Analysis of genomic DNA from medieval plague victims suggests long-term effect of Yersinia pestis on human immunity genes

2 3 4

1

Alexander Immel^{1,2,3}, Felix M. Key^{1,4*}, András Szolek^{5*}, Rodrigo Barquera^{1*}, Madeline K. Robinson⁶, Genelle F. Harrison⁶, William H. Palmer⁶, Maria A. Spyrou^{1,3}, Julian Susat², Ben Krause-Kyora², Kirsten I. Bos^{1,3}, Stephen Forrest³, Diana I. Hernández-Zaragoza^{1,7}, Jürgen Sauter⁸, Ute Solloch⁸, Alexander H. Schmidt⁸, Verena J. Schuenemann^{3,9}, Ella Reiter^{3,9}, Madita S. Kairies¹⁰, Rainer Weiß¹¹, Susanne Arnold¹¹, Joachim Wahl^{10,11}, Jill A. Hollenbach¹², Oliver Kohlbacher^{5,13,14,15,16}, Alexander Herbig^{1,3}, Paul J. Norman^{6#}, and Johannes Krause^{1,17,3#} 5 6 7 8 9 10

11

12 ¹ Max Planck Institute for the Science of Human History, Kahlaische Strasse 10, 07745 Jena, Germany

13 ² Institute of Clinical Molecular Biology, Kiel University, Rosalind-Franklin-Strasse 12, 24105 Kiel, Germany

14 ³ Institute of Archaeological Sciences, University of Tübingen, Rümelinstrasse 23, 72070 Tübingen, Germany

- 15 ⁴Max Planck Institute for Infection Biology, Charitéplatz 1, 10117 Berlin, Germany
- ⁵ Applied Bioinformatics, Dept. for Computer Science, University of Tübingen, Sand 14, 72076 Tübingen, Germany 16
- 17⁶ Division of Biomedical Informatics and Personalized Medicine, and Department of Immunology & Microbiology, 18 University of Colorado, CO 80045, USA
- 19 ⁷ Immunogenetics Unit, Técnicas Genéticas Aplicadas a la Clínica (TGAC), Mexico City, Mexico
- 20 ⁸DKMS, Kressbach 1, 72072 Tübingen, Germany
- 21⁹ Institute of Evolutionary Medicine, University of Zurich, Winterthurerstrasse 190, 8057 Zurich, Switzerland
- $\frac{21}{22}$ ¹⁰ Institute for Archaeological Sciences, WG Palaeoanthropology, University of Tübingen, Rümelinstrasse 23, 23 72070 Tübingen, Germany 24
- ¹¹ State Office for Cultural Heritage Management, Stuttgart Regional Council, Berliner Strasse 12, 73728 Esslingen, 25 Germany
- 26 ¹² UCSF Weill Institute for Neurosciences, Department of Neurology, University of California, San Francisco, USA 27
 - ¹³ Institute for Bioinformatics and Medical Informatics, University of Tübingen, Sand 14, 72076 Tübingen, Germany
 - ¹⁴ Ouantitative Biology Center, University of Tübingen, Auf der Morgenstelle 10, 72076 Tübingen, Germany
 - ¹⁵ Translational Bioinformatics, University Hospital Tübingen, Sand 14, 72076 Tübingen, Germany
 - ¹⁶ Biomolecular Interactions, Max Planck Institute for Developmental Biology, Max-Planck-Ring 5, 72076 Tübingen, Germany
- 34 ¹⁷ Max Planck Institute for Evolutionary Anthropology, Deutscher Platz 6, 04103 Leipzig, Germany 35
- *equal contribution 37
- #corresponding authors 38
- 39

28

29

30

31 32

33

36

This is an Open Access article distributed under the terms of the Creative Commons Attribution License

(http://creativecommons.org/licenses/by/4.0/), which permits unrestricted reuse, distribution, and reproduction in any medium, provided the original work is properly cited.

[©] The Author(s) 2021. Published by Oxford University Press on behalf of the Society for Molecular Biology and Evolution.

40 Abstract

Pathogens and associated outbreaks of infectious disease exert selective pressure on human 41 42 populations, and any changes in allele frequencies that result may be especially evident for 43 genes involved in immunity. In this regard, the 1346-1353 Yersinia pestis-caused Black 44 Death pandemic, with continued plague outbreaks spanning several hundred years, is one 45 of the most devastating recorded in human history. To investigate the potential impact of Y. 46 pestis on human immunity genes we extracted DNA from 36 plague victims buried in a mass grave in Ellwangen, Germany in the 16th century. We targeted 488 immune-related 47 48 genes, including HLA, using a novel in-solution hybridization capture approach. In 49 comparison with 50 modern native inhabitants of Ellwangen, we find differences in allele 50 frequencies for variants of the innate immunity proteins Ficolin-2 and NLRP14 at sites 51 involved in determining specificity. We also observed that HLA-DRB1*13 is more than 52 twice as frequent in the modern population, whereas HLA-B alleles encoding an isoleucine 53 at position 80 (I-80+), HLA C*06:02 and HLA-DPB1 alleles encoding histidine at position 9 54 are half as frequent in the modern population. Simulations show that natural selection has 55 likely driven these allele frequency changes. Thus, our data suggests that allele frequencies 56 of HLA genes involved in innate and adaptive immunity responsible for extracellular and 57 intracellular responses to pathogenic bacteria, such as Y. pestis, could have been affected by 58 the historical epidemics that occurred in Europe.

59 Introduction

60 Throughout evolution, humans have likely experienced multiple major episodes of infectious 61 disease. Of exceptional virulence and lethality, Yersinia pestis has been responsible for at least 62 three major plague pandemics during the last few millennia. Studies of ancient DNA have 63 confirmed Yersinia pestis caused widespread infections in Europe from the Late Neolithic period, nearly 5,000 years ago, until the 18th century AD (Andrades Valtuena et al., 2016; Bos et 64 65 al., 2016; Bos et al., 2011; Feldman et al., 2016; Keller et al., 2019; Namouchi et al., 2018; Rascovan et al., 2019; Rasmussen et al., 2015; Spyrou et al., 2018; Wagner et al., 2014). 66 Historical records show the first pandemic began with the Justinianic Plague in the 6th century 67 AD and lasted until the 8th century, the second began with the 1346-1353 Black Death and 68 continued with thousands of local plague outbreaks until the 18th century (Biraben, 1976; 69 70 Büntgen, Ginzler, Esper, Tegel, & McMichael, 2012) and the third pandemic started in China in the 19th century AD and spread the pathogen worldwide lasting up until the mid-20th century 71 72 (Morelli et al., 2010; Politzer & WHO, 1954). Of the three recorded pandemics, the Black Death 73 claimed up to half of the European population during its five-year period (Benedictow, 2004). 74Although Y. pestis is now absent from most of Europe, it still causes sporadic infections among 75 humans in the Americas, Africa and Asia, usually transmitted by fleas from rodent populations 76 that serve as plague reservoirs (Drummond et al., 2014; WHO, 2017). Although the lethality of 77 plague is very high without treatment (WHO, 2017), it remains likely that specific individuals 78 are protected from, or more susceptible to, severe disease through polymorphism in the 79 determinants of natural immunity. In this case, any changes in allele frequencies that occurred 80 during a given epidemic crisis could be evident as genetic adaptation and detectable in modern 81 day individuals.

82

There are multiple examples of natural selection affecting human immunity-related genes that can be attributed to challenge by pathogens. These examples include specific pathogens causing malaria, cholera or Lassa fever, or to wider differences in pathogen exposure between geographically discrete populations (Harrison et al., 2019; Karlsson et al., 2013; F. M. Key et al., 2014; Kwiatkowski, 2005; McManus et al., 2017; Sabeti et al., 2007; Voight, Kudaravalli, Wen, & Pritchard, 2006; Wang, Kodama, Baldi, & Moyzis, 2006). The toll like receptors (TLRs) are innate immune proteins that detect the presence of specific pathogens to initiate an immune

90 response. Signatures of purifying selection have been identified within specific TLR genes that 91 correlate with distinct pattern specificities of the encoded allotypes (Barreiro et al., 2009). In 92 another example, recent signatures of positive selection in the IFITM3 gene accompany 93 differential abilities of the alternative variants to control pandemic H1N1 influenza A virus 94 infection (Albright, Orlando, Pavia, Jackson, & Cannon Albright, 2008; Everitt et al., 2012). A 95 final example of human genetic adaptation to pathogens is the 32 base pair deletion in the 96 chemokine receptor CCR5 (CCR5- Δ 32), which prevents HIV from entering and infecting human 97 T-cells (Dean et al., 1996). Although once postulated as a plague resistance allele (Stephens et 98 al., 1998), there is little evidence for positive selection acting on $CCR5-\Delta 32$ (Sabeti et al., 2006). 99 By contrast, the Major Histocompatibility Complex (MHC), which encodes multiple immunity-100 related genes including the Human Leukocyte Antigen (HLA) molecules, does show evidence for 101 recent positive and balancing selection and has established roles initiating and directing the 102 immune response to infection (Klebanov, 2018; Parham & Moffett, 2013; Prugnolle et al., 2005; 103 Trowsdale & Knight, 2013).

104

Here, we extracted genomic DNA from 36 individuals who apparently died from plague (Y. *pestis*) in Ellwangen in Southern Germany during the 16th century. We also extracted DNA from 50 modern day Ellwangen inhabitants. We then compared their frequency spectra for a large panel of immunity-related genes. We observed evidence for pathogen-induced changes in allele distributions for two innate pattern-recognition receptors and four *HLA* molecules. We propose that these frequency changes could have resulted from *Y*. *pestis* plague exposure during the 16th century.

112

113 **Results**

114 Archaeological and Anthropological Findings

Ellwangen is a small town of 27,000 inhabitants situated in South Germany near the border of Baden-Wuerttemberg and Bavaria. Ellwangen was founded in the 7th century AD, with only a few hundred inhabitants until modern times. The town was affected by multiple plague outbreaks during the 16th and 17th centuries (Ellwangen, 2007). From 2013 to 2015 an excavation took place in Ellwangen during the restoration of the town's market square (Figure 1). Three mass graves were discovered with a total of 101 inhumated remains (Supplementary Figure 1A).

Consistent with 16th century bubonic plague predominantly affecting children (Bowsky, 1971; 121 122 Clouse, 2002; Cohn, 2003) only 23 of the individuals had reached adult age (Supplementary 123 Note 1). The individuals were buried close to each other and there was little sediment between 124 the distinct layers. The proximity, as well as radiocarbon dating, suggests that all three mass burials were created during the same epidemic crisis event during the 16th century 125 126 (Supplementary Figure 1B). Genomic DNA from Y. pestis was identified previously from 13 of 127 the individuals, and the complete genome of a strain consistent with the era was reconstructed 128 from one of them (Spyrou et al., 2019; Spyrou et al., 2016). We also performed shotgun 129 sequencing directly on DNA libraries prepared from tooth samples of 30 distinct individuals, and 130 pathogen screening using the metagenomic alignment tool MALT (Vågene et al., 2018) 131 identified reads matching to Y. pestis in 25 of them, with aDNA characteristic terminal 132 substitutions in samples with sufficient coverage (Supplementary Table 1), confirming that the 133 reads are of ancient DNA origin. With exception of one sequence read of Hepatitis B Virus in 134 one of the petrous bone samples (ELW012), no evidence of other pathogens was detected. 135 Additional archaeological and anthropological findings suggest little physical trauma, albeit poor 136 health condition prior to death, which can likely be considered as normal health and nutrition 137 status for people living in that time period (Supplementary Note 1). Taken together, these 138 findings strongly suggest that these individuals were victims of a single Y. pestis plague outbreak that occurred during the 16th century. 139

- 140
- 141

The 16th century Ellwangen plague victims display genetic similarity with modern inhabitants

From the 16th century mass grave site in Ellwangen, we successfully extracted DNA from 40 142 143 petrous bones (Supplementary Figure 1C) and four teeth. DNA of sufficient quality and quantity 144for genome wide sequence analysis was obtained from all samples. An average of 1.76 million unique, human genome reads per individual was generated by shotgun sequencing 145 146 (Supplementary Data 1A). Kinship analysis revealed three pairs of individuals to be first-degree 147 relatives (Supplementary Data 1B, Supplementary Figure 2). In order to obtain the most accurate 148 frequency distributions, one in each pair of the directly related individuals was removed from the 149 allele frequency calculations. In these cases, the individual having the lowest yield of sequence 150 reads was excluded (Material and Methods). In addition, one individual who was second-degree 151 related to two of the other individuals was also excluded (ELW030). We also obtained genomic

152DNA samples from 51 contemporary inhabitants of Ellwangen and shotgun-sequenced them 153with an average of 2.74 million unique human genome reads per individual (Supplementary Data 154 1A). Here, we identified a single pair of first-degree relatives and removed one individual. In 155order to test whether the two cohorts derive from a single continuous population, we tested for 156 population genetic similarity using Principle Component Analysis (PCA) (Patterson, Price, & 157 Reich, 2006) and ADMIXTURE analysis (Alexander, Novembre, & Lange, 2009). Showing that the 16th century and modern groups indeed are genetically very similar, we found that the 16th 158 159 century Ellwangen plague victims form a tight cluster in PCA space, which overlaps with the 160 modern inhabitants (Figure 2A). This finding is bolstered by the highly similar genetic ancestry 161 composition of the two groups as illustrated by their population admixture proportions (Figure 162 2B). This latter finding is important because recent demographic changes could alter allele frequencies of the modern compared with the 16th century group (Hellenthal et al., 2014). 163

164

165 <u>Two immunity-related genes harbor strongly differentiated SNPs</u>

In order to compare the allele spectra of immunity-related genes in the 16th century Y. pestis 166 167 plague victims with modern-day inhabitants of Ellwangen, we developed an in-solution 168 hybridization capture approach to enrich for 488 human genes implicated in immunity 169 (Supplementary Table 2). This approach allowed us to specifically target the genes of interest 170 while reducing the amount of sequencing required, leading to an average of 308 times more 171 reads on target compared to undirected genome wide sequencing (Supplementary Figure 3). We applied this 'immunity capture' method to all 16th century and modern DNA samples. The 172 173 targeted genes were covered with a mean read depth of 55.8 (Supplementary Data 2). We 174investigated the allele spectra of the 488 immunity-related genes by leveraging a branching 175statistic, Differentiation with Ancestral (DAnc) (F.M. Key, Fu, Romagné, Lachmann, & Andrés, 176 2016). DAnc is calculated per site and uses derived allele frequency estimates across three populations; 16th century and modern Ellwangen, and a non-European outgroup (we used Han 177 178 Chinese from Beijing (Abecasis et al., 2012)). DAnc scores can range from -1 to +1, and those in 179 the respective far tails of the distribution identify candidates for simulation studies that could 180 indicate positive selection has occured. We established the expected distribution of *DAnc* scores 181 (Supplementary Data 3) under neutrality through simulations using a human demographic model (Gravel et al., 2011). 182

183

184 In our analysis, the distribution of *DAnc* scores closely matches between the simulated and test 185 data (Supplementary Figure 4, Supplementary Table 3). In the far tail of the distribution 186 (>99.9%) we observed three SNPs, two in the Ficolin-2 (FCN2) gene and one in the NOD-like 187 receptor purine domain containing 14 (NLRP14) gene (Table 1) also corresponding to the 188 greatest F_{ST} values among the 488 genes for the same three SNPs (Supplementary Data 4). F_{ST} is 189 an established measure for population differentiation and corrects for expected heterozygosity 190 and sampling error (Weir & Cockerham, 1984). However, due to the ascertainment of SNPs, 191 which are not representative of the whole genome, the far tail of the observed DAnc or F_{ST} 192 distribution is no evidence alone for positive selection. Alternatively, we compared the fraction 193 of SNPs observed in the far tail of the simulated and test distribution, which suggest no 194 enrichment of SNPs in our test data and thus no evidence for positive selection using the data at 195 hand (Supplementary Table 3). Further analyses using a larger sample size and whole genome 196 data is necessary in order to understand the role of positive selection due to historic epidemics.

