1 An Unexpectedly Complex Architecture for Skin Pigmentation in Africans

2

Alicia R Martin^{1,2,3,4}, Meng Lin⁵, Julie M Granka⁶, Justin W Myrick⁵, Xiaomin Liu⁷, Alexandra 3 Sockell¹, Elizabeth G. Atkinson⁵, Cedric J Werely⁹, Marlo Möller⁹, Manjinder S Sandhu¹⁰, David 4 M. Kingsley⁸, Eileen G Hoal⁹, Xiao Liu⁷, Mark J. Daly^{2,3,4}, Marcus W Feldman⁶, Christopher R 5 6 Gignoux¹, Carlos D Bustamante¹, Brenna M Henn⁵ 7

8 ¹Department of Genetics, Stanford University, Stanford, CA, 94305; ²Analytic and Translational

9 Genetics Unit, Department of Medicine, Massachusetts General Hospital and Harvard Medical

School, Boston, MA 02114; ³Program in Medical and Population Genetics, Broad Institute, 10

11 Cambridge, MA 02141: ⁴Stanley Center for Psychiatric Research, Broad Institute, Cambridge,

12 MA 02141; ⁵Department of Ecology and Evolution, SUNY Stony Brook, NY 11794; ⁶Department

of Biological Sciences, Stanford University, Stanford, CA, 94305; ⁷BGI-Shenzhen, Shenzhen, 13

14 China; ⁸Department of Developmental Biology, Stanford University, Stanford, California, USA;

⁹SA MRC Centre for Tuberculosis Research, DST/NRF Centre of Excellence for Biomedical 15

16 Tuberculosis Research, Division of Molecular Biology and Human Genetics, Faculty of Medicine

17 and Health Sciences, Stellenbosch University, Tygerberg, South Africa; ¹⁰Wellcome Trust

Sanger Institute, Genome Campus, Hinxton, England. 18

19

20 Contact Information: armartin@broadinstitute.org or brenna.henn@stonybrook.edu

21

22 Key words: pigmentation, human evolution, Africa, heritability, population genetics

- 23
- 24 Summary
- 25

1	Fewer than 15 genes have been directly associated with skin pigmentation variation in humans,
2	leading to its characterization as a relatively simple trait. However, by assembling a global
3	survey of quantitative skin pigmentation phenotypes, we demonstrate that pigmentation is more
4	complex than previously assumed with genetic architecture varying by latitude. We investigate
5	polygenicity in the Khoe and the San, populations indigenous to southern Africa, who have
6	considerably lighter skin than equatorial Africans. We demonstrate that skin pigmentation is
7	highly heritable, but that known pigmentation loci explain only a small fraction of the variance.
8	Rather, baseline skin pigmentation is a complex, polygenic trait in the KhoeSan. Despite this,
9	we identify canonical and non-canonical skin pigmentation loci, including near SLC24A5,
10	TYRP1, SMARCA2/VLDLR, and SNX13 using a genome-wide association approach
11	complemented by targeted resequencing. By considering diverse, under-studied African
12	populations, we show how the architecture of skin pigmentation can vary across humans
13	subject to different local evolutionary pressures.
14	
15	Highlights
16	Skin pigmentation in Africans is far more polygenic than light skin pigmentation in
17	Eurasians.
18	• KhoeSan [§] populations, which diverged early in human prehistory from other populations,
19	have lightened skin pigmentation compared to equatorial Africans.
20	• Skin color is highly heritable in the KhoeSan, but pigmentation variability is not well
21	explained by previously discovered pigmentation genes.

[§] We use the term "KhoeSan" to refer to a diverse array of indigenous populations in southern Africa that carry KhoeSan ancestry and speak Khoe, !Ui-Tuu or Kx'a languages. "KhoeSan" is not accepted by all such communities; where possible we refer to populations by their specific ethnic name. This grouping lumps together populations of different languages, cultures and variable genetic diversity.

- We perform the first GWAS for pigmentation in African KhoeSan populations and identify
 canonical pigmentation loci near *TYRP1* and in *SLC24A5*, as well as novel associations
 surrounding *SMARCA2* and other genes.
- 4

5 Introduction

6

7 Skin pigmentation is one of the most strikingly variable and strongly selected phenotypes 8 among human populations (Sabeti et al., 2007; Sturm and Duffy, 2012), with darker skin 9 observed closer to the equator and lighter pigmentation observed at high latitudes. Researchers 10 have hypothesized that variable exposure to ultra violet radiation (UVR) creates opposing 11 selective forces for vitamin D production and folate protection, resulting in global pigmentation 12 differentiation (Chaplin and Jablonski, 2009; Jablonski and Chaplin, 2010). Skin pigmentation 13 differences at similar latitudes and UV exposures indicate that additional evolutionary forces. 14 such as assortative mating, drift, and epistasis, are also likely to have affected global skin 15 pigmentation (Wilde et al., 2014; Pośpiech et al., 2014). While ~171 genes have been 16 implicated in pigmentation variability across model organisms (e.g. the Color Genes database: 17 http://www.espcr.org/micemut/), only ~15 genes have been associated with skin color 18 differences in humans (Table 2). The relative paucity of skin pigmentation loci identified from 19 GWAS efforts has led to the characterization of pigmentation variation as a relatively simple 20 trait, with only a handful of SNPs being highly predictive of skin, eye, and hair color across 21 populations (Hart et al., 2013; Spichenok et al., 2011; Walsh et al., 2013). 22 23 The genetic basis of skin pigmentation has been primarily studied in Europeans, Asians, and 24 admixed individuals of western African descent using candidate gene and genome-wide

- 25 approaches (Candille et al., 2012; Beleza et al., 2013a; Beleza et al., 2013b; Sulem et al.,
- 26 2007; Sulem et al., 2008; Sturm and Duffy, 2012). Remarkably, only one study of quantitative

1 genetic effects on pigmentation in continental Africans has been published to date, despite the 2 fact that Africans have the greatest range of pigmentation variation globally (Relethford, 2000; 3 Jablonski and Chaplin, 2014; Crawford et al, 2017). Several adaptive sweeps have occurred at 4 large-effect skin pigmentation loci in populations from high latitudes, which researchers have 5 interpreted as resulting from strong environmental selection pressure that reduces variability in 6 the population. For example, SLC24A5 is among the best-studied skin pigmentation genes; the 7 derived Ala111Thr allele (rs1426654) confers the largest known lightening effect and has swept 8 to fixation in western Eurasian populations (Beleza et al., 2013a; Lamason et al., 2005). 9 rs35395 near SLC45A2, rs10831496 near GRM5 and TYR, and rs4424881 near APBA2 and 10 OCA2 also have different allele frequencies in Europeans and Africans, with high derived 11 frequencies that confer large skin lightening effects in Europeans (Beleza et al., 2013a; Norton 12 et al., 2007). Other variants of smaller effect contribute to the relatively narrow variation among 13 Europeans in skin pigmentation, including associations in/near MC1R, TYR, IRF4, and ASIP 14 (Sulem et al., 2007; Sulem et al., 2008). Several of the largest skin lightening effects in 15 Europeans and East Asians arose through convergent evolution; for example the His615Arg 16 amino acid substitution in OCA2 (rs1800414) has a large functional skin lightening effect 17 specifically in East Asians (Yang et al., 2016). Some of the same genes have been selected 18 across Eurasia at high latitudes with evidence of similar (e.g. KITLG) (Miller et al., 2007) or 19 different (OCA2) selective sweeps, whereas other genes have been selected/associated with 20 skin pigmentation in populations living close together at high latitudes, such as ATRN and DCT 21 in East Asians (McEvoy et al., 2006; Lao et al., 2007; Edwards et al., 2010) or SLC45A2, 22 SLC24A5, and TYRP1 in Europeans (Soejima et al., 2006; Soejima and Koda, 2007; Izagirre et 23 al., 2006; Voight et al., 2006; Lao et al., 2007).

24

Strong positive selection acting on skin pigmentation has resulted in large effect sizes that
explain a large fraction of heritable variation. For example, a previous study showed that only 4

1 loci explain 35% of the variation in skin pigmentation in recently admixed Cape Verdeans, who 2 have European and West African ancestors (Beleza et al., 2013b). In contrast, complex traits 3 such as height and schizophrenia, typically require ~10,000 independent SNPs derived from 4 GWAS of >100,000 individuals to build predictors that respectively explain ~29% and ~20% of 5 the variance in independent cohorts (Wood et al., 2014; Schizophrenia Working Group of the 6 Psychiatric Genomics Consortium, 2014). As a consequence of strong positive selection, 7 previous studies of naturally selected traits such as pigmentation, high altitude adaptation, and 8 response to pathogens have repeatedly shown that these traits have typically evolved 9 substantially larger effect sizes than, for example, complex common disease; these large effect 10 loci have typically been discovered with small sample sizes (i.e. ~100s of individuals) relative to 11 GWAS of complex, highly polygenic traits (Kenny et al., 2012; Yi et al., 2010; Zhou et al., 2013; 12 Alkorta-Aranburu et al., 2012; Genovese et al., 2010; Kayser et al., 2008; Moltke and 13 Albrechtsen, 2013). While adaptive pigmentation loci are among the most diverged in the 14 genome across populations, it is worth nothing that effect size estimates for nearly all significant 15 GWAS associations that are polymorphic across well-studied populations are on average 16 directionally consistent at individual loci across populations (Liu et al., 2015; Carlson et al., 17 2013), but that, in aggregate, prediction accuracy varies across populations (Martin et al., 18 2017).

19

Populations at lower latitudes—closer to the equator—typically have darker skin color than those in Europe or East Asia. Recently admixed populations (i.e. groups with highly divergent ancestors) have increased pigmentation variation, and the largest genetic effects are due to derived alleles that reduce melanin (Marcheco-Teruel et al., 2014; Beleza et al., 2013b; Norton et al., 2006; Norton et al., 2007). For example, all four significantly associated pigmentation loci identified in the study of Cape Verdeans were derived in Europeans, which together with admixture proportions explain the majority of heritable variation (Beleza et al., 2013b).

Together, these studies highlight a complex interaction between latitude, the strength of
selection (i.e. likelihood of selective sweep), and the distribution of effect sizes (i.e.
polygenicity). A clear understanding of the genetic determinants of dark skin variability is
lacking.

5

6 Striking skin pigmentation variability among African populations has been underappreciated in 7 genetic studies (Relethford, 2000; Jablonski and Chaplin, 2014). Additionally, genetic diversity 8 declines with distance from Africa (Ramachandran et al., 2005), which, coupled with greater 9 phenotypic variation, suggests that more genetic variation may contribute to skin pigmentation 10 diversity in Africa. Light skin pigmentation is observed in the far southern latitudes of Africa 11 among KhoeSan hunter-gatherers and pastoralists of the Kalahari Desert and nearby regions. 12 The KhoeSan are unique in their early divergence from other populations, likely dating back at 13 least ~100,000 years ago (Gronau et al., 2011; Schlebusch et al., 2012; Veeramah et al., 14 2012); they exhibit extraordinary levels of genetic diversity and low levels of linkage 15 disequilibrium (LD) (Henn et al., 2011; Li et al., 2008; Ramachandran et al., 2005). Previous 16 work points to southern Africa as the point of origin for modern humans (Henn et al., 2011; 17 Luca et al., 2011; Tishkoff et al., 2009), but it is unknown whether moderate to light skin 18 pigmentation in the different KhoeSan groups is an example of convergent evolution with 19 northern Europeans and Asians, or reflects the ancestral human phenotype. Previous studies 20 using samples from the Human Genome Diversity Panel (HGDP) have noted different 21 pigmentation allele frequencies between the Jul'hoansi KhoeSan and other Africans, but these 22 have been based on n<7 individuals from the former population without associated phenotype 23 data (Berg and Coop, 2014; Norton et al., 2007).

