# Genome-wide detection and characterization of positive selection in human populations

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With the advent of dense maps of human genetic variation, it is now possible to detect positive natural selection across the human genome. Here we report an analysis of over 3 million polymorphisms from the International HapMap Project Phase 2 (HapMap2)<sup>1</sup>. We used 'long-range haplotype' methods, which were developed to identify alleles segregating in a population that have undergone recent selection<sup>2</sup>, and we also developed new methods that are based on cross-population comparisons to discover alleles that have swept to near-fixation within a population. The analysis reveals more than 300 strong candidate regions. Focusing on the strongest 22 regions, we develop a heuristic for scrutinizing these regions to identify candidate targets of selection. In a complementary analysis, we identify 26 nonsynonymous, coding, single nucleotide polymorphisms showing regional evidence of positive selection. Examination of these candidates highlights three cases in which two genes in a common biological process have apparently undergone positive selection in the same population: LARGE and DMD, both related to infection by the Lassa virus3, in West Africa; SLC24A5 and SLC45A2, both involved in skin pigmentation<sup>4,5</sup>, in Europe; and EDAR and EDA2R, both involved in development of hair follicles<sup>6</sup>, in Asia.

An increasing amount of information about genetic variation, together with new analytical methods, is making it possible to explore the recent evolutionary history of the human population. The first phase of the International Haplotype Map, including ∼1 million single nucleotide polymorphisms (SNPs)<sup>7</sup>, allowed preliminary examination of natural selection in humans. Now, with the publication of the Phase 2 map (HapMap2)¹ in a companion paper, over 3 million SNPs have been genotyped in 420 chromosomes from three continents (120 European (CEU), 120 African (YRI) and 180 Asian from Japan and China (JPT + CHB)).

In our analysis of HapMap2, we first implemented two widely used tests that detect recent positive selection by finding common alleles carried on unusually long haplotypes<sup>2</sup>. The two, the Long-Range Haplotype (LRH)<sup>8</sup> and the integrated Haplotype Score (iHS)<sup>9</sup> tests, rely on the principle that, under positive selection, an allele may rise to high frequency rapidly enough that long-range association with nearby polymorphisms—the long-range haplotype<sup>8</sup>—will not have time to be eliminated by recombination. These tests control for local variation in recombination rates by comparing long haplotypes to other alleles at the same locus. As a result, they lose power as selected alleles approach fixation (100% frequency), because there are then

few alternative alleles in the population (Supplementary Fig. 2 and Supplementary Tables 1–2).

We next developed, evaluated and applied a new test, Cross Population Extended Haplotype Homozogysity (XP-EHH), to detect selective sweeps in which the selected allele has approached or achieved fixation in one population but remains polymorphic in the human population as a whole (Methods, and Supplementary Fig. 2 and Supplementary Tables 3–6). Related methods have recently also been described<sup>10–12</sup>.

Our analysis of recent positive selection, using the three methods, reveals more than 300 candidate regions (Supplementary Fig. 3 and Supplementary Table 7), 22 of which are above a threshold such that no similar events were found in 10 Gb of simulated neutrally evolving sequence (Methods). We focused on these 22 strongest signals (Table 1), which include two well-established cases, SLC24A5 and  $LCT^{2.5,13}$ , and 20 other regions with signals of similar strength.

The challenge is to sift through genetic variation in the candidate regions to identify the variants that were the targets of selection. Our candidate regions are large (mean length, 815 kb; maximum length, 3.5 Mb) and often contain multiple genes (median, 4; maximum, 15). A typical region harbours ~400–4,000 common SNPs (minor allele frequency >5%), of which roughly three-quarters are represented in current SNP databases and half were genotyped as part of HapMap2 (Supplementary Table 8).

We developed three criteria to help highlight potential targets of selection (Supplementary Fig. 1): (1) selected alleles detectable by our tests are likely to be derived (newly arisen), because long-haplotype tests have little power to detect selection on standing (pre-existing) variation<sup>14</sup>; we therefore focused on derived alleles, as identified by comparison to primate outgroups; (2) selected alleles are likely to be highly differentiated between populations, because recent selection is probably a local environmental adaptation2; we thus looked for alleles common in only the population(s) under selection; (3) selected alleles must have biological effects. On the basis of current knowledge, we therefore focused on non-synonymous coding SNPs and SNPs in evolutionarily conserved sequences. These criteria are intended as heuristics, not absolute requirements. Some targets of selection may not satisfy them, and some will not be in current SNP databases. Nonetheless, with ~50% of common SNPs in these populations genotyped in HapMap2, a search for causal variants is timely.