197

The identified SNPs of FCN2 are a 5' UTR promoter variant [rs17514136 (-4 A to G)] and one 198 199 coding change variant [rs17549193 (717 C to T; 236 Thr to Met)]. The UTR and coding change variants occur in complete linkage disequilibrium (Δ '= 1.0, R²=0.9), and appear to represent a 200 201 single haplotype that has risen in frequency in the modern population. Interestingly, FCN2 binds 202 to specific molecules on the surface of bacteria, triggering the complement pathway to neutralize 203 the pathogen (Hoang et al., 2011; Luo et al., 2013). The promoter variant is associated with 204 increased serum concentration of FCN2 (Cedzynski et al., 2007), whereas polymorphism at 205 residue 236 (rs17549193) affects binding to the target bacteria (Hummelshoj et al., 2005). 206 Similarly, NLRP14 belongs to inflammasome complex proteins, which are intracellular pattern 207 recognition receptors that trigger local and systemic responses to microbial invasion (Martinon, 208 Burns, & Tschopp, 2002). Inflammasomes are implicated in the immune response to Yersinia 209 infection, amongst other pathogens (Philip, Zwack, & Brodsky, 2016; Vladimer, Marty-Roix, 210 Ghosh, Weng, & Lien, 2013). The NLRP14 SNP is a coding change variant (rs10839708 [2745 211 G to A: 808 Glu-Lys]) that occurs in the leucine-rich repeat (LRR) domain, which in related 212 molecules controls the ligand specificity (Inohara, Chamaillard, McDonald, & Nunez, 2005). 213 Thus, in summary we show immune-related genes have no significant frequency changes

215

216 No evidence for role of CCR5- Δ 32 in protection from Y. pestis infection

217 We investigated the $\Delta 32$ deletion in the CCR5 locus (chr3:46414947-46414978), which was 218 included in our target regions because this mutation has previously been suggested as protective from the plague. We found that CCR5- Δ 32 has a frequency of 16.6% in the 16th century 219 220 compared to 10.8% in the modern individuals (p=0.27) and 11.2% in Germany (Supplementary 221 Data 5A and 5B, Supplementary Data 6A, Table 2). Consistent with epidemiological modeling 222 and lack of evidence that CCR5 can serve as a Y. pestis receptor (Galvani & Slatkin, 2003) this 223 finding suggests that the CCR5- Δ 32 mutation provided no protection from Y. pestis. Similarly 224we also investigated SNPs rs4986790, rs4986791 within the gene TLR4 previously suggested to 225 be associated with resistance to Y. pestis (Al Nabhani, Dietrich, Hugot, & Barreau; Laayouni et 226 al., 2014). However, we did not find any significant differences in their respective frequencies 227 (Supplementary Table 4).

228

Natural selection has increased HLA-DRB*13 and reduced HLA-B*51 and -C*06 frequencies in modern individuals

231 With more than 28,000 distinct alleles described (Robinson et al., 2015), HLA molecules are 232 encoded by the most polymorphic gene complex in humans. When human populations are 233 exposed to novel diseases through contact with populations or environments they had not 234 encountered previously, changes in *HLA* allele frequencies can occur rapidly (Lindo et al., 2016; 235 Patin et al., 2017). Consequently, the signatures of balancing selection in the genomic region that 236 contains HLA are consistently the strongest in the genome (Quintana-Murci, 2019; Sabeti et al., 237 2006), and specifically correspond to amino acid residues that bind peptide fragments derived 238 from pathogens (Bjorkman & Parham, 1990). Significant shifts in HLA allele frequencies can 239 thus reveal evidence of natural selection for specific pathogen resistance. We were able to 240 identify HLA class I (-A, -B, -C) and HLA class II (-DPA1, -DPB1, -DQA1, -DQB1 and -DRB1) genotypes from all of the 16th century and modern inhabitants of Ellwangen. We observed a total 241 242 of 86 distinct HLA class I alleles, 66 distinct HLA class II alleles and 168 distinct HLA 243 haplotypes (Supplementary The (HLA-Data 6B). most frequent haplotype $A*01:01 \sim B*08:01 \sim C*07:01 \sim DRB1*03:01$) is the same in both groups and is also the most 244

common and widespread across Europe today (Darke et al., 1998; Dunne, Crowley, Hagan,
Rooney, & Lawlor, 2008; Johansson, Ingman, Mack, Ehrlich, & Gyllensten, 2008; Nowak et al.,
2008; Pingel et al., 2013). Thus the diversity and composition of *HLA* haplotypes appears as
expected for Northern European populations (Alfirevic et al., 2012), and we did not observe any
significant differences in their frequencies between the 16th century and modern individuals.

250

251 By contrast to the haplotype distributions, on examining the individual HLA class I genes, we observed that the *B*51:01* allele of *HLA-B* decreased from 15.3% in the 16th century Ellwangen 252 253 plague victims to only 6.0% (p=0.04 (p-corrected = NS); DANc= -0.093) in the modern 254 Ellwangen population (Table 3, Supplementary Data 4, Supplementary Data 5A). Similarly, the 255C*06:02 allele of HLA-C decreased from 13.9% to 5% (p=0.04 (p-corrected = NS); DANc= 256 0.053). HLA-B*51:01 and -C*06:02 are not in linkage disequilibrium in either population 257 (Supplementary Data 6B), and so these two observations are independent. In addition, although 258 there were no significant frequency differences observed for any HLA class II alleles as 259 determined at two-field resolution, we observed that all allotypes present representing the DR13 serological group (Holdsworth et al., 2009) were at substantially lower frequency in the 16th 260 261 century than modern Ellwangen population. Accordingly, by considering them together, there was an increase in *DR13* frequency from 5.6% in the 16^{th} century to 17.0% in the modern 262 263 individuals (p=0.026, Table 3, Supplementary Data 5A). Repeating this analysis for all the major 264 DRB1 lineages present (Holdsworth et al., 2009), showed DRB1*13 as the only allotype 265 differing in frequency between the two groups (Table 3). We used Wilson Score Interval 266 estimation of the 95% binomial confidence interval. The 95% CI of HLA-B*51:01 was 0.09 -267 0.25 (observed = 0.06), the 95% CI of HLA-C*06:02 was 0.08 - 0.24 (observed = 0.05), and 268DRB1*13 was 0.02 - 0.13 (observed = 0.16). Thus, for each of the three HLA allotypes showing distinctions between modern and 16th century inhabitants of Ellwangen, the observed modern 269 270 allele frequencies are outside the 95% binomial confidence intervals surrounding sampling of the 16th century allele frequencies. We further validated these findings by comparing the *HLA* allele 271 272 frequencies observed in the Ellwangen individuals with a large panel (N=8,862) of unrelated 273 bone marrow donor registry volunteers gathered from all of Germany (Supplementary Data 5B). 274 Whereas there were no significant allele frequency differences when comparing modern 275 inhabitants of Ellwangen with modern Germany as a whole, we observed significantly lower frequencies of B*51:01 in modern Germany (5.5%) than the Ellwangen plague victims (15.3%), when applying a pairwise proportion test (p=0.005; DANc= -0.098). We also observed differences in *HLA-C*06* and *DRB1*13* between the plague victims and modern Germany, but these were not statistically significant (Supplementary Data 5B).

280

281 To distinguish if the changes in frequencies of B*51:01, C*06:02 and DRB1*13:01 were more 282 likely to be due either to natural selection or genetic drift we performed forward time simulations by starting from the observed polymorphisms in the 16th century Ellwangen and modelling 283 284 neutrality for the last 500 years. This way it was possible to start from reasonable levels of 285 genetic variation without the necessity to determine the impact of ancient selection on HLA and 286 episodic turnover of HLA alleles. Moreover, this way each allotype could be tested individually. 287 Again, we observed an overall concordance between median frequencies of the simulated neutral 288 alleles and the modern Ellwangen allele frequencies, as is expected under genetic drift. By 289 contrast, the allele frequencies of B*51:01, C*06:02 and DRB1*13:01 observed for modern 290 inhabitants of Ellwangen were in the extreme tails of their respective distributions ($p^{sim}=0.006$, 291 0.004, <0.001, respectively, Figure 3), suggesting natural selection likely drove the change in 292 these allele frequencies. A similar significant shift was observed when we considered DR13 broadly $(p^{sim} < 0.001)$. To quantify the selection coefficient (s) responsible for these changes, we 293 294 performed the simulations incorporating selection, mirroring the timeline of the plague, across a 295 range of s values. We identified an s equal to -0.25 was most likely to produce the observed 296 decrease in B*51:01 alleles as well as an s equal to -0.27 in case of C*06:02. An s of 0.37 was 297 most likely to cause the increase in DRB1*13:01 (Supplementary Figure 5). Notably, these 298 values are within the range of previously reported values of s acting on MHC (Radwan, Babik, 299 Kaufman, Lenz, & Winternitz, 2020).

300

301 *Higher incidence of KIR3DL1 interaction with HLA-B in plague victims than modern inhabitants* 302 *of Ellwangen*

The binding specificity of HLA allotypes, and thus their function and distinctiveness, is determined by specific amino acid residues in the alpha-helix of the molecule. Polymorphism of these amino acid residues is associated with autoimmune diseases and response to pathogens (Achkar et al., 2012; Hammer et al., 2015; Hollenbach et al., 2019; Sun et al., 2018). We 307 identified three of these residues having significant (p<0.05) differences in frequency between the 16th century victims and modern individuals (Supplementary Data 7A). We observed 308 309 histidine (H) at position 9 of HLA-DPB1 to be approximately three times more frequent in the 16^{th} century (13%) than the modern (4%) individuals (p=0.03 (p-corrected = NS); DANc= 0.13); 310 311 Supplementary Data 7A). We also observed isoleucine (I) at position 80 (I-80) in HLA-B twice as frequently in the 16th century (28%) than in the modern individuals (15%) (p=0.04 (p-312 313 corrected = NS); DANc= 0.28), and aspartic acid (D) at position 114 in HLA-C more frequently in the 16^{th} century (85%) than the modern (70%) individuals (p=0.02 (p-corrected = NS); 314 DANc= -0.062); Supplementary Data 7A). Residue D-114 is located in the outward-facing 315 316 groove of HLA-C and its variation can directly affect the sequence of endogenous peptides able 317 to bind (Di Marco et al., 2017). Since HLA-B alleles encoding I-80 are most commonly observed 318 on haplotypes that also have HLA-C alleles that encode D-114 (Cao et al., 2001), it is likely that 319 the observed frequency difference at this position is driven by linkage disequilibrium with HLA-320 B. HLA-B*27:02, -B*38:01, -B*49:01, -B*51:01, -B*52:01, -B*57:01 and -B*58:01 are all I- 80^+ allotypes that are more frequent in the 16^{th} century than the modern inhabitants of Ellwangen 321 322 (Supplementary Data 7B and 7C), together accounting for the observed difference in I-80 323 frequency (Table 3). Thus, it is likely that the significant difference in frequencies we observed 324 for HLA-B*51:01 can be attributed to the fact that it possesses an isoleucine at position 80. We 325 next tested whether the observed frequency changes in HLA-DPB1 H-9 and HLA-B I-80 were 326 more likely due to genetic drift or natural selection, using neutral forward genetic simulations as 327 above. In both cases, we found these allele frequency shifts were unlikely to be observed unless natural selection was included in the model (HLA-DPB1 H-9 p^{sim}=0.014, HLA-B I-80 328 $p^{sim} = 0.002$). 329

330

KIR genes encode surface proteins on natural killer (NK) cells whose interaction with HLA class I molecules can determine the outcome of NK cell responses (Guethlein, Norman, Hilton, & Parham, 2015). For example, polymorphism of residue 80 in HLA-B controls its ability to bind to KIR3DL1, with I-80 defining ligand specificity and permitting the strongest interaction (Saunders et al., 2015). We therefore sought to determine whether the observed high frequency of *HLA-B I-80*⁺ alleles in the 16th century samples affects the frequency of HLA-B interaction with KIR3DL1. The *KIR* region varies by gene content (Uhrberg et al., 1997), and we were able

to determine this diversity across all the 16th century individuals (Supplementary Figure 6). We 338 observed that 97% of the 16th century individuals possess at least one copy of KIR3DL1, 339 340 compared to 88% of the modern Ellwangen samples. These values are within the range observed 341 in modern European populations (Hollenbach, Nocedal, Ladner, Single, & Trachtenberg, 2012) as well as those predicted in our neutral forward genetic simulations ($p^{sim}=0.258$). Thus, we 342 observe no statistically significant differences in KIR3DL1 gene frequencies between the 16th 343 344 century and modern samples (Table 4A). Similarly, we observed no difference in KIR3DL1 allele frequencies (Supplementary Data 6C) between the 16th century and modern individuals 345 (Table 4A). By contrast, we found that KIR3DL1 and HLA-B I-80⁺, and thus their combined 346 genotype, is more frequent in 16th century (53%) than modern (26%) individuals (p=0.011 (p-347 348corrected = NS), Table 4B). Using simulations, we found that genetic drift was unlikely to produce the modern day observed frequencies of HLA-B I-80 and KIR3DL1, but that selection 349 350 against HLA-B I-80 likely drove the decreased HLA-B I-80⁺/KIR3DL1⁺ joint genotype frequencies ($p^{sim}=0.002$). 351

352

353 **Discussion**

354In this study we investigate a large panel of immunity-related genes from 36 individuals discovered in three 16th century plague mass graves in Ellwangen, Southern Germany, and 355 356 compare them to 50 present-day inhabitants of Ellwangen. For this purpose, we developed a 357 targeted DNA capture protocol comprising 488 human immune system genes including the six major HLA class I and class II genes and the KIR locus. We also compared the 16th century HLA 358 359 allele frequencies with sequence data of 8,862 potential stem cell donors registered with DKMS 360 (German Bone Marrow Donor Registry). Although we observe a predominant genetic stability of 361 human immune genes over at least five centuries in Central Europe, we find distinct allele 362 frequency changes in the HLA and in two other genes that encode components of innate 363 immunity.