Here we report an evolutionary and genetic study of skin pigmentation with a total of 465
genotyped KhoeSan individuals (278 ‡Khomani San and 187 Nama), with targeted

1 resequencing at associated pigmentation loci in 439 KhoeSan individuals (268 ±Khomani, 171 2 Nama) and matched quantitative spectrophotometric phenotype data (Table S4). The ‡Khomani 3 San are traditionally a Nlu-speaking hunter-gatherer population living in the southern Kalahari 4 Desert, while the Nama are traditionally a Khoekhoe-speaking semi-nomadic pastoralist group 5 of KhoeSan ancestry. We investigate: i) the degree of polygenicity and heritability of skin 6 pigmentation, ii) the extent to which variation in pigmentation is explained by previously 7 associated or canonical pigmentation genes, and iii) novel pigmentation alleles contributing to 8 variation in the ±Khomani San and Nama populations.

9 Results

10

11 Baseline skin color was quantitatively phenotyped for 479 individuals (277 ±Khomani, 202 12 Nama, Table S4) via specialized narrow-band reflectometry that specifically measures 13 hemoglobin and melanin of both the left and right upper inner arms (Methods, (Diffey et al., 14 1984)), with M index = $\log_{10}(1 / \%$ red reflectance). Sequencing and/or genotyping was 15 performed for a subset of phenotyped samples (Table S4, Methods). Skin pigmentation is 16 considerably lighter in the KhoeSan than the majority of other African populations, with baseline 17 upper arm M index = 57.57 ± 10.12 (mean \pm sd, N = 278) in the \pm Khomani San. Baseline upper 18 arm pigmentation in the Nama is slightly lower, with M index = 52.12 ± 8.93 (N=223). The 19 ±Khomani are on average significantly darker than the Nama (p=3.6e-10, Figure 1C), but the 20 variance is not significantly different (p>0.05). For comparison, we aggregated quantitative skin 21 pigmentation across 32 globally diverse populations (4.712 individuals) assayed with a 22 DermaSpectrometer (DSMI or DSMII—the latter was used in this study) (Basu Mallick et al., 23 2013; Beleza et al., 2013b; Candille et al., 2012; Durazo-Arvizu et al., 2014; Edwards et al., 24 2010; Norton et al., 2006; Coussens et al., 2015) (Figure 1A-B, Table S1). Only four African 25 populations are available for comparison; among these only the Ghanians represent an

1	equatorial African population without recent admixture. Skin color is substantially darker in
2	equatorial Ghanaians, where M index reaches a mean of 96.04 \pm 10.94; M index for Cape
3	Verdeans, who have ~40% European admixture on average, have slightly lighter (55.39 \pm
4	13.00, p=5.6e-3) and considerably more variable pigmentation (p=1.9e-6) than the KhoeSan.
5	Two other populations living in South Africa, the Xhosa and admixed Coloured populations,
6	have respectively darker (M index= 67.1 ± 7.5) and similar (M index= 53.1 ± 8.5) pigmentation
7	compared to the KhoeSan populations (Coussens et al., 2015).
8	

- 9 Evidence of Increased Polygenicity in Skin Pigmentation Among Equatorial Populations
- 10

11 We tested whether the correlation between absolute latitude and pigmentation was significant 12 with our large, quantitatively phenotyped sample of global populations. As previously observed 13 (Jablonski and Chaplin, 2010; Byard, 1981; Zaidi et al., 2017), we find that skin pigmentation is strongly associated with absolute latitude (R^2 =0.53, β =-1.18 on M index scale, p<2e-16); 14 15 populations further from the equator have lighter skin pigmentation. We next tested whether 16 variance in melanin within populations also varies across populations. Skin pigmentation has 17 primarily been studied in lightly pigmented European and East Asian populations, where skin color varies minimally among individuals (Figure 1A-B). Less-studied equatorial and admixed 18 19 populations, including Melanesians, Ghanaians, Cape Verdeans, South African admixed 20 Coloured, and South Asians vary considerably more in skin pigmentation (Figure 1B). We find 21 that absolute latitude is also significantly negatively associated with the standard deviation in 22 melanin (R^2 =0.41, p=5.0e-5). Further, melanin distributions are heteroskedastic (i.e. the 23 variance is not constant—rather, it changes over the range of observed M index), with the 24 coefficient of variation, a standardized metric of phenotypic dispersion, decreasing with increasing distance from the equator ($cv=\sigma/\mu$, R²=0.14, p=0.03, **Table S1**). 25

26

1 A sign test comparing variances in lighter versus darker population pairs within the same study indicates that populations with lighter skin have significantly reduced phenotypic variance than 2 3 expected by chance (p=2.01e-8). These results suggest that there is reduced genetic 4 heterogeneity and/or reduced variance in the population distribution of causal effect sizes 5 contributing to lighter versus darker pigmentation. There is more than an order of magnitude 6 difference in variance between the lightest and darkest populations (i.e. Irish vs Ghanaian 7 F=0.03, p=6.7e-23). Europeans and East Asians have significantly less variation than South 8 Asians (F=0.25, p=1.06e-14 and F=0.30, p=1.27e-10, respectively, Figure 1B). Cape Verdeans 9 with the highest quartile of European admixture have lighter, less variable skin color than 10 individuals with the lowest quartile of European ancestry (p=4.28e-9, although notably ancestry 11 proportions are bimodal across individuals). Among Melanesians, islands at similar latitudes 12 with more lightly pigmented individuals on average show less variance than those with more 13 darkly pigmented individuals (e.g. one-sided F test comparing variance among more lightly 14 pigmented New Britain individuals versus individuals from Bougainville, p=2.89e-9, Figure 1B). 15 Among the ‡Khomani and Nama, comparing individuals with primarily European admixture 16 (>20%, N=124) to individuals with primarily Bantu admixture (>20%, N=91), we find significantly 17 greater melanin variation among KhoeSan individuals with more Bantu admixture (p=1.33e-4). 18

19 Ancestry and Skin Pigmentation Variation in the KhoeSan

20

The ‡Khomani San and the Nama have both experienced admixture with neighboring darkerskinned Bantu-speaking groups beginning ~450 years ago, as well as with lighter-skinned European settlers who first arrived in the Northern Cape during the late 18^{th} century (Uren et al., 2016). We assessed these ancestry proportions using unsupervised allele frequency clustering with ADMIXTURE as well as principal components analysis (PCA, Methods). At *k*=3, we observe distinct clustering between Europeans, Bantu-speaking and West African

1 populations, and KhoeSan populations; both the Nama and the ±Khomani have ~75-80% 2 KhoeSan-specific ancestry. For k=7, which gives most stable ancestry estimates, we observe a 3 partitioning of the KhoeSan ancestry into 'northern Kalahari' ancestry shared with Jul'hoansi 4 and a distinct southern or circum-Kalahari ancestry present in the Nama and the ‡Khomani. On 5 average, in the ‡Khomani San we find 55% northern Kalahari KhoeSan ancestry, 21% southern 6 Kalahari KhoeSan ancestry, 11% European ancestry (common in CEU and French individuals), 7 12% western African ancestry (common in Yoruba and Bantu-speaking populations), and 2% 8 attributable to other African populations (Tanzanian hunter-gatherers, East African, and North 9 African populations, Table S2, Figure 2A and Figure S2A). The Nama differ from the 10 ±Khomani in their proportion of northern versus southern Kalahari ancestry; they have 17% 11 northern Kalahari ancestry, 62% southern Kalahari ancestry, 9% European ancestry, 10% 12 western African ancestry, and 1% attributable to other African populations on average. The 13 western African fraction in the Nama is significantly more variable among individuals (p=1.08e-14 5), resulting from recent Damara gene flow (Uren et al., 2016). The partition of ancestry 15 components occurs in the same order and is correlated between ADMIXTURE and PCA 16 (Figure 2, Figure S2A,D-F).

17

18 We performed forward stepwise regression to select the best multivariate mixed model of 19 ancestry and pigmentation with a random effect accounting for the genetic relationships among 20 individuals. Sex and age do not significantly correlate with baseline skin pigmentation, 21 suggesting that our quantitative measure of underarm reflectance is not significantly affected by 22 UV exposure. The best model fit, measured via AIC, included Bantu, European, East African, 23 and Hadza ancestries, although the latter two components comprise \leq 1% of individuals' total 24 ancestry on average and are likely imprecisely measured. In the multivariate mixed model with 25 European and Bantu admixture components, European ancestry is strongly correlated with

1 lightened skin (β = -18.09, p=2.9e-03), and Bantu ancestry is correlated with darkened skin (β = 2 25.60, p=1.8e-09). Together, we estimate that fixed admixture effects explained 34% of the variation in skin color (adjusted R²); by comparison, 44% of pigmentation variation in Cape 3 4 Verdeans is explained by admixture effects (Beleza et al., 2013b). Marginal associations are 5 shown in Figure 2B, with pairwise ancestry correlations shown in Figure S2B. Southern 6 Kalahari ancestry, frequent in the Nama, is significantly anti-correlated with Bantu ancestry and 7 is marginally predicted to lighten skin, but not when modeled jointly with Bantu ancestry in a 8 multivariate model. Interestingly, the mean pigmentation of Nama and ±Khomani individuals 9 with <90% KhoeSan ancestry is not significantly different from individuals with >90% KhoeSan 10 ancestry (p=0.94), although the variance is significantly greater in more admixed individuals 11 (admixture from either/both European or Bantu ancestries, p=2.2e-3). These results suggest 12 that while admixture increases phenotypic variance, pigmentation alleles on KhoeSan 13 haplotypes contribute more to the overall heterogeneity than those on European or Bantu 14 haplotypes. Consistent with this result, we observe substantial skin pigmentation variation 15 among related individuals, which, coupled with high heritability (see below) suggests a role for 16 large effect sizes of alleles contributing to pigmentation.

17

18 Skin Pigmentation is Highly Heritable

19

20 We inferred narrow sense heritability for baseline skin pigmentation and tanning status in the

21 KhoeSan with four methods: family pedigrees $(h_{pediaree}^2)$, SNP array similarity matrices (h_q^2) ,

identity-by-descent (IBD) sharing matrices (h_{IBD}^2), and exome sequence variation (h_{exome}^2 , **Table** 1). While pedigree-based heritability estimates are not based on genetic data and therefore not strongly affected by admixture, its careful consideration is necessary for SNP-based estimates, as described previously (Beleza et al., 2013b; Zaitlen et al., 2013; Zaitlen et al., 2014; Thornton

1 et al., 2012) and as we have conducted here. In each of the heritability estimates of baseline 2 skin color, we accounted for admixture proportions with European and Bantu ancestry as 3 covariates, as well as familial relatedness via a kinship covariance matrix. Similarly for tanning 4 status, we accounted for age, sex, and kinship. Previous family-based estimates for skin color 5 heritability in other populations are high, ranging between 55-90% (Byard, 1981; Clark et al., 6 1981; Frisancho et al., 1981; Harrison and Owen, 1964; Paik et al., 2012). Interestingly, 7 published genetic estimates of skin pigmentation heritability in Europe are low and insignificant, 8 potentially because of reduced genetic diversity at skin pigmentation loci due to positive 9 selection (Zaidi et al., 2017). Our heritability estimates in the KhoeSan are analogous to family-10 based estimates because of the elevated relatedness in our samples. 11 We first constructed pedigrees from ethnographic interviews for individuals within the ±Khomani

12 and Nama populations and verified relationships where possible with genetic data. 533 13 individuals (including parental individuals not sampled) could be assigned to a pedigree, 14 resulting in 354 extended pedigrees and 470 nuclear families. Via traditional pedigree-based 15 estimation of narrow sense heritability using the Sequential Oligogenic Linkage Analysis Routines (SOLAR) software (Almasy and Blangero, 1998), we estimate an $h_{pediaree}^2$ of 0.96 ± 16 17 0.12 for baseline skin color. We then asked whether variation present on the ascertained SNP 18 arrays or from exome sequencing could explain a similar fraction of the pigmentation variation. 19 Genetic heritability estimates inferred from recently admixed populations have two potential 20 problems: 1) inferred familial relationships between individuals are less accurate (Thornton et 21 al., 2012), and 2) environmental confounders (e.g. socioeconomic status) could be associated 22 with the variance component attributed to additive genetic effects. In order to address the first 23 issue, we use the proportion of KhoeSan, European and Bantu ancestry per individual to correct 24 the SNP array genetic relatedness matrix (GRM) as described by the REAP approach 25 (Thornton et al., 2012). The REAP matrix is also compared to the IBS matrix inferred using

default GCTA parameters that do not account for stratification (*Methods*). We include European and Bantu ancestry as global covariates in the heritability estimation. All further estimation of h_g^2 was made using the unconstrained model in GCTA. Furthermore, we contrast baseline pigmentation with tanning status (i.e. sun exposed wrist – underarm melanin pigmentation); if our estimates were inflated by environmental confounders, we would also expect inflated heritability of tanning status.