We applied the criteria to the regions containing *SLC24A5* and *LCT*, each of which already has a strong candidate gene, mutation and trait. At *SLC24A5*, the 600 kb region contains 914 genotyped

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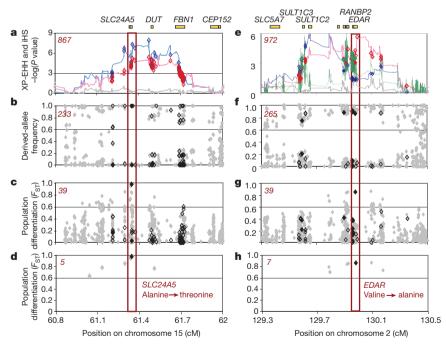
Table 1 The twenty-two strongest candidates for natural selection

Region	Chr:position (MB, HG17)	Selected population	Long Haplotype Test	Size (Mb)	Total SNPs with Long Haplotype Signal	Subset of SNPs that fulfil criteria 1	Subset of SNPs that fulfil criteria 1 and 2	Subset of SNPs that fulfil criteria 1, 2 and 3	Genes at or near SNPs that fulfil all three criteria
1	chr1:166	CHB + JPT	LRH, iHS	0.4	92	39	30	2	BLZF1, SLC19A2
2	chr2:72.6	CHB + JPT	XP-EHH	0.8	732	250	0	0	
3	chr2:108.7	CHB + JPT	LRH, iHS, XP-EHH	1.0	972	265	7	1	EDAR
4	chr2:136.1	CEU	LRH, iHS, XP-EHH	2.4	1,213	282	24	3	RAB3GAP1, R3HDM1, LCT
5	chr2:177.9	CEU,CHB + JPT	LRH, iHS, XP-EHH	1.2	1,388	399	79	9	PDE11A
6	chr4:33.9	CEU,YRI, CHB + JPT	LRH, iHS	1.7	413	161	33	0	
7	chr4:42	CHB + JPT	LRH, iHS, XP-EHH	0.3	249	94	65	6	SLC30A9
8	chr4:159	CHB + JPT	LRH, iHS, XP-EHH	0.3	233	67	34	1	
9	chr10:3	CEU	LRH, iHS, XP-EHH	0.3	179	63	16	1	
10	chr10:22.7	CEU, CHB $+$ JPT	XP-EHH	0.3	254	93	0	0	
11	chr10:55.7	CHB+JPT	LRH, iHS, XP-EHH	0.4	735	221	5	2	PCDH15
12	chr12:78.3	YRI	LRH, iHS	0.8	151	91	25	0	
13	chr15:46.4	CEU	XP-EHH	0.6	867	233	5	1	SLC24A5
14	chr15:61.8	CHB + JPT	XP-EHH	0.2	252	73	40	6	HERC1
15	chr16:64.3	CHB + JPT	XP-EHH	0.4	484	137	2	0	
16	chr16:74.3	CHB + JPT, YRI	LRH, iHS	0.6	55	35	28	3	CHST5, ADAT1, KARS
17	chr17:53.3	CHB + JPT	XP-EHH	0.2	143	41	0	0	
18	chr17:56.4	CEU	XP-EHH	0.4	290	98	26	3	BCAS3
19	chr19:43.5	YRI	LRH, iHS, XP-EHH	0.3	83	30	0	0	
20	chr22:32.5	YRI	LRH	0.4	318	188	35	3	LARGE
21	chr23:35.1	YRI	LRH, iHS	0.6	50	35	25	0	
22	chr23:63.5	YRI	LRH, iHS	3.5	13	3	1	0	
		Total SNPs		16.74	9,166	2,898	480	41	

Twenty-two regions were identified at a high threshold for significance (Methods), based on the LRH, iHS and/or XP-EHH test. Within these regions, we examined SNPs with the best evidence of being the target of selection on the basis of having a long haplotype signal, and by fulfilling three criteria: (1) being a high-frequency derived allele; (2) being differentiated between populations and common only in the selected population; and (3) being identified as functional by current annotation. Several candidate polymorphisms arise from the analysis including well-known LCT and SLC24A5 (ref. 2), as well as intriguing new candidates.