364

Given its devastating effect, the *Y. pestis*-driven 2^{nd} plague pandemic is a strong candidate for exerting selection pressure on the human immune response (Laayouni et al., 2014; Lenski, 1988). We observed strong allele frequency differences at SNPs located in the *FCN2* and *NLRP14* genes, albeit we find no clear evidence that positive selection has contributed to the 369 observed allele frequency differentiation. Both of these molecules are pattern recognition 370 receptors that bind specific pathogen-derived components to initiate the inflammation response; 371 Ficolin-2 does this extracellularly, and NLRP14 intracellularly. Ficolin-2 promotes phagocytosis 372 of pathogenic bacteria (Hoang et al., 2011; Luo et al., 2013). Interestingly, we observed two 373 SNPs of known direct functional effect to be in strong LD, forming a single haplotype that is elevated in frequency in the modern compared to the 16th century individuals. This haplotype 374 375 both increases serum concentration and alters the binding properties of Ficolin-2 (Cedzynski et 376 al., 2007; Hummelshoj et al., 2005), which makes it a good candidate for providing improved 377 resistance to Y. pestis infection. On the other hand, less is known about NLRP14, which has 378 similar domain organization to other inflammasome proteins. Inflammasomes act to trigger 379 inflammation as well as self-destruction of infected cells (Lamkanfi & Dixit, 2014) and have been identified recently as important mediators of the immune response to Y. pestis (Park et al., 380 381 2020). Interestingly, the same variant we observed at lower frequency in modern individuals than 382 plague victims (K-808) was identified at high frequency due to positive selection in the Human 383 Genome Diversity-Project populations from East-Asia (Vasseur et al., 2012). Similar 384inflammasome molecules, including NLRP3 and NLRP12, are known to respond to Y. pestis 385 (Vladimer et al., 2013; Vladimer et al., 2012), but may also be exploited by bacteria to inhibit 386 immunity (Anand et al., 2012; Philip et al., 2016; Zaki, Man, Vogel, Lamkanfi, & Kanneganti, 387 2014). K-808 is located in the LRR domain of NLRP14 and influences ligand specificity. 388 Therefore, the fluctuating frequencies of the variants at this position point to an evolutionary 389 battle between host and pathogen (Abi-Rached, Dorighi, Norman, Yawata, & Parham, 2007). 390 Functional tests are thus required to determine if mutation at residue 808 permits recognition of 391 any components of Y. pestis.

392 On examination of HLA alleles we observed candidates for natural selection of human adaptive 393 immune responses. HLA class I and II are cell surface molecules that bind to peptides derived 394 from intracellular or extracellular proteins, respectively. To trigger and drive the adaptive 395 immune response, these peptides are presented by the HLA molecules to T-cells. Antibody 396 production is elicited through highly polymorphic HLA class II molecules, HLA-DP, -DQ, and -397 DR, presenting pathogen-derived peptides to CD4+ T-cells (Neefjes, Jongsma, Paul, & Bakke, 398 2011). Direct killing of infected cells can occur when any of three highly polymorphic HLA 399 class I molecules, HLA-A, -B or -C, presents pathogen-derived peptides to cytotoxic CD8+ T-

400 cells (Doherty & Zinkernagel, 1975). The HLA-DRB1*13 allelic group increased in frequency 401 from 5.6% in the plague victims to 17% in the modern Ellwangen individuals and 12% in the 402 German bone marrow donors, potentially indicating antibody-driven protection from the plague 403 for individuals having this allotype. HLA-DRB1*13 is associated with resistance to M. 404 tuberculosis (Dubaniewicz, Lewko, Moszkowska, Zamorska, & Stepinski, 2000). Similar to Y. 405 pestis, M. tuberculosis can invade and survive within macrophages (Pieters, 2008). Macrophages 406 express high levels of HLA class II and are cells that are specialized for presenting peptides to 407 CD4+ T cells to initiate antibody production. These HLA class II molecules can present antigens 408 from intracellular pathogens, such as M. tuberculosis (Ankley, Thomas, & Olive, 2020). Thus, 409 the same adaptive immune pathway triggered by HLA-DRB1*13 that provides resistance to M. 410 tuberculosis, might also provide resistance to Y. pestis.

411

412 Some HLA class I allotypes interact with killer-cell immunoglobulin-like receptors (KIRs) to 413 modulate the function of Natural Killer (NK) cells, which are essential components of innate 414 immunity, providing front-line defense against infection (Guethlein et al., 2015; Long, Kim, Liu, 415 Peterson, & Rajagopalan, 2013). The KIR locus varies by gene content (Uhrberg et al., 1997; 416 Wilson et al., 2000) and is located on a separate chromosome (chr19) to HLA (chr6). 417 Combinatorial diversity of HLA class I and KIR allotypes directly impacts NK cell responses to 418 infection (Bashirova, Martin, McVicar, & Carrington, 2006; Parham & Moffett, 2013). We 419 observed a lower frequency of the HLA-B allotypes that can interact with KIR3DL1 in the 420 modern individuals than we did in the plague victims, suggesting this combination could have 421 been disadvantageous for individuals infected with Y. pestis. KIR3DL1 is an inhibitory receptor 422 that enables NK cells to respond strongly to changes in HLA expression by infected cells 423 (Boudreau & Hsu, 2018; Saunders et al., 2015) (Gumperz, Litwin, Phillips, Lanier, & Parham, 424 1995). Finally, we observed a marked decrease in the frequency of HLA-C*06:02 when comparing the 16th century and modern Ellwangen populations. HLA-C*06:02, which also 425 426 interacts strongly with KIR (Hilton et al., 2015), is strongly associated with psoriasis (Ogawa & 427 Okada, 2020), an immune-mediated disease. These observations implicate excess collateral 428 damage caused by NK cells responding to infection (Guo, Patil, Luan, Bohannon, & Sherwood, 429 2018; Kim et al., 2008), as a potential mechanism of pathology.

A limitation of this study is the relatively small sample size of 36 plague victims from the 16th 431 432 century. As suggested by our effect size analyses (Supplementary Figure 7), with the given 433 sample size only large effects (w = 0.40 - 0.45) can be detected, and therefore, the observed 434 frequency changes do not withstand multiple testing correction. Thus, it also remains possible 435 that the signals of selection we detected for some variants are caused by drift and/or sampling 436 biases, and, on the other hand, some other variants under selection were potentially not targeted 437 through this approach. Increasing the sample size in future studies will allow addressing this caveat. Moreover, all tested individuals are 16th century late plague victims, and it remains 438 439 possible that stronger selection signatures could be observed when analyzing individuals who 440 died of plague in earlier pandemics. Importantly, further cohorts of Y. pestis victims are required 441 to verify the observations in this study in different geographic contexts, and also whether the 442 associations with the above-mentioned immunity genes are specific to the plague or might be 443 caused by other pathogens (Galvani & Slatkin, 2003). Furthermore, the demographic model we 444 used for simulation of natural selection is fitted to the CEU population (Central Europeans from 445 Utah) (Gravel et al., 2011) and assumes an exponential population growth. However, the CEU 446 population might have had a different demographic history than Ellwangen. It cannot, therefore, 447 be ruled out that the results from our analysis of natural selection may be inaccurate, if 448 Ellwangen has undergone stronger genetic drift than CEU. Nevertheless, our simulation results 449 provide preliminary evidence for natural selection as the main driving agent for the decrease of 450 frequencies in HLA-C*06:02, HLA-B*51:01 (and other HLA-B I-80⁺ alleles), and HLA-DPB1-451 H9 on the one hand, and the frequency-increase in HLA-DRB1*13 on the other hand. We note 452 that the frequency changes we observed are based on simulations of episodic selection and could 453 also be derived through alternative scenarios, including constant selection pressure (e.g. s of -4540.012 B*51, -0.014 C*06, 0.06 DRB1*13); (data not shown), or other epidemic challenges, such as smallpox or tuberculosis, occurring since the 16th century. However, we did not find evidence 455 456 of smallpox or tuberculosis in the plague victims' DNA. Comparison with non-plague victims 457 from the same time period will be necessary to definitively answer this question. Our results do 458 not provide support for the proposition that evolution of human immunity drove reduction of Y. 459*pestis* virulence and its disappearance from Europe (Ell, 1984). Instead, we provide first evidence 460 for evolutionary adaptive processes that might be driven by Y. pestis and may have been shaping 461 certain human immunity-relevant genes in Ellwangen and possibly also in Europe. As the earliest

victims of *Y. pestis* in Europe were already present in the Late Neolithic (Andrades Valtuena et
al., 2016; Rascovan et al., 2019; Rasmussen et al., 2015) and Europeans were intermittently
exposed to plague for almost 5,000 years, it is possible that relevant immunity alleles had already
been pre-selected in the European population long ago and maintained by standing variation
(Ralph & Coop, 2015) but recently became selected through epidemic events. Whilst *Y. pestis*seems a likely culprit, this remains to be determined through replication cohorts and further
functional analyses.

- 469
- 470
- 471
- 472
- 473
- 474

475 Material and Methods

476 <u>Anthropological analyses</u>

477 Anthropological analyses on the skeletal remains were conducted in the Institute of 478 Paleoanthropology, University of Tübingen. Diseases of the periodontium and the teeth, 479 nonspecific stress markers and deficiencies, degenerative transformations, inflammatory bone 480 changes, and trauma were recorded (Supplementary Note 1). The body height of the adult 481 individuals was reconstructed and the growth course of the sub adult individuals was analyzed 482 (Kairies, 2015).

483

484 <u>C14-Dating of the archaeological remains from Ellwangen</u>

Acceleration Mass Spectrometry Radiocarbon (AMS-C14) dating was conducted at the CurtEngelhorn Center for Archaeometry in Mannheim. Calibration was performed based on the
INTCAL13 and the SwissCal 1.0 calibration curves.

488

489 <u>DNA extraction</u>

490 Petrous pyramids were cut longitudinally in order to enable access to the bony labyrinth

491 (Supplementary Figure 1C), which is the densest part of the mammalian body (Frisch, Sorensen,
492 Overgaard, Lind, & Bretlau, 1998) and provides the highest endogenous DNA yields (Pinhasi et

493 al., 2015). After cleaning the surface on one side of the bony labyrinth with the drill bit, 494 sampling was performed along the semicircular canal, which yielded 80-120 mg bone powder. 495 DNA extraction was performed by guanidinium-silica based extraction (Rohland & Hofreiter, 496 2007) using all the bone powder obtained. Tooth samples were cut in the middle, thus separating 497 the crown from the root, followed by drilling into the dental pulp to produce bone powder (ca. 498 100 mg). Saliva samples were obtained from 51 living Ellwangen citizens using Whatman 499 OmniSwab cheek swabs. Samples were obtained only from individuals whose families have been 500 resident in Ellwangen for at least four generations. Consent was given by the contributing 501 persons and their samples were anonymized. Approval for the study was granted by the Ethics 502 Committee of the Faculty of Medicine of the Eberhard Karls University and the University 503 Hospital Tübingen. Isolation of genomic DNA was performed using the QIAamp DNA Blood 504 *Mini Kit* following the *Qiagen* protocol.

505

506 *Preparation of libraries and sequencing*

507 Overall strategy: Indexed libraries were generated from all samples and the sequencing was then 508 performed in two stages. First, an aliquot of the full DNA library was subjected to whole genome 509 sequencing. Then, a second aliquot was subjected to enrichment for selected immunity-related 510 genes and subsequently sequenced.

511

Since our protocols for DNA extraction and library preparation are optimized for short-length 512 513 ancient DNA, and in order to avoid potential bias through laboratory methods, we sheared the 514 DNA extracted from modern individuals using ultrasonic DNA shearing to the same average 515 length as the ancient DNA. Therefore, the modern DNA was sheared to an average fragment 516 length of 75 bp using a Covaris M220 Focused ultrasonicator. DNA libraries, including sample-517 specific indices, were prepared using 20 µl of each extract following published protocols 518 (Kircher, Sawyer, & Meyer, 2012; Meyer & Kircher, 2010). For the ancient samples, partial 519 uracil-DNA-glycosylase treatment was first applied (Rohland, Harney, Mallick, Nordenfelt, & 520 Reich, 2015). Sequencing was performed using an Illumina Hiseq 4000 instrument with 75+8 521 cycles in single-end mode.

- 522
- 523

524 *Screening for pathogens*

525 DNA samples were screened for their metagenome content using the alignment tool MALT 526 version 0.3.8 (Vågene et al., 2018) and the metagenome analyzer MEGAN V6.11.4 (Huson, 527 Auch, Qi, & Schuster, 2007) (Supplementary Table 1).

528

529 Since petrous bone samples are not ideal for pathogen screening, we additionally accessed well-530 preserved tooth samples from 30 distinct 16th century plague victims. Teeth were not available 531 from all individuals from whom we had obtained petrous bones, nor could they be 532 unambiguously attributed to specific individuals. Sequencing libraries and shotgun sequencing 533 were performed on the teeth following published protocols as described above.

- 534MALT was used to align all pre-processed reads against a collection of all complete bacterial 535 genomes obtained from NCBI (ftp.ncbi.nlm.nih.gov/genomes/refseq/bacteria, access 536 12.03.2018). MALT was executed in BLASTN mode for bacteria using the following command: 537 malt-run --mode BlastN --e 0.001 --id 95 --alignmentType SemiGlobal --index \$REF --inFile 538 \$IN --output \$OUT (where \$REF is the MALT index). The e-value (--e) is a parameter that 539describes the number of hits that are expected to be found just by chance. The --id parameter 540 describes the minimum percent identity that is needed for a hit to be reported. As the screening 541 with MALT was performed on aDNA data the applied filters are not very stringent since we 542 expect substitutions in organisms from ancient samples.
- Reads assigned to the *Yersinia pestis* node and reads assigned to the nodes below, were extracted using the extract reads function in MEGAN. For subsequent verification blastn (version 2.7.1) was used to blast the extracted reads against *Yersinia pestis* (NC_003143.1) and *Yersinia pseudotuberculosis* (NC_010634.1). The following custom blast command was used:
- blastn -db \$REF -query \$IN -outfmt "6 qseqid sseqid pident length mismatch gapopen qstart
 qend sstart send evalue bitscore gaps" (where \$REF is the reference genome and \$IN are the
 extracted reads from MEGAN).
- 550

551 *Targeted sequencing of immunity-related genes*

552 Indexed libraries containing 20 μ l DNA each were amplified in 100 μ l reactions in a variable 553 number of one to seven cycles to reach the required concentration of 200 ng/ μ l for enrichment, 554 followed by purification using *Qiagen MinElute* columns. Using an in-solution capture-byhybridization approach (Fu et al., 2013), DNA molecule fragments originating from immunity
genes were enriched from the total DNA. The design and manufacture of the capture probes are
described below. Sequencing was performed as above.

