# **1** Additional File 1: Supplementary Information

2

# **Section 1: Details of measurement and analysis methods**

## 4 (a) Maximum-likelihood methods

The maximum-likelihood approach to copy number determination we adopted was 5 similar in its general structure to that used by Aldhous et al. for beta-defensins [1], 6 and our rationale for adopting such an approach was two-fold. Firstly, we needed a 7 way of combining information from different independent measures of DEFA1A3 8 copy number. This was particularly important in allowing us to leverage the power of 9 the allele ratio measurements, which we have found to have high empirical accuracy, 10 presumably because allele ratios do not compare representation of the target 11 sequence with another (reference) locus in the genome, but instead compare 12 variants of the target sequence with each other. Nevertheless, allele ratio methods 13 alone are not sufficient – a measured allele ratio of 2:1 is compatible with true copy 14 numbers of 3, 6, 9 or any multiple of 3 – and PRTs (or some other method of fixing 15 the approximate copy number relative to the genome as a whole) are necessary to 16 arrive at a reliable copy number determination. If all the data were PRT 17 measurements, we could simply combine the measurements as an average (or 18 19 weighted average if differences in accuracy need to be taken into account); by contrast, allele ratios and PRTs are very different types of data, and likelihood 20 evaluations allow us to combine them on an even basis. 21

The second rationale was that a likelihood approach would have a built-in method for 22 evaluating the confidence that could be placed in an integer copy-number call. 23 Although the distributions of error around each measurement are not known a priori, 24 we have enough empirical data from samples of confidently-assigned copy number 25 to model the expected distribution of measurements, and these can in turn be used 26 to derive the probability of the observed measurement conditional on a particular true 27 integer copy number. The distributions observed (see Supplementary Figure 1 for 28 29 the PRT measurements) approximate quite well to a Gaussian, and despite a small excess of values at the extremes of some distributions (Supplementary Figures 1 30 and 2), they fit well enough in the central range -2 < z < 2 in which most observations 31 are found that we adopted a Gaussian model as mathematically convenient. 32

33

# 34 (b) Evaluating likelihoods

35 For the PRT measurements, the probability of measuring the value observed

36 assuming a true underlying copy number was determined assuming that PRT

- 37 measurements of samples of true copy number N would have a Gaussian
- 38 distribution with mean N, and a standard deviation estimated from repeated analysis

of samples of known copy number. Using a relatively small number of reference 39 standards allowed us to estimate standard deviations for PRT measurements that 40 gave useful analyses, but appeared to underestimate the standard deviations for all 41 copy-number classes relative to the data observed in a larger data set. Further 42 43 analysis of PRT measurements showed that higher standard deviations were observed in analysis of many different samples of the same copy number relative to 44 repeated analysis of the same samples. We therefore increased the estimated 45 standard deviations to take account of this phenomenon, resulting in analyses that 46 were more internally consistent. This procedure was also conservative, in the sense 47 that it would act to underestimate the overall confidence in our integer copy number 48 calls. We have never observed a sample with a copy number of 2, and there are few 49 each of copy numbers above 11 in our dataset. For these copy numbers, standard 50 deviations were estimated by extrapolation from neighbouring values. The standard 51 52 deviations used in our analyses were:

53	CN	MLT1A0 PRT	DEFA4 PRT
54	2	0.2	0.2
55	3	0.3	0.3
56	4	0.43	0.54
57	5	0.53	0.65
58	6	0.63	0.76
59	7	0.73	0.87
60	8	0.83	0.98
61	9	0.93	1.09
62	10	1.03	1.2
63	11	1.3	1.3
64	12	1.4	1.4
65	13	1.6	1.6
66	14	1.8	1.8
67	15	2	2
68	16	2.2	2.2
69			

