Genome-wide association studies of autoimmune vitiligo identify 23 new risk loci and highlight key pathways and regulatory variants

3

Ying Jin^{1,2}, Genevieve Andersen¹, Daniel Yorgov³, Tracey M Ferrara¹, Songtao Ben¹, Kelly M 4 Brownson¹, Paulene J Holland¹, Stanca A Birlea^{1,4}, Janet Siebert⁵, Anke Hartmann⁶, Anne Lienert⁶, Nanja 5 van Geel⁷, Jo Lambert⁷, Rosalie M Luiten⁸, Albert Wolkerstorfer⁸, JP Wietze van der Veen^{8,9}, Dorothy C 6 Bennett¹⁰, Alain Taïeb¹¹, Khaled Ezzedine¹¹, E Helen Kemp¹², David J Gawkrodger¹², Anthony P 7 Weetman¹², Suley Kõks¹³, Ele Prans¹³, Külli Kingo¹⁴, Maire Karelson¹⁴, Margaret R Wallace¹⁵, Wayne T 8 McCormack¹⁶, Andreas Overbeck¹⁷, Silvia Moretti¹⁸, Roberta Colucci¹⁸, Mauro Picardo¹⁹, Nanette B 9 Silverberg^{20,21}, Mats Olsson²², Yan Valle²³, Igor Korobko^{23,24}, Markus Böhm²⁵, Henry W. Lim²⁶, Iltefat 10 Hamzavi²⁶, Li Zhou²⁶, Qing-Sheng Mi²⁶, Pamela R. Fain^{1,2}, Stephanie A Santorico^{1,3,27}, & Richard A 11 Spritz^{1,2} 12

13

¹Human Medical Genetics and Genomics Program and ²Department of Pediatrics, University of 14 Colorado School of Medicine, Aurora, Colorado, USA. ³Department of Mathematical and 15 Statistical Sciences, University of Colorado Denver, Denver, Colorado, USA. ⁴Department of 16 Dermatology, University of Colorado School of Medicine, Aurora, Colorado, USA. 17 ⁵CytoAnalytics, Denver, Colorado, USA. Department of Dermatology, ⁶University Hospital 18 Erlangen, Erlangen, Germany. ⁷Department of Dermatology, Ghent University Hospital, Ghent, 19 Belgium. ⁸Netherlands Institute for Pigment Disorders, Department of Dermatology, Academic 20 Medical Centre University of Amsterdam, Amsterdam, The Netherlands. ⁹Department of 21 22 Dermatology, Medical Centre Haaglanden, The Hague, The Netherlands. ¹⁰Molecular & Clinical Sciences Research Institute, St. George's, University of London, London, UK. ¹¹Centre de 23 Référence des maladies rares de la peau, Department of Dermatology, Hôpital St.-André, 24 Bordeaux, France. ¹²Department of Oncology and Metabolism, University of Sheffield, 25

26	Sheffield, UK. ¹³ Department of Pathophysiology and ¹⁴ Department of Dermatology, University of
27	Tartu, Tartu, Estonia. ¹⁵ Department of Molecular Genetics & Microbiology, and ¹⁶ Department of
28	Pathology, Immunology, and Laboratory Medicine, University of Florida College of Medicine,
29	Gainesville, Florida, USA. ¹⁷ Lumiderm, Madrid, Spain. ¹⁸ Section of Dermatology, Department of
30	Surgery and Translational Medicine, University of Florence, Italy. ¹⁹ Laboratorio Fisiopatologia
31	Cutanea, Istituto Dermatologico San Gallicano, Rome, Italy. ²⁰ Department of Dermatology,
32	Columbia University College of Physicians and Surgeons, New York, New York, USA and
33	²¹ Pediatric and Adolescent Dermatology, St. Luke's-Roosevelt Hospital Center, New York, New
34	York, USA. ²² International Vitiligo Center, Uppsala, Sweden. ²³ Vitiligo Research Foundation,
35	New York, New York, USA. ²⁴ Institute of Gene Biology, Russian Academy of Sciences,
36	Moscow, Russia. ²⁵ Department of Dermatology, University of Münster, Münster, Germany.
37	²⁶ Department of Dermatology, Henry Ford Hospital, Detroit, Michigan, USA. ²⁷ Department of
38	Biostatistics and Informatics, Colorado School of Public Health, University of Colorado, Aurora,
39	Colorado, USA.
40	
41	Correspondence should be addressed to R.A.S. (richard.spritz@ucdenver.edu).

Vitiligo is an autoimmune disease in which depigmented skin results from destruction of 45 melanocytes¹, with epidemiologic association with other autoimmune diseases². In 46 previous linkage and genome-wide association studies (GWAS1, GWAS2), we identified 47 27 vitiligo susceptibility loci in patients of European (EUR) ancestry. We carried out a 48 49 third GWAS (GWAS3) in EUR subjects, with augmented GWAS1 and GWAS2 controls, genome-wide imputation, and meta-analysis of all three GWAS, followed by an 50 51 independent replication. The combined analyses, with 4,680 cases and 39,586 controls, identified 23 new loci and 7 suggestive loci, most encoding immune and apoptotic 52 regulators, some also associated with other autoimmune diseases, as well as several 53 melanocyte regulators. Bioinformatic analyses indicate a predominance of causal 54 regulatory variation, some corresponding to eQTL at these loci. Together, the identified 55 56 genes provide a framework for vitiligo genetic architecture and pathobiology, highlight 57 relationships to other autoimmune diseases and melanoma, and offer potential targets for treatment. 58

59

In previous genome-wide linkage and association studies, we identified 27 vitiligo susceptibility loci³⁻⁶ in 60 61 EUR subjects, principally encoding immunoregulatory proteins, many of which are associated with other autoimmune diseases⁷. Several other vitiligo-associated genes encode melanocyte components that 62 regulate normal pigmentary variation⁸ and in some cases are major vitiligo autoimmune antigens, with an 63 inverse association of variation at these loci with vitiligo *versus* malignant melanoma^{4,6}. To detect 64 additional vitiligo-associations with lower odds ratios (ORs), as well as uncommon risk alleles with 65 higher ORs, we conducted a third GWAS (GWAS3) of EUR subjects. We augmented the number of 66 population controls in our previous GWAS1 and GWAS2 and performed genome-wide imputation of all 67 68 three EUR vitiligo GWAS. After quality control procedures, the augmented studies included 1,381 cases 69 and 14,518 controls (GWAS1), 413 cases and 5,209 controls (GWAS2), and 1,059 cases and 17,678 controls (GWAS3), with genomic inflation factors 1.068, 1.059, and 1.013, respectively. We performed a 70

71	fixed-effects meta-analysis of the three GWAS datasets for 8,966,411 markers (GWAS123; Online
72	Methods). Replication used an additional 1,827 EUR vitiligo cases and 2,181 controls.
73	Results for the three individual GWAS, the meta-analysis, and the replication study are presented
74	in Table 1, Supplementary Table 1, and Fig. 1. Twenty-three new loci achieved genome-wide
75	significance ($P < 5 \ge 10^{-8}$) for association with vitiligo and demonstrated subsequent replication; of these,
76	21 are completely novel (FASLG, PTPRC, PPP4R3B, BCL2L11, FARP2-STK25, UBE2E2, FBXO45-
77	NRROS, PPP3CA, IRF4, SERPINB9, CPVL, NEK6, ARID5B, a multigenic segment that includes BAD,
78	TNFSF11, KAT2A-HSPB9-RAB5C, TNFRSF11A, SCAF1-IRF3-BCL2L12, a multigenic segment that
79	includes ASIP, PTPN1, and IL1RAPL1), while two, CTLA4 and TICAM1, were suggestive in our previous
80	studies. One previously significant locus, CLNK, was no longer significant (Supplementary Table 1).
81	Another potential new locus, PVT1, exceeded genome-wide significance in the discovery meta-analysis
82	$(P = 7.74 \times 10^{-9})$, but could not be successfully genotyped in the replication study and so remains
83	uncertain. Two other loci, FLI1 and LOC101060498, exceeded genome-wide significance in the
84	discovery meta-analysis ($P = 3.76 \times 10^{-8}$ and $P = 3.60 \times 10^{-11}$, respectively), but did not demonstrate
85	replication. Seven additional novel loci achieved suggestive significance ($P < 10^{-5}$) in the discovery meta-
86	analysis (STAT4, PPARGC1B, c7orf72, PARP12, FADS2, CBFA2T3, and a chr17 locus in the vicinity of
87	AFMID) and gave evidence of replication, but failed to achieve genome-wide significance
88	(Supplementary Table 1).
89	Together, the most significantly associated variants at the 48 loci (Table 1) identified by meta-
90	analyses of the three GWAS account for 17.4% of vitiligo heritability ($h^2 \sim 0.75$). To assess whether
91	additional independent variants at these loci might account for additional vitiligo heritability, we