558

559 DNA damage estimation

560 We performed an initial analysis of the merged data using the EAGER pipeline (Peltzer et al., 561 2016) as follows: reads were mapped to hg19 (The Genome Sequencing Consortium, 2001) 562 using the *aln* algorithm in *BWA 0.7.12* (H. Li & Durbin, 2010) with a seed length (k) of 32, the samtools mapping quality parameter "q" set to 30 and a reduced mapping stringency parameter 563 564 "-n 0.01" to account for damage in ancient DNA. On average 2.2 million reads (51%) from the 565plague victims with an average length of 59 bp, and 4.2 million reads (91%) from the modern 566 individuals with an average length of 68 bp, mapped uniquely to hg19 (Supplementary Data 1A). 567 To assess the authenticity of the ancient DNA fragments, C to T misincorporation frequencies 568 (Briggs et al., 2007) were obtained using mapDamage 2.0 (Jonsson, Ginolhac, Schubert, 569 Johnson, & Orlando, 2013). As expected from partial UDG-treatment (Rohland et al., 2015), 570 ancient DNA sequences showed C to T substitutions at the first two positions of their 5' ends and 571 G to A substitutions at the 3' ends (Supplementary Data 1A). The first two positions from the 5' 572 end of the fastq-reads were trimmed off. The modern sample DNA sequence reads were not 573 subjected to this trimming.

574

575 <u>Sex determination</u>

576 Genetic sex was determined based on the ratio of sequences aligning to the X and Y 577 chromosomes compared to the autosomes (Skoglund, Storå, Götherström, & Jakobsson, 2013).

578

579 *Final data collation*

580 Contamination was estimated through examination of mitochondria sequences using the software 581 *Schmutzi* (Renaud, Slon, Duggan, & Kelso, 2015), and in males additionally on the X-582 chromosomal level by applying *ANGSD* (Korneliussen, Albrechtsen, & Nielsen, 2014). 583 Contamination estimates ranged between 1 and 3% on mitochondrial and between 0.2 and 2.9% 584 on X-chromosomal level (Supplementary Data 1A). Datasets showing >8% contamination were 585 excluded from further analyses. 586

587 *Genotyping*

588 SNPs were drawn at random at each position from a previously published dataset of 1,233,013 589 SNPs (Haak et al., 2015; Lazaridis et al., 2014; Mathieson et al., 2015) in a pseudo-haploid 590 manner using *pileupcaller* from the *sequenceTools* package (Lamnidis et al., 2018). Samples 591 having fewer than 10,000 calls from a set of 1,233,013 SNPs were excluded. Forty-four datasets 592 from ancient samples (40 from petrous bones and four from teeth) and 52 datasets from modern 593 saliva samples remained.

594

595 *Population genetic analyses*

596The genotype data from both Ellwangen populations were merged with a dataset of previously 597 published West Eurasian populations genotyped on the aforementioned 1,233,013 SNPs 598 (Mathieson et al., 2015) using the program *mergeit* from the *EIGENSOFT* package (Patterson et 599 al., 2006). Principle Component Analysis (PCA) was performed using the software smartpca 600 (Patterson et al., 2006). Admixture modelling was performed using the software ADMIXTURE 601 (Alexander et al., 2009) with 65 West Eurasian populations from the Affymetrix Human Origin 602 dataset, and the number of ancestral components ranging from K=3 to K=12. Cross-validation 603 was performed for every admixture model and the model with the highest accuracy was 604 determined by the lowest cross-validation error.

605

606 Kinship analysis

607 Kinship was assessed using three different software packages: *READ* (Monroy, Jose, Jakobsson, 608 & Günther, 2017), lcMLkin (Lipatov, Sanjeev, Patro, & Veeramah, 2015) and outgroup f3 609 statistics (Patterson et al., 2012). READ identifies relatives based on the proportion of non-610 matching alleles. *lcMLkin* infers individual kinship from calculated genotype likelihoods, and f3 611 statistics can be used to identify relatives based on the amount of shared genetic drift. A pair of 612 individuals was regarded related if evidence of relatedness was independently provided by at 613 least two programs. For the modern population a first-degree relationship (parent-child or 614 siblings) was detected by all three programs for EL1 and EL57. For the plague victims, evidence 615 of a first-degree kinship was provided from all three programs for three pairs of individuals: 616 ELW015 and ELW037, ELW016 and ELW017, and ELW036 and ELW039. Support from at

617 least two programs was given for second degree relatedness (grandparent-grandchild, uncle-618 nephew or first cousins) for two pairs: ELW021 and ELW030, and ELW007 and ELW039. 619 Second- or higher-degree relatedness was suggested for the pair ELW030 and ELW034. Nine 620 further observations of second-degree relationships were observed, but supported by only one 621 program at a time and therefore not regarded as reliable kinship estimates (Supplementary Figure 622 2). Individuals EL57, ELW017, ELW030, ELW037 and ELW039 were excluded from allele 623 frequency calculations, since they constitute kinship "nodes" or "leaves" that would bias allele 624 frequencies as they do not contribute to the total allele diversity.

625

626 *Effect size analysis*

Effect sizes were estimated and plotted in G^*Power 3.1.9.2 (Faul, Erdfelder, Lang, & Buchner, 2007) based on the given sample size and a power of 0.8. Effect size analysis has shown that with the current sample size large to medium effects (w=0.45-0.4) could be detected (Supplementary Figure 7).

631

632 *Probe design for immune-capture*

633 Enrichment of selected target genomic regions prior to sequencing can save sequencing costs and 634 significantly reduce microbial DNA contaminants (Fu et al., 2016; Gnirke et al., 2009; Haak et 635 al., 2015; Lazaridis et al., 2014; Mathieson et al., 2015). We therefore selected a set of 488 636 different human genes representative of the innate and adaptive immune system (Supplementary 637 Table 2). Exon sequences were extracted from the human genome build hg19 (The Genome 638 Sequencing Consortium, 2001) using the *RefSeqGene* records from the *NCBI/Nucleotide* 639 database and then selecting "Highlight Sequence Features" and "Exon". We added alternative 640 alleles for HLA, MIC, TAP and KIR, which were obtained from the IMGT/HLA database 641 (Robinson et al., 2015). For HLA class I and KIR genes the intronic regions were also included. 642 For the HLA and MIC genes a set of 83 representative alleles with full-length gene sequences 643 was chosen that encompasses the major serologically defined subclasses (Holdsworth et al., 644 2009) and covers 95% of the known polymorphism. To capture the remaining 5%, a set of 162 x 645 160 bp consensus sequences was designed.

A 60 bp probe was designed at every 5 bp interval along the target sequence. The last (3') 8 bp of each generated sequence was replaced by a custom primer sequence, so that probes could be 648 amplified. The final 52 bp probe sequences were mapped to hg19 using RazerS3 (Weese, 649 Holtgrewe, & Reinert, 2012) with minimum threshold of 95% identity. Duplicates and probe 650 sequences that mapped more than 20 times were removed. This process resulted in a final set of 651 322,667 unique probe sequences of 52 bp length. The probe set was tripled to complete capacity 652 of the Agilent 1-million feature array. The probes were cleaved from the array and amplified 653 using PCR (Fu et al., 2016). In summary, we generated 322,667 unique probes of 52 bp length 654 using stepwise 5 bp tiling to cover a total of 3,355,736 bp. The final set of probe sequences is 655 available in Supplementary Data 8. To validate the capture protocol, we used seven cell lines 656 from the Immunogenetics and Histocompatibility Workshop (IHW) chosen to represent 657 divergent HLA alleles that we had previously sequenced to full resolution (P. J. Norman et al., 658 2017). The results are shown in Supplementary Data 2.

659

660 <u>Analysis of the CCR5-∆32 frequency</u>

The CCR5 locus (chr3:46414947-46414978) was included in the target regions. To genotype CCR5 for wildtype (wt) and Δ 32 alleles, the sequence data was remapped to *hg19* using BWA*mem* with the mapping quality filter turned off. To generate genotypes, the CCR5 locus was visually inspected using the Integrative Genomics Viewer (Robinson et al., 2011).

665

666 <u>1000 Genome data for selection scan</u>

We obtained the "low coverage" and "exome" aligned data for a set of 50 unrelated individuals for the East Asian population CHB (Han Chinese in Beijing, China) from the 1000 Genomes Phase 3 dataset (<u>ftp://ftp.1000genomes.ebi.ac.uk/vol1/ftp/phase3/data/</u>). The bam files were converted into *fastq* format using the *bamtofastq* option from the software *bedtools 2.28.0* (Quinlan, 2014).

672

673 *Variant detection*

We used *samtools mpileup* (Heng Li et al., 2009) for variant detection with a minimum mapping and base quality of 30 while ignoring indels (-q 30 -Q 30 -C 50 -t DP,SP -g --skip-indels), and used bcftools (Heng Li, 2011) for variant calling (-m -f GQ -O b). We considered only variants that were within the captured regions \pm 1,000 bp. Variants were kept when at least 10 individuals had a genotype quality of 30 or higher as measured using vcftools (Danecek et al., 2011). Resulting vcf-files were further annotated by adding the ancestral allele and dbSNP IDs
version 147. The ancestral allele was called as the most parsimonious based on 1000 Genomes
data (Abecasis et al., 2012) and a multiple species alignment (F.M. Key et al., 2016).

682

683 <u>DAnc calculation</u>

For all variants shared across the Ellwangen data (modern and ancient) and 1000 Genomes CHB population we calculated a *Differentiation with Ancestral (DAnc)* score (F.M. Key et al., 2016). *DAnc* is calculated per site, and uses derived allele frequency estimates to infer populationspecific allele frequency changes. Therefore, we inferred the derived allele frequency (DAF) using the annotated ancestral allele for every site. Using the DAF we calculated *DAnc* scores per site:

690

$$DAnc = |(ELW_{MOD} - CHB)| - |(ELW_{ANC} - CHB)|$$

691

For every site the resulting *DAnc* scores can range from -1 to +1. Invariable sites have a score of 0. A positive *DAnc* score indicates that the modern Ellwangen population has a different allele frequency compared to the ancient Ellwangen population and the outgroup population, e.g. due to recent positive selection. A negative *DAnc* score indicates that the ancient Ellwangen population differentiates from both modern Ellwangen and the outgroup CHB.

697

698 *Estimating* F_{ST} values

We calculated F_{ST} values for all variants using the (Weir & Cockerham, 1984) estimator implemented in *vcf-tools* (Danecek et al., 2011).We report the empirical p-values, which were obtained by comparing the F_{ST} of all three candidate SNPs to the empirical distribution of F_{ST} scores from all other variants.

703

704 *Simulation of neutral evolution*

In order to estimate the expected distribution of *DAnc* scores under neutral evolution, we simulated the European demographic history, using a published model (Gravel et al., 2011) and the simulation software *slim2* (Haller & Messer, 2017). The demographic model is based on genome-wide data; we however had predominantly capture data from coding regions. To account for increased drift in coding regions due to background selection, we reduced the effective population sizes using background selection coefficients (*B scores*) (F.M. Key et al., 2016). We estimated background selection for every genomic region captured using a published genomewide map (McVicker, Gordon, Davis, & Green, 2009). The complete model including all parameters is available in Supplementary Data 9. We ran 100,000 simulations of genomic loci matched in length to the captured region and used the resulting variants to calculate the neutral expectation of the *DAnc* score distribution.

716

718

717 Simulation of natural selection

719 We performed 10,000 forward genetic simulations using *slim3* (Haller & Messer, 2019) to 720 determine null distributions for neutral frequency changes over 500 years in Ellwangen for each 721 HLA and KIR allotype. We used the sampled ancestral Ellwangen HLA and KIR allotype 722 frequencies as input and simulated 20 generations, assuming a 25 year generation time (e.g. 723 Gravel et al, 2011). We assumed a constant population growth rate of 1.085 per generation, 724 resulting in growth from 5000 to approximately 25000 in Ellwangen. We explicitly modelled 725 HLA and KIR allotypes, using linked binary identifiers to differentiate between alleles of a gene, 726 and therefore assumed no new mutations or intragenic recombination. We calculated intergenic 727 recombination rates per generation between HLA genes using a recent sex-averaged refined 728 genetic map (Bhérer, Campbell, & Auton, 2017). We allowed free recombination between HLA 729 and KIR regions (because they are on separate chromosomes). Specifically, we assumed the 730 following number of crossovers per generation between each HLA gene. HLA-A/HLA-C: 5.3e⁻³, HLA-C/HLA-B: 1e⁻⁸, HLA-B/HLA-DRB345: 5.4e⁻³, HLA-DRB345/HLA-DRB1: 1e⁻⁸, HLA-731 DRB1/HLA-DQA1: 3.2e⁻⁵, HLA-DQA1/HLA-DQB1: 3.9e⁻⁷, HLA-DQB1/HLA-DPA1: 6.5e⁻³, 732 and HLA-DPA1/HLA-DPB1: 1e⁻⁸. We calculated neutral frequency changes of each allotype. 733 734 We conclude the frequency changes of an allotype is due to natural selection if the sampled 735 modern day allotype frequency falls within the 0.5% extremes of the respective neutral 736 distribution (p < 0.01).

We re-implemented the neutral slim3 models as described above, but included a non-zero sparameter for each HLA-allotype in question. For each selected allotype, we ran 100 simulations with a positive or negative s with an absolute value of 0.001, 0.01, 0.1, 0.2, 0.3, 0.4, 0.5, 0.6 or 0.7. Mirroring the timeline of the European plague outbreak, allotypes were selected for 7 generations and then returned to neutrality. The reported *s* values were consistent with previous reported values of *s* acting on *MHC* genes (Radwan et al., 2020). We estimated the strength of natural selection by fitting a LOESS curve to the simulated relationship between *s* and allotype frequency and mapping the observed modern Ellwangen allotype frequency.

745

746 <u>HLA typing of the Ellwangen individuals</u>

747 We applied the *OptiType* algorithm, which is a program that enables HLA genotyping from high-748 throughput sequence data. *OptiType* requires a minimum of a 12-fold coverage to reliably 749 determine the HLA alleles present at two-field (distinct polypeptide sequences) resolution. We 750 applied OptiType (Szolek et al., 2014) to identify HLA class I alleles, using a reference set of 751 present-day HLA allele sequences and a required sequence identity of at least 97% for every 752 alignment. We set no limit on the number of potential best matches during read mapping. We 753 manually verified the results obtained by a development version of the upcoming OptiType 2.0 754 package in order to determine HLA class II alleles. For every sample, the OptiType call having 755 highest confidence was used.

756

757 <u>Reconstruction of HLA haplotypes</u>

Haplotypes were assigned based on previously reported frequencies and linkage disequilibrium
(LD) (Cao et al., 2001; González-Neira et al., 2004). Maximum-likelihood haplotype frequencies
for alleles and two-point, three-point and four-point associations were estimated using an
Expectation-Maximization (EM) algorithm provided by the computer program *Arlequin* ver. 3.5
(Excoffier & Lischer, 2010).