7 The array-based heritability point estimates are consistently but not significantly higher when 8 using a kinship matrix from Relatedness Estimation in Admixed Populations (REAP) than 9 GCTA's identity-by-state (IBS) GRM, both for the joint dataset and each population separately (**Table 1** and **Table S3**). We estimate $h_q^2 = 0.97 \pm 0.15$ (standard error) in an unconstrained 10 11 model across both populations using the REAP GRM. We find consistent results from exome 12 sequence data, where we estimate that $h_{exome}^2 = 0.95 \pm 0.26$ in the \pm Khomani. We then used the 13 familial relationships (Figure S1) and population-level endogamy to estimate heritability from 14 IBD sharing among all individuals in the ‡Khomani and Nama; we obtain a similar estimate of 15 h_{IBD}^2 = 0.97 ± 0.15 (*Methods*, see also (Zaitlen et al., 2013)).

16 We contrast the high heritability estimates for baseline pigmentation with estimates for tanning 17 status. Tanning status is significantly associated with both sex (male β =6.2 increase in M index, 18 p = 4.2e-4) and age ($\beta = 0.18$ increase in M index per year, p = 1.8e-4), but not with admixture proportions. None of the tanning status h² estimates, including pedigree-, IBD-, exome-, and 19 20 SNP array-based estimates, are significantly greater than 0 (Table 1), consistent with previous 21 observations that tanning status is largely environmentally determined by UV exposure (Clark et 22 al., 1981; Nan et al., 2009). Previous GWAS of tanning status have also failed to identify and 23 replicate significant SNPs that are not already known to canonically influence baseline 24 pigmentation (Nan et al., 2009). The stark contrast of the baseline pigmentation and tanning

status heritability estimates, and the consistency of h² across methods indicates that our high
baseline pigmentation heritability estimates do not simply arise from pedigree and population
structure and that socioeconomic factors are unlikely to have significant effect on our heritability
estimates.

5

6 A Complex Genetic Architecture in the KhoeSan

7

8 The genetic architecture of skin pigmentation has been described as simpler than many other 9 phenotypes, for which only a few genes explain ~35% of the total variation in a given 10 population, and average genomic ancestry explains an additional ~44% of the variation, 11 indicating a long tail of smaller effects (Beleza et al., 2013b; Candille et al., 2012). We 12 investigated how much of the heritable variation in KhoeSan populations can be ascribed to 13 previously annotated pigmentation gene sets (Figure 3A). The first gene set (GS1) consists of 14 14 genes containing or near previously discovered skin pigmentation genetic associations in 15 Europeans, East Asians, Cape Verdeans, and Native Americans (Table 2 and Table S6). The 16 larger, second gene set (GS2) contains 50 genes compiled previously (Beleza et al., 2013b) 17 from human pigmentation associations, positive selection scans, and model organism 18 pigmentation loci. The third gene set (GS3) contained 50 loci most significantly associated with 19 pigmentation in the KhoeSan (phase 1, see section titled "Novel Variants Influence Skin 20 Pigmentation in KhoeSan Populations"). We partitioned the genome into GS1, GS2, GS3, and 21 the rest of the genome and performed four comparisons, computing the variance explained by: 22 GS1 versus the rest of the genome, GS2 versus the rest of the genome, GS3 versus the rest of 23 the genome, and GS1 versus GS2 versus the rest of the genome. For each comparison, we 24 performed a restricted likelihood ratio test. The GS1 and GS2 gene sets do not explain a 25 significant fraction of the heritability; that is, the heritability estimates overlap with zero. Rather, 26 the remainder of the genome explains the overwhelming majority of the heritability (**Figure 3**B,

1 $\sigma_{GS1}^2=0.08 \text{ vs } \sigma_{Genome}^2=0.82, p_{Genome}^2=2.7e-5; \sigma_{GS2}^2=0.09 \text{ vs } \sigma_{Genome}^2=0.79, p_{Genome}^2=3.3e-4; and$ $2 <math>\sigma_{GS1}^2=0.08 \text{ vs } \sigma_{GS2}^2=0.09 \text{ vs } \sigma_{Genome}^2=0.71, p_{Genome}^2=2.5e-3, respectively).$ This result contrasts 3 with conclusions from previous studies and indicates that the vast majority of variation in 4 KhoeSan skin pigmentation arises from pigmentation genes yet to be discovered, providing 5 strong evidence for a complex, polygenic architecture. GS3 explains a small but significant 6 fraction of the heritability, as discussed below.

7

8 We further assessed whether GS1 and GS2 explain more of the heritable variation than a 9 random sample of coding regions; genes tend to explain more phenotypic variation than 10 noncoding regions (Gusev et al., 2014). Specifically, we matched both candidate gene sets by 11 number of genes, length, and number of exons and permuted these matched samples 1000 12 times. After regressing out the effect of variable numbers of SNPs per gene set, we find that 13 both GS1 and GS2 explain more than random genes with a 10% false discovery rate 14 (FDR=0.016 and FDR = 0.079, Figure 3C-D, respectively) across both KhoeSan populations. 15 This is not significant in the Nama alone (**Figure S3**), likely because of ancestry heterogeneity 16 between the two populations.

17

18 Replication of Known Pigmentation Associations in the KhoeSan

19

Even though previously identified pigmentation loci explain little of the phenotypic variance in
our samples, it is possible that these loci simply have small effect sizes in the KhoeSan. We
used SNP array and/or resequencing data in a linear mixed model with ancestry covariates (see
Methods and "*Novel Variants Influence Skin Pigmentation in KhoeSan Populations*") to assess
both the frequencies and effect sizes of 42 previously identified eye, skin, and hair pigmentation
variants, some of which have been experimentally shown to be causal (**Table 2** and **Table S6**).
To this end, we also deconvolved recent admixture into local ancestry tracts across the genome

and estimated the allele frequencies specifically on KhoeSan haplotypes via expectationmaximization (Gravel et al., 2013). Known pigmentation allele frequencies vary considerably
between the ‡Khomani San, Europeans, and West Africans (Table 2).
Most previously identified pigmentation associations do not replicate with genome-wide
significance or nominally in the ‡Khomani and Nama, with a few exceptions. Four SNPs in the
genes *SLC45A2* (rs16891982, p=1.2e-3), *KITLG* (rs12821256, p=0.02), and *SLC24A5*(rs1426654, p=9.8e-9 and rs2470102, p=1.1e-8) marginally replicate in the ‡Khomani + Nama

9 under an additive model. The derived allele frequencies of the associated SNPs in SLC45A2 10 and KITLG are low in the KhoeSan, consistent with ~10% admixture from recent European 11 gene flow. Interestingly, however, SNPs in OCA2, SLC24A5 and GRM5/TYR are at much 12 higher frequencies in both the ‡Khomani and Nama than expected from European admixture 13 alone, as estimated from global ancestry (Methods). We do not replicate the vast majority of 14 previously observed skin pigmentation associations in our dataset, potentially due to low 15 frequencies in the KhoeSan, power limitations, differentiated LD structure in which the tag SNPs 16 are non-causal pigmentation alleles, or epistatic effects. It is therefore unsurprising that when 17 we applied forensic models based on only seven SNPs that claim very high prediction accuracy 18 of skin color across populations (>99%) (Spichenok et al., 2011; Hart et al., 2013), we did not 19 find a significant association with quantitatively measured M index (p=0.31, Figure S5B).

20

Because high divergence in a segment of the genome can be a signature of selection (e.g. XPEHH scans), we assessed genetic divergence between KhoeSan, West African, and European
populations at SNPs and in sliding windows across the genome. We find considerable
divergence in many canonical pigmentation genes when comparing regions of the genome
across populations (Figure 4A-B). We followed up our divergence scan by focusing on two
outlier genes that were highly diverged among all three populations: *SLC24A5* and *OCA2*

1 (Figure 4). The divergence in SLC24A5 is among the highest in the genome, especially 2 between the KhoeSan and European populations (Figure 4D). Interestingly, different regions of 3 OCA2 exhibit elevated divergence between the KhoeSan and European comparison versus the 4 KhoeSan and West African comparison (Figure 4C). A previous study suggested that the 5 derived, synonymous T allele of rs1800404 in OCA2 has been positively selected and is a 6 candidate skin pigmentation variant conferring light skin in Europeans and KhoeSan populations 7 based on its global allele frequency distribution (Norton et al., 2007). We confirm its elevated 8 allele frequency on KhoeSan haplotypes (65%), but do not find an association with skin 9 pigmentation (p=0.53). Variants in OCA2 explain most of the variation in human eye color 10 (Duffy et al., 2007), and rs1800404 was later significantly associated with this phenotype 11 (Eriksson et al., 2010); ‡Khomani and Nama individuals notably have heterogeneous eye color, 12 with a range of brown, hazel, and green eyes. We identified a missense mutation in OCA2 13 (rs1800417, ns with skin pigmentation: p=0.87) with a derived allele (G) frequency of 0.32 in the 14 KhoeSan (Table S6) that is at low frequency in all other populations surveyed (global allele 15 frequency = 0.016 in Phase 3 1000 Genomes and 0.0058 in the Exome Aggregation 16 Consortium, ExAC). 17 18 Novel Variants Influence Skin Pigmentation in KhoeSan Populations 19 20 To identify novel variants associated with skin pigmentation in the ‡Khomani and Nama, we 21 performed a 2-stage study (Figure S6A), employing a linear mixed model approach including 22 recent admixture covariates as fixed effects and covariance matrices adjusted for admixture 23 (akin to a GRM in GCTA) as random effects to identify associations between pigmentation and

- high quality imputed variants (Alexander et al., 2009). We assessed the quality of the
- 25 imputation via homozygous reference, heterozygous, and homozygous non-reference
- 26 concordance with high coverage exome sequencing data (Figure S4A). We ran the initial

1 GWAS (i.e. phase 1) with imputed variants from 107 ±Khomani and 109 Nama individuals 2 (Table S4, Table S5, Figure S6A-C), and the genes closest to the strongest associations 3 (Table S5) showed a significant enrichment in multiple mammalian phenotypes related to skin 4 pigmentation (abnormal extracutaneous pigmentation p=2.3e-3, abnormal melanocyte 5 morphology p=5.8e-3, abnormal skin morphology p=3.5e-2). Further, the strongest signals 6 across the genotyped ±Khomani and Nama cohorts were near canonical pigmentation genes 7 (e.g. TYRP1 and SLC24A5) (Sturm, 2009), genes associated with pigmentation-related 8 disorders (e.g. TYRP1) (Jin et al., 2010), or genes implicated in pigmentation in model 9 organisms and in vitro studies (e.g. VLDLR, SMARCA2, and others) (Demir et al., 2013; 10 Keenen et al., 2010; de la Serna et al., 2006; Liu-Smith et al., 2014). To assess the variation 11 explained by the most significantly associated loci, we generated an additional gene set, 12 referred to as "GS3", using the 50 most significantly associated loci ± 10 kb. We find that the 13 GS3 loci explain significantly more of the heritable variation in skin pigmentation than previously 14 identified pigmentation candidate genes in the KhoeSan, but that the majority of heritable variation remains to be explained (**Figure 3**B, σ^2_{GS3} =0.23±0.13, p_{GS3}=0.027 vs 15 16 $\sigma^{2}_{\text{Genome}} = 0.64 \pm 0.08, p_{\text{Genome}} < 1e-5).$