92 performed logistic regression conditional on the most significant SNP at each locus. Eight loci (FARP2-

93 STK25, IFIH1, IL2RA, LPP, MC1R, SLA/TG, TYR, UBASH3A) and the MHC showed evidence of

94 additional independent associations, accounting for an additional 5.1% of vitiligo heritability, for a total

- 95 of 22.5%. In general, the ORs for the 23 new confirmed loci were lower than those for loci detected
- 96 previously⁶, 1.15 to 1.27, excepting *CPVL* (OR = 1.84), *RALY-EIF252-ASIP-AHCY-ITCH* (OR = 1.64),

and *IL1RAPL1* (OR = 1.77); for these three signals the associated alleles are uncommon (minor allele
frequencies 0.03, 0.07, and 0.01, respectively) and thus were not detected in the previous GWAS due to
power limitations.

100 To screen for functional relationships among proteins encoded at the 48 confirmed vitiligo-101 associated loci, we included all genes under the association peaks at these loci in unsupervised pathway analyses using g:PROFILER⁹, PANTHER¹⁰, and STRING¹¹. PANTHER and gPROFILER identified an 102 103 enriched network of BioGRID interactions, most significant for the GO categories immune response, 104 immune system process, positive regulation of response to stimulus, positive regulation of biological process, and regulation of response to stimulus. STRING identified a large potential interaction network 105 106 (Fig. 2), with a predominance of proteins involved in immunoregulation, T-cell receptor repertoire, apoptosis, antigen processing and presentation, and melanocyte function. 107 108 Considering proteins encoded at the 23 newly confirmed vitiligo candidate loci, at least twelve (CTLA4, TICAM1, PTPRC, FARP2, UBE2E2, NRROS, CPVL, ARID5B, PTPN1, TNFSF11, 109 110 TNFRSF11A, IRF3, and perhaps also IL1RAPL1) play roles in immune regulation, and PPP3CA may regulate FOXP3 via NFATC2 and is associated with canine lupus¹². Six (FASLG, BCL2L11, BCL2L12, 111 112 SERPINB9, NEK6, BAD) are regulators of apoptosis, particularly involving immune cells. ASIP is a regulator of melanocyte gene expression, and IRF4 is a key transcription factor for both immune cells and 113 melanocytes. 114 115 Strikingly, several vitiligo-associated genes encode proteins that interact physically and

116functionally. BCL2L11 and BAD are binding partners that promote apoptosis¹³. CD80 binds to CTLA4 to117inhibit T cell activation¹⁴. BCL2L12 binds to and neutralizes caspase 7 (*CASP7*)¹⁵. SERPINB9 binds to118and specifically inhibits granzyme B (GZMB)¹⁶. Eos (IKZF4) binds and is an obligatory co-repressor of119FOXP3 in regulatory T cells¹⁷. RANK (TNFRSF11A) binds to RANKL (TNFSF11) to regulate many120aspects of immune cell function, including interactions of T cells and dendritic cells and thymic121tolerization¹⁸. Agouti signaling protein (ASIP) binds to the melanocortin-1 receptor (MC1R) to down-122regulate production of brown-black eumelanin¹⁹. IRF4 cooperates with MITF to activate transcription of

 TYR^{20} . And the vitiligo-associated HLA-A *02:01:01:01 subtype presents peptide antigens derived from 123 several different melanocyte proteins, including tyrosinase (TYR), OCA2, and MC1R^{4,6,21}. Together, these 124 relationships appear to highlight key pathways of vitiligo pathogenesis that are beginning to coalesce. 125 126 An unexpected finding from vitiligo GWAS has been an inverse relationship between vitiligo and 127 malignant melanoma risk for genes that encode melanocyte structural and regulatory proteins. TYR, OCA2, and MC1R, encode functional components of the melanocyte and are key vitiligo autoantigens. 128 *IRF4* encodes a transcription factor for melanocytes as well as lymphoid, myeloid, and dendritic cells²². 129 controlled by alternative tissue-specific enhancers²³. ASIP and PPARGC1B encode paracrine regulators of 130 melanocyte gene expression. All six loci play important roles in normal pigmentary variation^{8,24}, and for 131 132 all six the specific SNPs associated with vitiligo risk are also associated with melanoma protection, and vice-versa²⁵⁻²⁷. The inverse genetic relationship of susceptibility to vitiligo versus melanoma suggests that 133 vitiligo may represent enhanced immune surveillance against melanoma^{27,28}, consistent with the threefold 134 reduction in melanoma incidence among vitiligo patients^{29,30} and prolonged survival of melanoma patients 135 who develop vitiligo during immunotherapy³¹. 136

Vitiligo is epidemiologically associated with several other autoimmune diseases, including 137 138 autoimmune thyroid disease, pernicious anemia, rheumatoid arthritis, adult-onset type 1 diabetes, Addison's disease, and lupus^{2,32}. We searched the NHGRI-EBI GWAS Catalog and PubMed for the 48 139 genome-wide significant and 7 suggestive vitiligo susceptibility loci for associations with other 140 141 autoimmune, inflammatory, and immune-related disorders. As shown in Fig. 3, of the 23 novel genomewide significant vitiligo loci, FASLG has been associated with celiac disease³³ and Crohn's disease³⁴; 142 PTPRC with ulcerative colitis³⁵; BCL2L11 with primary sclerosing cholangitis³⁶; CTLA4 with alopecia 143 areata³⁷, rheumatoid arthritis³⁸, autoimmune thyroid disease^{39,40}, myasthenia gravis⁴¹, and type 1 diabetes 144 autoantibody production⁴²; *TNFRSF11A* with myasthenia gravis⁴¹; and *ARID5B* with systemic lupus 145 erythematosus⁴³. Of the seven suggestive loci, STAT4 has been associated with Behçet's disease⁴⁴, 146 Sjögren's syndrome⁴⁵, and lupus⁴⁶; and c7orf72 with lupus⁴⁷. These concordant associations for vitiligo 147 and other autoimmune and inflammatory diseases add to those involving previously identified vitiligo 148

- 149 susceptibility loci, which include RERE, PTPN22, IFIH1, CD80, LPP, BACH2, RNASET2-FGFR10P-
- 150 CCR6, TG/SLA, IL2RA, CD44, a chr11q21 gene desert, IKZF4, SH2B3-ATXN2, UBASH3A, and
- 151 $C1QTNF6^{4,6}$. Nevertheless, in most cases it remains uncertain whether apparent shared locus associations
- 152 for different autoimmune diseases reflect shared or different underlying causal variants.

153 A majority of loci associated with complex traits involve causal variants that are regulatory in nature⁴⁸⁻⁵², often corresponding to apparent expression quantitative trait loci (eQTLs)⁵². For TYR^{21} , 154 $GZMB^{53}$, and $MC1R^7$, principal vitiligo risk derives from missense substitutions, whereas for $OCA2^6$ and 155 the MHC class I⁵⁴ and class II⁵⁵ loci principal vitiligo risk is associated with causal variation in nearby 156 transcriptional regulatory elements. To assess the fraction of vitiligo-associated loci for which causal 157 158 variation is likely regulatory, we carried out conditional logistic regression analysis of all loci to define independent association signals, and for each signal we compiled all variants that could not be statistically 159 160 distinguished. All variants were then annotated against all available ENCODE datasets for immune-161 related and melanocyte-related cells (Supplementary Table 2). Overall, at approximately 58% of loci, the most significant variants (or statistically indistinguishable variants) are within a transcriptional 162 regulatory element predicted by ENCODE data^{56,57}. Only about 15% are in coding regions, several 163 164 resulting in missense substitutions. To further assess the general functional categories of apparent causal variants for vitiligo, we applied stratified LD score regression⁵¹ to the GWAS meta-analysis summary 165 statistics. As shown in **Fig. 4**, greatest enrichment of heritability was observed for markers in regulatory 166 167 functional categories, with considerably less enrichment of markers in protein coding regions.