763

764 *Comparing allele and haplotype frequencies*

HLA allele frequencies were calculated from HLA-A, -B, -C, and -DRB1 sequence data of 8862 potential stem cell donors registered with DKMS (German Bone Marrow Donor Registry) until June 2014. Donors were of self-assessed German origin. Allele frequencies were calculated to the two-field level (polypeptide sequence) (Schmidt et al., 2009). For allele frequency comparisons, chi-squared tests (Pearson, 1900) were applied in R (R Development Core Team, 2011). Pairwise proportion tests were made between the allele or haplotype frequencies, where *p* < 0.05 was considered significant. Omnibus tests for association with specific amino acid positions, as well as pairwise tests for specific residues, were computed using the BIGDAWG R package (Pappas, Marin, Hollenbach, & Mack, 2016). Linear mixed effects modeling was performed using the Gaston package in R (https://cran.r-project.org/web/packages/gaston/) and the *lcMLkin* kinship matrix generated as above. Wilson Score Interval estimation was performed using the 'Hmisc' package of R (https://CRAN.R-project.org/package=Hmisc).

777

778 <u>Reconstruction of KIR genotypes and KIR allele frequency analyses</u>

779 Sequence reads specific to the KIR locus were identified by alignment to the human genome 780 reference hg19 using BWA mem, and then extracting those mapping to chr19:55,228,188-781 55,383,188 or chr19 gl000209 random. The presence or absence and copy number of each KIR 782 gene were determined using the PING pipeline (P.J. Norman et al., 2016), modified for single-783 end (SE; i.e. non-paired) reads. The alleles of KIR3DL1/S1 were also determined using an SE 784 modified version of PING, and further validated by determining the alleles of the genes flanking 785 KIR3DL1/S1 in the telomeric portion of the KIR locus. As an additional step, virtual sequence 786 probes were used to identify specific alleles directly from FASTQ data files, with a threshold of 787 ten reads used to positively identify a given allele. The scripts and probe sequences are available 788 at https://github.com/n0rmski/ThePlague/.

- 789
- 790

791

792 **References**

- Abecasis, G. R., Auton, A., Brooks, L. D., DePristo, M. A., Durbin, R. M., Handsaker, R.
 E., . . McVean, G. A. (2012). An integrated map of genetic variation from 1,092
 human genomes. *Nature*, 491(7422), 56-65. doi:10.1038/nature11632
 Abi-Rached, L., Dorighi, K., Norman, P. J., Yawata, M., & Parham, P. (2007). Episodes of
- natural selection shaped the interactions of IgA–Fc with FcalphaRI and bacterial decoy
 proteins. *J Immunol, 178*(12), 7943–7954. doi:10.4049/jimmunol.178.12.7943
- Achkar, J. P., Klei, L., de Bakker, P. I. W., Bellone, G., Rebert, N., Scott, R., . . . Duerr, R.
 H. (2012). Amino acid position 11 of HLA–DR β 1 is a major determinant of
 chromosome 6p association with ulcerative colitis. *Genes and immunity*, 13(3), 245–
- 802 252. doi:10.1038/gene.2011.79
- Al Nabhani, Z., Dietrich, G., Hugot, J. P., & Barreau, F. Nod2: The intestinal gate keeper.

- 804 (1553–7374 (Electronic)).
- Albright, F. S., Orlando, P., Pavia, A. T., Jackson, G. G., & Cannon Albright, L. A. (2008).
 Evidence for a heritable predisposition to death due to influenza. *J Infect Dis.*,
 197(0022-1899 (Print)).
- Alexander, D. H., Novembre, J., & Lange, K. (2009). Fast model-based estimation of
 ancestry in unrelated individuals. *Genome Res.*, 19(9), 1655–1664.
- Alfirevic, A., Gonzalez-Galarza, F., Bell, C., Martinsson, K., Platt, V., Bretland, G., . . .
 Pirmohamed, M. (2012). In silico analysis of HLA associations with drug-induced liver
 injury: use of a HLA-genotyped DNA archive from healthy volunteers. *Genome Med*,
 4(6), 51.
- Anand, P. K., Malireddi, R. K., Lukens, J. R., Vogel, P., Bertin, J., Lamkanfi, M., &
 Kanneganti, T. D. (2012). NLRP6 negatively regulates innate immunity and host
 defence against bacterial pathogens. *Nature*, 488(7411), 389–393.
 doi:10.1038/nature11250
- Andrades Valtuena, A., Mittnik, A., Massy, K., Allmae, R., Daubaras, M., Jankauskas,
 R., . . . Krause, J. (2016). The Stone Age Plague: 1000 years of Persistence in
 Eurasia. *bioRxiv*.
- Ankley, L., Thomas, S., & Olive, A. A.-O. (2020). Fighting Persistence: How Chronic
 Infections with Mycobacterium tuberculosis Evade T Cell-Mediated Clearance and
 New Strategies To Defeat Them. LID e00916-19 [pii] LID 10.1128/IAI.00916-19
 [doi]. Infect. Immun., 88(1098-5522 (Electronic)).
- Barreiro, L. B., Ben-Ali M Fau Quach, H., Quach H Fau Laval, G., Laval G Fau Patin,
 E., Patin E Fau Pickrell, J. K., Pickrell Jk Fau Bouchier, C., . . . Quintana–Murci,
 L. (2009). Evolutionary dynamics of human Toll–like receptors and their different
 contributions to host defense. *PLoS Genet*, 5(1553–7404 (Electronic)).
- Bashirova, A. A., Martin, M. P., McVicar, D. W., & Carrington, M. (2006). The killer
 immunoglobulin-like receptor gene cluster: tuning the genome for defense. *Annu Rev Genomics Hum Genet, 7*, 277-300. doi:10.1146/annurev.genom.7.080505.115726
- Benedictow, O. J. (2004). *The Black Death, 1346–1353: The Complete History, 383*: Boydell
 & Brewer.
- Bhérer, C., Campbell, C. L., & Auton, A. (2017). Refined genetic maps reveal sexual
 dimorphism in human meiotic recombination at multiple scales. *Nature Communications, 8*(1), 14994. doi:10.1038/ncomms14994
- Biraben, J.-N. (1976). Les hommes et la peste en France et dans les pays européens et méditerranéens. Mouton: Paris-La Haye.
- Bjorkman, P. J., & Parham, P. (1990). Structure, function, and diversity of class I major
 histocompatibility complex molecules. *Annu Rev Biochem, 59*, 253-288.
 doi:10.1146/annurev.bi.59.070190.001345
- Bos, K. I., Herbig, A., Sahl, J., Waglechner, N., Fourment, M., Forrest, S. A., . . . Poinar, H.
 N. (2016). Eighteenth century Yersinia pestis genomes reveal the long-term
- persistence of an historical plague focus. *Elife, 5*, e12994. doi:10.7554/eLife.12994

- Bos, K. I., Schuenemann, V. J., Golding, G. B., Burbano, H. A., Waglechner, N., Coombes,
 B. K., . . . Krause, J. (2011). A draft genome of Yersinia pestis from victims of the
 Black Death. *Nature, 478*(7370), 506–510. doi:10.1038/nature10549
- Boudreau, J. E., & Hsu, K. C. (2018). Natural Killer Cell Education and the Response to
 Infection and Cancer Therapy: Stay Tuned. *Trends Immunol*, 39(3), 222–239.
 doi:10.1016/j.it.2017.12.001
- Bowsky, W. M. (1971). *The Black Death: a turning point in history?*: New York, HOlt,
 Rinhart and Winston.
- Briggs, A. W., Stenzel, U., Johnson, P. L., Green, R. E., Kelso, J., Prufer, K., . . . Paabo, S.
 (2007). Patterns of damage in genomic DNA sequences from a Neandertal. *Proceedings* of the National Academy of Sciences of the United States of America, 104(37), 14616– 14621.
- Büntgen, U., Ginzler, C., Esper, J., Tegel, W., & McMichael, A. J. (2012). Digitizing
 historical plague. *Clin. Infect. Dis.*, 55(11), 1586-1588.
- Cao, K., Hollenbach, J., Shi, X., Shi, W., Chopek, M., & Fernández-Viña, M. A. (2001).
 Analysis of the frequencies of HLA-A, B, and C alleles and haplotypes in the five
 major ethnic groups of the United States reveals high levels of diversity in these loci
 and contrasting distribution patterns in these populations. *Hum. Immunol., 62*(9),
 1009-1030.
- Cedzynski, M., Nuytinck, L., Atkinson, A. P. M., St Swierzko, A., Zeman, K., Szemraj,
 J., . . Kilpatrick, D. C. (2007). Extremes of L-ficolin concentration in children with
 recurrent infections are associated with single nucleotide polymorphisms in the FCN2
 gene. *Clin. Exp. Immunol.*, 150(1), 99–104.
- Clouse, M. (2002). The Black Death Transformed: Disease and Culture in Early Renaissance
 Europe.: Samuel K Cohn Jr. London and New York: Arnold and Oxford University
 Press, 2002, pp. 318, US\$65.00 (HB) ISBN: 0-340-70646-5. International Journal of
 Epidemiology, 31(6), 1280-1281. doi:10.1093/ije/31.6.1280
- 872 Cohn, S. K., Jr. (2003). *The Black Death Transformed: Disease and Culture in Early*873 *Renaissance Europe.* London: Edward Arnold.
- Danecek, P., Auton, A., Abecasis, G., Albers, C. A., Banks, E., DePristo, M. A., ...
 Genomes Project Analysis, G. (2011). The variant call format and VCFtools. *Bioinformatics*, 27(15), 2156-2158.
- Darke, C., Guttridge, M. G., Thompson, J., MacNamara, S., Street, J., & Thomas, M. (1998).
 HLA class I (A, B) and II (DR, DQ) gene and haplotype frequencies in blood donors
 from Wales. *Exp Clin Immunogenet*, *15*, 69–83.
- Dean, M., Carrington, M., Winkler, C., Huttley, G. A., Smith, M. W., Allikmets, R., . . .
 O'Brien, S. J. (1996). Genetic restriction of HIV-1 infection and progression to AIDS
 by a deletion allele of the CKR5 structural gene. Hemophilia Growth and Development
 Study, Multicenter AIDS Cohort Study, Multicenter Hemophilia Cohort Study, San
- 884 Francisco City Cohort, ALIVE Study. *Science*, *273*(5283), 1856–1862.
- Di Marco, M., Schuster, H., Backert, L., Ghosh, M., Rammensee, H. G., & Stevanovic, S.

- (2017). Unveiling the Peptide Motifs of HLA-C and HLA-G from Naturally Presented
 Peptides and Generation of Binding Prediction Matrices. *J Immunol, 199*(8), 2639–
 2651. doi:10.4049/jimmunol.1700938
 Debarte D. G. & Zinkernend, D. M. (1075). A bickerical role for the main histogeneratibilities
 - Doherty, P. C., & Zinkernagel, R. M. (1975). A biological role for the major histocompatibility
 antigens. *Lancet*, 1(7922), 1406–1409.
 - B91 Drummond, W. K., Nelson, C. A., Fowler, J., Epson, E. E., Mead, P. S., & Lawaczeck, E. W.
 892 (2014). Plague in a Pediatric Patient: Case Report and Use of Polymerase Chain
 893 Reaction as a Diagnostic Aid. *J Pediatric Infect Dis Soc, 3*(4), e38-41.
 894 doi:10.1093/jpids/piu001
 - Bubaniewicz, A., Lewko, B., Moszkowska, G., Zamorska, B., & Stepinski, J. (2000).
 Molecular subtypes of the HLA-DR antigens in pulmonary tuberculosis. *Int. J. Infect. Dis., 4*(3), 129–133.
 - Dunne, C., Crowley, J., Hagan, R., Rooney, G., & Lawlor, E. (2008). HLA-A, B, Cw, DRB1,
 DQB1 and DPB1 alleles and haplotypes in the genetically homogenous Irish
 population. *Int. J. Immunogenet.*, 35(4-5), 295-302.
 - Bell, S. R. (1984). Immunity as a Factor in the Epidemiology of Medieval Plague. *Reviews of Infectious Diseases, 6*(6), 866-879. doi:10.1093/clinids/6.6.866
 - 903 Ellwangen, S. (2007). Die dunkle Zeit. Hexenverfolgung in der Stadt und Fürstpropstei
 904 Ellwangen. Ellwangen: Stadtverwaltung Ellwangen.
- 905 Everitt, A. R., Clare S Fau Pertel, T., Pertel T Fau John, S. P., John Sp Fau Wash, R.
 906 S., Wash Rs Fau Smith, S. E., Smith Se Fau Chin, C. R., . . . Kellam, P. (2012).
 907 IFITM3 restricts the morbidity and mortality associated with influenza. *Nature*,
- 908 *484*(1476–4687 (Electronic)), 519–523. doi:D NLM: EMS41068 FIR Everingham, K
- 909 Excoffier, L., & Lischer, H. E. L. (2010). Arlequin suite ver 3.5: a new series of programs to
 910 perform population genetics analyses under Linux and Windows. *Mol Ecol Resour*,
 911 10(3), 564-567.
- Faul, F., Erdfelder, E., Lang, A.-G., & Buchner, A. (2007). G*Power 3: a flexible statistical
 power analysis program for the social, behavioral, and biomedical sciences. *Behav Res Methods, 39*(2), 175–191.
- Feldman, M., Harbeck, M., Keller, M., Spyrou, M. A., Rott, A., Trautmann, B., . . . Krause,
 J. (2016). A High-Coverage Yersinia pestis Genome from a Sixth-Century Justinianic
 Plague Victim. *Mol. Biol. Evol.*, 33(11), 2911–2923.
- 918 Frisch, T., Sorensen, M. S., Overgaard, S., Lind, M., & Bretlau, P. (1998). Volume-Referent
 919 Bone Turnover Estimated From the Interlabel Area Fraction After Sequential Labeling.
 920 Bone, 22, 677-682. doi:10.1016/s8756-3282(98)00050-7
- Fu, Q., Meyer, M., Gao, X., Stenzel, U., Burbano, H. A., Kelso, J., & Pääbo, S. (2013). DNA
 analysis of an early modern human from Tianyuan Cave, China. *Proc. Natl. Acad. Sci. U.S.A., 110*(6), 2223–2227.
- Fu, Q., Posth, C., Hajdinjak, M., Petr, M., Mallick, S., Fernandes, D., . . . Reich, D. (2016).
 The genetic history of Ice Age Europe. *Nature*, 534(7606), 200–205.
- 926 Galvani, A. P., & Slatkin, M. (2003). Evaluating plague and smallpox as historical selective