SNPs. Applying filters progressively (Table 1 and Fig. 1a–d), we found that 867 SNPs are associated with the long-haplotype signal, of which 233 are high-frequency derived alleles, of which 12 are highly differentiated between populations, and of which only 5 are

common in Europe and rare in Asia and Africa. Among these five SNPs, there is only one implicated as functional by current knowledge; it has the strongest signal of positive selection and encodes the A111T polymorphism associated with pigment differences in



**Figure 1** | **Localizing SLC24A5** and **EDAR** signals of selection. **a**–**d**, *SLC24A5*. **a**, Strong evidence for positive selection in CEU samples at a chromosome 15 locus: XP-EHH between CEU and JPT + CHB (blue), CEU and YRI (red), and YRI and JPT + CHB (grey). SNPs are classified as having low probability (bordered diamonds) and high probability (filled diamonds) potential for function. SNPs were filtered to identify likely targets of selection on the basis of the frequency of derived alleles (**b**), differences between populations (**c**) and differences between populations for high-frequency derived alleles (less than 20% in non-selected populations)

(**d**). The number of SNPs that passed each filter is given in the top left corner in red. The threonine to alanine candidate polymorphism in *SLC24A5* is the

clear outlier. e–h, *EDAR*. e, Similar evidence for positive selection in JPT + CHB at a chromosome 2 locus: XP-EHH between CEU and JPT + CHB (blue), between YRI and JPT + CHB (red), and between CEU and YRI (grey); iHS in JPT + CHB (green). A valine to alanine polymorphism in *EDAR* passes all filters: the frequency of derived alleles (f), differences between populations (g) and differences between populations for high-frequency derived alleles (less than 20% in non-selected populations) (h). Three other functional changes, a D→E change in *SULT1C2* and two SNPs associated with *RANBP2* expression (Methods), have also become common in the selected population.

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humans and thought to be the target of positive selection<sup>5</sup>. Our criteria thus uniquely identify the expected allele.

At the *LCT* locus, we found similar degrees of filtration. Within the 2.4 Mb selective sweep, 24 polymorphisms fulfil the first two criteria (Table 1, and Supplementary Fig. 4), with the polymorphism thought to confer adult persistence of lactase among them. However, this SNP was only identified as functional after extensive study of the *LCT* gene<sup>15</sup>. Thus *LCT* shows both the utility and the limits of the heuristics.

Given the encouraging results for SLC24A5 and LCT, we performed a similar analysis on all 22 candidate regions (Table 1). Filtering the 9,166 SNPs associated with the long-haplotype signal, we found that 480 satisfied the first two criteria. We identified 41 out of the 480 SNPs (0.2% of all SNPs genotyped in the regions) as possibly functional on the basis of a newly compiled database of polymorphisms in known coding elements, evolutionarily conserved elements and regulatory elements (Methods; B.F., unpublished), together containing  $\sim 5.5\%$  of all known SNPs.

Eight of the forty-one SNPs encode non-synonymous changes (Table 1 and Supplementary Table 9). Apart from the well-known case of *SLC24A5*, they are found in *EDAR*, *PCDH15*, *ADAT1*, *KARS*, *HERC1*, *SLC30A9* and *BLFZ1*. The remaining 33 potentially functional SNPs lie within conserved transcription factor motifs, introns, UTRs and other non-coding regions.

To identify additional candidates, we reversed the process by taking non-synonymous coding SNPs with highly differentiated high-frequency derived alleles; these SNPs comprise a tiny fraction of all SNPs and have a higher a priori probability of being targets of selection. Of the 15,816 non-synonymous SNPs in HapMap2, 281 (Supplementary Table 10) have both a high derived-allele frequency (frequency >50%) and clear differentiation between populations ( $F_{\rm ST}$  is in the top 0.5 percentile). We examined these 281 SNPs to identify those embedded within long-range haplotypes<sup>16</sup>, and identified 26 putative cases of positive selection. These include the eight non-synonymous SNPs identified in the genome-wide analysis above.

