⁹⁶ , Affymetrix genotyping
16	console or Genome Studio. Markers with genotyping quality (call rate < 0.95) or deviation from
17	Hardy-Weinberg equilibrium (p-value<10 ⁻⁶) were discarded from further analysis. Samples were
18	checked for relatedness with filtering based on proportion of identity-by-descent using cut off >0.2
19	in PLINK 1.9 PI_HAT score ⁸⁸ . One pair of related individuals was removed. If related individuals
20	were a case and a control, cases were retained in the analysis. Three first principal components
21	within each cohort were visualized and outliers were removed. Supplementary Table 1 shows
22	for each cohort N QCed original genotypes, N for those passing the QC and N for individuals
23	removed during QC.
24	
25	Imputation: We imputed samples by prephasing cases and controls together using SHAPEIT

v2.2⁸⁹ and imputed with IMPUTE2 v2.3.2 ^{97,98} and 1000 genomes phase 1v3 build37 (hg19) in
 5Mb chunks across autosomes. For variants having both imputed and genotyped values, the

genotyped values were kept except for those individuals where the genotype was missing. In this
 case imputed values were kept.

3

Analysis: Analyses for all data sets were performed at Stanford University except for the Finnish 4 and Swedish vaccination related cases and European Narcolepsy Network samples, which were 5 analyzed by respective study teams using exactly the same analysis. Genome-wide association 6 analysis was first performed in each case control group separately using SNPTEST v.2.5.299 . We 7 used linear regression implemented in SNPTEST method score adjusting for ten first principal 8 9 components in order to adjust for cohort specific population stratification. Standard post imputation guality control was done: Variants with info score <0.7 and minor allele frequency 10 (MAF) <0.01 were removed from the analysis. Signals specific for one genotyping platform only 11 and variants in each locus with heterogeneity p-value<10⁻²⁰ were removed. We used fixed effects 12 model implemented in METAv1.7 with inverse-variance method based on a fixed-effects model 13 for combining the association results¹⁰⁰. In total 12,600,187 markers across the studies were 14 included in the final case control meta-analysis. Significance level for statistically significant 15 association was set to genome-wide significance (p-value<5*10⁻⁸) controlling for multiple testing. 16 Overall test statistics showed no genomic inflation. GCTA was used for heritability and gene 17 based tests ¹⁰¹. Coloc analysis was done using coloc package in R version 3.4.2 (2017-09-28)⁴⁰. 18 Manhattan and QQ-plots were created with QQman or FUMA 97. Shared heritability was 19 estimated using LD score regression³². 20

21

Typing and imputation of HLA variants: High resolution HLA imputation in 4-digit resolution (2 field, amino acid level) for HLA *A*, *B*, *C*, *DRB1*, *DQA1*, *DQB1*, *DPA1* and *DPB1* was performed
 using HLA*IMP:02 as implemented in Affymetrix HLA or the HIBAG package in R version 3.1.2
 (2014-10-31). HIBAG is an HLA imputation tool that uses attribute bootstrap aggregation of
 several classifiers (SNPs) to select groups of SNPs that predict HLA type and allows the use of
 own HLA reference panels⁷⁶. Reference HLA types were used from published imputation models
 and for Asian and Blacks obtained with Sirona sequencing ¹⁰²in ethnic specific populations

N=500 Blacks, N=2,000 Whites and N=368 Asians. Imputation accuracy was further verified by
 Luminex HLA typing in a subset of samples and accuracy was over 95% for all ethnic groups and
 common alleles with > 5% frequency in population. For all alleles the accuracies were for Whites:
 0.98 in HLA-A, 0.97 in HLA-B, 0.98 in HLA-C, 0.96 in HLA-DRB1, 1.00 in HLA-DQA1, 1.00 in
 HLA-DQB1, 1.00 in HLA-DPA1, and 0.92 in HLA-DPB1 and for Asian for alleles where typing was
 also available 0.95 for HLA-DRB1, 0.94 for HLA-DQA1, and 0.98 for HLA-DQB1.

