

Research article

Open Access

# Intergenic DNA sequences from the human X chromosome reveal high rates of global gene flow

Murray P Cox<sup>1</sup>, August E Woerner<sup>1</sup>, Jeffrey D Wall<sup>2</sup> and Michael F Hammer\*<sup>1</sup>Address: <sup>1</sup>ARL Division of Biotechnology, University of Arizona, AZ 85721, USA and <sup>2</sup>Institute for Human Genetics, University of California San Francisco, San Francisco, CA 94143, USA

Email: Murray P Cox - mpcox@u.arizona.edu; August E Woerner - augustw@u.arizona.edu; Jeffrey D Wall - wallj@humgen.ucsf.edu; Michael F Hammer\* - mfh@u.arizona.edu

\* Corresponding author

Published: 27 November 2008

Received: 16 July 2008

BMC Genetics 2008, 9:76 doi:10.1186/1471-2156-9-76

Accepted: 27 November 2008

This article is available from: <http://www.biomedcentral.com/1471-2156/9/76>

© 2008 Cox et al; licensee BioMed Central Ltd.

This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/2.0>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

## Abstract

**Background:** Despite intensive efforts devoted to collecting human polymorphism data, little is known about the role of gene flow in the ancestry of human populations. This is partly because most analyses have applied one of two simple models of population structure, the island model or the splitting model, which make unrealistic biological assumptions.

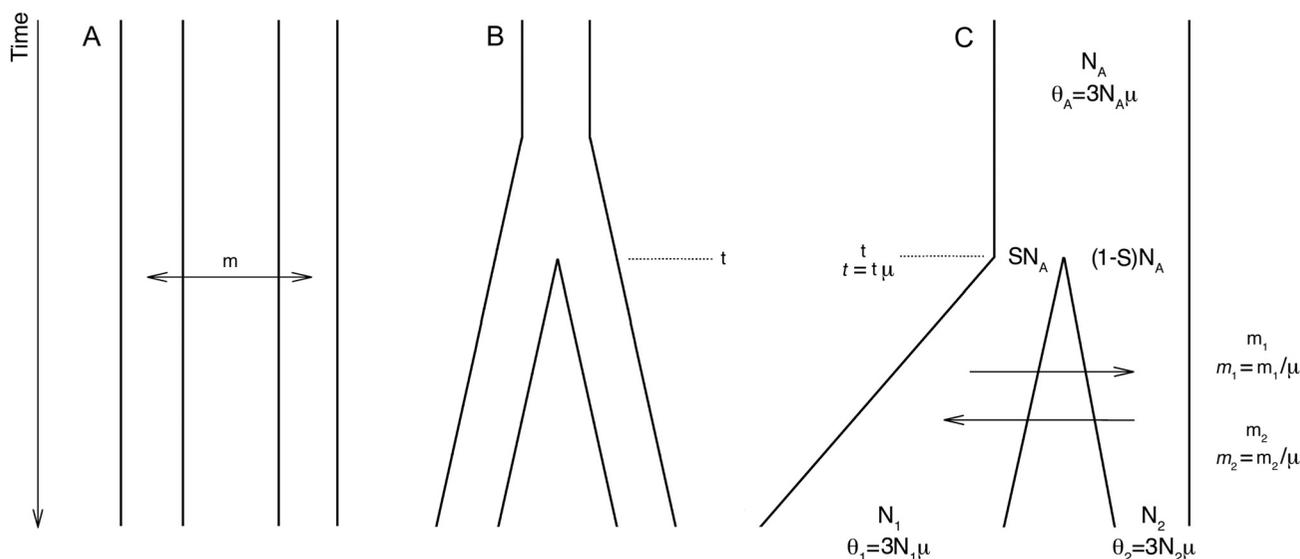
**Results:** Here, we analyze 98-kb of DNA sequence from 20 independently evolving intergenic regions on the X chromosome in a sample of 90 humans from six globally diverse populations. We employ an isolation-with-migration (IM) model, which assumes that populations split and subsequently exchange migrants, to independently estimate effective population sizes and migration rates. While the maximum effective size of modern humans is estimated at ~10,000, individual populations vary substantially in size, with African populations tending to be larger (2,300–9,000) than non-African populations (300–3,300). We estimate mean rates of bidirectional gene flow at  $4.8 \times 10^{-4}$ /generation. Bidirectional migration rates are ~5-fold higher among non-African populations ( $1.5 \times 10^{-3}$ ) than among African populations ( $2.7 \times 10^{-4}$ ). Interestingly, because effective sizes and migration rates are inversely related in African and non-African populations, population migration rates are similar within Africa and Eurasia (e.g., global mean  $Nm = 2.4$ ).