17

18 Based on initial evidence from the imputed ±Khomani pigmentation GWAS, we designed a 19 targeted NGS capture and successfully resequenced 36 candidate pigmentation regions (Table 20 **S7**, Figure S6) across a larger set of 451 KhoeSan samples in order to improve power to detect 21 associated loci (Table S8, Supplementary Materials), including 269 Khomani, and 182 Nama 22 individuals. In this larger sample, we observe more variants significantly associated with 23 pigmentation than expected by chance in the resequencing regions (**Figure 5**A). The strongest signal comes from SNPs in *SLC24A5*, 8 of which are all in high pairwise LD ($\mathbb{R}^2 > 0.6$) on a high 24 25 frequency haplotype (**Figure 5**B). We identify significant associations between lighter skin and 26 derived SLC24A5 SNPs, including the putatively causal p.Thr111Ala rs1426654 allele (β =-3.58

1 on M index scale, p=9.8e-9), which has previously been associated with skin pigmentation in 2 Eurasians. The most strongly associated SNP (rs2555364, β =-3.58 on M index scale, p=6.7e-9) is tightly linked with rs1426654 (LD R²=0.81). These variants are strongly differentiated between 3 4 Europeans and Africans, with rs1426654 having derived allele frequencies of 99.7% vs 5.5% in 5 1000 Genomes (excluding ASW and ACB populations with recent European admixture), 6 respectively. The derived allele of rs1426654 has previously been observed in HGDP Jul'hoansi 7 San samples at 7% frequency, which have no detectable recent European admixture (Norton et 8 al., 2007). The frequency of the derived rs1426654 allele is 40% in the combined Nama + 9 ‡Khomani dataset, which is significantly greater than expected from ~11% European admixture 10 alone (binomial test p=7.8e-52, Table S6, STAR Methods). 11 12 Multiple low frequency (<5%) SNPs near several additional genes, including EPM2A, FREM1, 13 SMARCA2/VLDLR, and TYRP1, are above the 95% confidence interval of expected versus 14 observed significance (Figure 5). Two of these regions are near EPM2A and FREM1, which are 15 known to play roles in myoclonic epilepsy and the development of multiple organ systems, 16 respectively; however, neither of these genes play any known role in skin pigmentation either in 17 humans or model organisms. In contrast, there are >5 independent low frequency signals 18 upstream, downstream, and in introns of SMARCA2 and near VLDLR with p<1e-3, with 19 rs7866411 (p=8.91e-5) and rs2093835 (p=1.17e-4) being the SNPS most significantly 20 associated with skin pigmentation. We used HaploReg to infer regulatory activity in/near these 21 peaks and identify multiple enhancer and DNAse peaks identified in skin, including melanocytes 22 and/or keratinocytes, overlapping top tag and/or perfectly linked SNPs (Table S9). We also 23 identify a low frequency association (rs34803545, p=3.7e-4) ~600 kb upstream of TYRP1 in a 24 gene desert. This variant is perfectly linked with multiple conserved variants, one of which 25 exhibits enhancer activity and DNAse hypersensitivity specifically in skin (Table S9).

26

1	We followed our phase 1 GWAS analysis with a 2 nd phase, in which an additional 240 unique
2	individuals were genotyped (Table S4, Figure S6A) and meta-analyzed with phase 1 summary
3	statistics. While two tanning status associations met genome-wide significance, none of the loci
4	contained linkage peaks, suggesting that they are most likely spurious. The tanning status
5	GWAS results are expected from a phenotype with low heritability. As expected from the
6	resequencing study, we identified a genome-wide significant association in SLC24A5
7	(rs2470102 derived allele β = -3.4, p=3.6e-12) and a suggestive association upstream of <i>TYRP1</i>
8	(chr9:12088112, frequency=0.014, β = -13.6, p=1.1e-07 Figure S6B-C, Figure S6F-G). We
9	identified an additional suggestive novel association in and near SNX13, with common derived
10	T alleles of rs2110015 associated with light skin (β = -3.1, p=1.3e-07, Figure S6H); SNX13
11	regulates lysosomal degradation and G-protein signaling, but has not previously been
12	associated with skin pigmentation.
13	
13	Discussion
13 14	
13 14 15	
13 14 15 16	Discussion
13 14 15 16 17	Discussion Pigmentation has been described previously as a relatively simple trait with few loci of large
13 14 15 16 17 18	Discussion Pigmentation has been described previously as a relatively simple trait with few loci of large effect contributing to the phenotype (Hart et al., 2013; Spichenok et al., 2011; Sulem et al.,
13 14 15 16 17 18 19	Discussion Pigmentation has been described previously as a relatively simple trait with few loci of large effect contributing to the phenotype (Hart et al., 2013; Spichenok et al., 2011; Sulem et al., 2007). However, populations living in continental Africa, where humans have the greatest
13 14 15 16 17 18 19 20	Discussion Pigmentation has been described previously as a relatively simple trait with few loci of large effect contributing to the phenotype (Hart et al., 2013; Spichenok et al., 2011; Sulem et al., 2007). However, populations living in continental Africa, where humans have the greatest genetic diversity and variation in pigmentation (as demonstrated here), have been largely
 13 14 15 16 17 18 19 20 21 	Discussion Pigmentation has been described previously as a relatively simple trait with few loci of large effect contributing to the phenotype (Hart et al., 2013; Spichenok et al., 2011; Sulem et al., 2007). However, populations living in continental Africa, where humans have the greatest genetic diversity and variation in pigmentation (as demonstrated here), have been largely ignored in genetic studies of quantitatively phenotyped pigmentation. We investigated the

- 25 unique glimpse into the evolution of pigmentation.
- 26

1 Novel Genetic Associations with Pigmentation

2

25

3 We have performed the first genetic discovery effort for pigmentation loci in the Nama and 4 ‡Khomani San populations. The strongest allelic associations include previously associated 5 variants, noncoding regions near canonical pigmentation genes, and novel genes shown in 6 model organisms to have a role in pigmentation. The strongest association is in SLC24A5. 7 which is a well-known pigmentation gene (Lamason et al., 2005) and is among the most 8 differentiated regions of the genome between European and African populations – indicative of 9 strong positive selection in northern Europeans (Sturm and Duffy, 2012). We find that derived 10 variants in SLC24A5 are at high frequency in the KhoeSan, including missense mutations that 11 influence skin and eye pigmentation (Table 2). Notably, these variants are segregating at higher 12 frequency than expected by recent European admixture alone. Three possible evolutionary 13 scenarios that may explain these elevated frequencies are: 1) these variants arose in southern 14 Africa more than 100,000 years ago and were later selected for in Europeans after the out-of-15 Africa migration in response to northern UVR environments. Alternatively, 2) these variants 16 arose in Europe/Near East, were introduced into KhoeSan populations via "back to Africa" migration into southern Africa predating 17th century European colonialism (Tishkoff et al., 2007; 17 Pickrell et al., 2012; Pickrell et al., 2014; Uren et al., 2016), and have since been positively 18 19 selected in the KhoeSan. Lastly, 3) a recurrent mutation (G to A transition at the CpG ancestral 20 dinucleotide, a class of mutations shown to have elevated mutation rates) occurred. 21 Considerable future work is needed to definitively disentangle these scenarios. 22 23 We find a significant enrichment of genes related to melanogenesis in our GWAS. Specifically, 24 we find several independent associations near SMARCA2 and VLDLR. SMARCA2 has a known

26 expressed across CEU and YRI populations in lymphoblastoid cell lines (Duan et al., 2009).

role in folate biosynthesis, in vitamin D-coupled transcription regulation, and is differentially

1 Additionally, previous functional studies have shown that *MITF*, the transcription factor known 2 as the "master regulator of melanogenesis" due to its ability to activate many melanocyte-3 specific genes (Praetorius et al., 2013), recruits critical components of the SWI/SNF chromatin 4 remodeling complex, including SMARCA2, to the promoter region of its targets (Vachtenheim et 5 al., 2010). This recruitment is required for normal expression of many *MITF* target genes. 6 including TYR, TYRP1, DCT, RAB27A, BCL2, among others (Keenen et al., 2010; de la Serna 7 et al., 2006). Additionally, VLDLR knockout mice exhibit hypopigmented retinas (Xia et al., 8 2013). We also find a suggestive association upstream of TYRP1 (Figure 5A). TYRP1 9 mutations in humans have been associated with oculocutaneous albinism and shown to cause 10 nearly Mendelian inheritance of blond hair in Solomon Islanders (Kenny et al., 2012; 11 Sarangarajan and Boissy, 2001). Thus, we observe enrichments of molecular pathways 12 involved in pigmentation beyond those previously identified as associated with the phenotype in 13 non-African populations. 14 15 The Polygenic Architecture of Pigmentation in Africa 16 17 We assessed the heritability of baseline skin pigmentation, and find that it is virtually completely 18 heritable in our KhoeSan sample. In contrast, tanning status is primarily environmental, with 19 heritability estimates which are not significantly different from zero. In European populations, 20 predictive models based on only 9 SNPs capture up to 16% of the variance in skin pigmentation 21 (Liu et al., 2015), highlighting its relative simplicity. We applied a predictive model (Spichenok et 22 al., 2011; Hart et al., 2013) based on these SNPs to the Nama and ‡Khomani San populations,

and find no significant association between predicted skin color and spectrophotometrically

24 measured skin M index, showing that this estimation fails to capture the genetic variation driving

- 25 the phenotype in the KhoeSan. Given the large effect sizes and high fraction of variation
- 26 explained in Eurasian populations, we asked whether and how much of the phenotypic variation

can be explained by previously identified genes. All gene sets, including previously associated 1 loci, canonical pigmentation genes, and the most significantly associated variants in this study, 2 explained a small fraction of the phenotypic variance ($\sigma^2_{GS1}=0.08$, $\sigma^2_{GS2}=0.09$, $\sigma^2_{GS3}=0.23$, 3 4 respectively). As expected from previous work (Martin et al., 2017), our results indicate that 5 genetic risk prediction is strongly affected by population structure. Most of the pigmentation 6 variability in KhoeSan populations is not explained by previously identified loci, suggesting that 7 more than 50 loci (and indeed, likely far more, given our genomic heritability estimates) with a 8 distribution of mostly small effects contribute to variation in pigmentation in the KhoeSan. This 9 suggests that skin pigmentation is a far more complex trait than previously discussed, 10 analogous to numerous other complex traits discussed in biomedical literature. 11 12 The Evolution of Skin Pigmentation: Selection and Constraint 13 14 By aggregating a large set of quantitative skin pigmentation phenotypes (N=4,712) from globally 15 diverse populations, we have demonstrated heteroskedasticity as a function of latitude. As 16 observed previously, we find a strong correlation between absolute latitude and average skin 17 pigmentation reflectance caused by melanin content. We also observe that populations with 18 lighter skin have reduced variation within any given study: populations furthest from the equator 19 have narrower distributions, while populations closest to the equator have wider distributions. 20 These patterns suggest that selection is acting differently at different latitudes. In equatorial 21 regions, strong directional selection for darker pigmentation has shifted the distribution means in 22 some populations to M indices greater than 90, but with wide variances. This is consistent with a 23 'threshold' model (Chaplin, 2004) in which the protective benefit of melanin needs to meet some 24 minimum threshold but with no penalty to darker pigmentation; alternatively, diversifying 25 selection could maintain the wide variance.