Analysis of HLA variants: HLA effects in narcolepsy were analyzed as described before⁶. We 8 9 examined altogether variation from 23,410 individuals with 9,789 Asians, 13,621 Whites. In each ethnicity HLA alleles were analyzed using additive model under logistic regression adjusting for 10 10 first population specific principal components to adjust for local population stratification. We 11 identify independent associations using conditional analysis (stepwise forward regression in each 12 cohort). Fixed effects meta-analysis was used to combine associations using Plink 1.9¹⁰³ and R 13 version 3.2.2. We considered alleles sustaining Bonferroni correction for correction of number of 14 alleles with minor allele frequency over 2% (N=110 HLA alleles) significant resulting in Bonferroni 15 cut-off p=0.00045. 16

17

Analysis of expression quantitative trait loci (eQTL): We used tissue specific summary statistics 18 from the GTEx consortium and from Westra et al. to examine total blood specific effects of 19 associating variants on gene expression^{75,104}. Furthermore, we examined how the genetic 20 variants modulated T cell and antigen presenting (dendritic cell and monocyte) gene expression 21 by RNA sequencing and RNA expression. To examine environment specific triggers for eQTLs 22 we challenged the dendritic cells on influenza-A infection, or stimulated them with interferon or 23 LPS^{105,106}. Finally, we identify short range (cis) SNPs and trans HLA alleles association with TCR 24 V and J usage estimated from total peripheral blood RNA sequencing as described before⁷³. 25 26

T cell receptor RNA sequencing in matched narcolepsy case control data set and in population
 <u>cohorts:</u> We performed RNA sequencing in 895 individuals with total blood RNA sequencing and

in T cells from 60 individuals with narcolepsy and 60 healthy individuals from using total CD4+ T 1 cells, CD4+ T memory and CD8+ T cell populations. We used fastqc to infer quality and trimmed 2 low guality reads. We then performed barcode demultiplexing, after which local blast was used to 3 align and extract CDR3s. Linear regression was fit for TRA usage ~ Genotype adjusting for age 4 and gender, RNA sequencing lane and case/control status as covariates. We also analyzed 5 separately coding consequences for each TRAJ24 containing productive CDR3 fragment as one 6 of the most significantly associating SNPs was a coding SNP (rs1483979) was changing an 7 amino acid Leucine to Phenylalanine. These 'LQF' and 'FQF' were extracted and their 8 9 frequencies were computed. Ratio of FQF/(LQF+FQF) was further computed across all the samples. 10

11

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Closest Gene	chr	rsid	pos	non-coded allele	coded allele	p-value	coded af	OR [CI lower - upper]	beta	se
CD207 (Langerin)	2	rs13383830	71058306	т	С	2.65E-09	0.078	1.285 [1.184-1.396]	0.251	0.042
ZFAND2	7	rs75674288	1195322	А	С	4.05E-08	0.913	0.778 [0.711-0.851]	-0.251	0.046
TRB	7	rs1008599	142038782	А	G	6.63E-12	0.332	0.813 [0.767-0.862]	-0.207	0.03
ZNF365	10	rs4237304	64407845	С	Т	8.40E-10	0.824	1.233 [1.154-1.319]	0.21	0.034
PRF1	10	rs35947132	72360387	G	А	1.40E-09	0.04	0.570 [0.475-0.684]	-0.562	0.093
TRA	14	rs1154155	23002684	Т	G	1.48E-73	0.255	1.643 [1.559-1.733]	0.497	0.027
CTSH	15	rs34593439	79234957	G	А	1.44E-08	0.09	1.246 [1.154-1.345]	0.22	0.039
IL27	16	rs200840505	28539396	GTGTGTA	G	4.70E-08	0.281	0.849 [0.801-0.901]	-0.163	0.03
P2YR11	19	rs34849604	10229098	Т	TG	4.26E-09	0.537	1.232 [1.148-1.323]	0.209	0.036
SIRPG	20	rs6110697	1615661	Т	С	1.83E-10	0.74	1.206 [1.138-1.28]	0.188	0.03
IFNAR1	21	rs2409487	34684958	С	Т	1.23E-15	0.754	1.214 [1.158-1.273]	0.194	0.024