We utilized two approaches to assess correspondence of vitiligo association signals with expression of genes in the vicinity. We used PrediXcan⁵⁸ to predict expression of 11,553 genes in whole blood for each study subject and then tested association of predicted expression of each gene with vitiligo affection status. We used a Bayesian method to assess co-localization of *cis* eQTL signals in purified blood monocytes with the confirmed vitiligo association signals. The PrediXcan analysis found 83 genes with significant differential predicted expression in vitiligo cases versus controls after Bonferroni correction (**Supplementary Table 3**); of these, 75 were located within 1 Mb of one of the 48 confirmed

175 vitiligo susceptibility loci, demonstrating highly significant enrichment compared with locations of genes 176 non-significant for PrediXcan (P value < 0.00001). The eQTL analysis found that 8 of the confirmed 177 vitiligo association signals showed significant co-localization with eQTL association signals identified in 178 purified monocytes (Supplementary Fig. 1 and Supplementary Table 4). Of the confirmed vitiligo-179 associated genes that could be tested using both methods, 6 were significant in both analyses (CASP7, HERC2-OCA2, ZC3H7B-TEF, TICAM1, RERE, RNASET2-FGFR1OP-CCR6). For all of these except 180 181 CASP7, one or more of the most associated SNPs not distinguishable by logistic regression was located 182 within or very close to an ENCODE element likely to regulate gene expression in immune cell types, melanocytes, or both (Supplementary Table 2). 183

Like a jigsaw puzzle, the pieces of the vitiligo pathogenome are thus beginning to fit together, revealing a complex network of immunoregulatory proteins, apoptotic regulators, and melanocyte components that mediate both autoimmune targeting of melanocytes in vitiligo and susceptibility to melanoma. For vitiligo as for other complex diseases, there is enrichment of causal variation in regions that regulate gene expression. This may bode well for identifying potential therapeutic targets, as pharmacologic modulation of dysregulated biological pathways may prove more tractable than attempting to target proteins impacted by amino acid substitutions.

191

192

193 URLs. 1000 Genomes Project, http://www.1000genomes.org/; 1000 Genomes Project data,

194 http://www.sph.umich.edu/csg/abecasis/MACH/download/ 1000G-2010-08.html; NHGRI-EBI GWAS

195 Catalog, http://www.ebi.ac.uk/gwas/; NIH Database of Genotypes and Phenotypes (dbGaP),

196 http://www.ncbi.nlm.nih.gov/gap; Online Mendelian Inheritance in Man (OMIM),

197 http://www.ncbi.nlm.nih.gov/omim; PLINK, http://pngu.mgh.harvard.edu/purcell/plink/; STATA,

198 http://www.stata.com; STRING database, http://string-db.org.

199

- 200 Accession Codes. Genotype and phenotype data for GWAS1, GWAS2, and GWAS 3 have been
- deposited with the NIH Database of Genotypes and Phenotypes (dbGaP) as phs000224.v1.p1,
- phs000224.v2.p1, and phs000224.v3.p1, respectively.
- 203

204 ACKNOWLEDGMENTS

- 205 We thank the thousands of vitiligo patients and normal control individuals around the world who
- 206 participated in this study. We thank the Center for Inherited Disease Research (CIDR) for genotyping.
- 207 This work utilized the Janus supercomputer, which is supported by the National Science Foundation
- 208 (award number CNS-0821794), the University of Colorado Boulder, the University of Colorado Denver,
- and the National Center for Atmospheric Research. The Janus supercomputer is operated by the
- 210 University of Colorado Boulder. This work was supported by grants R01AR045584, R01AR056292,
- 211 X01HG007484, and P30AR057212 from the U.S. National Institutes of Health and by institutional
- research funding IUT20-46 from the Estonian Ministry of Education and Research.
- 213

214 AUTHOR CONTRIBUTIONS

- 215 Y.J., G.A. and D.Y. performed statistical analyses. J.S. managed computer databases, software, and
- 216 genotype data. T.M.F., S.B., G.A., and K.M.B. managed DNA samples and contributed to experimental
- 217 procedures. P.J.H. managed subject coordination. S.A.B., A.H., A.L., R.M.L., A.W., J.P.W.vdV., N.vG.,
- 218 J.L., D.C.B., A.T., K.E., E.H.K., D.J.G., A.P.W., S.K., E.P., K.K., M.K., M.R.W., W.T.M., A.O., S.M.,
- 219 R.C., M.P., N.B.S., M.S., Y.V., I.K., M.B., H.L., I.H., L.Z., and Q.-S.M. provided subject samples and
- 220 phenotype information. S.A.S., P.R.F. and R.A.S. conceived, oversaw, and managed all aspects of the
- study. R.A.S. wrote the first draft of the manuscript. All authors contributed to the final paper.
- 222
- 223
- 224

225 References (Main text)

- 1. Picardo, M. & Taïeb, A. (eds.) Vitiligo (Springer, Heidelberg & New York, 2010).
- 227 2. Alkhateeb, A. et al. Epidemiology of vitiligo and associated autoimmune diseases in
- 228 Caucasian probands and their families. *Pigment Cell Res.* **16**, 208–214 (2003).
- 3. Jin, Y. et al. NALP1 in vitiligo-associated multiple autoimmune disease. N. Engl. J. Med.
- **356**, 1216-1225 (2007).
- Jin, Y. *et al.* Variant of *TYR* and autoimmunity susceptibility loci in generalized vitiligo. *N. Engl. J. Med.* **362**, 1686–1697 (2010).
- 5. Jin, Y. et al. Common variants in FOXP1 are associated with generalized vitiligo. Nat.

234 Genet. **42**, 576-578 (2010).

- 235 6. Jin, Y. *et al.* Genome-wide association study and meta-analysis identifies 13 new
- 236 melanocyte-specific and immunoregulatory susceptibility loci for generalized vitiligo. *Nat.*

237 *Genet.* **44**, 676-680 (2012).

- Ricano-Ponce I & Wijmenga C. Mapping of immune-mediated disease genes. *Annu. Rev. Genomics Hum. Genet.* 14, 325–353 (2013).
- 240 8. Liu F. *et al.* Genetics of skin color variation in Europeans: genome-wide association studies
 241 with functional follow-up. *Hum Genet.* **134**, 823–835 (2015).
- 242 9. Reimand, J., Arak, T. & Vilo J. g:Profiler—a web server for functional interpretation of gene
 243 lists (2011 update). *Nucleic Acids Res.*, **39**, W307-15 (2011).
- 10. Mi, H., Poudel, S., Muruganujan, A., Casagrande, J.T. & Thomas P.D. PANTHER version
- 245 10: expanded protein families and functions, and analysis tools. *Nucleic. Acids. Res.* 44,
 246 D336-342 (2016).
- 11. Szklarczyk, D. *et al.* STRING v10: protein-protein interaction networks, integrated over the
 tree of life. *Nucleic Acids Res.* 43, D447-D452 (2015).
- 12. Wilbe, M., *et al.* Multiple changes of gene expression and function reveal genomic and
- phenotypic complexity in SLE-like disease. *PLoS Genet.* **11**, e1005248 (2015).

251	13. Wang, X., Xing, D., Liu, L. & Chen, W.R. BimL directly neutralizes Bcl-xL to promote Bax
252	activation during UV-induced apoptosis. FEBS Lett. 583, 1873-1879 (2009).

14. Linsley, P.S. *et al.* Human B7-1 (CD80) and B7-2 (CD86) bind with similar avidities but
distinct kinetics to CD28 and CTLA-4 receptors. *Immunity.* 1, 793-801 (1994).

- 15. Stegh, A.H. *et al.* Bcl2L12 inhibits post-mitochondrial apoptosis signaling in glioblastoma.
- 256 Genes Dev. **21**, 98-111 (2007).
- 16. Sun, J. *et al.* A cytosolic granzyme B inhibitor related to the viral apoptotic regulator cytokine
 response modifier A is present in cytotoxic lymphocytes. *J. Biol. Chem.* 271, 27802-27809
 (1996).
- 17. Pan, F. *et al.* Eos mediates Foxp3-dependent gene silencing in CD4+ regulatory T cells.
 Science 325, 1142-1146 (2009).
- 18. Akiyama, T., Shinzawa, M., & Akiyama, N. RANKL-RANK interaction in immune regulatory
 systems. *World J. Orthop.* **3**, 142-150 (2012).
- 19. Ollmann, M.M., Lamoreux, M.L., Wilson, B.D. & Barsh, G.S. Interaction of Agouti protein
- with the melanocortin 1 receptor in vitro and in vivo. *Genes Dev.* **12**, 316-330 (1998).
- 266 20. Praetorius, C. et al. A polymorphism in IRF4 affects human pigmentation through a

tyrosinase-dependent MITF/TFAP2A pathway. *Cell* **155**, 1022-1033 (2013).