- 927 pressures for the CCR5-Delta 32 HIV-resistance allele. *Proceedings of the National*928 *Academy of Sciences of the United States of America, 100*(25), 15276–15279.
 - 929 doi:10.1073/pnas.2435085100
 - Gnirke, A., Melnikov, A., Maguire, J., Rogov, P., LeProust, E. M., Brockman, W., . . .
 Nusbaum, C. (2009). Solution hybrid selection with ultra-long oligonucleotides for
 massively parallel targeted sequencing. *Nat Biotech*, 27(2), 182–189.
 - 933 doi:<u>http://www.nature.com/nbt/journal/v27/n2/suppinfo/nbt.1523_S1.html</u>
 - González-Neira, A., Calafell, F., Navarro, A., Lao, O., Cann, H., Comas, D., & Bertranpetit,
 J. (2004). Geographic stratification of linkage disequilibrium: a worldwide population
 study in a region of chromosome 22. *Hum. Genomics*, 1(6), 399-409.
 - Gravel, Henn, B., Gutenkunst, R., Indap, A., Marth, G., Clark, A., . . . Project, T. G.
 (2011). Demographic history and rare allele sharing among human populations. *Proceedings of the National Academy of Sciences of the United States of America*,
 108(29), 11983-11988. doi:10.1073/pnas.1019276108
 - Guethlein, L. A., Norman, P. J., Hilton, H. G., & Parham, P. (2015). Co-evolution of MHC
 class I and variable NK cell receptors in placental mammals. *Immunol. Rev., 267*(1),
 259-282.
 - Gumperz, J. E., Litwin, V., Phillips, J. H., Lanier, L. L., & Parham, P. (1995). The Bw4 public
 epitope of HLA-B molecules confers reactivity with natural killer cell clones that
 express NKB1, a putative HLA receptor. *J. Exp. Med.*, *181*(3), 1133–1144.
 - Guo, Y., Patil, N. K., Luan, L., Bohannon, J. K., & Sherwood, E. R. (2018). The biology of
 natural killer cells during sepsis. *Immunology*, 153(2), 190-202.
 doi:10.1111/imm.12854
 - Haak, W., Lazaridis, I., Patterson, N., Rohland, N., Mallick, S., Llamas, B., . . . Reich, D.
 (2015). Massive migration from the steppe was a source for Indo-European languages
 in Europe. *Nature*, 522(7555), 207-211.
 - Haller, B. C., & Messer, P. W. (2017). SLiM 2: Flexible, Interactive Forward Genetic
 Simulations. *Mol. Biol. Evol.*, 34(1), 230-240.
 - Haller, B. C., & Messer, P. W. (2019). SLiM 3: Forward Genetic Simulations Beyond the
 Wright-Fisher Model. *Molecular Biology and Evolution*, *36*(3), 632–637.
 doi:10.1093/molbev/msy228
 - Hammer, C., Begemann, M., McLaren, P. J., Bartha, I., Michel, A., Klose, B., . . . Fellay, J.
 (2015). Amino Acid Variation in HLA Class II Proteins Is a Major Determinant of
 Humoral Response to Common Viruses. *American journal of human genetics*, 97(5),
 738-743. doi:10.1016/j.ajhg.2015.09.008
 - Harrison, G. F., Sanz, J., Boulais, J., Mina, M. A.-O., Grenier, J. A.-O., Leng, Y., . . .
 Barreiro, L. B. (2019). Natural selection contributed to immunological differences
 between hunter-gatherers and agriculturalists. *Nature Ecology and Evolution, 3*(2397– 334X (Electronic)), 1253–1264.
 - Hellenthal, G., Busby, G. B., Band, G., Wilson, J. F., Capelli, C., Falush, D., & Myers, S.
 (2014). A genetic atlas of human admixture history. *Science*, 343(6172), 747-751.

| 968 | Hilton, H. G., Guethlein, L. A., Goyos, A. AO. X., Nemat-Gorgani, N., Bushnell, D. A., |
|------|--|
| 969 | Norman, P. J., & Parham, P. (2015). Polymorphic HLA-C Receptors Balance the |
| 970 | Functional Characteristics of KIR Haplotypes. J Immunol, 195(1550-6606 |
| 971 | (Electronic)), 160–170. |
| 972 | Hoang, T. V., Toan, N. L., Song, L. H., Ouf, E. A., Bock, C. T., Kremsner, P. G., |
| 973 | Velavan, T. P. (2011). Ficolin-2 levels and FCN2 haplotypes influence hepatitis B |
| 974 | infection outcome in Vietnamese patients. PLoS ONE, 6(11), e28113. |
| 975 | Holdsworth, R., Hurley, C. K., Marsh, S. G., Lau, M., Noreen, H. J., Kempenich, J. H., |
| 976 | Maiers, M. (2009). The HLA dictionary 2008: a summary of HLA-A, -B, -C, - |
| 977 | DRB $1/3/4/5$, and -DQB1 alleles and their association with serologically defined HLA- |
| 978 | A, -B, -C, -DR, and -DQ antigens. <i>Tissue Antigens</i> , 73(2), 95-170. |
| 979 | doi:10.1111/j.1399-0039.2008.01183.x |
| 980 | Hollenbach, J., Nocedal, I., Ladner, M. B., Single, R. M., & Trachtenberg, E. A. (2012). |
| 981 | Killer cell immunoglobulin–like receptor (KIR) gene content variation in the HGDP– |
| 982 | CEPH populations. <i>Immunogenetics</i> . doi:10.1007/s00251-012-0629-x |
| 983 | Hollenbach, J., Norman, P. J., Creary, L. E., Damotte, V. AO., Montero-Martin, G., |
| 984 | Caillier, S., Oksenberg, J. R. (2019). A specific amino acid motif of HLA–DRB1 |
| 985 | mediates risk and Interacts with smoking history in Parkinson's Disease. Proc. Natl. |
| 986 | Acad. Sci. U.S.A., 116(1091–6490 (Electronic)), 7419–7424. |
| 987 | Hummelshoj, T., Munthe-Fog, L., Madsen, H. O., Fujita, T., Matsushita, M., & Garred, P. |
| 988 | (2005). Polymorphisms in the FCN2 gene determine serum variation and function of |
| 989 | Ficolin-2. <i>Hum. Mol. Genet.</i> , 14(12), 1651-1658. |
| 990 | Huson, D. H., Auch, A. F., Qi, J., & Schuster, S. C. (2007). MEGAN analysis of |
| 991 | metagenomic data. <i>Genome Res.</i> , 17(3), 377-386. |
| 992 | Inohara, Chamaillard, McDonald, C., & Nunez, G. (2005). NOD-LRR proteins: role in host- |
| 993 | microbial interactions and inflammatory disease. Annu Rev Biochem, 74, 355–383. |
| 994 | doi:10.1146/annurev.biochem.74.082803.133347 |
| 995 | Johansson, A., Ingman, M., Mack, S. J., Ehrlich, H., & Gyllensten, U. (2008). Genetic origin |
| 996 | of the Swedish Sami inferred from HLA class I and class II allele frequencies. <i>Eur J</i> |
| 997 | <i>Hum Genet., 16</i> , 1341–1349. |
| 998 | Jonsson, H., Ginolhac, A., Schubert, M., Johnson, P. L., & Orlando, L. (2013). |
| 999 | mapDamage2.0: fast approximate Bayesian estimates of ancient DNA damage |
| 1000 | parameters. <i>Bioinformatics, 29</i> (13), 1682–1684. |
| 1001 | Kairies, M.–S. (2015). <i>Drei frühneuzeitliche Massengräber aus Ellwangen (Jagst)</i> – |
| 1002 | Paläopathologie und demographische Struktur. (Master of Science), University of |
| 1003 | Tübingen, Germany. |
| 1004 | Karlsson, E. K., Harris Jb Fau – Tabrizi, S., Tabrizi S Fau – Rahman, A., Rahman A Fau – |
| 1005 | Shlyakhter, I., Shlyakhter I Fau - Patterson, N., Patterson N Fau - O'Dushlaine, |
| 1006 | C., Larocque, R. C. (2013). Natural selection in a bangladeshi population from the |
| 1007 | cholera-endemic ganges river delta. <i>Sci Transl Med., 5</i> (1946-6242 (Electronic)). |
| 1000 | Kallan M. Chamay M. A. Cahaih, C. I. Naymann, C. H. Knänalin, A. Harr, Calibrat |

1008 Keller, M., Spyrou, M. A., Scheib, C. L., Neumann, G. U., Kröpelin, A., Haas-Gebhard,

1009 B., . . . Krause, J. (2019). Ancient genomes from across Western Europe reveal early 1010 diversification during the First Pandemic (541-750). Proc. Natl. Acad. Sci. U.S.A., 1011 *116*(25), 12363–12372. Key, F. M., Fu, Q., Romagné, F., Lachmann, M., & Andrés, A. M. (2016). Human adaptation 1012 1013 and population differentiation in the light of ancient genomes. Nat Commun, 7, 10775. Key, F. M., Peter, B., Dennis, M. Y., Huerta-Sánchez, E., Tang, W., Prokunina-Olsson, 1014 1015 L., . . . Andrés, A. M. (2014). Selection on a variant associated with improved viral 1016 clearance drives local, adaptive pseudogenization of interferon lambda 4 (IFNL4). 1017 (1553-7404 (Electronic)). 1018 Kim, S., Sunwoo, J. B., Yang, L., Choi, T., Song, Y.-J., French, A. R., . . . Yokoyama, W. M. 1019 (2008). HLA alleles determine differences in human natural killer cell responsiveness 1020 and potency. Proceedings of the National Academy of Sciences of the United States of America, 105(8), 3053-3058. doi:10.1073/pnas.0712229105 1021 1022 Kircher, M., Sawyer, S., & Meyer, M. (2012). Double indexing overcomes inaccuracies in 1023 multiplex sequencing on the Illumina platform. Nucleic Acids Res. 40(1), e3. 1024 Klebanov, N. (2018). Genetic Predisposition to Infectious Disease. Cureus, 10(8), e3210. 1025 Korneliussen, T. S., Albrechtsen, A., & Nielsen, R. (2014). ANGSD: Analysis of Next 1026 Generation Sequencing Data. BMC Bioinformatics, 15, 356. 1027 Kwiatkowski, D. P. (2005). How malaria has affected the human genome and what human genetics can teach us about malaria. Am. J. Hum. Genet., 77(0002-9297 (Print)), 171-1028 1029 192. 1030 Laayouni, H., Oosting, M., Luisi, P., Ioana, M., Alonso, S., Ricaño-Ponce, I., . . . Netea, M. 1031 G. (2014). Convergent evolution in European and Rroma populations reveals pressure 1032 exerted by plague on Toll-like receptors. Proc. Natl. Acad. Sci. U.S.A., 111(7), 2668-1033 2673. 1034 Lamkanfi, M., & Dixit, V. M. (2014). Mechanisms and functions of inflammasomes. *Cell*, 1035 157(5), 1013-1022. doi:10.1016/j.cell.2014.04.007 1036 Lamnidis, T. C., Majander, K., Jeong, C., Salmela, E., Wessman, A., Moiseyev, V., . . . 1037 Schiffels, S. (2018). Ancient Fennoscandian genomes reveal origin and spread of Siberian ancestry in Europe. Nat Commun, 9(1), 5018. doi:10.1038/s41467-018-1038 1039 07483 - 51040 Lazaridis, I., Patterson, N., Mittnik, A., Renaud, G., Mallick, S., Kirsanow, K., . . . Krause, 1041 J. (2014). Ancient human genomes suggest three ancestral populations for present-day 1042 Europeans. Nature, 513(7518), 409-413. 1043 Lenski, R. E. (1988). Evolution of plague virulence. *Nature*, 334(6182), 473-474. 1044 Li, H. (2011). A statistical framework for SNP calling, mutation discovery, association 1045 mapping and population genetical parameter estimation from sequencing data. 1046 *Bioinformatics*, 27(21), 2987–2993. 1047 Li, H., & Durbin, R. (2010). Fast and accurate long-read alignment with Burrows-Wheeler 1048 transform. Bioinformatics, 26(5), 589-595. Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., . . . Genome Project 1049

- Data Processing, S. (2009). The Sequence Alignment/Map format and SAMtools. *Bioinformatics*, 25(16), 2078–2079.
- Lindo, J., Huerta-Sánchez, E., Nakagome, S., Rasmussen, M., Petzelt, B., Mitchell, J., . . .
 Malhi, R. S. (2016). A time transect of exomes from a Native American population
 before and after European contact. *Nat Commun*, *7*, 13175.
- Lipatov, M., Sanjeev, K., Patro, R., & Veeramah, K. (2015). Maximum Likelihood Estimation
 of biological Relatedness from low Coverage Sequencing Data. *bioRxiv*.
- Long, E. O., Kim, H. S., Liu, D., Peterson, M. E., & Rajagopalan, S. (2013). Controlling
 natural killer cell responses: integration of signals for activation and inhibition. *Annu Rev Immunol, 31*, 227–258. doi:10.1146/annurev-immunol-020711-075005
- Luo, F., Sun, X., Wang, Y., Wang, Q., Wu, Y., Pan, Q., . . . Zhang, X.-L. (2013). Ficolin-2
 defends against virulent Mycobacteria tuberculosis infection in vivo, and its
 insufficiency is associated with infection in humans. *PLoS ONE*, 8(9), e73859.
- Martinon, F., Burns, K., & Tschopp, J. (2002). The inflammasome: a molecular platform
 triggering activation of inflammatory caspases and processing of proIL-beta. *Mol Cell*,
 1065 10(2), 417-426.
- Mathieson, I., Lazaridis, I., Rohland, N., Mallick, S., Patterson, N., Roodenberg, S. A., . . .
 Reich, D. (2015). Genome-wide patterns of selection in 230 ancient Eurasians. *Nature*, *528*(7583), 499-503.
- McManus, K. A.-O., Taravella, A. M., Henn, B. A.-O. X., Bustamante, C. D., Sikora, M., &
 Cornejo, O. A.-O. (2017). Population genetic analysis of the DARC locus (Duffy)
 reveals adaptation from standing variation associated with malaria resistance in
 humans. *PLoS Genet*, 13(1553-7404 (Electronic)).
- McVicker, G., Gordon, D., Davis, C., & Green, P. (2009). Widespread genomic signatures of
 natural selection in hominid evolution. *PLoS Genet.*, 5(5), e1000471.
- Meyer, M., & Kircher, M. (2010). Illumina sequencing library preparation for highly
 multiplexed target capture and sequencing. *Cold Spring Harb Protoc, 2010*(6),
 pdb.prot5448.
- Monroy, K., Jose, M., Jakobsson, M., & Günther, T. (2017). Estimating genetic Kin
 Relationships in prehistoric Populations. *bioRxiv*.
- Morelli, G., Song, Y., Mazzoni, C. J., Eppinger, M., Roumagnac, P., Wagner, D. M., . . .
 Achtman, M. (2010). Yersinia pestis genome sequencing identifies patterns of global
 phylogenetic diversity. *Nat. Genet.*, 42(12), 1140–1143.
- Namouchi, A., Guellil, M., Kersten, O., Hänsch, S., Ottoni, C., Schmid, B. V., . . . Bramanti,
 B. (2018). Integrative approach using Yersinia pestis genomes to revisit the historical
 landscape of plague during the Medieval Period. *Proceedings of the National Academy*of Sciences, 115(50), E11790. doi:10.1073/pnas.1812865115
- 1087 Neefjes, J., Jongsma, M. L. M., Paul, P., & Bakke, O. (2011). Towards a systems
 1088 understanding of MHC class I and MHC class II antigen presentation. *Nat. Rev.*1089 *Immunol.*, 11(12), 823–836.
- 1090 Norman, P. J., Hollenbach, J., Nemat-Gorgani, N., Marin, W., Norberg, S., Ashouri, E., . . .

1091Parham, P. (2016). Defining KIR and HLA Class I Genotypes at Highest Resolution via1092High-Throughput Sequencing. Am. J. Hum. Genet., 99(2), 375-391.