1	Table 1	Genome-wide significant associat	ions observed in T1	N across ethnic groups
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2

Leading SNP of loci associated with T1N at a genome wide significant level (p-value< 5x10-8). Heterogeneity p-value is calculated between

the nine cohorts in this study. Altogether 228 variants were significantly associated with T1N. Associations tested using SNPtest, and

⁵ META with fixed effects test statistics are shown^{99,107}. Positions are shown for genome build human genome build 37 (GRCh37/hg19).

Closest Gene	chr	rsid	pos	non-coded allele	coded allele	p-value	OR	beta	se	p-value heterogeneity
CD207										
(Langerin)	2	rs13383830	71058306	т	с	0.757	1.106 [0.584 - 2.097]	0.101	0.326	0.421
ZFAND2	7	rs75674288	1195322	А	с	4.92E-04	3.189 [1.66- 6.122]	1.160	0.333	0.673
TRB	7	rs1008599	142038782	А	G	0.099	0.798 [0.61 - 1.043]	-0.226	0.137	0.822
ZNF365	10	rs4237304	64407845	с	т	0.410	1.116 [0.85 - 1.450]	0.110	0.133	0.948
PRF1	10	rs35947132	72360387	G	А	4.48E-04	0 [0 - inf]	-10.879	50.123	1*
TRA	14	rs1154155	23002684	т	G	1.58E-13	2.531 [1.978 - 3.239]	0.929	0.126	0.365
CTSH	15	rs34593439	79234957	G	А	0.074	1.418 [0.967 - 2.079]	0.349	0.195	0.614
IL27	16	rs200840505	28539396	GTGTGTA	G	0.318	0.834 [0.583 - 1.191]	-0.182	0.182	1**
P2YR11	19	rs34849604	10229098	т	TG	0 024	1.515	0 415	0 184	1**
SIRPG	20	rs6110697	1615661	т	c	0.050	1.336 [1.00-	0.290	0.148	0.737
IFNAR1	21	rs2409487	34684958	С	т	0 720	1.077	0.074	0.206	0 964
SIRPB1- SIRPG	20	rs76958425	1602668	C	т	1.12E-08	2.491 [1.821 - 3.408]	0.913	0.16	0.078

Table 2 | Locus specific (from Table 1) and Genome-Wide significant associations observed in vaccination-triggered T1N cases.

2

Association with vaccination related narcolepsy is shown for loci having genome wide significant association with T1N or those loci being

genome-wide significant with vaccination related narcolepsy. Associations tested using SNPtest or Chisq test (Irish) with meta-analysis

⁵ using META with fixed effects test statistics are shown^{99,107}. Positions are shown for genome build human genome build 37

- 1 (GRCh37/hg19). * SNP imputed in Finnish cohort only ** SNP imputed in Norwegian cohort only. For cohort specific association see
- ² Supplementary Table 8.



2

Fig. 1. Multi ethnic genetic analysis of type 1 narcolepsy. Multi-ethnic analysis conducted in 5,339 cases and 20,518 controls reveals
 genome-wide significant associations in 11 loci plus HLA. The x-axis shows genomic location by chromosome and the y-axis shows -log₁₀
 p-values. Red horizontal line indicates genome-wide significant p-value threshold of 5*10⁻⁸. P-values smaller than 10⁻⁷⁵ were set to 10⁻⁷⁵

⁶ (HLA locus has many SNPs with p-value<10⁻²¹⁶).