For the ratio methods, because the same copy number could be informatively 70 71 represented by many compatible integer splits (a copy number of 7 could be split 0:7, 1:6, 2:5, 3:4, 4:3, 5:2, 6:1 and 7:0) we analysed all possible splits for each copy 72 number, analysing for each copy number the split that best matched the observed 73 ratio. This best-fitting observed ratio was then expressed as a normalised ratio, the 74 ratio of the observed value relative to the expected; for example, a measured ratio of 75 1.8 and a MLCN of 6 (for which the best-fit integer ratio is 4:2, or a ratio of 2.0) would 76 77 generate a NR of 0.9. Normalised allele ratios appeared to have empirical distributions that approximate well to Gaussian distributions (see below). Our data 78 allowed us to observe that ratio measurements for indel5 and DefHae3 had 79 normalised values that were consistently different from the expected mean value of 80

81 1.0 (see below), and the data allowed us to estimate standard deviations for the 82 normalised values.

83

# 84 (c) Observed measurement distributions

Supplementary Figure 1 shows the observed distributions of normalised ratio (NR) 85 values, and Supplementary Figure 2 shows the quantile-quantile plots against a 86 Gaussian distribution. For PRTs, the normalised value is the observed PRT 87 measurement expressed relative to the maximum-likelihood copy number (MLCN, 88 see below) for that sample. Thus a PRT measurement of 6.6 in a sample to which an 89 MLCN of 6 was assigned would generate a normalised ratio of 1.1. For the allele 90 91 ratios, the NR is the measured ratio expressed relative to the best-fitting integer split 92 of the MLCN (see above).

Previous experience [2] had shown that the DefHae3 (DEFA1:DEFA3) ratio test had 93 a tendency to overestimate the representation of *DEFA3* by about 10%. On average, 94 95 samples with equal numbers of DEFA1 and DEFA3 genes would record a 96 DEFA1:DEFA3 ratio of about 0.92, which we assume is due to the generation of heteroduplex DNA that would fail to digest with HaelII (see Supplementary Figure 97 2d, below). In our analysis, we corrected for this bias by modelling a distribution of 98 99 NR values with a mean of 0.918 rather than 1. Similarly, presumably because the shorter PCR product has a small amplification advantage relative to the longer one, 100 the ratio of the deleted to undeleted forms of the indel5 variant has a mean of about 101 102 1.05, which was used as the mean of the NR distribution.

103

## 104 (d) Minimum ratios as confidence measures

We used the likelihood estimates to determine a measure of the confidence with 105 which a MLCN was assigned – in some cases there would be multiple 106 107 measurements strongly supporting the same MLCN, leading to high confidence, whereas in other cases some of the measures might be missing, uninformative or 108 contradictory, leading to lower confidence in the best-supported single integer value 109 for the MLCN. We defined the "minimum ratio" (MR) as the factor by which the 110 likelihood associated with the MLCN exceeded the next best supported integer copy 111 number. In our data, these MR values had a median value of 20.1 and an upper 112 quartile value of 133.1, suggesting that most samples had a strongly supported 113 MLCN, but there were also many samples with relatively low MRs (the lowest 114 quartile value is 3.78). There was a strong association between low MR and missing 115 116 or uninformative data - the 528 samples with four or five informative values out of the five possible measures (two PRTs and three ratios) had a median MR of 25.48, 117 while the 61 samples with three or fewer informative measurements had a median 118 MR of 4.65. A technically accurate ratio measurement can be uninformative if only 119

one of the two variants is present – this is particularly frequent for the DefHae3 ratio,
for which about 10% of the population lack *DEFA3* [2]. Low MR was also strongly
correlated with high copy number, presumably because of the increased difficulty in
distinguishing neighbouring integer values; of the 336 samples with MLCN values
between 3 and 7, the median MR was 93.51, whereas the 253 samples with MLCN
of 8 or more had a median MR of 5.12.