26

1 In stark contrast, pigmentation in far northern European and Asian populations has been under 2 directional selection for decreased melanin production, reflected by very narrow distributions. 3 There may be biological constraints on the lower boundary of skin pigmentation, and/or due to 4 the strong positive selection acting on a few large-effect alleles, there is little genetic variability 5 left at these pigmentation loci. This would simplify the genomic architecture, with relatively few 6 alleles of large effect driving the phenotype, particularly alleles that lighten skin at extreme 7 northern latitudes, and could explain why prior investigations observed an almost Mendelian 8 inheritance of large effect light pigmentation alleles.

9

10 Finally, populations at intermediate latitudes have increased variance and higher means than 11 populations in northern Eurasia, but less than equatorial populations. The most parsimonious 12 explanation for this pattern is that stabilizing selection affects the light and dark tails of the 13 pigmentation distribution (Barton, 1999). The Nama and ‡Khomani San appear to be two such 14 instances of this intermediate variation within Africa, likely attributable to their geographic 15 distance from the equator in far southern Africa (~24-29 degrees South). The observed mean 16 and variance differences across the full spectrum of skin pigmentation by latitude may be driven 17 by imbalanced opposing adaptive pressures, where selective forces to produce vitamin D and 18 protect folate from photolysis are unequal and change in response to UV radiation exposure. 19 Given our heritability results and the observed variability in baseline pigmentation; light skin 20 pigmentation in the KhoeSan appears to be due to a combination of many small-effect 21 mutations as well as some large-effect variants. The evolution of the pigmentation phenotype in 22 these populations cannot be explained in terms of only a few variants segregating in Eurasians. 23 A fuller characterization of the genes underlying the architecture in Africans is needed before we 24 can distinguish between the hypothesis of directional versus stabilizing selection across 25 different latitudes (Berg and Coop, 2014).

26

1 Conclusion

2

3 Because African populations often carry the ancestral (i.e. dark) allele for skin pigmentation 4 genes identified in Eurasians, allusions to African skin pigmentation have ignored the great 5 variability in this phenotype across Africa. Here, we reiterate that skin pigmentation varies more 6 in Africa than any other continent, and we show that pigmentation in African populations cannot 7 simply be explained by the small number of large effect alleles discovered in Eurasians. Even in 8 light to moderately pigmented KhoeSan populations, the polygenicity of skin pigmentation is 9 much greater than Eurasians, encompassing both known pigmentation genes as well as novel 10 loci. We argue that the distributions of skin pigmentation globally suggest different forces of 11 selection operating at various latitudes. To better understand baseline pigmentation, one of the 12 most rapidly-evolving traits and strongest cases for positive selection in humans, it is essential 13 to guantitatively measure and study pigmentation in a large set of genetically diverged 14 populations that have historically been exposed to different levels of UV radiation. As human 15 genetics moves to ever larger studies of complex traits (Wood et al., 2014), the full picture of 16 genetic architecture will remain incomplete without representation from diverse worldwide 17 populations.

18

19 Author Contributions

BMH, CRG, MWF, and CDB conceived of and designed the study. ARM and AS designed
experiments. ARM, MS and AS performed experiments. ARM, JMG, ML, EGA and XL analyzed
data. BMH, CRG, CJW, JWM, ARM, JMG, and MM collected samples and measured skin
photometrics. EGH, CRG, DMK, MWF, CDB, and BMH supervised the study. ARM and BMH
wrote the manuscript with input from ML, JMG, MM, DMK, EGH, MWF, and CRG. All authors
read and approved of the final version of the manuscript.

1 Acknowledgments

2 We thank the Beijing Genome Institute and Agilent Technologies for sequencing support. We 3 thank George Chaplin and Nina Jablonski for providing summary statistics for baseline 4 pigmentation in the Xhosa and Cape Coloured populations. We thank Sandra Beleza, Heather Norton, Esteban Parra, Chandana Basu Mallick, Andres Moreno-Estrada and Karla Sandoval. 5 6 Richard Cooper, Sophie Candille, and their colleagues for providing quantitative phenotypes 7 from their pigmentation work. We thank Catherine Guenther for discussing molecular strategies 8 for functional followup. We would also like to thank the Working Group of Indigenous Minorities 9 in Southern Africa (WIMSA), community leaders and the South African San Institute (SASI) for 10 their advice and oversight. Finally, we thank Richard Jacobs, Wilhelmina Mondzinger, Hans 11 Padmaker, Willem de Klerk, Hendrik Kaiman, and the communities in which we have sampled; 12 without their support, this study would not have been possible. Funding for this project was 13 provided by a Stanford University CDEHA seed grant (NIH, NIA P30 AG017253-12) to BMH and 14 by a trainee research grant to ARM by the Stanford Center for Computational, Evolutionary, and 15 Human Genomics. Funding was also provided by the Morrison Institute for Population Studies, 16 Stanford University. Funding for genotyping additional KhoeSan individuals was provided by the 17 Stanford Center for Computational, Evolutionary, and Human Genomics. ARM was funded by 18 NIH Genetics and Developmental Biology Training Program T32 GM07790. EA was supported 19 by an NIH IRACDA fellowship to Stony Brook University. CRG was supported by the Stanford 20 Genome Training Program 5T32HG000044. CJW, MM and EGH are partly supported by the 21 South African Medical Research Council. The content is solely the responsibility of the authors 22 and does not necessarily represent the official views of the South African Medical Research 23 Council.

24

25 Conflicts of Interest

- 1 CRG and BMH own stock in 23andMe, Inc. CRG is a member of the scientific advisory board
- 2 and academic founder for Encompass Bioscience, Inc. JAG is an employee of AncestryDNA.
- 3 CDB is a member of the scientific advisory board for Liberty Biosecurity, Personalis, Inc.,
- 4 23andMe Roots into the Future, Ancestry.com, IdentifyGenomics, LLC, Etalon, Inc., and is a
- 5 founder of CDB Consulting, LTD. All other authors declare that they have no competing
- 6 interests.
- 7

1 References

- 2
- Alexander, D.H., Novembre, J., and Lange, K. (2009). Fast model-based estimation of ancestry
 in unrelated individuals. Genome research *19*, 1655-664.
- 5 Alkorta-Aranburu, G., Beall, C.M., Witonsky, D.B., Gebremedhin, A., Pritchard, J.K., and Di
- 6 Rienzo, A. (2012). The genetic architecture of adaptations to high altitude in Ethiopia. PLoS
- 7 Genet 8, e1003110.
- 8 Almasy, L., and Blangero, J. (1998). Multipoint quantitative-trait linkage analysis in general
- 9 pedigrees. The American Journal of Human Genetics *62*, 1198-1211.
- 10 Barton, N.H. (1999). Clines in polygenic traits. Genetical research 74, 223-236.
- 11 Basu Mallick, C., Iliescu, F.M., Möls, M., Hill, S., Tamang, R., Chaubey, G., Goto, R., Ho,
- 12 S.Y.W., Gallego Romero, I., et al. (2013). The light skin allele of SLC24A5 in South Asians and
- 13 Europeans shares identity by descent. PLoS Genet 9, e1003912.
- 14 Beleza, S., Santos, A.M., McEvoy, B., Alves, I., Martinho, C., Cameron, E., Shriver, M.D., Parra,
- 15 E.J., and Rocha, J. (2013a). The timing of pigmentation lightening in Europeans. Mol Biol Evol
- 16 30, 24-35.
- 17 Beleza, S., Johnson, N.A., Candille, S.I., Absher, D.M., Coram, M.A., Lopes, J., Campos, J.,
- 18 Araújo, I.I., Anderson, T.M., et al. (2013b). Genetic Architecture of Skin and Eye Color in an
- 19 African-European Admixed Population. PLoS Genet 9, e1003372.
- 20 Berg, J.J., and Coop, G. (2014). A Population Genetic Signal of Polygenic Adaptation. PLoS
- 21 Genet 10, e1004412.
- Berg, J.J., and Coop, G. (2014). A Population Genetic Signal of Polygenic Adaptation. PLoS
 Genet *10*, e1004412.
- 24 Byard, P.J. (1981). Quantitative genetics of human skin color. American Journal of Physical
- 25 Anthropology 24, 123-137.
- 26 Candille, S.I., Absher, D.M., Beleza, S., Bauchet, M., McEvoy, B., Garrison, N.A., Li, J.Z.,
- 27 Myers, R.M., Barsh, G.S., et al. (2012). Genome-wide association studies of quantitatively
- 28 measured skin, hair, and eye pigmentation in four European populations. PLoS One 7, e48294.
- 29 Carlson, C.S., Matise, T.C., North, K.E., Haiman, C.A., Fesinmeyer, M.D., Buyske, S.,
- 30 Schumacher, F.R., Peters, U., Franceschini, N., et al. (2013). Generalization and dilution of
- 31 association results from European GWAS in populations of non-European ancestry: the PAGE
- 32 study. PLoS Biol *11*, e1001661.
- 33 Chaplin, G. (2004). Geographic distribution of environmental factors influencing human skin
- coloration. American Journal of Physical Anthropology *125*, 292-302.
- 35 Chaplin, G., and Jablonski, N.G. (2009). Vitamin D and the evolution of human depigmentation.
- 36 American journal of physical anthropology *139*, 451-461.
- 37 Clark, P., Stark, A.E., Walsh, R.J., Jardine, R., and Martin, N.G. (1981). A twin study of skin
- 38 reflectance. Annals of Human Biology 8, 529-541.
- 39 Coussens, A.K., Naude, C.E., Goliath, R., Chaplin, G., Wilkinson, R.J., and Jablonski, N.G.
- 40 (2015). High-dose vitamin D ₃ reduces deficiency caused by low UVB exposure
- 41 and limits HIV-1 replication in urban Southern Africans. Proceedings of the National Academy of
- 42 Sciences , 201500909.
- 43 Crawford, N. G., et al. (2017). Loci associated with skin pigmentation identified in African
- 44 populations. Science