1 Fig. 2 Narcolepsy risk variants are enriched in immune cells and for missense variants.

- a) GARFIELD analysis of narcolepsy associated variants shows a 6 fold enrichment for exon variants and a 5.2 fold enrichment in 5'UTRs located
- variants. b) overall enrichment in DNA hypersensitivity regions is seen specifically in circulating hematopoietic (blood) cells c) Epigenome
- roadmap data shows that the majority of narcolepsy heritability is enriched in hematopoietic cell lineages, with changes most pronounced in
- ⁵ immune cells notably T helper and cytotoxic cells. Statistically significant enrichment is marked with a line corresponding to an Benjamin
- ⁶ Hochberg enrichment p-value = 0.001.



³ Fig. 3. TRA lead variant rs1154155 is associated with repertoire usage of TRAJ24 and

4 **TRAJ28 genes.** (a) T1N association with TRA. T1N association with T cell receptor alpha chain

⁵ locus spans a region that contains 5 SNPs with almost perfect LD (rs1154155, rs1483979,

6 rs3764159, rs3764160) and high LD over 18kb. (b) Usage of TRAJ28*01 in 895 individuals

- shows similar association with T1N lead variant rs1154155 with posterior probability of 0.958
- 8 between narcolepsy and TRAJ28 usage. T cell receptor sequencing in CD4+ T memory cells in
- ⁹ 60 type-1 narcolepsy patients and matched controls confirmed the effect of rs1154155 on usage

1 of both (c) $[RA]24^{\circ}U]$ and (d) $[RA]28^{\circ}U]$ with higher effect seen in the type-1 narcoleps		(1 (1 () TD))		TD 4 100%01	.1 1 . 1		1
	1	of both (c) I RA	AJ24*01 and (d) I KAJ28*01	with higher effe	ect seen in the type-I	narcolepsy

- 2 cases.

- 5 \



Fig. 4. Postulated disease mechanisms in autoimmune narcolepsy. 1) Peripheral response: 1 Influenza virions or vaccine protein debris are ingested by DCs facilitated by CD207; flu proteins 2 are processed by cathepsins CTSH and CTSC for presentation by HLA molecules to specific 3 TCR α/β bearing CD4+cells, initiating an immunological synapse and responses to influenza. 4 Presentation by DC is modulated by IFNAR1 in the context of influenza infection. Cross 5 presentation of influenza antigens processed via the MHC class I pathway in DCs is necessary 6 activate CD8+ cells that mature into cytotoxic lymphocytes (CTLs), initiating cell killing of viron 7 infected cells. Activated CD4+ cells produce cytokines such as IFNy, IL-2 and IL27 which 8 augment cytotoxic activity of CTLs via perforin (PRF1). On the other hand, activated CD4+ cells 9 interact with B-cells via the MHC class II pathway and initiate influenza-specific antibody 10 production, class switching and somatic hypermutation. SIRPG and P2RY11 on activated T cells 11 may also promote cell-cell adhesion and proliferation in this response. 2) CNS Autoimmunity: 12 Activated and primed specific CD4+ cells migrate to the CNS where they interact with microglia 13 and resident DCs via DQ0602 bound to an influenza-mimic autoimmune-epitope (derived from 14 hypocretin cells) initiating a secondary memory response. Hypocretin cell proteins are processed 15 by cathepsins CTSH and CTSC for presentation by DQ0602 to specific TCR α/β bearing 16 CD4+cells, initiating an immunological synapse and autoimmune responses. Chain usage for 17 TRAJ24-2, TRAJ28, and TRBV4-2 is associated with narcolepsy risk and may be crucial for 18 autoantigen recognition. Further, cross presentation by resident DCs and microglial cells activate 19 specific CD8+cells via MHC class I binding of another hert neuron-derived peptides. These 20 primed cytotoxic CD8+ then kill hert neurons after recognizing MHC class I (such as A*11:01, 21 associated with narcolepsy independently of DQ0602) bound cognate hert neuron derived peptide 22 on hert neurons. SIRPB1 on DC or microglia and SIRPG plus P2RY11 on activated T cells may 23 also promote cell-cell adhesion and proliferation in this response. The role of ZFN365 and 24 ZFAND2A is unknown. 25

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