- Norman, P. J., Norberg, S. J., Guethlein, L. A., Nemat-Gorgani, N., Royce, T., Wroblewski,
 E. E., . . . Parham, P. (2017). Sequences of 95 human MHC haplotypes reveal extreme
 coding variation in genes other than highly polymorphic HLA class I and II. *Genome Res, 27*(5), 813-823. doi:10.1101/gr.213538.116
- 1097 Nowak, J., Mika-Witkowska, R., Polak, M., Zajko, M., Rogatko-Koros, M., Graczyk-Pol, E.,
 1098 & Lange, A. (2008). Allele and extended haplotype polymorphism of HLA-A, -C, -B,
 1099 -DRB1 and -DQB1 loci in Polish population and genetic affinities to other populations.
 1100 *Tissue Antigens, 71*(3), 193-205. doi:10.1111/j.1399-0039.2007.00991.x
- 1101 Ogawa, K., & Okada, Y. (2020). The current landscape of psoriasis genetics in 2020. J
 1102 Dermatol Sci., S0923-1811(1873-569X (Electronic)).
 1103 doi:10.1016/j.dermsci.2020.05.008
- Pappas, D. J., Marin, W., Hollenbach, J. A., & Mack, S. J. (2016). Bridging ImmunoGenomic
 Data Analysis Workflow Gaps (BIGDAWG): An integrated case-control analysis
 pipeline. *Hum. Immunol.*, 77(3), 283-287.
- Parham, P., & Moffett, A. (2013). Variable NK cell receptors and their MHC class I ligands in
 immunity, reproduction and human evolution. *Nat Rev Immunol, 13*(2), 133-144.
 doi:10.1038/nri3370
- Park, Y. H., Remmers, E. A.-O., Lee, W. A.-O., Ombrello, A. K., Chung, L. K., Shilei,
 Z., . . Chae, J. A.-O. (2020). Ancient familial Mediterranean fever mutations in
 human pyrin and resistance to Yersinia pestis. *Nat Immunol., 21*(1529–2916)
 (Electronic)), 857–867.
- Patin, E., Lopez, M., Grollemund, R., Verdu, P., Harmant, C., Quach, H., . . . QuintanaMurci, L. (2017). Dispersals and genetic adaptation of Bantu-speaking populations in
 Africa and North America. *Science*, *356*(6337), 543-546. doi:10.1126/science.aal1988
- Patterson, N., Moorjani, P., Luo, Y., Mallick, S., Rohland, N., Zhan, Y., . . . Reich, D.
 (2012). Ancient admixture in human history. *Genetics*, 192(3), 1065–1093.
- Patterson, N., Price, A. L., & Reich, D. (2006). Population structure and eigenanalysis. *PLoS Genet.*, 2(12), e190.
- Pearson, K. (1900). On the criterion that a given system of deviations from the probable in
 the case of a correlated system of variables is such that it can be reasonably supposed
 to have arisen from random sampling. *Philosophical Magazine Series 5, 50*, 157–175.
 doi:doi:10.1080/14786440009463897
- Peltzer, A., Jäger, G., Herbig, A., Seitz, A., Kniep, C., Krause, J., & Nieselt, K. (2016).
 EAGER: efficient ancient genome reconstruction. *Genome Biol.*, 17(60).
 doi:10.1186/s13059-016-0918-z
- Philip, N. H., Zwack, E. E., & Brodsky, I. E. (2016). Activation and Evasion of Inflammasomes
 by Yersinia. *Curr Top Microbiol Immunol, 397*, 69–90. doi:10.1007/978-3-31941171-2_4
- 1131 Pieters, J. (2008). Mycobacterium tuberculosis and the macrophage: maintaining a balance.

| 132 | Cell Host Microbe, | <i>3</i> (6), | 399 - 407 | 7. |
|-----|--------------------|---------------|-----------|----|
|-----|--------------------|---------------|-----------|----|

- Pingel, J., Solloch, U. V., Hofmann, J. A., Lange, V., Ehninger, G., & Schmidt, A. H. (2013).
 High-resolution HLA haplotype frequencies of stem cell donors in Germany with
 foreign parentage: how can they be used to improve unrelated donor searches? *Hum. Immunol., 74*(3), 330–340.
- Pinhasi, R., Fernandes, D., Sirak, K., Novak, M., Connell, S., Alpaslan-Roodenberg, S., . . .
 Hofreiter, M. (2015). Optimal Ancient DNA Yields from the Inner Ear Part of the
 Human Petrous Bone. *PLoS ONE*, 10(6), e0129102. doi:10.1371/journal.pone.0129102
- 1140 Politzer, R., & WHO. (1954). *Plague*.
- Prugnolle, F., Manica, A., Charpentier, M., Guégan, J., V., G., & Balloux, F. (2005).
 Pathogen-driven selection and worldwide HLA class I diversity. *Current Biology*, 15, 1022–1027.
- Quinlan, A. R. (2014). BEDTools: The Swiss-Army Tool for Genome Feature Analysis. Curr
 Protoc Bioinformatics, 47, 11.12.11-34. doi:10.1002/0471250953.bi1112s47
- Quintana-Murci, L. (2019). Human Immunology through the Lens of Evolutionary Genetics.
 Cell, 177(1), 184–199. doi:10.1016/j.cell.2019.02.033
- R Development Core Team. (2011). R: A Language and Environment for Statistical
 Computing. Vienna, Austria : the R Foundation for Statistical Computing: R
 Foundation for Statistical Computing.
- Radwan, J., Babik, W., Kaufman, J., Lenz, T. L., & Winternitz, J. (2020). Advances in the
 Evolutionary Understanding of MHC Polymorphism. *Trends in Genetics, 36*, 298–311.
- 1153 Ralph, P. L., & Coop, G. (2015). Convergent Evolution During Local Adaptation to Patchy
 1154 Landscapes. *PLoS Genet.*, 11(11), e1005630.
- Rascovan, N., Sjögren, K.-G., Kristiansen, K., Nielsen, R., Willerslev, E., Desnues, C., &
 Rasmussen, S. (2019). Emergence and Spread of Basal Lineages of Yersinia pestis
 during the Neolithic Decline. *Cell, 176*(1-2), 295-305.e210.
- Rasmussen, S., Allentoft, M. E., Nielsen, K., Orlando, L., Sikora, M., Sjogren, K. G., . . .
 Willerslev, E. (2015). Early divergent strains of Yersinia pestis in Eurasia 5,000 years
 ago. *Cell*, 163(3), 571–582. doi:10.1016/j.cell.2015.10.009
- Renaud, G., Slon, V., Duggan, A. T., & Kelso, J. (2015). Schmutzi: estimation of
 contamination and endogenous mitochondrial consensus calling for ancient DNA. *Genome Biology, 16*(1), 224. doi:10.1186/s13059-015-0776-0
- Robinson, J., Halliwell, J. A., Hayhurst, J. D., Flicek, P., Parham, P., & Marsh, S. G. E.
 (2015). The IPD and IMGT/HLA database: allele variant databases. *Nucleic Acids Res., 43*(Database issue), D423–D431.
- Robinson, J., Thorvaldsdóttir, H., Winckler, W., Guttman, M., Lander, E. S., Getz, G., &
 Mesirov, J. P. (2011). Integrative genomics viewer. *Nat. Biotechnol.*, 29(1), 24–26.
- Rohland, N., Harney, E., Mallick, S., Nordenfelt, S., & Reich, D. (2015). Partial uracil–DNA–
 glycosylase treatment for screening of ancient DNA. *Philos Trans R Soc Lond B Biol*
- 1171 Sci, 370(1660), 20130624. doi:10.1098/rstb.2013.0624
- 1172 Rohland, N., & Hofreiter, M. (2007). Ancient DNA extraction from bones and teeth. *Nat*

| 1 | 1 | 79 |
|---|---|----|
| 1 | Τ | 10 |

- *Protoc*, 2(7), 1756–1762.
- Sabeti, Schaffner, S., Fry, B., Lohmueller, J., Varilly, P., Shamovsky, O., . . . Lander, E. S.
 (2006). Positive natural selection in the human lineage. *Science*, *312*(5780), 1614–1620. doi:10.1126/science.1124309
- 1177 Sabeti, Varilly, P., Fry, B., Lohmueller, J., Hostetter, E., Cotsapas, C., . . . Stewart, J.
- 1178 (2007). Genome-wide detection and characterization of positive selection in human
- 1179 populations. *Nature, 449*(1476–4687 (Electronic)), 913–918. doi:D NLM: UKMS4416
- 1180EDAT- 2007/10/19 09:00 MHDA- 2007/12/06 09:00 CRDT- 2007/10/19 09:001181PHST- 2007/08/08 00:00 [received] PHST- 2007/09/13 00:00 [accepted] PHST-
- 1181
 PHST- 2007/08/08 00:00 [received] PHST- 2007/09/13 00:00 [accepted] PHST

 1182
 2007/10/19 09:00 [pubmed] PHST- 2007/12/06 09:00 [medline] PHST- 2007/10/19
- 1182
 2007/10/19 09:00 [pubmed] PHST- 2007/12/06 09:00 [medline] PHST- 2007/10/1

 1183
 09:00 [entrez] AID nature06250 [pii] AID 10.1038/nature06250 [doi] PST

 1184
 ppublish
- Saunders, P. M., Vivian, J. P., O'Connor, G. M., Sullivan, L. C., Pymm, P., Rossjohn, J., &
 Brooks, A. G. (2015). A bird's eye view of NK cell receptor interactions with their
 MHC class I ligands. *Immunol Rev, 267*(1), 148–166. doi:10.1111/imr.12319
- Schmidt, A. H., Baier, D., Solloch, U. V., Stahr, A., Cereb, N., Wassmuth, R., . . . Rutt, C.
 (2009). Estimation of high-resolution HLA-A, -B, -C, -DRB1 allele and haplotype
 frequencies based on 8862 German stem cell donors and implications for strategic
 donor registry planning. *Hum. Immunol.*, 70(11), 895–902.
- Skoglund, P., Storå, J., Götherström, A., & Jakobsson, M. (2013). Accurate sex identification
 of ancient human remains using DNA shotgun sequencing. *Journal of Archaeological Science, 40*(12), 4477-4482.
- Solloch, U. V., Lang, K., Lange, V., Böhme, I., Schmidt, A. H., & Sauter, J. (2017).
 Frequencies of gene variant CCR5-Δ32 in 87 countries based on next-generation
 sequencing of 1.3 million individuals sampled from 3 national DKMS donor centers. *Hum. Immunol.*, 78(11-12), 710-717.
- Spyrou, M. A., Keller, M., Tukhbatova, R. I., Scheib, C. L., Nelson, E. A., Andrades
 Valtueña, A., . . . Krause, J. (2019). Phylogeography of the second plague pandemic
 revealed through analysis of historical Yersinia pestis genomes. *Nature Communications, 10*(1), 4470–4470. doi:10.1038/s41467–019–12154–0
- Spyrou, M. A., Tukhbatova, R. I., Feldman, M., Drath, J., Kacki, S., Beltran de Heredia,
 J., . . Krause, J. (2016). Historical Y. pestis Genomes Reveal the European Black
 Death as the Source of Ancient and Modern Plague Pandemics. *Cell Host Microbe*, *19*(6), 874–881. doi:10.1016/j.chom.2016.05.012
- Spyrou, M. A., Tukhbatova, R. I., Wang, C.-C., Valtueña, A. A., Lankapalli, A. K.,
 Kondrashin, V. V., . . . Krause, J. (2018). Analysis of 3800-year-old Yersinia pestis
 genomes suggests Bronze Age origin for bubonic plague. *Nat Commun, 9*(1), 2234.
- 1210 Stephens, J. C., Reich, D. E., Goldstein, D. B., Shin, H. D., Smith, M. W., Carrington,
- 1211 M., . . . Dean, M. (1998). Dating the origin of the CCR5-Delta32 AIDS-resistance 1212 allele by the coalescence of haplotypes. *Am. J. Hum. Genet.*, 62(6), 1507-1515.
- 1213 Sun, J., Yang, C., Fei, W., Zhang, X., Sheng, Y., Zheng, X., . . . Zhang, X. (2018). HLA-

- 1214 DQ β 1 amino acid position 87 and DQB1*0301 are associated with Chinese Han SLE. 1215 *Molecular genetics & genomic medicine*, 6(4), 541–546. doi:10.1002/mg3.403 Szolek, A., Schubert, B., Mohr, C., Sturm, M., Feldhahn, M., & Kohlbacher, O. (2014). 1216 OptiType: precision HLA typing from next-generation sequencing data. 1217 Bioinformatics, 30(23), 3310-3316. doi:10.1093/bioinformatics/btu548 1218 1219 The Genome Sequencing Consortium. (2001). Initial sequencing and analysis of the human 1220 genome. Nature, 409(6822), 860-921. Trowsdale, J., & Knight, J. C. (2013). Major histocompatibility complex genomics and human 1221 1222 disease. Annu Rev Genomics Hum Genet, 14, 301-323. 1223 Uhrberg, M., Valiante, N. M., Shum, B. P., Shilling, H. G., Lienert-Weidenbach, K., Corliss, 1224 B., . . . Parham, P. (1997). Human diversity in killer cell inhibitory receptor genes. 1225 *Immunity*, 7(6), 753–763. 1226 Vågene, Å. J., Herbig, A., Campana, M. G., Robles García, N. M., Warriner, C., Sabin, 1227 S., . . . Krause, J. (2018). Salmonella enterica genomes from victims of a major 1228 sixteenth-century epidemic in Mexico. Nature Ecology & Evolution, 2, 520-528. 1229 Vasseur, E., Boniotto, M., Patin, E., Laval, G., Quach, H., Manry, J., . . . Quintana-Murci, 1230 L. (2012). The evolutionary landscape of cytosolic microbial sensors in humans. 1231 American journal of human genetics, 91(1), 27-37. doi:10.1016/j.ajhg.2012.05.008 1232 Vladimer, G. I., Marty-Roix, R., Ghosh, S., Weng, D., & Lien, E. (2013). Inflammasomes and 1233 host defenses against bacterial infections. Curr Opin Microbiol, 16(1), 23-31. 1234 doi:10.1016/j.mib.2012.11.008 Vladimer, G. I., Weng, D., Paquette, S. W., Vanaja, S. K., Rathinam, V. A., Aune, M. 1235 1236 H., . . . Lien, E. (2012). The NLRP12 inflammasome recognizes Yersinia pestis. 1237 *Immunity*, 37(1), 96–107. doi:10.1016/j.immuni.2012.07.006 1238 Voight, B. F., Kudaravalli, S., Wen, X., & Pritchard, J. K. (2006). A map of recent positive 1239 selection in the human genome. *PLoS Biol.*, 4(1545–7885 (Electronic)). Wagner, D. M., Klunk, J., Harbeck, M., Devault, A., Waglechner, N., Sahl, J. W., ... 1240 Poinar, H. (2014). Yersinia pestis and the plague of Justinian 541–543 AD: a genomic 1241 analysis. Lancet Infect Dis, 14(4), 319-326. doi:10.1016/s1473-3099(13)70323-2 1242 Wang, E. T., Kodama, G., Baldi, P., & Moyzis, R. K. (2006). Global landscape of recent 1243 1244 inferred Darwinian selection for Homo sapiens. Proc. Natl. Acad. Sci. U.S.A., 1245 *103*(0027-8424 (Print)), 135-140. Weese, D., Holtgrewe, Manuel, & Reinert, K. (2012). RazerS 3: Faster, fully sensitive read 1246 mapping. *Bioinformatics*. doi:10.1093/bioinformatics/bts505 1247 1248 Weir, B. S., & Cockerham, C. C. (1984). ESTIMATING F-STATISTICS FOR THE ANALYSIS OF POPULATION STRUCTURE. (1558–5646 (Electronic)). 1249 1250 WHO. (2017). Plague in Madagascar. WHO.
- 1251 Wilson, M. J., Torkar, M., Haude, A., Milne, S., Jones, T., Sheer, D., . . . Trowsdale, J.
- 1252 (2000). Plasticity in the organization and sequences of human KIR/ILT gene families.
- 1253 Proceedings of the National Academy of Sciences of the United States of America,
- 1254 *97*(9), 4778–4783. doi:10.1073/pnas.080588597