- 1 Demir, K., Kirsch, N., Beretta, C.A., Erdmann, G., Ingelfinger, D., Moro, E., Argenton, F., Carl,
- 2 M., Niehrs, C., and Boutros, M. (2013). RAB8B is required for activity and caveolar endocytosis 3 of LRP6. Cell reports 4, 1224-234
- 3 of LRP6. Cell reports *4*, 1224-234.
- 4 Diffey, B.L., Oliver, R.J., and Farr, P.M. (1984). A portable instrument for quantifying erythema
- 5 induced by ultraviolet radiation. British Journal of Dermatology *111*, 663-672.
- 6 Duan, S., Huang, R.S., Zhang, W., Mi, S., Bleibel, W.K., Kistner, E.O., Cox, N.J., and Dolan,
- 7 M.E. (2009). Expression and alternative splicing of folate pathway genes in HapMap
- 8 lymphoblastoid cell lines. Pharmacogenomics *10*, 549-563.
- 9 Duffy, D.L., Montgomery, G.W., Chen, W., Zhao, Z.Z., Le, L., James, M.R., Hayward, N.K.,
- 10 Martin, N.G., and Sturm, R.A. (2007). A three-single-nucleotide polymorphism haplotype in
- 11 intron 1 of OCA2 explains most human eye-color variation. Am J Hum Genet *80*, 241-252.
- 12 Durazo-Arvizu, R.A., Camacho, P., Bovet, P., Forrester, T., Lambert, E.V., Plange-Rhule, J.,
- 13 Hoofnagle, A.N., Aloia, J., Tayo, B., et al. (2014). 25-Hydroxyvitamin D in African-origin
- 14 populations at varying latitudes challenges the construct of a physiologic norm. The American
- 15 journal of clinical nutrition *100*, 908-914.
- 16 Edwards, M., Bigham, A., Tan, J., Li, S., Gozdzik, A., Ross, K., Jin, L., and Parra, E.J. (2010).
- 17 Association of the OCA2 polymorphism His615Arg with melanin content in east Asian
- 18 populations: further evidence of convergent evolution of skin pigmentation. PLoS Genet 6,
- 19 e1000867.
- 20 Eriksson, N., Macpherson, J.M., Tung, J.Y., Hon, L.S., Naughton, B., Saxonov, S., Avey, L.,
- 21 Wojcicki, A., Pe'er, I., and Mountain, J. (2010). Web-based, participant-driven studies yield
- novel genetic associations for common traits. PLoS Genet 6, 1-20.
- 23 Frisancho, A.R., Wainwright, R., and Way, A. (1981). Heritability and components of phenotypic
- expression in skin reflectance of Mestizos from the Peruvian lowlands. American journal ofphysical anthropology *55*, 203-08.
- 26 Genovese, G., Friedman, D.J., Ross, M.D., Lecordier, L., Uzureau, P., Freedman, B.I., Bowden,
- 27 D.W., Langefeld, C.D., Oleksyk, T.K., et al. (2010). Association of Trypanolytic ApoL1 Variants
- 28 with Kidney Disease in African Americans. Science 329, 841-45.
- 29 Gravel, S., Zakharia, F., Moreno-Estrada, A., Byrnes, J.K., Muzzio, M., Rodriguez-Flores, J.L.,
- 30 Kenny, E.E., Gignoux, C.R., Maples, B.K., et al. (2013). Reconstructing Native American
- 31 migrations from whole-genome and whole-exome data. PLoS Genet 9, e1004023.
- 32 Gronau, I., Hubisz, M.J., Gulko, B., Danko, C.G., and Siepel, A. (2011). Bayesian inference of
- 33 ancient human demography from individual genome sequences. Nat Genet
- 34 Gusev, A., Lee, S.H., Trynka, G., Finucane, H., Vilhjálmsson, B., Xu, H., Zang, C., Ripke, S.,
- 35 Bulik-Sullivan, B., et al. (2014). Partitioning Heritability of Regulatory and Cell-Type-Specific
- 36 Variants across 11 Common Diseases. The American Journal of Human Genetics 95, 535-552.
- 37 Harrison, G.A., and Owen, J.J. (1964). Studies on the Inheritance of Human Skin Colour.
- 38 Annals of human genetics 28, 27-37.
- Hart, K.L., Kimura, S.L., Mushailov, V., Budimlija, Z.M., Prinz, M., and Wurmbach, E. (2013).
- Improved eye- and skin-color prediction based on 8 SNPs. Croatian medical journal *54*, 248256.
- 42 Henn, B.M., Gignoux, C.R., Jobin, M., Granka, J.M., Macpherson, J.M., Kidd, J.M., Rodríguez-
- 43 Botigué, L., Ramachandran, S., Hon, L., et al. (2011). Hunter-gatherer genomic diversity

- 1 suggests a southern African origin for modern humans. Proc Natl Acad Sci U S A 108, 5154-
- 2 162.
- 3 Izagirre, N., García, I., Junquera, C., de la Rúa, C., and Alonso, S. (2006). A scan for signatures
- of positive selection in candidate loci for skin pigmentation in humans. Mol Biol Evol 23, 16971706.
- Jablonski, N.G., and Chaplin, G. (2010). Colloquium paper: human skin pigmentation as an
- 7 adaptation to UV radiation. Proc Natl Acad Sci U S A 107 Suppl, 8962-68.
- 8 Jablonski, N.G., and Chaplin, G. (2014). The Evolution of Skin Pigmentation and Hair Texture in
- 9 People of African Ancestry. Dermatologic Clinics 32, 113-121.
- 10 Jin, Y., Birlea, S.A., Fain, P.R., Gowan, K., Riccardi, S.L., Holland, P.J., Mailloux, C.M., Sufit,
- 11 A.J.D., Hutton, S.M., et al. (2010). Variant of TYR and autoimmunity susceptibility loci in
- 12 generalized vitiligo. The New England journal of medicine *362*, 1686-697.
- 13 Kayser, M., Liu, F., Janssens, A.C.J., Rivadeneira, F., Lao, O., van Duijn, K., Vermeulen, M.,
- 14 Arp, P., Jhamai, M.M., et al. (2008). Three Genome-wide Association Studies and a Linkage
- 15 Analysis Identify HERC2 as a Human Iris Color Gene. The American Journal of Human
- 16 Genetics 82, 411-423.
- 17 Keenen, B., Qi, H., Saladi, S.V., Yeung, M., and de la Serna, I.L. (2010). Heterogeneous
- 18 SWI/SNF chromatin remodeling complexes promote expression of microphthalmia-associated
- 19 transcription factor target genes in melanoma. Oncogene 29, 81-92.
- 20 Kenny, E.E., Timpson, N.J., Sikora, M., Yee, M., Moreno-Estrada, A., Eng, C., Huntsman, S.,
- Burchard, E.G., Stoneking, M., et al. (2012). Melanesian blond hair is caused by an amino acid
- change in TYRP1. Science 336, 554.
- 23 Lamason, R.L., Mohideen, M.P.K., Mest, J.R., Wong, A.C., Norton, H.L., Aros, M.C., Jurynec,
- M.J., Mao, X., Humphreville, V.R., et al. (2005). SLC24A5, a putative cation exchanger, affects pigmentation in zebrafish and humans. Science *310*, 1782-86.
- Lao, O., de Gruijter, J.M., van Duijn, K., Navarro, A., and Kayser, M. (2007). Signatures of
- 27 positive selection in genes associated with human skin pigmentation as revealed from analyses
- of single nucleotide polymorphisms. Annals of human genetics 71, 354-369.
- de la Serna, I.L., Ohkawa, Y., Higashi, C., Dutta, C., Osias, J., Kommajosyula, N., Tachibana,
- 30 T., and Imbalzano, A.N. (2006). The microphthalmia-associated transcription factor requires
- SWI/SNF enzymes to activate melanocyte-specific genes. The Journal of biological chemistry
 281, 20233-241.
- Li, J.Z., Absher, D.M., Tang, H., Southwick, A.M., Casto, A.M., Ramachandran, S., Cann, H.M.,
- Barsh, G.S., Feldman, M., et al. (2008). Worldwide human relationships inferred from genomewide patterns of variation. Science *319*, 1100-04.
- 36 Liu, F., Visser, M., Duffy, D.L., Hysi, P.G., Jacobs, L.C., Lao, O., Zhong, K., Walsh, S.,
- 37 Chaitanya, L., et al. (2015). Genetics of skin color variation in Europeans: genome-wide
- association studies with functional follow-up. Human Genetics *134*, 823-835.
- Liu, J.Z., van Sommeren, S., Huang, H., Ng, S.C., Alberts, R., Takahashi, A., Ripke, S., Lee,
- 40 J.C., Jostins, L., et al. (2015). Association analyses identify 38 susceptibility loci for
- inflammatory bowel disease and highlight shared genetic risk across populations. Nat Genet 47,
 979-986.
- 43 Liu-Smith, F., Dellinger, R., and Meyskens, F.L. (2014). Updates of reactive oxygen species in
- 44 melanoma etiology and progression. Archives of biochemistry and biophysics

- 1 Luca, F., Hudson, R.R., Witonsky, D.B., and Di Rienzo, A. (2011). A reduced representation
- 2 approach to population genetic analyses and applications to human evolution. Genome
- 3 Research *21*, 1087-098.
- 4 Marcheco-Teruel, B., Parra, E.J., Fuentes-Smith, E., Salas, A., Buttenschøn, H.N., Demontis,
- 5 D., Torres-Español, M., Marín-Padrón, L.C., Gómez-Cabezas, E.J., et al. (2014). Cuba:
- 6 exploring the history of admixture and the genetic basis of pigmentation using autosomal and
- 7 uniparental markers. PLoS Genet 10, e1004488.
- 8 Martin, A.R., Gignoux, C.R., Walters, R.K., Wojcik, G.L., Neale, B.M., Gravel, S., Daly, M.J.,
- 9 Bustamante, C.D., and Kenny, E.E. (2017). Human Demographic History Impacts Genetic Risk
- 10 Prediction across Diverse Populations. The American Journal of Human Genetics
- 11 McEvoy, B., Beleza, S., and Shriver, M.D. (2006). The genetic architecture of normal variation in
- 12 human pigmentation: an evolutionary perspective and model. Human molecular genetics *15*
- 13 Spec No, R176-181.
- 14 Miller, C.T., Beleza, S., Pollen, A.A., Schluter, D., Kittles, R.A., Shriver, M.D., and Kingsley,
- 15 D.M. (2007). cis-Regulatory changes in Kit ligand expression and parallel evolution of
- 16 pigmentation in sticklebacks and humans. Cell *131*, 1179-189.
- 17 Moltke, I., and Albrechtsen, A. (2013). RelateAdmix: a software tool for estimating relatedness
- 18 between admixed individuals. Bioinformatics , 1-2.
- 19 Nan, H., Kraft, P., Qureshi, A.A., Guo, Q., Chen, C., Hankinson, S.E., Hu, F.B., Thomas, G.,
- Hoover, R.N., et al. (2009). Genome-wide association study of tanning phenotype in a
- 21 population of European ancestry. The Journal of investigative dermatology 129, 2250-57.
- 22 Norton, H.L., Friedlaender, J.S., Merriwether, D.A., Koki, G., Mgone, C.S., and Shriver, M.D.
- 23 (2006). Skin and hair pigmentation variation in Island Melanesia. American journal of physical
- 24 anthropology *130*, 254-268.
- Norton, H.L., Kittles, R.A., Parra, E., McKeigue, P., Mao, X., Cheng, K., Canfield, V.A., Bradley,
- 26 D.G., McEvoy, B., and Shriver, M.D. (2007). Genetic evidence for the convergent evolution of
- 27 light skin in Europeans and East Asians. Mol Biol Evol 24, 710-722.
- 28 Paik, S.H., Kim, H., Son, H., Lee, S., Im, S., Ju, Y.S., Yeon, J.H., Jo, S.J., Eun, H.C., et al.
- 29 (2012). Gene mapping study for constitutive skin color in an isolated Mongolian population.
- 30 Experimental & molecular medicine 44, 241-49.
- 31 Pickrell, J.K., Patterson, N., Barbieri, C., Berthold, F., Gerlach, L., Güldemann, T., Kure, B.,
- 32 Mpoloka, S.W., Nakagawa, H., et al. (2012). The genetic prehistory of southern Africa. Nat
- 33 Commun 3, 1143.
- 34 Pickrell, J.K., Patterson, N., Loh, P.-, Lipson, M., Berger, B., Stoneking, M., Pakendorf, B., and
- 35 Reich, D. (2014). Ancient west Eurasian ancestry in southern and eastern Africa. Proceedings
- 36 of the National Academy of Sciences , 1-6.
- Pośpiech, E., Wojas-Pelc, A., Walsh, S., Liu, F., Maeda, H., Ishikawa, T., Skowron, M., Kayser,
- 38 M., and Branicki, W. (2014). The common occurrence of epistasis in the determination of human
- 39 pigmentation and its impact on DNA-based pigmentation phenotype prediction. Forensic
- 40 Science International: Genetics 11, 64-72.
- 41 Prado-Martinez, J., Sudmant, P.H., Kidd, J.M., Li, H., Kelley, J.L., Lorente-Galdos, B.,
- 42 Veeramah, K.R., Woerner, A.E., O'Connor, T.D., et al. (2013). Great ape genetic diversity and
- 43 population history. Nature , 1-5.