Interestingly, analysis of the top regions and the non-synonymous SNPs together revealed three cases of two genes in the same pathway both having strong evidence of selection in a single population.

In the European sample, there is strong evidence for two genes already shown to be associated with skin pigment differences among humans. The first is *SLC24A5*, described above. We further examined the global distribution (Fig. 2) and the predicted effect on protein activity of the *SLC24A5* A111T polymorphism (Supplementary Fig. 5, 6). The second, *SLC45A2*, has an important role in pigmentation in zebrafish, mouse and horse<sup>4</sup>. An L374F substitution in *SLC45A2* is at 100% frequency in the European sample, but absent in the Asian and African samples. A recent association study has shown that the Phe-encoding allele is correlated with fair skin and non-black hair in Europeans<sup>4</sup>. Together, the data support *SLC45A2* as a target of positive selection in Europe<sup>10,17</sup>.

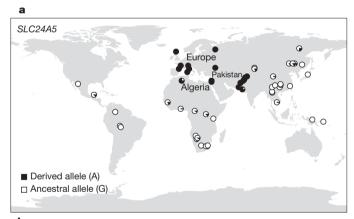
In the African sample (Yoruba in Ibadan, Nigeria), there is evidence of selection for two genes with well-documented biological links to the Lassa fever virus. The strongest signal in the genome, on the basis of the LRH test, resides within a 400 kb region that lies entirely within the gene LARGE. The LARGE protein is a glycosylase that post-translationally modifies α-dystroglycan, the cellular receptor for Lassa fever virus (as well as other arenaviruses), and the modification has been shown to be critical for virus binding3. The virus name is derived from Lassa, Nigeria, where the disease is endemic, with 21% of the population showing signs of exposure<sup>18</sup>. We also noted that the DMD locus is on our larger candidate list of regions, with the signal of selection again in the Yoruba sample. DMD encodes a cytosolic adaptor protein that binds to  $\alpha$ -dystroglycan and is critical for its function. We hypothesize that Lassa fever created selective pressure at LARGE and DMD<sup>12</sup>. This hypothesis can be tested by correlating the geographical distribution of the selected haplotype

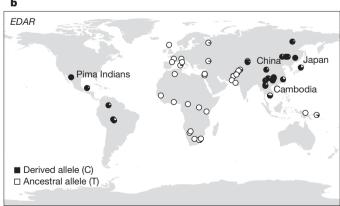
with endemicity of the Lassa virus, studying infection of genotyped cells *in vitro*, and searching for an association between the selected haplotype and clinical outcomes in infected patients.

In the Asian samples, we found evidence of selection for non-synonymous polymorphisms in two genes in the ectodysplasin (EDA) pathway, which is involved in development of hair, teeth and exocrine glands<sup>6</sup>. The genes are *EDAR* and *EDA2R*, which encode the key receptors for the ligands EDA A1 and EDA A2, respectively. Notably, the EDA signalling pathway has been shown to be under positive selection for loss of scales in multiple distinct populations of freshwater stickleback fish<sup>19</sup>. A mutation encoding a V370A substitution in *EDAR* is near fixation in Asia and absent in Europe and Africa (Fig. 1e–h). An R57K substitution in *EDA2R* has derived-allele frequencies of 100% in Asia, 70% in Europe and 0% in Africa.

The *EDAR* polymorphism is notable because it is highly differentiated between the Asian and other continental populations (the 3rd most differentiated among 15,816 non-synonymous SNPs), and also within Asian populations (in the top 1% of SNPs differentiated between the Japanese and Chinese HapMap samples). Genotyping of the *EDAR* polymorphism in the CEPH (Centre d'Etudie du Polymorphisme Humain) global diversity panel<sup>20</sup> shows that it is at high but varying frequency throughout Asia and the Americas (for example, 100% in Pima Indians and in parts of China, and 73% in Japan) (Fig. 2, and Supplementary Fig. 7). Studying populations like the Japanese, in which the allele is still segregating, may provide clues to its biological significance.