In most cases the data supported an interpretation that all measurements were 126 consistent with a single underlying copy number value, but we wanted to ensure that 127 we were aware of any evidence that any of the tests was measuring a value 128 genuinely inconsistent with the consensus. This might happen either because of 129 130 variant repeats with altered representation of the measured sequences, unexpected SNP variation compromising the efficiency of PCR from particular targets, or 131 because of copy number variation of reference loci in PRT assays. We therefore 132 screened our analyses to identify any samples for which the relative P value for the 133 134 MLCN (derived from integrating all measurements) was below 0.0005 for any individual test. Because we obtained five measures of copy number for each of more 135 than 500 samples, we considered that a threshold of 1 in 2000 would allow us to 136 identify any strong anomalies without creating too great a burden of false positives. 137

Inspection of the 7 samples (1.2%) highlighted as anomalous showed no recurrent 138 pattern of discrepancy that explains most of the anomalies. All these samples did 139 show unusually divergent values between the two PRT measurements, which might 140 in principle indicate reference locus variation. We therefore retyped the PRTs for 141 these samples, which yielded values on retyping that were more consistent with 142 each other and with one of the previous PRT measurements. We would therefore 143 144 suggest that our initial measurements of these samples represent extremes of random measurement variation, and are not evidence of uncommon genotypes that 145 lead to systematic error in copy number evaluation. 146

One sample (NA12045) included in our sample set was known from other work [3] to 147 carry a heterozygous deletion of *DEFA4*, such that the DEFA4 PRT would be 148 expected to return a copy number estimate (based on the assumption that two 149 copies of *DEFA4* were present) of about twice the true value. This deletion was 150 tracked using a PCR assay in CEPH pedigree 1346, and is found in the mother 151 (CEPH 134602 = NA10852), her father (CEPH 134613 = NA12045) and four 152 offspring. Although NA12045 is not highlighted as anomalous in this work by the 153 analysis program, the DEFA4 PRT does return a value (18.95) much higher than the 154 MLT1A0 PRT value (13.58); these measurements constitute the extreme outlier 155 point at the top right of Figure 2. If this deletion of DEFA4 were prevalent, it would 156 compromise the general applicability of our combined PRT scheme for DEFA1A3 157 copy number measurement. We therefore used the PCR-based assay to type the 158 DEFA4 deletion status of all samples flagged as anomalous in the analysis (see 159 above) and samples with DEFA4 PRT copy number values more than 1.4 times the 160 MLT1A0 value. We found no further examples of the DEFA4 deletion, and conclude 161

- that it is present at low frequency; even with incomplete ascertainment, since one
- heterozygous example was found in 589 unrelated individuals, the allele frequency is likely to be of the order of 0.001.

Our maximum likelihood analysis does not take into account any prior probabilities derived from known distributions of copy number within the population; this assumption of "flat priors" is necessary in this initial analysis, to avoid circularity of argument, but the analysis could be extended in future work by applying known frequencies of particular diploid copy number states as prior probabilities. This would have the effect of increasing the confidence of assignment (as measured by the Minimum Ratio) for the majority of common copy number states.

- We applied the analysis procedure in the context of a custom program written in c++ (source code available on request). In this context, the smallest positive number that
- can be represented as a double-precision variable is about 10<sup>-308</sup>, and probability
- values smaller than this are rounded to zero.
- 176

# 177 Section 2: Comparison with other *DEFA1A3* CNV measurements

We were able to compare our measurements with eight samples that were both part 178 of our sample set and included in the CNV Genome Baseline Set of Complete 179 Genomics [4]. As the read-depth most likely to correspond to DEFA1A3 copy 180 number, we selected sequence bins (chr8: 6822000-6828000, 6840000-6848000 181 and 6860000-6866000) that included the gene sequences and surrounding 182 sequences shared at high levels of sequence identity between the repeats on the 183 human genome assembly (Build 36). The mean values across these intervals for 184 median-scaled, GC-corrected read depth representation are shown relative to the 185 corresponding MLCN values in Supplementary Table 1 below, and in Supplementary 186 Figure 3. 187