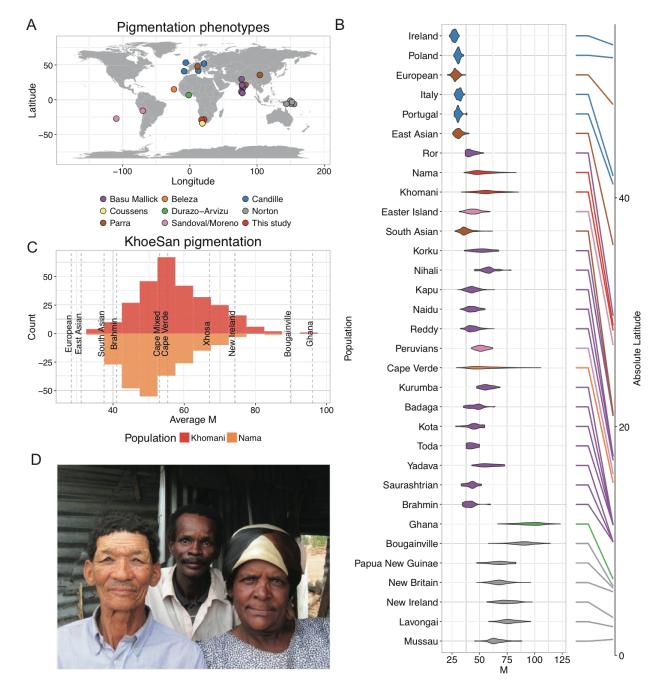
- 1 Praetorius, C., Grill, C., Stacey, S.N., Metcalf, A.M., Gorkin, D.U., Robinson, K.C., Van Otterloo,
- 2 E., Kim, R.S.Q., Bergsteinsdottir, K., et al. (2013). A polymorphism in IRF4 affects human
- 3 pigmentation through a tyrosinase-dependent MITF/TFAP2A pathway. Cell *155*, 1022-033.
- 4 Ramachandran, S., Deshpande, O., Roseman, C.C., Rosenberg, N.A., Feldman, M.W., and
- 5 Cavalli-Sforza, L.L. (2005). Support from the relationship of genetic and geographic distance in
- 6 human populations for a serial founder effect originating in Africa. Proc Natl Acad Sci U S A
- 7 102, 15942-47.
- 8 Relethford, J.H. (2000). Human skin color diversity is highest in sub-Saharan African
- 9 populations. Human biology 72, 773-780.
- 10 Sabeti, P.C., Varilly, P., Fry, B., Lohmueller, J., Hostetter, E., Cotsapas, C., Xie, X., Byrne, E.H.,
- 11 McCarroll, S.A., et al. (2007). Genome-wide detection and characterization of positive selection
- 12 in human populations. Nature 449, 913-18.
- 13 Sarangarajan, R., and Boissy, R.E. (2001). Tyrp1 and oculocutaneous albinism type 3. Pigment
- 14 cell research / sponsored by the European Society for Pigment Cell Research and the
- 15 International Pigment Cell Society 14, 437-444.
- 16 Schizophrenia Working Group of the Psychiatric Genomics Consortium (2014). Biological
- 17 insights from 108 schizophrenia-associated genetic loci. Nature 511, 421-27.
- 18 Schlebusch, C.M., Skoglund, P., Sjödin, P., Gattepaille, L.M., Hernandez, D., Jay, F., Li, S., De
- 19 Jongh, M., Singleton, A., et al. (2012). Genomic Variation in Seven Khoe-San Groups Reveals
- 20 Adaptation and Complex African History. Science 374
- 21 Soejima, M., and Koda, Y. (2007). Population differences of two coding SNPs in pigmentation-
- related genes SLC24A5 and SLC45A2. International Journal of Legal Medicine *121*, 36-39.
- 23 Soejima, M., Tachida, H., Ishida, T., Sano, A., and Koda, Y. (2006). Evidence for recent positive
- selection at the human AIM1 locus in a European population. Mol Biol Evol 23, 179-188.
- 25 Spichenok, O., Budimlija, Z.M., Mitchell, A.A., Jenny, A., Kovacevic, L., Marjanovic, D.,
- 26 Caragine, T., Prinz, M., and Wurmbach, E. (2011). Prediction of eye and skin color in diverse
- 27 populations using seven SNPs. Forensic Science International: Genetics *5*, 472-78.
- 28 Sturm, R.A. (2009). Molecular genetics of human pigmentation diversity. Human molecular
- 29 genetics 18, R9-17.
- 30 Sturm, R.A., and Duffy, D.L. (2012). Human pigmentation genes under environmental selection.
- 31 Sulem, P., Gudbjartsson, D.F., Stacey, S.N., Helgason, A., Rafnar, T., Jakobsdottir, M.,
- 32 Steinberg, S., Gudjonsson, S.A., Palsson, A., et al. (2008). Two newly identified genetic
- determinants of pigmentation in Europeans. Nat Genet 40, 835-37.
- 34 Sulem, P., Gudbjartsson, D.F., Stacey, S.N., Helgason, A., Rafnar, T., Magnusson, K.P.,
- 35 Manolescu, A., Karason, A., Palsson, A., et al. (2007). Genetic determinants of hair, eye and
- 36 skin pigmentation in Europeans. Nat Genet 39, 1443-452.
- 37 Thornton, T., Tang, H., Hoffmann, T.J., Ochs-Balcom, H.M., Caan, B.J., and Risch, N. (2012).
- 38 Estimating kinship in admixed populations. Am J Hum Genet *91*, 122-138.
- 39 Tishkoff, S.A., Gonder, M.K., Henn, B.M., Mortensen, H., Knight, A., Gignoux, C.,
- 40 Fernandopulle, N., Lema, G., Nyambo, T.B., et al. (2007). History of Click-Speaking Populations
- 41 of Africa Inferred from mtDNA and Y Chromosome Genetic Variation. Mol Biol Evol 24, 2180-

42 195.

- 1 Tishkoff, S.A., Reed, F.A., Friedlaender, F.R., Ehret, C., Ranciaro, A., Froment, A., Hirbo, J.B.,
- Awomoyi, A.A., Bodo, J., et al. (2009). The genetic structure and history of Africans and African
 Americans. Science *324*, 1035-044.
- 4 Uren, C., Kim, M., Martin, A.R., Bobo, D., Gignoux, C.R., van Helden, P.D., Moller, M., Hoal,
- 5 E.G., and Henn, B.M. (2016). Fine-Scale Human Population Structure in Southern Africa
- 6 Reflects Ecogeographic Boundaries. Genetics 204, 303-314.
- 7 Vachtenheim, J., Ondrušová, L., and Borovanský, J. (2010). SWI/SNF chromatin remodeling
- 8 complex is critical for the expression of microphthalmia-associated transcription factor in
- 9 melanoma cells. Biochemical and Biophysical Research Communications *392*, 454-59.
- 10 Veeramah, K.R., Wegmann, D., Woerner, A., Mendez, F.L., Watkins, J.C., Destro-Bisol, G.,
- 11 Soodyall, H., Louie, L., and Hammer, M.F. (2012). An Early Divergence of KhoeSan Ancestors
- 12 from Those of Other Modern Humans Is Supported by an ABC-Based Analysis of Autosomal
- 13 Resequencing Data. Mol Biol Evol 29, 617-630.
- 14 Voight, B.F., Kudaravalli, S., Wen, X., and Pritchard, J.K. (2006). A map of recent positive
- 15 selection in the human genome. PLoS Biol 4, e72.
- 16 Walsh, S., Liu, F., Wollstein, A., Kovatsi, L., Ralf, A., Kosiniak-Kamysz, A., Branicki, W., and
- 17 Kayser, M. (2013). The HIrisPlex system for simultaneous prediction of hair and eye colour from
- 18 DNA. Forensic Science International: Genetics 7, 98-115.
- 19 Wilde, S., Timpson, A., Kirsanow, K., Kaiser, E., Kayser, M., Unterländer, M., Hollfelder, N.,
- 20 Potekhina, I.D., Schier, W., et al. (2014). Direct evidence for positive selection of skin, hair, and
- eye pigmentation in Europeans during the last 5,000 y. Proc Natl Acad Sci U S A *111*, 4832-37.
- 22 Wood, A.R., Esko, T., Yang, J., Vedantam, S., Pers, T.H., Gustafsson, S., Chu, A.Y., Estrada,
- K., Luan, J., et al. (2014). Defining the role of common variation in the genomic and biological
- 24 architecture of adult human height. Nat Genet 46, 1173-186.
- 25 Xia, C., Lu, E., Zeng, J., and Gong, X. (2013). Deletion of LRP5 in VLDLR Knockout Mice
- 26 Inhibits Retinal Neovascularization. PLoS One 8, e75186.
- 27 Yang, Z., Zhong, H., Chen, J., Zhang, X., Zhang, H., Luo, X., Xu, S., Chen, H., Lu, D., et al.
- 28 (2016). A Genetic Mechanism for Convergent Skin Lightening during Recent Human Evolution.
- 29 Mol Biol Evol 33, 1177-187.
- 30 Yi, X., Liang, Y., Huerta-Sanchez, E., Jin, X., Cuo, Z.X.P., Pool, J.E., Xu, X., Jiang, H.,
- Vinckenbosch, N., et al. (2010). Sequencing of 50 human exomes reveals adaptation to high
 altitude. Science *329*, 75-78.
- Zaidi, A.A., Mattern, B.C., Claes, P., McEcoy, B., Hughes, C., and Shriver, M.D. (2017).
- 34 Investigating the case of human nose shape and climate adaptation. PLoS Genet *13*,
- 35 e1006616.
- 36 Zaitlen, N., Kraft, P., Patterson, N., Pasaniuc, B., Bhatia, G., Pollack, S., and Price, A.L. (2013).
- 37 Using extended genealogy to estimate components of heritability for 23 quantitative and
- dichotomous traits. PLoS Genet 9, e1003520.
- 39 Zaitlen, N., Pasaniuc, B., Sankararaman, S., Bhatia, G., Zhang, J., Gusev, A., Young, T.,
- Tandon, A., Pollack, S., et al. (2014). Leveraging population admixture to characterize the
 heritability of complex traits. Nat Genet *46*, 1356-362.
- Zhou, D., Udpa, N., Ronen, R., Stobdan, T., Liang, J., Appenzeller, O., Zhao, H., Yin, Y., Du, Y.,
- 43 et al. (2013). Whole-Genome Sequencing Uncovers the Genetic Basis of Chronic Mountain
- 44 Sickness in Andean Highlanders. The American Journal of Human Genetics , 1-11.

1 Main Figures





3

4 Figure 1 – Distributions of baseline pigmentation in globally diverse populations. A) 5 Sample locations of skin pigmentation datasets where phenotypes were measured with a 6 DermaSpectrometer I or DermaSpectrometer II. B) Violin plots of pigmentation distributions for 7 32 populations from 8 studies ordered by latitude; absolute latitudes provided on the right. 8 Corresponding datasets are colored as in A). Table S1 provides summary statistics for each 9 population. M indices are reflectance measures that approximate melanin content, C) A 10 comparison of skin pigmentation distributions in ±Khomani (top) and Nama populations 11 (bottom). Dashed grey lines and labels indicate mean M index for the indicated other global

12 populations. **D**) South African individuals in a household that exemplify the substantial skin

1 pigmentation variability in the ‡Khomani and Nama populations. Picture taken with consent for

2 3

publication.