EDAR has a central role in generation of the primary hair follicle pattern, and mutations in EDAR cause hypohidrotic ectodermal





**Figure 2** | **Global distribution of SLC24A5 A111T and EDAR V370A.** Worldwide allele-frequency distributions for candidate polymorphisms with the strongest evidence for selection<sup>20</sup>. **a**, *SLC24A5* A111T is common in Europe, Northern Africa and Pakistan, but rare or absent elsewhere. **b**, *EDAR* V370A is common in Asia and the Americas, but absent in Europe and Africa.

dysplasia (HED) in humans and mice, characterized by defects in the development of hair, teeth and exocrine glands<sup>6</sup>. The V370A polymorphism, proposed to be the target of selection, lies within *EDAR*'s highly conserved death domain (Supplementary Fig. 8), the location of the majority of *EDAR* polymorphisms causing HED<sup>21</sup>. Our structural modelling predicts that the polymorphism lies within the binding site of the domain (Fig. 3).

Our analysis only scratches the surface of the recent selective history of the human genome. The results indicate that individual candidates may coalesce into pathways that reveal traits under selection, analogous to the alleles of multiple genes (for example, *HBB*, *G6PD* and *DARC*) that arose and spread in Africa and other tropical populations as a result of the partial protection they confer against malaria<sup>2,12</sup>. Such endeavours will be enhanced by continuing development of analytical methods to localize signals in candidate regions, generation of expanded data sets, advances in comparative genomics to define coding and regulatory regions, and biological follow-up of promising candidates. True understanding of the role of adaptive evolution will require collaboration across multiple disciplines, including molecular and structural biology, medical and population genetics, and history and anthropology.

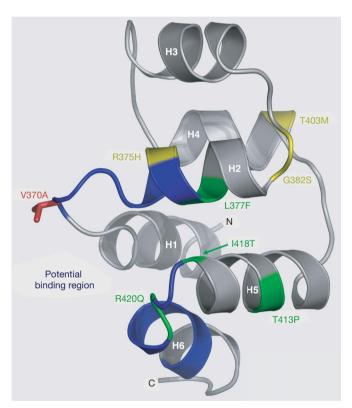


Figure 3 | Structural model of the EDAR death domain. Ribbon representation of a homology model of the EDAR death domain (DD), based on the alignment of the EDAR DD amino acid sequence (EDAR residues 356-431), with multiple known DD structures. The helices are labelled H1 to H6. Residues in blue (the H1-H2 and H5-H6 loops, residues 370-376 and 419-425, respectively) correspond to the homologous residues in Tube that interact with Pelle in the Tube-DD-Pelle-DD structure24. These EDAR-DD residues therefore form a potential region of interaction with a DD-containing EDAR-interacting protein, such as EDARADD. The V370A polymorphic residue (red) is located prominently within this potential binding region in the H1-H2 loop. Seven of the thirteen known mis-sense mutations in EDAR that lead to hypohidrotic ectodermal dysplasia (HED) in humans are located in the EDAR-DD: the only four mutations in EDAR that lead to the dominant transmission of HED (green) and three recessive mutations (yellow)21. Four of these mutations, R375H, L377F, R420Q and I418T are located in the vicinity of the predicted interaction interface.

#### **METHODS SUMMARY**

**Genotyping data.** Phase 2 of the International Haplotype Map (HapMap2) (www.hapmap.org) contains 3.1 million SNPs genotyped in 420 chromosomes in 3 continental populations (120 European (CEU), 120 African (YRI) and 180 Asian (JPT+CHB))<sup>1</sup>. We further genotyped our top HapMap2 functional candidates in the HGDR-CEPH Human Genome Diversity Cell Line Panel<sup>20</sup>.