- 268 21. Jin, Y. *et al.* Next-generation DNA re-sequencing identifies common variants of *TYR* and
- 269 *HLA-A* that modulate the risk of generalized vitiligo via antigen presentation. *J. Invest.*
- 270 Dermatol. **132**, 1730-1733 (2012).
- 271 22. Gualco, G., Weiss, L.M. & Bacchi, C.E. MUM1/IRF4. A review. *Appl. Imunohistochem. Mol.* 272 *Morphol.* 18, 301-310 (2010).
- 273 23. Visser, M., Palstra, R.J. & Kayser, M. Allele-specific transcriptional regulation of IRF4 in
- melanocytes is mediated by chromatin looping of the intronic rs12203592 enhancer to the
- 275 *IRF4* promoter. *Hum. Mol. Genet.* **25**, 2629-2661 (2015).

- 276 24. Nan H. *et al.* Genome-wide association study of tanning phenotype in a population of
 277 European ancestry. *J. Invest. Dermatol.* **129**, 2250-2257 (2009).
- 278 25. Shoag, J. *et al.* PGC-1 coactivators regulate MITF and the tanning response. *Mol. Cell* 49,
 279 145-157. (2013).
- 280 26. Read, J., Wadt, K.A. & Hayward, N.K. Melanoma genetics. J. Med. Genet. 53, 1-14 (2016).
- 281 27. Spritz, R.A. The genetics of generalized vitiligo: autoimmune pathways and an inverse

relationship with malignant melanoma. *Genome Med.* **19**, 2:78 (2010).

- 283 28. Das, P.K., van den Wijngaard R.M.J.G.J., Wankowicz-Kalinska, A. & Le Poole, I.C. A
- symbiotic concept of autoimmunity and tumour immunity: lessons from vitiligo. *Trends Immunol.* 22, 130-136 (2001).
- 286 29. Teulings, H.E. et al. Decreased risk of melanoma and nonmelanoma skin cancer in patients
- with vitiligo: a survey among 1307 patients and their partners. *Br. J. Dermatol.* 168, 162-171
 (2013).
- 30. Paradisi, A. *et al.* Markedly reduced incidence of melanoma and nonmelanoma skin cancer
- in a nonconcurrent cohort of 10040 patients with vitiligo. J. Am. Acad. Dermatol. 71, 1110-

291 1116 (2014).

- 31. Teulings, H.E. *et al.* Vitiligo-like depigmentation in patients with stage III-IV melanoma
- receiving immunotherapy and its association with survival: a systematic review and meta-
- analysis. J. Clin Onc. **33**, 773-781 (2015).
- 32. Laberge, G. *et al.* Early disease onset and increased risk of other autoimmune diseases in
 familial generalized vitiligo. *Pigment Cell Res.* 18, 300-305 (2005).
- 33. Dubois, P.C. *et al.* Multiple common variants for celiac disease influencing immune gene
 expression. *Nat. Genet.* 42, 295-302 (2010).
- 34. Franke A. et al. Genome-wide meta-analysis increases to 71 the number of confirmed
- 300 Crohn's disease susceptibility loci. *Nat. Genet.* **42**, 1118-1125 (2010).

- 301 35. Juyal, G. *et al.* Genome-wide association scan in north Indians reveals three novel HLA 302 independent risk loci for ulcerative colitis. *Gut* 64, 571-579 (2015).
- 303 36. Melum E. *et al.* Genome-wide association analysis in primary sclerosing cholangitis
 304 identifies two non-HLA susceptibility loci. *Nat. Genet.* 43, 17-19 (2011).
- 305 37. Petukhova, L. *et al.* Genome-wide association study in alopecia areata implicates both
 innate and adaptive immunity. *Nature* 466, 113-117 (2010).
- 307 38. Gregersen, P.K. *et al.* REL, encoding a member of the NF-kappaB family of transcription
 308 factors, is a newly defined risk locus for rheumatoid arthritis. *Nat. Genet.* 41, 820-823
- 309 (2009).
- 310 39. Chu, X. et al. A genome-wide association study identifies two new risk loci for Graves'
- 311 disease. *Nat. Genet.* **43**, 897-901 (2011).
- 40. Eriksson, N. *et al.* Novel associations for hypothyroidism include known autoimmune risk
 loci. *PloS One* 7, e34442 (2012).
- 41. Renton, A.E. *et al.* A genome-wide association study of myasthenia gravis. *JAMA Neurol.*72, 396-404 (2015).
- 42. Plagnol, V. *et al.* Genome-wide association analysis of autoantibody positivity in type 1
- 317 diabetes cases. *PLoS Genet.* **7**, e1002216 (2011).
- 43. Yang, W. *et al.* Meta-analysis followed by replication identifies loci in or near CDKN1B,
- 319 TET3, CD80, DRAM1, and ARID5B as associated with systemic lupus erythematosus in
- 320 Asians. *Am. J. Hum. Genet.* **92**, 41-51 (2013).
- 44. Hou, S. *et al.* Identification of a susceptibility locus in STAT4 for Behcet's disease in Han
- 322 Chinese in a genome-wide association study. *Arth. Rheumat.* **64**, 4104-4113 (2012).
- 45. Li, Y. et al. A genome-wide association study in Han Chinese identifies a susceptibility locus
- for primary Sjogren's syndrome at 7q11.23. *Nat. Genet.* **45**, 1361-1365 (2013).

- 46. Lee, Y.H., Bae, S.C., Choi, S.J., Ji, J.D. & Song, G.G. Genome-wide pathway analysis of
- genome-wide association studies on systemic lupus erythematosus and rheumatoid arthritis.
 Molec. Biol. Rep. **39**, 10627-10635 (2012).
- 47. Han, J.W. *et al.* Genome-wide association study in a Chinese Han population identifies nine
- new susceptibility loci for systemic lupus erythematosus. *Nat. Genet.* **41**, 1234-1237 (2009).
- 48. Corradin, O. & Schcheri, P.C. Enhancer variants: evaluating functions in common disease.
- 331 *Genome Med.* **6**, 85 (2014).
- 49. Gusev, A. *et al.* Partitioning heritability of regulatory and cell-type-specific variants across 11
 common diseases. *Am. J. Hum. Genet.* **95**, 535-552 (2014).
- 334 50. Paul, D.S. *et al.* Functional interpretation of non-coding sequence variation: concepts and
- 335 challenges. *Bioessays* **36**, 191-199 (2014).
- 51. Finucane, H.K. *et al.* Partitioning heritability by functional annotation using genome-wide
 association summary statistics. *Nat. Genet.* 47, 1228-1235 (2015).
- 52. Nicolae, D. *et al.* Trait-associated SNPs are more likely to be eQTLs: annotation to enhance
 discovery from GWAS. *PLoS Genet.* 6, e1000888 (2010).
- 53. Ferrara, T.M., Jin, Y., Gowan, K., Fain, P.R., & Spritz, R.A. Risk of generalized vitiligo is
- 341 associated with the common 55R-94A-247H variant haplotype of *GZMB* (encoding
- 342 Granzyme B). J. Investig. Dermatol. 133, 1677-1679 (2013).
- 54. Hayashi, M. *et al.* Autoimmune vitiligo is associated with gain of function by a transcriptional
- regulator that elevates expression of HLA-A*02:01 *in vivo. Proc. Natl. Acad. Sci. U.S.A.* 113,
 1357-1362 (2016).
- 55. Cavalli, G. et al. MHC class II super-enhancer increases surface expression of HLA-DR and
- 347 HLA-DQ and affects cytokine production in autoimmune vitiligo. *Proc. Natl. Acad. Sci. U.S.A.*
- **113**, 1363-1368 (2016).
- 349 56. Shlyueva, D., Stampfel, G. & Stark, A. Transcriptional enhancers from properties to
- 350 genome-wide predictions. *Nat. Rev. Genet.* **15**, 272-286 (2014).