Zaki, M. H., Man, S. M., Vogel, P., Lamkanfi, M., & Kanneganti, T. D. (2014). Salmonella
exploits NLRP12-dependent innate immune signaling to suppress host defenses during
infection. *Proceedings of the National Academy of Sciences of the United States of America, 111*(1), 385–390. doi:10.1073/pnas.1317643111

1260 Acknowledgements

1261 We thank Almut Nebel for her advice to assess the statistical power and the obtainable effect 1262 sizes from our given sample. Our special thanks goes to Karl Hilsenbek and Theresa Hilsenbek for the announcement of our project to the inhabitants and students of Ellwangen, and so, for 1263 1264 conferring the collection of anonymous saliva samples. In this context we want to deeply thank 1265 all participants from Ellwangen who contributed their anonymous saliva samples to make this 1266 study possible. We also thank Michael Franken for sampling the Ellwangen plague individuals 1267 for petrous bones. Thanks to Chris Gignoux for advice on data analysis. This work was supported by the European Research Council (APGREID) and NIH/NIAID R56 AI151549 (to PJ 1268 1269 Norman).

1270

1259

1271 Ethical Approval for modern and ancient Samples

1272 Saliva samples were obtained from the contributing persons after their consent was given. The 1273 samples were obtained in a completely anonymised way, so that no personal information was 1274 registered. Ethical Approval was granted by the Ethics Committee of the Faculty of Medicine of 1275 the Eberhard Karls University and the University Hospital of Tübingen. According to ethical guidelines, sampling of 16th century teeth and petrous bones was performed with archaeological / 1276 1277 anthropological supervision to minimize the destructive effect. Each sample was sampled only 1278 once and photographs were taken before and after the sampling procedure. Every sample has 1279 been documented and archived in the aDNA facility of the Max Planck Institute for the Science 1280 of Human History in Jena, Germany.

1281

1282 Author Contributions

1283 AI, AS, PJN, AH, KIB, SF, OK and JK designed the immunity capture. AI, ER and JK collected 1284 modern saliva samples. AI, MAS, VJS and ER conducted lab work. AI, RB, AS and DIHZ 1285 performed HLA genotyping, and FMK conducted *DAnc* and F_{st} analysis. JS and BKK performed 1286 pathogen screening. PJN and MKR performed KIR genotyping. JH and PJN performed data

| 1287 | analyses. PJN, WHP and GFH performed simulations for natural selection. JS, US and AHS |
|------|--|
| 1288 | contributed the DKMS allele frequencies. RW and SA led the Excavation in Ellwangen. JW and |
| 1289 | RW provided the 16 th century Ellwangen samples. MSK and JW conducted anthropological |
| 1290 | analyses. AI, JH, PJN and JK wrote the manuscript. JK led the study. |
| 1291 | |
| 1292 | Conflicts of Interests |
| 1293 | The authors declare no conflicts of interests. |
| 1294 | |
| 1295 | Data Availability |
| 1296 | The data underlying this article is available on the European Nucleotide Archive under the |
| 1297 | accession number PRJEB44124 (ERP128137). |
| 1298 | |
| 1299 | |
| 100 | |
| 1300 | |
| 1301 | |
| 1302 | |
| 1303 | |
| 1304 | |
| 1305 | |
| 1306 | |
| 1307 | |
| 1308 | |
| 1309 | |
| 1310 | |
| 1311 | |
| 1312 | |
| 1313 | |
| 1314 | |
| 1315 | |
| 1316 | |
| | |

- **Figures**



Figure 1. Mass burials discovered at Ellwangen. A. Location of Ellwangen in Germany. B.
Location of the marketplace, where the mass burials were discovered during an excavation in
2013-2015. C. Mass grave 549 showing several individuals being buried together.

Downloaded from https://academic.oup.com/mbe/advance-article/doi/10.1093/molbev/msab147/6277411 by MPI Science of Human History user on 08 June 2021



1332

1333

Figure 2. The 16th century plague victims and modern inhabitants of Ellwangen form a continuous population

A. PCA showing the 16th century (red) and modern (blue) Ellwangen populations in the context of 65 modern day populations from West-Eurasia based on 1,233,013 genome wide SNPs (Lazaridis et al. 2014; Haak et al. 2015; Fu et al. 2016). **B**. Admixture modeling based on four ancestral components (K=4) of the same 65 modern West Eurasian populations including 16th century (Ellwangen plague) and modern Ellwangen (Ellwangen modern) populations. The K=4 model was chosen due to the lowest cross-validation error.

- 1343
- 1344
- 1345
- 1346



1347

1348 **Figure 3. Natural selection drives HLA allele frequency changes**

Density plots showing the distributions of allele frequencies from SLIM3 model simulations with (dark grey) or without (light grey) natural selection. The starting frequency for simulations was the observed frequency in the 16th century population. Selection coefficients for the models with natural selection were -0.1 for *HLA-B*51:01* and *HLA-C*06:02* and 0.2 for *DRB1*13:01* (Supplementary Figure 5). The 2.5% extremes are shown in blue illustrating where the p-value cut-off of 0.05 would occur. Red points represent the frequency in the modern-day population.

1355

1356

1357**Table 1.** Genes identified in the 0.01% tail of distribution following *DAnc* analysis. **Ref** =1358reference, **Alt** = alternative, **Der** = derived, **Anc** = derived allele frequency in Ellwangen 16^{th} 1359century, **Mod** = derived allele frequency in Ellwangen modern, **CEU** = derived allele frequency1360in Central Europeans from Utah, **FIN** = derived allele frequency in Finnish, **GBR** = derived

allele frequency in Great Britains (obtained from the 1000 Genomes Project Phase 3 data). Red text indicates alleles that have significantly (p<0.05) increased in frequency in the modern individuals and blue text indicates that allele frequency has significantly (p<0.05) decreased in frequency in the modern individuals. F_{ST} empirical p-value refers to the empirical distribution of F_{ST} calculated between the 16th century and the modern Ellwangen population.

1366

| Chromosome | | Allele | | Ellwangen | | | | | | | | | | | |
|------------|-----------|------------|-----|-----------|-----|------|------|------|------|------|------|-----------------|-------------|--------|---------------|
| | | | | | | | | | | | | F _{ST} | | | Function |
| | | | | | | | | | | | | empirical | | | |
| No. | Position | SNP ID | Ref | Alt | Der | Anc | Mod | CEU | FIN | GBR | DAnc | p-value | Variant | Gene | |
| | | | | | | | | | | | | | | | activation of |
| 9 | 137772664 | rs17514136 | А | G | G | 0.17 | 0.37 | 0.28 | 0.24 | 0.21 | 0.20 | 0.99 | 5_prime_UTR | FCN2 | the lectin |
| | | | | | | | | | | | | | | | complement |
| | | | | | | | | | | | | | | | pathway |
| 9 | 137779026 | rs17549193 | С | Т | т | 0.19 | 0.39 | 0.29 | 0.25 | 0.23 | 0.20 | 0.99 | missense | FCN2 | |
| | | | | | | | | | | | | | | | activation of |
| | | | | | | | | | | | | | | | pro- |
| | | | | | | | | | | | | | | | inflammatory |
| 11 | 7079038 | rs10839708 | G | А | А | 0.69 | 0.51 | 0.60 | 0.65 | 0.63 | 0.18 | 0.97 | missense | NLRP14 | caspases |

1367

1368**Table 2.** Genotype and allele frequencies of *CCR5*-wildtype (wt), and *CCR5-\Delta32* (Δ 32), among1369the plague victims and modern individuals from Ellwangen. The individual genotypes are given1370in Supplementary Data 6A. The frequencies for Germany were obtained from a study of German1371bone marrow donor registry volunteers (Solloch et al., 2017) for comparison.

1372

| | Genotype fre | equency (| Allele Frequency (%) | | | |
|-----------|--------------|-----------------|-----------------------|------|------|--|
| | wt/wt | wt/ $\Delta 32$ | $\Delta 32/\Delta 32$ | wt | Δ32 | |
| Ellwangen | 71.4 | 23.8 | 4.8 | 83.4 | 16.6 | |
| plague | | | | | | |
| Ellwangen | 78.4 | 21.6 | 0 | 89.2 | 10.8 | |
| modern | | | | | | |
| Germany | 79.2 | 19.4 | 1.4 | 88.8 | 11.2 | |

- 1374 **Table 3.** *HLA-B*, *-C* and *-DRB1* allele frequencies in 16th century plague victims and modern
- 1375 inhabitants of Ellwangen. Frequency differences with p<0.05 are highlighted in red. No
- 1376 significance could be obtained after multiple testing correction (for details see Supplementary
- 1377 Data 5A).

| | Frequency | quency Frequency | |
|------------|---------------|------------------|---------|
| Loouo | (%) Diagua | (%) Modern | |
| Rtorio2 | Plague | Modern | P-value |
| B*00:01 | 13.89 | 14 | 0.904 |
| B*06:01 | 9.72 | 13 | 0.508 |
| B*13:02 | 1.39 | 3 | 0.490 |
| B*14:02 | 1.39 | 4 | 0.315 |
| B*15:01 | 5.56 | 10 | 0.294 |
| B*18:01 | 5.56 | 3 | 0.402 |
| B*27:05 | 4.17 | 3 | 0.680 |
| B*35:01 | 4.17 | 6 | 0.595 |
| B*35:03 | 4.17 | 2 | 0.403 |
| B*38:01 | 2.78 | 1 | 0.379 |
| B*40:01 | 4.17 | 2 | 0.403 |
| B*44:02 | 4.17 | 6 | 0.595 |
| B*49:01 | 1.39 | 1 | 0.814 |
| B*50:01 | 4.17 | 1 | 0.174 |
| B*51:01 | 15.28 | 6 | 0.044 |
| B*52:01 | 1.39 | 1 | 0.814 |
| B*57:01 | 4.17 | 2 | 0.403 |
| | | | |
| C*01:02 | 4.17 | 2 | 0.403 |
| C*02:02 | 4.17 | 3 | 0.680 |
| C*03:03 | 4.17 | 11 | 0.106 |
| C*03:04 | 6.94 | 4 | 0.393 |
| C*04:01 | 11.11 | 15 | 0.460 |
| C*05:01 | 2.78 | 5 | 0.467 |
| C*06:02 | 13.89 | 5 | 0.041 |
| C*07:01 | 13.89 | 17 | 0.580 |
| C*07:02 | 15.28 | 12 | 0.533 |
| C*07:04 | 1.39 | 1 | 0.814 |
| C*08:02 | 1.39 | 4 | 0.315 |
| C*12:02 | 1.39 | 5 | 0.871 |
| C*15:02 | 5.56 | 4 | 0.632 |
| | | | |
| DRB1*01:01 | 9.72 | 7 | 0.520 |
| DRB1*01:02 | 1.39 | 2 | 0.763 |
| DRB1*03:01 | 11.11 | 11 | 0.982 |
| DRB1*04:01 | 9.72 | 3 | 0.063 |
| DRB1*04:07 | 1.39 | 1 | 0.814 |
| DRB1*04:08 | 1.39 | 2 | 0.763 |
| DRB1*07:01 | 11.11 | 12 | 0.857 |
| DRB1*09:01 | 1.39 | 2 | 0.763 |
| DRB1*11:01 | 9.72 | 6 | 0.363 |
| DRB1*11:03 | 2.78 | 2 | 0.738 |
| DRB1*11:04 | 1.39 | 4 | 0.315 |
| DRB1*12:01 | 1.39 | 1 | 0.814 |
| DRB1*13:01 | 2.78 | 10 | 0.067 |
| DRB1*13:02 | 2.78 | 6 | 0.323 |
| DRB1*15:01 | 18.06 | 15 | 0.592 |
| DRB1*15:02 | 1.39 | 1 | 0.814 |
| DRB1*16:01 | 1.39 | 3 | 0.490 |
| | | | |
| DRB1*01 | 11.11 | 9 | 0.625 |
| DRB1*03 | 11.11 | 11 | 0.956 |
| DRB1*04 | 15.28 | 10 | 0.281 |
| DRB1*07 | 11.11 | 12 | 0.883 |
| DRB1*11 | 13.89 | 13 | 0.838 |
| DRB1*13 | 5.56 | 17 | 0.026 |
| DRB1*15 | 19.44 | 16 | 0.529 |

1378

1380 **Table 4. A.** Allele frequencies for (top) presence of *KIR3DL1* gene, (bottom) *KIR3DL1* alleles

1381 (‡) indicates allele not expressed at the cell surface (Guethlein et al., 2015).

1382 **B.** Genotype frequencies for *KIR3DL1* and *I80⁺HLA-B* in 16^{th} century (plague) and modern

1383 inhabitants of Ellwangen. Shown are p values from (chi) chi square, and (lme) logistic mixed

1384 effects model.

1385

1386

| Α | | frequency plague | frequency modern |
|---------|---------------------------|---------------------|---------------------|
| Gene | KIR3DL1 | 0.81 | 0.74 |
| | *00101 *002 | 0.25 0.17 | 0.18 0.13 |
| Alleles | *00401 <i>‡</i> *00501 | 0.11 0.13 | 0.08 0.18 |
| | *007 | 0.03 | 0.02 |
| | *008 | 0.07 | 0.04 |
| | *01502 | 0.06 | 0.11 |

В

| | Number Observed | | | | | p= | | |
|-----------------------------------|-----------------|-----------|-------|----------|-------|-------|--|--|
| Genotype | plagı | ıe (N=36) | moder | n (N=50) | (chi) | (Ime) | | |
| I-80 ⁺ HLA-B | 20 | (55.6%) | 16 | (32%) | 0.029 | 0.07 | | |
| KIR3DL1 | 35 | (97.2%) | 44 | (88%) | 0.099 | 0.29 | | |
| KIR3DL1 + I-80 ⁺ HLA-B | 19 | (52.8%) | 13 | (26%) | 0.011 | 0.01 | | |