- 188 The comparison with the microarray data of Campbell *et al*. used the values from
- their Table S7 for the "non-discrete" CNV defined by 52 probes in the interval
- chr8:6815835-6866374. There were 108 samples typed for that CNV by both
- 191 Campbell *et al.* and in this study, with an  $r^2$  value of 0.49 between the different
- measures. A scatterplot of the results is shown as Supplementary Figure 4, below.
- 193 Using publicly available intensity data for 17 samples common to both studies
- 194 (http://www.sanger.ac.uk/research/areas/humangenetics/cnv/highres\_discovery.html
- 195 ) from the 42 million-element array-CGH data of Conrad *et al.* (2010), the median
- log<sub>2</sub> ratio values across the three repeat intervals at chr8:6,822,000-6,828,000,
- 197 chr8:6,840,000-6,848,000 and chr8:6,860,000-6,866,000 were compared with the
- 198 MLCN from this study. A scatterplot of these comparisons is shown in
- 199 Supplementary Figure 5 below ( $r^2 = 0.74$ ). Although we have not determined its copy
- number directly in this study, these comparisons are consistent with the reference
- sample NA10851 having a copy number of 7.

# 202 Section 3: P values from GWAS studies

After consulting with the relevant investigators, we interrogated 18 GWAS studies of 203 infectious/inflammatory disorders for P values at SNP loci associated with DEFA1A3 204 copy number, and Supplementary Table 3 below summarises those findings. In 205 addition to the GWAS studies of inflammatory conditions specifically interrogated in 206 that approach, further P values for rs4300027, rs4512398 and rs7825750 can be 207 obtained by searching GWAS Central (http://www.gwascentral.org/index). In total, 208 152 entries were found in GWAS Central for P values involving these SNPs. Among 209 these 152 entries, there were 6 examples of P values below 0.05: 210

211	SNP	P value	phenotype	GWAS Central ID
212	rs4512398	0.007237	Rheumatoid arthritis	HGVST185
213	rs4512398	0.008682	Parkinson's disease	HGVST6
214	rs7825750	0.0174983	Systolic blood pressure	HGVST307
215	rs4512398	0.02662	Parkinson's disease	HGVST6
216	rs4512398	0.03606	Rheumatoid arthritis	HGVST185
217	rs4300027	0.03989	Amyotrophic lateral sclerosis	HGVST65
218				

The first and fifth entries, and the second and fourth, are variant analyses of the same SNP in the same data set, and are therefore not independent. These include no examples of P values that are of clear significance given the number of values considered overall. Taken together the P values from non-duplicate SNP analyses conform well to the expectation for 87 values randomly distributed between 0 and 1 (see Supplementary Figure 6, below).

225

### 227 Supplementary Tables

## 228 Supplementary Table 1

- 229 DEFA1A3 MLCN (this study) and median-scaled, GC-corrected read depth
- 230 (Complete Genomics) for eight samples common to both studies.

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sample	MLCN	read
		depth
NA06985	7	2.26
NA06994	6	1.94
NA07357	10	3.33
NA12004	7	2.27
NA12889	10	2.87
NA12890	5	1.69
NA12891	5	1.73
NA12892	7	2.51

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233

# 234 Supplementary Table 2

New reference standards used in this study. "CEPH family ID" is given for those

samples which have been validated not only via repeated concordant measurements

against previous reference samples (of copy number deduced from restriction

fragment lengths established by Southern blotting of pulsed-field gels), but also from

segregation of haplotypes established via segregation in three-generation CEPH

240 pedigrees. These particular copy number values can therefore be regarded as very

strongly established.

Sample	<i>DEFA1A3</i> CN	Source	CEPH family ID
C0007	7	ECACC HRC1	
C0075	6	ECACC HRC1	
C0150	8	ECACC HRC1	
C0877	9	ECACC HRC1	
NA07062	5	CEPH	1340-3
NA11998	6	CEPH	1420-4
NA07008	7	CEPH	1340-5

242

#### 244 Supplementary Table 3

Summary of P values for *DEFA1A3* CNV-associated SNPs in 18 independent GWAS studies of inflammatory or infectious disorders. In the single instance of a nominally significant point P value ( $P_{obs} < 0.05$ ), the adjusted P value ( $P_{corr}$ ) is shown using a Bonferroni correction for the 18 different studies analysed:  $P_{corr} = 1 - [(1-P_{obs})^N]$ , where N is the number of tests,

249 which approximates to  $NP_{obs}$  when N is large and  $P_{obs}$  small.