- 351 57. Kellis, M. *et al.* Defining functional DNA elements in the human genome. *Proc. Natl. Acad.*
- 352 *Sci. U.S.A.* **111**, 6131–6138 (2014).
- 58. Gamazon, E.R. et al. A gene-based association method for mapping traits using reference
- 354 transcriptome data. *Nat. Genet.* **47**, 1091-1098 (2015).
- 355

357 Figure Legends (Main text)

358

359Figure 1 Genome-wide meta-analysis results. The genome-wide distribution of $-\log_{10}$ (*P* values)360from the Cochran-Mantel-Haenszel meta-analysis for 8,966,411 genotyped and imputed361markers from GWAS1, GWAS2, and GWAS3 is shown across the chromosomes. The dotted362line indicates the threshold for genome-wide significance ($P < 5 \times 10^{-8}$).363364Figure 2 Bioinformatic functional interaction network analysis of proteins encoded by all

365 positional candidate genes at all confirmed and suggestive vitiligo candidate loci. As a first step,

unsupervised functional interaction network analysis was carried out using STRING v10.0¹¹,

367 considering each protein as a node and permitting \leq 5 second-order interactions to maximize

368 connectivity. Nodes that shared no edges with other nodes were then excluded from the

network. Edge colors are per STRING: teal, interactions from curated databases; purple,

experimentally determined interactions; green, gene neighborhood; blue, databases; red, gene

fusions; dark blue, gene co-occurrence; pale green, text-mining; black, co-expression; lavender,

protein homology. Note that SMEK2 is an alternative name for PPP4R3B.

373

374 **Figure 3** Concordant associations for vitiligo and other autoimmune and inflammatory diseases.

We searched the NHGRI-EBI GWAS Catalog and PubMed for associations of the 48 genome-

376 wide significant and 7 suggestive vitiligo susceptibility loci with other autoimmune, inflammatory,

and immune-related disorders, and for association with normal human pigmentation variation.

378 Only reported associations that achieved genome-wide significance ($P < 5 \times 10^{-8}$) are included.

379 RA, rheumatoid arthritis; T1D, type 1 diabetes mellitus; AITD, autoimmune thyroid disease;

380 SLE, systemic lupus erythematosus; IBD, inflammatory bowel disease; MS, multiple sclerosis;

381 MG, myasthenia gravis; AI hepatitis, autoimmune hepatitis.

382

Figure 4 Enrichment estimates for functional annotations. The combined CMH GWAS123 383 384 summary statistics were analyzed using the stratified LD score regression method utilizing the full baseline model⁵¹. Regulatory, yellow; protein coding, blue; intron, green. Bar height 385 represents enrichment which is defined to be the proportion of SNP heritability in the category 386 387 divided by the proportion of SNPs in that category. Error bars represent jackknife standard error around the enrichment. For each category, percentage of the total markers in the category is in 388 389 parentheses. Dashed line represents a ratio of 1 (no enrichment). Asterisks indicate enrichment 390 significant at P < 0.05 after Bonferroni correction for the 20 categories tested (the categories conserved, repressed, transcribed, and promoter flanking were removed and considered 391 392 insufficiently specific). CTCF, CCCTC-binding factor; DGF, digital genomic footprint; DHS, 393 DNase hypersensitivity site; TFBS, transcription factor binding site; TSS, transcriptional start 394 site; 5' and 3' UTR, 5' and 3' untranslated regions. H3K4me1, H3K4me3, H3K9ac, and H3K27ac are regulatory chromatin marks^{56,57}. 395

396

Table 1	1 Allelic associations at vitiligo susceptibility loci following GWAS meta-analysis and replication study	
---------	---	--

				•	GWAS123 meta-analysis		GWAS3 replication study		GWAS123 & GWAS3 replication study meta-analysis		
Chr.	Variant	Position (Build 37)	Locus	EA/OA	P value	Odds ratio	P value	Odds ratio	P value	Odds ratio (95% CI)	Heritability explained* (%)
1	rs301807	8484823	RERE	A/G	1.84 x 10 ⁻¹²	1.22	4.09 x 10 ⁻⁰⁴	1.17	4.14 x 10 ⁻¹⁵	1.21 (1.15-1.27)	0.003
1	rs2476601	114377568	PTPN22	A/G	2.21 x 10 ⁻¹⁴	1.39	1.08 x 10 ⁻⁰⁵	1.36	1.21 x 10 ⁻¹⁸	1.38 (1.29-1.49)	0.003
1	rs78037977	172715702	FASLG	G/A	1.39 x 10 ⁻¹³	1.33	8.95 x 10 ⁻⁰⁵	1.29	6.74 x 10 ⁻¹⁷	1.32 (1.24-1.41)	0.003
1	rs16843742	198672299	PTPRC	С/Т	8.84 x 10 ⁻⁰⁹	0.82	1.87 x 10 ⁻⁰²	0.88	1.02 x 10 ⁻⁰⁹	0.83 (0.79-0.88)	0.002
2	rs10200159	55845109	PPP4R3B	С/Т	3.35 x 10 ⁻¹³	1.48	3.70 x 10 ⁻⁰⁷	1.55	3.73 x 10 ⁻¹⁹	1.51 (1.38-1.66)	0.003
2	rs4308124	112010486	BCL2L11-MIR4435-2HG	С/Т	4.99 x 10 ⁻⁰⁸	1.17	1.67 x 10 ⁻⁰²	1.12	3.96 x 10 ⁻⁰⁹	1.15 (1.10-1.21)	0.002
2	rs2111485	163110536	IFIH1	A/G	2.69 x 10 ⁻²²	0.75	8.58 x 10 ⁻⁰⁵	0.83	6.40 x 10 ⁻²⁵	0.77 (0.73-0.81)	0.008
2	rs231725	204740675	CTLA4	A/G	2.25 x 10 ⁻⁰⁸	1.18	1.57 x 10 ⁻⁰³	1.16	1.49 x 10 ⁻¹⁰	1.18 (1.12-1.24)	0.002
2	rs41342147	242407588	FARP2-STK25	A/G	8.03 x 10 ⁻⁰⁷	0.80	1.25 x 10 ⁻⁰³	0.80	3.70 x 10 ⁻⁰⁹	0.80 (0.74-0.86)	0.003
3	rs35161626	23512312	UBE2E2	I/D	7.34 x 10 ⁻⁰⁷	0.87	1.09 x 10 ⁻⁰²	0.89	3.13 x 10 ⁻⁰⁸	0.87 (0.83-0.92)	0.001
3	rs34346645	71557945	FOXP1	A/C	6.11 x 10 ⁻¹⁴	0.80	4.23 x 10 ⁻⁰⁶	0.81	7.99 x 10 ⁻¹⁹	0.80 (0.76-0.84)	0.004
3	rs148136154	119283468	CD80-ADPRH	C/T	5.02 x 10 ⁻¹⁵	1.37	1.74 x 10 ⁻⁰²	1.17	4.58 x 10 ⁻¹⁵	1.31 (1.22-1.40)	0.003
3	rs13076312	188089254	LPP	T/C	3.58 x 10 ⁻²²	1.32	3.48 x 10 ⁻¹⁰	1.33	1.61 x 10 ⁻³⁰	1.32 (1.26-1.38)	0.009
3	rs6583331	196347253	FBX045-NRROS	A/T	1.39 x 10 ⁻⁰⁷	0.86	3.62 x 10 ⁻⁰²	0.91	2.53 x 10 ⁻⁰⁸	0.87 (0.83-0.92)	0.002
4	rs1031034	102223386	PPP3CA	A/C	4.78 x 10 ⁻⁰⁶	0.86	2.14 x 10 ⁻⁰³	0.86	3.43 x 10 ⁻⁰⁸	0.86 (0.81-0.91)	0.001
6	rs12203592	396321	IRF4	T/C	1.03 x 10 ⁻⁰⁹	0.77	3.17 x 10 ⁻⁰⁸	0.68	8.86 x 10 ⁻¹⁶	0.75 (0.70-0.80)	0.001
6	rs78521699	2908591	SERPINB9	G/A	3.33 x 10 ⁻⁰⁶	0.79	2.27 x 10 ⁻⁰³	0.80	2.54 x 10 ⁻⁰⁸	0.79 (0.73-0.86)	0.001
6	rs60131261	29937335	HLA-A	D/I	2.63 x 10 ⁻⁴⁸	1.53	8.01 x 10 ⁻²⁰	1.54	1.56 x 10 ⁻⁶⁶	1.54 (1.46-1.61)	0.016
6	rs9271597	32591291	HLA-DRB1/DQA1	A/T	3.15 x 10 ⁻⁸⁹	1.77	nd	nd	nd	nd	0.042
6	rs72928038	90976768	BACH2	A/G	1.12 x 10 ⁻¹¹	1.28	2.04 x 10 ⁻⁰⁴	1.25	1.00 x 10 ⁻¹⁴	1.27 (1.19-1.35)	0.003
6	rs2247314	167370230	RNASET2-FGFR10P- CCR6	C/T	1.97 x 10 ⁻¹³	0.79	1.56 x 10 ⁻⁰⁶	0.79	1.72 x 10 ⁻¹⁸	0.79 (0.75-0.84)	0.003
7	rs117744081	29132279	CPVL	G/A	3.74 x 10 ⁻²²	1.95	1.88 x 10 ⁻⁰⁶	1.66	8.72 x 10 ⁻²⁶	1.84 (1.64-2.06)	0.004
8	rs2687812	133931055	TG-SLA-WISP1	A/T	1.98 x 10 ⁻¹¹	1.21	1.69 x 10 ⁻⁰³	1.15	2.19 x 10 ⁻¹³	1.19 (1.14-1.25)	0.007
9	rs10986311	127071493	NEK6	С/Т	5.45 x 10 ⁻⁰⁷	1.16	5.10 x 10 ⁻⁰³	1.14	1.01 x 10 ⁻⁰⁸	1.15 (1.10-1.21)	0.001
10	rs706779	6098824	IL2RA	C/T	1.30 x 10 ⁻²⁴	0.74	9.25 x 10 ⁻⁰⁵	0.84	7.20 x 10 ⁻²⁷	0.77 (0.73-0.81)	0.012
10	rs71508903	63779871	ARID5B	T/C	1.09 x 10 ⁻⁰⁶	1.18	1.52 x 10 ⁻⁰³	1.19	6.93 x 10 ⁻⁰⁹	1.18 (1.12-1.25)	0.001
10	rs12771452	115488331	CASP7	A/G	9.16 x 10 ⁻⁰⁸	0.83	8.42 x 10 ⁻⁰⁶	0.79	4.43 x 10 ⁻¹²	0.82 (0.78-0.87)	0.002
11	rs1043101	35274829	CD44-SLC1A2	G/A	2.08 x 10 ⁻¹³	1.24	4.20 x 10 ⁻⁰⁶	1.24	5.26 x 10 ⁻¹⁸	1.23 (1.18-1.29)	0.003
11	rs12421615	64021605	PPP1R14B-PLCB3-BAD-	A/G	3.38 x 10 ⁻⁰⁶ 1	L8 0.87	3.78 x 10 ⁻⁰³	0.87	4.81 x 10 ⁻⁰⁸	0.87 (0.83-0.91)	0.001