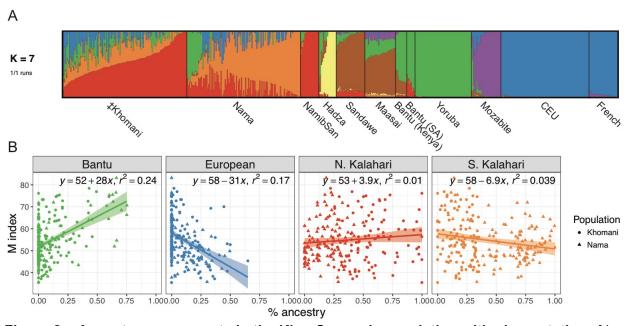




Figure 2 – Ancestry components in the KhoeSan and association with pigmentation. A)

6 ADMIXTURE proportions at k=7 for the \pm Khomani and Nama populations, using Namibian San,

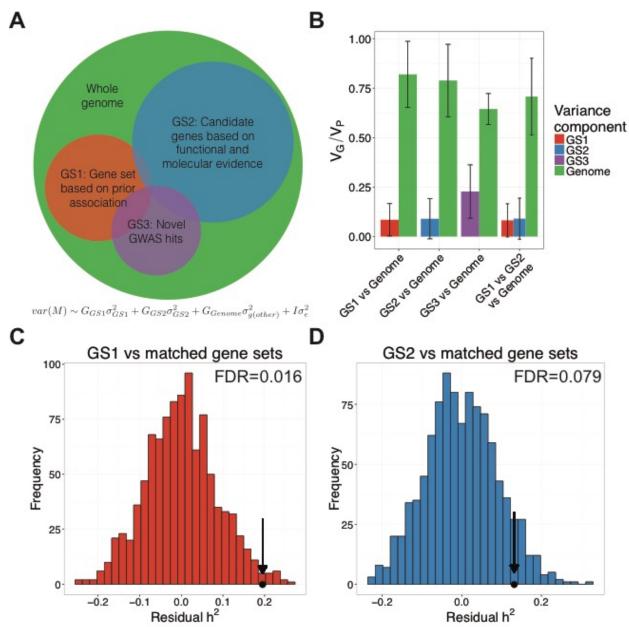
7 Hadza, Sandawe, Maasai, Kenyan Bantu, South African (SA) Bantu, Yoruba, Mozabite, Central

8 Europeans (CEU), and French populations as a reference panel (see also **Figure S2**). **B**)

9 Associations between substantial *k* ancestry clusters and average melanin (M index) baseline

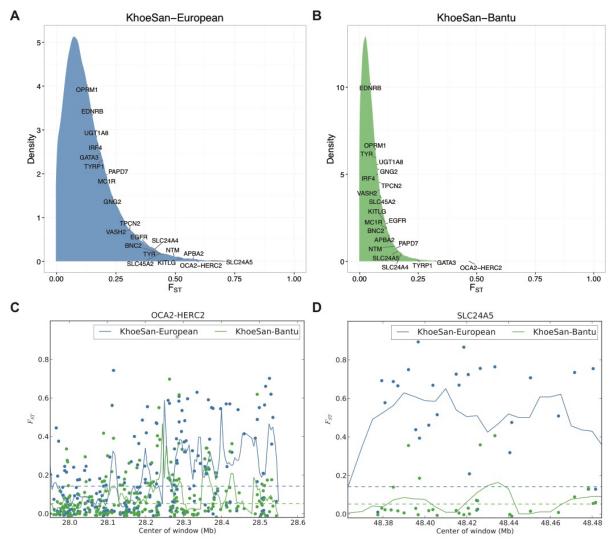
10 pigmentation value in the combined ‡Khomani and Nama populations. The Bantu and European

- 11 components each constitute \geq 5% of the total KhoeSan ancestry on average and have
- 12 significant associations in the best multivariate model (p < 0.05).
- 13



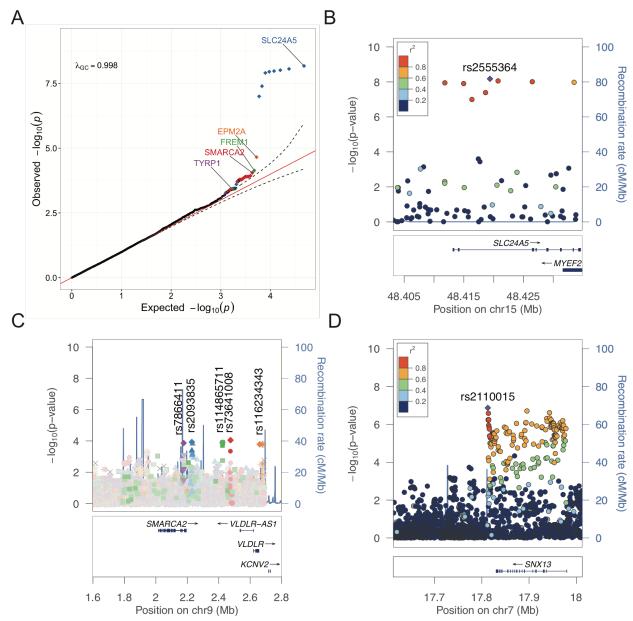


1 2 Figure 3 – Partitioned heritability across known and novel gene sets. Heritable variation in 3 KhoeSan pigmentation is partially explained by previously associated loci, newly associated 4 loci, and candidate genes discovered in divergence studies of other populations, and in animal 5 models. A) Schema illustrating how heritability analyses were used to partition the phenotypic 6 variance explained by candidate gene sets (GS1, GS2) and novel associations (GS3) compared 7 to the rest of the genome. B) Variance components analysis in GCTA comparing pigmentation 8 variability explained by GS1, GS2, and the rest of the genome. Error bars span ± 1 standard 9 error. C) Heritability explained by estimated value observed in our data (dot and arrow) versus matched null distribution in the ‡Khomani and Nama after accounting for number of SNPs in 10 11 GS1 gene sets containing 14 genes previously associated with skin pigmentation in other 12 populations. **D**) As in C), where GS2 = gene set from **Table S4** of (Beleza et al., 2013b) 13 compiled based on pigmentation function (see also Figure S3). 14



1 2 3 4 Figure 4 – Genetic divergence in genes previously associated with pigmentation. A-B) Distribution of weighted F_{ST} in 20 kb moving windows of SNPs across the genome with a step size of 5 kb. Labels indicate where the maximal F_{ST} window from each canonical pigmentation 5 gene lies in the distribution. Divergence depicted is between A) the KhoeSan and Europeans, 6 and B) the KhoeSan and West African populations. C-D) F_{ST} in canonical pigmentation genes. 7 Dots indicate SNPs, lines indicate moving averages over 20 kb windows with a step size of 5 kb. Canonical pigmentation loci/genes are shown as: C) the OCA2-HERC2 locus, and D) the 8

9 SLC24A5 gene.



1 2 3 Figure 5 – Associations between genetic data and baseline pigmentation. Information regarding targeted resequencing regions is shown in Table S7. A) Targeted resequencing QQ 4 plot. 95% confidence interval on the QQ plot is drawn assuming the *j*th order statistic from a 5 uniform sample follows a Beta(j, n - j + 1) distribution. Colors differentiate loci containing more 6 than one variant associated more significantly than the 95% confidence interval in a region. B-7 C) LocusZoom plots of targeted resequencing genetic associations incorporating KhoeSan-8 specific LD. Recombination rates are from HapMap b37. Regions include: B) SLC24A5, and C) 9 5 independent signals associated with p < 1e-3 in/near SMARCA2 and VLDLR. E) LocusZoom 10 plot of suggestive association in/near SNX13 from meta-analysis of phase 1 and phase2 11 (Figure S7A) imputed associations with KhoeSan-specific LD.

1 Main Tables

2

3 Table 1 – Heritability estimates contrasting baseline skin pigmentation with tanning

4 status. SNP-based heritability estimates were computed with GCTA using genetic relationship

- 5 matrices (GRMs) calculated from SNP gentoypes, an admixture-corrected GRM computed with
- 6 REAP, and IBD segments. All models were unconstrained.

Method	Dataset	SNPs	N	h ² (SE) baseline pigmentation ^a	h ² (SE) tanning status ^b
GCTA GRM	genotype array	286,026	216	0.90 (0.15)	0.31 (0.19)
REAP GRM	genotype array	286,026	216	0.97 (0.15)	0.41 (0.21)
K _{IBD}	genotype array	NA	216	0.97 (0.16)	0.45 (0.22)
GCTA GRM	exome	117,132	82	0.95 (0.26)	0.37 (0.37)
SOLAR	pedigrees	NA	477	0.96 (0.12)	0.19 (0.11)

- 7 ^aBantu and European admixture proportions were included as covariates.
- ^b Age and sex were included as significant covariates for tanning status (wrist minus baseline
- 9 underarm pigmentation).

10

1 Table 2 – Replication of previously associated skin pigmentation variants in the joint

2 **‡Khomani and Nama populations**. P-value indicates the joint association across all KhoeSan

3 individuals using a linear mixed model accounting for European and Bantu admixture as well as

4 kinship. Beta values reflect the effect size of adding one derived allele, assuming an additive

						San-			
				Derived ^a	Allele	specific	San 95%	W	Ν.
Gene	rsID	P-value	Beta	frequency	number ^b	frequency	Cl ^c	AFR [₫]	EUR ^e
UGT1A	rs6742078	0.58	-0.44	0.54	460	0.60	[0.54,0.69]	0.47	0.29
SLC45A2	rs35395	0.98	-0.02	0.32	882	0.21	[0.18,0.25]	0.20	0.99
SLC45A2	rs16891982	1.2E-03	-2.84	0.14	882	0.00	[0.00,0.02]	0.00	0.98
IRF4	rs12203592	0.83	-0.54	0.01	882	0.00	[0.00,0.00]	0.00	0.17
IRF4	rs12202284	0.51	0.99	0.04	824	0.00	[0.00,0.01]	0.15	0.21
OPRM1	rs6917661	0.29	-0.71	0.66	882	0.71	[0.67,0.79]	0.61	0.76
EGFR	rs12668421	0.65	-0.49	0.08	882	0.02	[0.01,0.08]	0.06	0.27
TYRP1	rs13289810	0.61	0.53	0.19	882	0.18	[0.11,0.25]	0.24	0.34
BNC2	rs10756819	0.51	0.91	0.08	466	0.02	[0.00,0.05]	0.07	0.65
GATA3	rs376397	0.91	0.07	0.65	872	0.79	[0.75,0.82]	0.31	0.32
GRM5, TYR	rs10831496	0.28	-0.90	0.52	460	0.63	[0.57,0.70]	0.12	0.69
TYR	rs1042602	0.74	0.58	0.06	466	0.00	[0.00,0.02]	0.00	0.38
KITLG	rs12821256	0.02	-5.28	0.02	882	0.00	[0.00,0.01]	0.00	0.17
OCA2	rs1800404	0.53	-0.40	0.55	854	0.65	[0.56,0.74]	0.11	0.81
OCA2	rs7495174	0.92	-0.07	0.71	716	0.61	[0.55,0.69]	0.26	0.90
HERC2	rs12913832	0.09	-1.70	0.10	882	0.00	[0.00,0.02]	0.01	0.79
APBA2	rs4424881	0.25	-1.24	0.18	440	0.02	[0.00,0.06]	0.07	0.86
SLC24A5	rs1426654	9.8E-09	-3.58	0.40	882	0.24	[0.17,0.32]	0.05	1.00
MC1R	rs1805007	0.80	-0.64	0.01	630	0.00	[0.00,0.03]	0.00	0.11

5 model, to the distribution of M index (see Figure 1).

^a Derived alleles were determined previously from great ape genome sequencing (Prado-

7 Martinez et al., 2013).

- 8 ^b Allele number indicates the total number of alleles genotyped or sequenced across all
- 9 KhoeSan samples.

^c Confidence interval for the San-specific frequencies indicates the allele frequencies specifically

11 on ‡Khomani haplotypes, assessed with local ancestry tracts.

^d W. AFR (western African) allele frequencies were estimated from 405 ESN, GWD, YRI, and

- 13 MSL populations in the phase 3 1000 Genomes project
- ^e N. EUR (northern Europeans) allele frequencies were estimated from 190 GBR and CEU
- 15 populations in the phase 3 1000 Genomes project