LRH, iHS and XP-EHH tests. The Long-Range Haplotype (LRH), integrated Haplotype Score (iHS) and Cross Population EHH (XP-EHH) tests detect alleles that have risen to high frequency rapidly enough that long-range association with nearby polymorphisms—the long-range haplotype—has not been eroded by recombination; haplotype length is measured by the EHH<sup>8,9</sup>. The first two tests detect partial selective sweeps, whereas XP-EHH detects selected alleles that have risen to near fixation in one but not all populations. To evaluate the tests, we simulated genomic data for each HapMap population in a range of demographic scenarios—under neutral evolution and twenty scenarios of positive selection—developing the program Sweep (www.broad.mit.edu/mpg/sweep) for analysis. For our top candidates by the three tests, we tested for haplotype-specific recombination rates and copy-number polymorphisms, possible confounders.

**Localization.** We calculated  $F_{\rm ST}$  and derived-allele frequency for all SNPs within the top candidate regions. We developed a database for those regions to annotate all potentially functional DNA changes (B.F., unpublished), including non-synonymous variants, variants disrupting predicted functional motifs, variants within regions of conservation in mammals and variants previously associated with human phenotypic differences, as well as synonymous, intronic and untranslated region variants.

**Structural model.** We generated a homology model of the EDAR death domain (DD) from available DD structures using Modeller 9v1 (ref. 22). The distribution of conserved residues, built using ConSurf<sup>23</sup> with an EDAR sequence alignment from 22 species, shows a bias to the protein core in helices H1, H2 and H5, supporting our model.

**Full Methods** and any associated references are available in the online version of the paper at www.nature.com/nature.

#### Received 8 August; accepted 13 September 2007.

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**Supplementary Information** is linked to the online version of the paper at www.nature.com/nature.

Acknowledgements P.C.S. is funded by a Burroughs Wellcome Career Award in the Biomedical Sciences and has been funded by the Damon Runyon Cancer Fellowship and the L'Oreal for Women in Science Award. We thank A. Schier, B. Voight, R. Roberts, M. Kreiger, A. Abzhanov, D. Degusta, M. Burnette, E. Lieberman, M. Daly, D. Altshuler, D. Reich, D. Lieberman and I. Woods for helpful discussions on our analysis and results. We also thank L. Ziaugra, D. Tabbaa and T. Rachupka for experimental assistance. This work was funded in part by grants from the National Human Genome Research Institute (to E.S.L.) and from the Broad Institute of MIT and Harvard.

**Author Contributions** P.C.S., P.V., B.F. and E.S.L. initiated the project. P.V., B.F. and P.C.S. developed key software. P.C.S., P.V., B.F., S.F.S., J.L., E.H., C.C., X.X., E.B., S.A.McC. and R.G. performed analysis. P.C.S., E.B. and E.H. performed experiments. P.C.S., E.S.L., P.V. and S.F.S. wrote the manuscript.

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doi:10.1038/nature06250 nature

### **METHODS**

**Genotyping data.** The chromosomes examined in HapMap 2 were phased by the consortium using PHASE<sup>25</sup>.

The HGDR-CEPH Human Genome Diversity Cell Line Panel<sup>20</sup> consists of 1,051 individuals from 51 populations across the world. We obtained DNA for the panel from the Foundation Jean Dausset (CEPH) and genotyped our top functional candidates for selection in the panel.

**LRH, iHS, and XP-EHH tests.** The Long-Range Haplotype (LRH) and the integrated Haplotype Score (iHS) tests have been previously described<sup>8,9</sup> and our methods are given in Supplementary Methods.

EHH between two SNPs, A and B, is defined as the probability that two randomly chosen chromosomes are homozygous at all SNPs between A and B, inclusive<sup>8</sup>; it is usually calculated using a sample of chromosomes from a single population. Explicitly, if the N chromosomes in a sample form G homozygous groups, with each group i having  $n_i$  elements, EHH is defined as

$$EHH = \frac{\sum_{i=1}^{G} \binom{n_i}{2}}{\binom{N}{2}}$$

The XP-EHH test detects selective sweeps in which the selected allele has risen to high frequency or fixation in one population, but remains polymorphic in the human population as a whole; for this purpose it is more powerful than either iHS or LRH (Supplementary Fig. 2 and Supplementary Tables 3–6). XP-EHH uses cross-population comparison of haplotype lengths to control for local variation in recombination rates. Such cross-population comparison is complicated by the fact that haplotype lengths also depend on population history, such as bottlenecks and expansions<sup>26</sup>. The XP-EHH test normalizes for genome-wide differences in haplotype length between populations.