			ESRRA-TRMT112- PRDX5								
11	rs1126809	89017961	TYR	A/G	7.13 x 10 ⁻³²	0.67	2.54 x 10 ⁻¹³	0.68	1.16 x 10 ⁻⁴³	0.67 (0.63-0.71)	0.012
11	rs11021232	95320808	Gene desert	C/T	1.01 x 10 ⁻²¹	1.38	3.81 x 10 ⁻⁰⁴	1.22	2.10 x 10 ⁻²³	1.34 (1.26-1.41)	0.005
12	rs2017445	56407072	IKZF4	A/G	3.81 x 10 ⁻²⁰	1.31	1.22 x 10 ⁻¹²	1.40	6.62 x 10 ⁻³¹	1.33 (1.27-1.40)	0.005
12	rs10774624	111833788	SH2B3-ATXN2	A/G	1.88 x 10 ⁻¹⁴	0.80	1.52 x 10 ⁻¹⁰	0.75	6.22 x 10 ⁻²³	0.79 (0.75-0.83)	0.004
13	rs35860234	43070206	TNFSF11	G/T	2.82 x 10 ⁻⁰⁶	1.16	3.45 x 10 ⁻⁰⁴	1.20	4.76 x 10 ⁻⁰⁹	1.17 (1.11-1.23)	0.001
14	rs8192917	25102160	GZMB	C/T	1.37 x 10 ⁻¹⁰	1.23	1.23 x 10 ⁻⁰⁶	1.29	8.91 x 10 ⁻¹⁶	1.25 (1.18-1.32)	0.002
15	rs1635168	28535266	OCA2-HERC2	A/C	6.97 x 10 ⁻¹³	1.43	7.45 x 10 ⁻⁰³	1.25	8.78 x 10 ⁻¹⁴	1.37 (1.26-1.49)	0.003
16	rs4268748	90026512	MC1R?	C/T	1.63 x 10 ⁻²⁰	0.73	8.23 x 10 ⁻¹⁵	0.66	2.88 x 10 ⁻³³	0.71 (0.67-0.75)	0.013
17	rs11079035	40289012	KAT2A-HSPB9-RAB5C	A/G	3.20 x 10 ⁻⁰⁶	1.18	3.19 x 10 ⁻⁰⁵	1.28	6.77 x 10 ⁻¹⁰	1.21 (1.14-1.29)	0.001
18	rs8083511	60028655	TNFRSF11A	C/A	9.42 x 10 ⁻¹⁰	1.24	3.23 x 10 ⁻⁰²	1.13	2.81 x 10 ⁻¹⁰	1.21 (1.14-1.28)	0.002
19	rs4807000	4831878	TICAM1	A/G	1.58 x 10 ^{-₀9}	1.19	2.11 x 10 ⁻⁰⁶	1.24	1.94 x 10 ⁻¹⁴	1.21 (1.15-1.26)	0.002
19	rs2304206	50168871	SCAF1-IRF3-BCL2L12	A/G	6.45 x 10 ^{-₀9}	0.82	4.52 x 10 ⁻⁰²	0.90	2.36 x 10 ⁻⁰⁹	0.84 (0.80-0.89)	0.002
20	rs6059655	32665748	RALY-EIF252-ASIP- AHCY-ITCH	A/G	3.58 x 10 ⁻¹³	0.63	3.08 x 10 ⁻⁰⁸	0.57	1.04 x 10 ⁻¹⁹	0.61 (0.55-0.68)	0.004
20	rs6012953	49123043	PTPN1	G/A	1.18 x 10 ⁻⁰⁷	1.16	1.74 x 10 ⁻⁰²	1.11	9.47 x 10 ⁻⁰⁹	1.15 (1.10-1.20)	0.002
21	rs12482904	43851828	UBASH3A	A/T	5.74 x 10 ⁻²⁹	1.43	1.16 x 10 ⁻⁰³	1.18	5.84 x 10 ⁻²⁹	1.35 (1.28-1.43)	0.010
22	rs229527	37581485	C1QTNF6	A/C	1.40 x 10 ⁻²⁴	1.34	1.15 x 10 ⁻⁰⁷	1.27	1.14 x 10 ⁻³⁰	1.32 (1.26-1.38)	0.006
22	rs9611565	41767486	ZC3H7B-TEF	C/T	1.99 x 10 ⁻¹²	0.78	3.34 x 10 ⁻⁰⁴	0.82	3.13 x 10 ⁻¹⁵	0.79 (0.75-0.84)	0.003
x	rs73456411	29737404	IL1RAPL1	T/G	1.57 x 10 ⁻⁰⁷	1.72	5.90 x 10 ⁻⁰³	1.62	7.34 x 10 ⁻¹⁰	1.77 (1.47-2.13)	0.001
х	rs5952553	49392721	CCDC22-FOXP3-GAGE	C/T	1.81 x 10 ⁻⁰⁸	0.85	3.48 x 10 ⁻⁰²	0.92	1.05 x 10 ⁻⁰⁹	0.86 (0.82-0.90)	0.001

GPR137-KCNK4-TEX40-

*Heritability explained by all independent signals of the locus. Chr., chromosome; CI, confidence interval; nd, not determined; EA, effect allele; OA, other allele. Bold, novel significant vitiligo susceptibility loci. The chromosome 16 association peak spans a large number of genes, including *MC1R*.