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251	Phenotype	SNP	P <sub>obs</sub>	P <sub>corr</sub>	Reference
252	WTCCC				
253	Bipolar disorder	rs7825750	0.529		[5]
254	Coronary artery disease	rs7825750	0.555		[5]
255	Crohn's disease	rs7825750	0.168		[5]
256	Hypertension	rs7825750	0.660		[5]
257	Rheumatoid arthritis	rs7825750	0.365		[5]
258	Type 1 diabetes	rs7825750	0.201		[5]
259	Type 2 diabetes	rs7825750	0.191		[5]
260					
261	Coeliac Disease	rs4512398	0.013	0.21	[6]
262	type 1 diabetes	rs4512398	>0.05		[7]
263		rs4300027	>0.05		[7]
264	Ulcerative colitis	rs4512398	0.8		[8]
265		rs4300027	0.71		[8]
266	Crohn's Disease	rs4512398	0.525		[9]
267	IBD	rs4512398	>0.05		[10]
268		rs4300027	>0.05		[10]
269	Psoriasis	rs4512398	0.2		[11]
270	Psoriasis	rs4300027	0.49		[12]
271		rs4512398	0.926		[12]
272	Atopic Dermatitis	rs7825750	>0.05		[13]
273	Multiple Sclerosis	rs7825750	0.5904		[14]
274	HIV progression	rs4300027	0.946		[15]
275		rs4512398	0.783		[15]
276		rs7825750	0.79		[15]
277	CF severity	rs4300027	0.10		[16]
278		rs4512398	0.12		[16]
279					

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## 283 Supplementary Figure 1

- Normalised Ratio (=measurement/MLCN) distributions for (a) MLT1A0 and (b)
- 285 DEFA4 PRTs.
- 286 (a)



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# 291 Supplementary Figure 2

292 QQ plots of NR relative to a Gaussian distribution for all 5 measures: (a) MLT1A0

PRT, (b) DEFA4 PRT, (c) indel5 ratios, (d) DefHae3 (*DEFA1:DEFA3*) ratios and (e)

7bp duplication ratios. For a given MLCN, in (c)-(e) there will more than one possible

split of variants consistent with the integer total, and the ratio that most closelymatches the observed value has been used.





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(c)







DEFA1A3 MLCN (this study) plotted against median-scaled, GC-corrected read 312

depth (Complete Genomics) for eight samples common to both studies (see also 313 Supplementary Table 1). 314

315



Scatterplot comparing the MLCN values in this study with the microarray data of Campbell *et al.* (their Table S7, chr8:6815835-6866374) for 108 HapMap samples typed in both studies ( $r^2 \approx 0.49$ ).



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326 Comparison between intensity data from Conrad et al. (2010) from the *DEFA1A3* 

327 CNV region for 17 samples and the MLCN from this study (see section 2 for details). 328 The  $r^2$  value is 0.74.



Q-Q plot of all 87 non-duplicate P values for rs7825750, rs4300027 or rs4512398 332 from GWAS Central. To avoid double-counting of non-independent data, this 333 compilation removed duplicate analyses of the same SNP in the same data, in every 334 case choosing the more significant P value. This over-conservative procedure is 335 likely to have led to the observed general small excess of non-significant P values in 336 the range above P = 0.05 (i.e.,  $-\log_{10} P$  values below 1.3). Nevertheless, there is no 337 indication of an excess of significant P values, and the overall pattern of P values 338 observed is consistent with what would be expected from 87 numbers distributed 339 randomly between 0 and 1. 340



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