We define the XP-EHH test with respect to two populations, A and B, a given core SNP and a given direction (centromere distal or proximal). EHH is calculated for all SNPs in population A between the core SNP and X, and the value integrated with respect to genetic distance, with the result defined as  $I_A$ .  $I_B$  is defined analogously for population B. The statistic  $\ln(I_A/I_B)$  is then calculated; an unusually positive value suggests selection in population A, a negative value selection in B. For identifying outliers, the log-ratio is normalized to have zero mean and unit variance. Details are given in Supplementary Methods.

We developed a computer program, Sweep, to implement these tests (LRH, iHS and XP-EHH) for positive selection, (Supplementary Methods; www.broad. mit.edu/mpg/sweep). In identifying the 22 strongest candidate regions, we considered regions with signals in at least two of five tests (LRH, iHS and XP-EHH in the three pairwise comparisons among the three populations), as well as those that had the strongest signal for each individual test. With this threshold we found no events in 10 Gb of simulated neutrally evolving sequence. For the top candidates by the three tests, we have taken additional steps to rule out the effects of recombination rate variation and copy number polymorphisms (Supplementary Methods).

**Simulations and power calculations.** We simulated the evolution of 1 MB sections of 120 chromosomes from each of the three continental HapMap populations, using a previously validated demographic model<sup>27</sup>, under neutrality and under twenty scenarios of positive selection. We studied the effects of demography by further simulating recent bottlenecks with a range of intensity. Details of simulations and power calculations are given in Supplementary Methods.

**Functional annotation.** We developed an annotation database for our candidate regions to identify all DNA changes with potential functional consequence (B.F., unpublished). We first examined candidates most likely to be functional, including non-synonymous mutations, variants that disrupt predicted functional motifs (transcription factor motifs in conserved regions up to 10-kb 5' of known

genes and miRNA binding-site motifs in conserved 3' untranslated regions of known genes), and variations reported to be associated with human phenotypic differences. For the last category, we identified variations associated with a clinical state (for example, malaria resistance) by a review of the published literature and those associated with changes to gene expression in lymphoblastoid cell lines from the HapMap individuals. The annotation included insertion/ deletion mutations of all sizes. We also examined candidates with lower probability of being functional, including synonymous, intronic and untranslated variations and those that occur within regions of conservation in mammalian species. These methods are described in greater detail in Supplementary Methods.

Structural model of EDAR's death domain. We generated a homology model for EDAR's death domain (DD) using six solved DD structures: p75 NGFR-DD, RAIDD-DD, Pelle-DD, FADD-DD, Fas-DD and IRAK4-DD<sup>24,28-32</sup>. We aligned the corresponding protein sequences using SALIGN<sup>33</sup>. We then added the amino acid sequence of EDAR's DD (residues 356-431) to this structural alignment using Modeller 9v1 (ref. 22). The resulting alignment was used as the input to Modeller 9v1 to build ten EDAR-DD structure models, and the best model was selected based on the Objective Function Score. Owing to the high DOPE scores in the H1-H2 loop we performed a loop refinement using Modeller9v1, significantly reducing the energy of this region. We further evaluated the model by examining the distribution of conserved residues using ConSurf<sup>23</sup> with an alignment of EDAR-DD sequences from 22 species. We observed a bias of conserved residues to the protein core in H1, H2 and H5, which supports our EDAR-DD model. To identify potential binding regions of EDAR-DD, we used LSQMAN<sup>34</sup> to superimpose the model to the Tube-DD-Pelle-DD complex structure<sup>24</sup>. The H1-H2 and H5-H6 loops of the EDAR-DD correspond to Tube residues interacting with Pelle, and H2-H3 and H4-H5 loops to Pelle residues interacting with Tube. We focused our analysis on the residues corresponding to the interacting region in Tube because our EDAR-DD model is most similar to Tube. Figures were generated with PyMOL35.

Other analysis. Description of methods for calculating  $F_{\rm ST}$ , derived-allele frequency, alignment of the SLC24 amino acids, species alignments, conservation graphs, and estimation of the fraction of SNPs genotyped in HapMap2 and identified in dbSNP, are given in Supplementary Methods.

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