398

400

401 402

403 Subjects

ONLINE METHODS

404 The genome-wide portion of this study included unrelated cases from our three generalized 405 vitiligo GWAS: GWAS1⁴ (n = 1514), GWAS2⁶ (n = 450), and the current GWAS3 (n = 1090). All cases were of non-Hispanic-Latino European-derived white ancestry (EUR) from North America 406 and Europe, and met strict clinical criteria for generalized vitiligo⁵⁹. All controls were EUR 407 individuals not specifically known to have any autoimmune disease or malignant melanoma, for 408 409 whom genome-wide genotypes were obtained from the NCBI database of Genotypes and Phenotypes (dbGaP; phs000092.v1.p1, phs000125.v1.p1, phs000138.v2.p1, phs000142.v1.p1, 410 phs000168.v1.p1, phs000169.v1.p1, phs000206.v3.p2, phs000237.v1.p1, phs000346.v1.p1, 411 and phs000439.v1.p1 for GWAS1; phs000203.v1.p1, and phs000289.v2.p1 for GWAS2; 412 phs000196.v2.p1, phs000303.v1.p1, phs000304.v1.p1, phs000368.v1.p1, phs000381.v1.p1, 413 phs000387.v1.p1, phs000389.v1.p1, phs000395.v1.p1, phs000408.v1.p1, phs000421.v1.p1, 414 phs000494.v1.p1, and phs000524.v1.p1 for GWAS3). Control datasets were matched to each of 415 416 the three GWAS case datasets based on platforms used for genotyping. The independent 417 replication study included 1827 unrelated EUR vitiligo cases and 2181 unrelated EUR controls not included in any of the GWAS. All subjects provided written informed consent. This study was 418 419 carried out under the jurisdiction of each local IRB with overall oversight of the Colorado Multiple Institutional Review Board (COMIRB). 420

421

422 Genome-wide genotyping

423 Saliva specimens were obtained using a DNA self-collection kit (Oragene, DNA Genotek), and 424 DNA was prepared using either the Maxwell apparatus/16 LEV Blood DNA kit (Promega) or the DNA Genotek Oragene Purifier protocol. DNA concentrations were measured using either 425 426 the Qubit dsDNA BR Assay kit and Qubit 2.0 Fluorometer (Invitrogen) or the Promega

427 QuantiFluor ONE dsDNA kit and GloMax®-Multi+ Detection System (Promega).

- Genome-wide genotyping for the GWAS3 cases was performed for 716,503 variants using Illumina Human OmniExpress BeadChips by the Center for Inherited Disease Research (CIDR). Genotype data for GWAS3 were deposited in dbGaP (phs000224.v3.p1). GWAS1⁴ and GWAS2⁶ have been described previously.
- 432

433 Genome-wide quality control procedures

434 Quality control filtering of genome-wide genotype data was carried out using PLINK⁶⁰, version 1.9. For each case/control dataset, DNA strand calls were reversed as needed. Cases were 435 excluded on the basis of SNP call rates <98.5%, discordance between reported and observed 436 sex, or inadvertent subject duplication, and controls were excluded on the basis of SNP call 437 438 rates < 98%. SNPs were excluded on the basis of genotype missing rate > 2% for SNPs with observed minor allele frequency (MAF) > 0.01, and for SNPs with MAF < 0.01 exclusion 439 criteria were genotype missing rate >1% and < 5 minor alleles observed, or significant (P <440 10⁻⁴) deviation from Hardy-Weinberg equilibrium. For X chromosome SNPs, Hardy-Weinberg 441 equilibrium tests were performed in females, and SNPs with $P < 10^{-4}$ were excluded from the 442 final analysis. For each GWAS, only SNPs that existed in all case and control datasets were 443 retained for imputation. 444

Within each GWAS, subjects were excluded based on cryptic relatedness identified by 445 446 pairwise identity-by-descent estimations (pi-hat > 0.0625), in which case the individual with lower SNP call rate was excluded. For each of the three GWAS, the cleaned case dataset was 447 448 combined with one cleaned control dataset at a time and the genotype data of 270 subjects of Phase I and II of the International HapMap Project from 4 populations, and principal 449 components analysis (PCA) was performed with EIGENSOFT⁵⁹ based on tag-SNPs (within 450 which no pair were correlated with $r^2 > 0.2$) selected from genotyped SNPs. The first two 451 eigenvectors were used to produce a PCA plot. A PCA plot was first made for cases and 452

HapMap samples, and cases that were clearly separated from the main cluster of cases and
HapMap EUR samples were excluded as outliers. A PCA plot of controls and HapMap
samples was then made, and the same x and y coordinates that separated the case outliers
from the main cluster of cases and HapMap EUR samples were used to identify control
outliers.

After all QC procedures, the final number of genotyped SNPs remaining in GWAS1, 458 GWAS2, and GWAS3 were 464,902, 494,043, and 483,609, respectively. For autosomal 459 analyses, the final numbers of cases and controls in GWAS1, GWAS2, and GWAS3 were 460 1,381 and 14,518, 413 and 5,209, and 1,059 and 17,678, respectively, whereas for X 461 chromosome analyses, the final numbers of cases and controls in GWAS1, GWAS2, and 462 GWAS3 were 1,380 and 9,439, 413 and 5,209, and 1,059 and 14,220, respectively. This 463 464 sample size provided at least 85% power to detect associations with OR > 1.22 at genome-465 wide significance ($P = 5 \times 10^{-8}$) for MAF > 0.25.

466

467 Genome-wide Genotype Imputation

For each GWAS, we used SHAPEIT version2 to pre-phase genotypes to produce best-guess 468 469 haplotypes, and then performed imputation with these estimated haplotypes using IMPUTE2 and the 1000 Genomes Project phase I integrated variant set version 3 (March, 2012) as the 470 reference panel. All cryptic related individuals and outliers from each GWAS were included in 471 472 the process to improve imputation accuracy, but were removed for the final analyses. Only 473 genotypes with imputation INFO > 0.5 were retained, which were combined with prior SNP 474 genotype data. Imputed genotypes for variants with MAF \geq 0.01 calculated from all 3 GWAS combined and without significant ($P > 10^{-5}$) deviation from Hardy-Weinberg equilibrium were 475 used in the final analysis, which included 8,721,242 autosome variants and 245,169 476 477 chromosome X variants.

478

479 **Replication study genotyping and quality control procedures**

480 For the replication study, genotyping was attempted for 379 variants using a custom Illumina GoldenGate array by CIDR. 71 SNPs were excluded on the basis of genotype missing rate > 2% 481 (which includes apparent technical failures), or significant ($P < 10^{-4}$) deviation from Hardy-482 483 Weinberg equilibrium. For X chromosome SNPs, Hardy-Weinberg equilibrium tests were performed in females. Subjects were excluded on the basis of SNP call rates <95%, or 484 discordance between reported and observed sex. Unintended duplicate samples were identified 485 by pairwise identity-by-descent estimations (pi-hat > 0.99), in which case the individual with 486 lower SNP call rate was excluded. The final numbers of remaining cases and controls were 487 1,827 and 2,181, respectively, providing at least 80% power to replicate associations at P = 0.05488 with Bonferroni correction for up to 48 independent tests for $OR \ge 1.23$ for MAF ≥ 0.25 . 489

490

491 Statistical analyses

To control for the effects of population stratification, we assigned cases and controls of each GWAS to homogenous clusters using GemTools⁶⁰, and performed Cochran-Mantel- Haenszel (CMH) analysis to test for association for each GWAS and the combined GWAS data, with the cluster variable defined by the case-control clusters from each GWAS. After removing variants within the extended MHC, the genomic inflation factor for GWAS1, GWAS2, and GWAS3 was 1.068, 1.059, and 1.013, respectively. For the combined GWAS1-GWAS2-GWAS3 genotype data for shared SNPs, the genomic inflation factor was 1.019.

For the replication study, after quality control procedures we compared allele frequencies for the remaining 308 SNPs in the remaining 1,827 cases and 2,181 controls using the Cochran-Armitage trend test. ORs and 95% confidence limits were calculated by logistic regression analysis. We used CMH analysis to obtain ORs and P values for the combined GWAS plus the replication study data, with the cluster variable defined by the case-control clusters from each GWAS and the replication study data as one cluster. To analyze X

chromosome SNPs, we assumed complete X-inactivation and similar effect size between
males and females, with the effect of having an A allele in a male equal to the effect of having
two A alleles in a female⁶³. We thus coded males as homozygous for the allele carried for each
variant and tested for association by CMH analysis to obtain ORs and P values for each
GWAS, the combined GWAS, and the combined GWAS plus the replication study data, and by
the Cochran- Armitage trend test for the replication study data.

To test heterogeneity of associations across the three GWAS and the replication study data, we performed the Cochran Q test. The analysis was done with PLINK, version 1.07, using the ORs and standard errors estimated from the CMH analysis of each GWAS, and from logistic regression analysis of the replication study data. The P statistic from the Q test quantifies heterogeneity and ranges from 0% to 100%⁶⁴, with a value of 75% or greater typically taken to indicate a high degree of heterogeneity⁶⁵.

517 To test for multiple independent signals at each locus, we performed logistic regression analysis of each locus conditional on the most significantly associated variant, including as 518 519 covariates in the model the significant principal components for each GWAS derived from 520 GemTools⁶² to control for population stratification, and used a stepwise procedure to select 521 additional variants, one by one, until no additional variants showed conditional P values ≤ 1.0 x 522 10⁻⁵. If a tested variant and the conditional variant could not improve each other significantly (P 523 > 0.05 when comparing the two SNP model to a single SNP model), then both variants were 524 considered to represent the same signal. We calculated the variance explained by a specific variant or a set of variants from the combined GWAS as the Pseudo R² of a logistic regression 525 526 model which included the specific variants tested.

527

528 Bioinformatic pathway and functional enrichment analyses

To screen for functional relationships among the vitiligo candidate genes, we carried out
pathway analysis of the protein products of all positional candidate genes at all 48 confirmed

loci and the seven suggestive loci using g:PROFILER¹⁰, PANTHER¹¹, and STRING¹². To 531 532 assess enrichment of association signals in different functional genomic categories contributing to vitiligo heritability, we applied stratified LD score regression⁵¹ to the combined CMH 533 GWAS123 summary statistics. The regression model contained 24 overlapping functional 534 535 categories, including coding, UTR, promoter and intronic regions, annotations for different histone marks, DNase I hypersensitivity site (DHS) regions, combined ChromHMM and Segway 536 predictions, conserved regions in mammals, super-enhancers and FANTOM5 enhancers. For 537 each of the 24 categories, a 500-bp window was used. Linkage disequilibrium data were 538 provided by the LD score software, estimated from the EUR samples in the 1000 Genomes 539 Project Phase 1. Enrichment per category was calculated by the ratio of the estimated 540 proportion of heritability explained by the category over the proportion of the markers in the 541 542 category.

543

544 PrediXcan and Monocyte eQTL Co-Localization analyses

We carried out a gene-based test of association of vitiligo with "imputed" expression profiles for 545 11,553 autosomal genes in whole blood using PrediXcan⁵⁸. The analysis included 2,853 cases 546 and 37,412 controls from the combined GWAS. Association testing between expression 547 548 estimates for each gene and affection status for vitiligo was performed by generalized logistic regression. P values were adjusted for the number of genes tested (n = 11,553). NRROS, 549 550 ZC3H7B, TNFRSF11A, BCL2L12, RALY, ASIP, OCA2, and TYR were excluded from the 551 PrediXcan analysis due to poor prediction of gene expression in blood cells. 552 We derived expression quantitative trait loci (eQTLs) in peripheral blood monocytes from 414 EUR subjects with paired genotyping and gene expression data⁶⁶. SHAPEIT version2 was 553 554 used to pre-phase genotypes to produce best-guess haplotypes with imputation performed using IMPUTE2 and the 1000 Genomes Project phase I integrated variant set version 3 (March, 555

2012) as reference panel. We tested for co-localization of eQTL and vitiligo GWAS autosomal

association patterns as described^{67,68}. Vitiligo susceptibility loci were defined by windows of 557 558 robust association plus an added 100 kb buffer on both sides. eQTL probes were selected by choosing probes that resided within these windows. Probe guality annotation was performed 559 using ReMOAT⁶⁹ and all probes with an annotation of "bad" were removed. After removing non-560 561 autosomal loci and duplicate probe IDs, a total of 904 probes remained. All vitiligo susceptibility loci contained at least one probe with the exception of the gene desert 3' of TYR, for which the 562 only probe that intersected the locus was excluded due to ReMOAT annotation of "bad". Within 563 each locus window, all SNPs were tested for association with all probes using linear regression. 564 P values, MAF for each SNP and respective sample sizes were used as input to test for co-565 localization, simultaneously testing five mutually exclusive hypotheses by generating 5 566 corresponding posterior probabilities (PP): 567 568 H0 (PP0): There is no association with either the GWAS or the eQTL. • 569 H1 (PP1): There is association for the GWAS only. • H2 (PP2): There is association for the eQTL only. 570 H3 (PP3): There is association for both the GWAS and the eQTL, but the associated 571 572 variants are different for the GWAS and the eQTL. 573 • H4 (PP4): The associated variants are the same for both the GWAS and the eQTL (co-574 localization). 575 Posterior probabilities were calculated using the R package "coloc" using default settings for prior probabilities of association. Co-localization was assessed as per Guo et al. 68; significant 576 co-localization was $PP_3 + PP_4 > 0.99$ and $PP_4: PP_3 > 5$, and suggestive co-localization was 577 $PP_3 + PP_4 > 0.95$ and $PP_4 : PP_3 > 3$. 578

579

580 URLs. 1000 Genomes Project, http://www.1000genomes.org/; coloc, https://cran.r-

581 project.org/web/packages/coloc/index.html; GemTools,

582 http://wpicr.wpic.pitt.edu/WPICCompgen/GemTools/GemTools.htm; IMPUTE2,

- 583 https://mathgen.stats.ox.ac.uk/impute/impute_v2.html; International HapMap Project,
- 584 http://hapmap.ncbi.nlm.nih.gov/; PrediXcan, https://github.com/hriordan/PrediXcan; SHAPEIT,
- 585 http://www.shapeit.fr/; REMOAT, http://remoat.sysbiol.cam.ac.uk/transcript.php.
- 586

587 Methods-only References

- 588 59. Taïeb, A. & Picardo, M. The definition and assessment of vitiligo: a consensus report of the
- 589 VitiligoEuropean Task Force. *Pigment Cell Res.* **20**, 27-35 (2007).
- 590 60. Purcell, S. et al. PLINK: a toolset for whole-genome association and population-based
- 591 linkage analysis. *Am. J. Hum. Genet.* **81**, 559–575 (2007).
- 592 61. Price, A.L. *et al.* Principal components analysis corrects for stratification in
- 593 genome-wide association studies. *Nat. Genet.* **38**, 904–909 (2006).
- 62. Lee, A.B., Luca, D., Klei, L., Devlin, B. & Roeder, K. Discovering genetic ancestry using
 spectral graph theory. *Genet. Epidemiol.* 34, 51–59 (2010).
- 596 63. Chang, D. et al. Accounting for eXentricities: analysis of the X chromosome in GWAS
- 597 reveals X- linked genes implicated in autoimmune diseases. *PLoS One* **9**, e113684
- 598 (2014).
- 64. Higgins, J.P. & Thompson, S.P. Quantifying heterogeneity in a meta-analysis. *Stat. Med.* 21,
 1539–1558 (2002).
- 65. Higgins, J.P. *et al.* Measuring inconsistency in meta-analyses. *Br. Med. J.* **327**, 557–560
 (2003).
- 603 66. Fairfax, B.P. *et al.* Innate immune activity conditions the effect of regulatory variants upon 604 monocyte gene expression. *Science* **343**, 1246949 (2014).
- 605 67. Giambartolomei, C. *et al.* Bayesian test for colocalisation between pairs of genetic
- association studies using summary statistics. *PLoS Genet.* **10**, e1004383 (2014).
- 607 68. Guo, H. et al. Integration of disease association and eQTL data using a Bayesian
- 608 colocalisation approach highlights six candidate causal genes in immune-mediated

- 609 diseases. *Hum. Mol. Genet.* **24**, 3305-3313 (2015).
- 610 69. Arloth, J., Bader, D.M., Röh, S. & Altmann, A. Re-Annotator: Annotation pipeline for
- 611 microarray probe sequences. *PLoS One*. **10**, 1–13 (2015).

613 Competing Financial Interests

614 The authors declare no competing financial interests.

615