**Conclusion:** We conclude that gene flow has played an important role in structuring global human populations and that migration rates should be incorporated as critical parameters in models of human demography.

## Background

Reconstructing human history requires an accurate picture of global human population structure [1]. However, methods currently used to describe structure among human groups typically rely on very simple demographic models that make unrealistic biological assumptions. Two commonly used models include the island model, which assumes that populations have no shared ancestry

and are related *only* through gene flow (Figure 1A), and the phylogenetic branching or splitting model, which assumes that populations diverged at some time in the past and have remained completely isolated ever since (i.e., no gene flow) (Figure 1B). Despite increasingly sophisticated genetic datasets, most contemporary studies still assume these unrealistic models to infer aspects of human demographic history [2-8].

**Figure 1****Models of population structure reflecting the (A) island, (B) splitting and (C) isolation-with-migration (IM)**

**models.** The island model assumes equilibrium gene flow ( $m$ ) between subpopulations that have no shared ancestry. The divergence model describes an ancestral population, which splits at time  $t$  into two daughter populations that do not exchange genes in subsequent generations. The isolation-with-migration model describes a constant-sized ancestral population that splits into two daughter populations that can exchange genes and change in size. There are seven parameters in the isolation-with-migration model: effective population size of the ancestral deme ( $N_A$ ), effective population sizes of the two descendent demes ( $N_1$  and  $N_2$ ), unidirectional migration between the descendent populations ( $m_1$  and  $m_2$ ), proportion of the ancestral population founding deme 1 ( $S$ ), and population divergence time ( $t$ ).

Furthermore, human population structure is often considered only from the perspective of a single summary statistic,  $F_{ST}$ , which is a standardized measure of the genetic variation shared between populations. However,  $F_{ST}$  is dependent on the effective size ( $N$ ), migration rate ( $m$ ) and divergence time ( $t$ ) of individual demes, and by itself has no straightforward demographic interpretation. A small  $F_{ST}$  between two populations may indicate large effective population sizes, high rates of gene flow since diverging from a common ancestral population, or recent population divergence. For instance, under Wright's [9] island model,  $N$ ,  $m$  and  $F_{ST}$  are linked by a nonlinear relationship independent of  $t$  (equation 2) [10]. Assuming a global effective size for modern humans of  $\sim 10^4$ , an X chromosome  $F_{ST}$  of 0.2 [11,12] suggests that human populations have exchanged  $\sim 4$  gene copies per generation. Conversely, under a simple divergence and isolation model,  $N$ ,  $t$  and  $F_{ST}$  are related by a nonlinear relationship independent of  $m$  (equation 4) [13]. Assuming a mean generation time of 25 years, an X chromosome  $F_{ST}$  of 0.2 suggests that global human populations diverged on average  $\sim 84$  Kya. However, despite being in common usage, gene flow-only and divergence-only models probably have little relevance to actual human demographic history.

Here, we examine the structure of human populations by means of the isolation-with-migration (IM) model [14], which incorporates both population splitting and gene flow (Figure 1C). The IM model describes two daughter populations, which can expand or contract in size, that diverge from a constant-sized ancestral population with continuing migration between the two demes. The IM model has seven demographic parameters: effective population size of the ancestral deme ( $N_A$ ), effective population sizes of the two descendent demes ( $N_1$  and  $N_2$ ), unidirectional migration rates between the descendent populations ( $m_1$  and  $m_2$ ), proportion of the ancestral population founding the first deme ( $S$ ), and population divergence time ( $t$ ). Unlike the island model, which assumes infinite divergence times, or the splitting model, which assumes zero migration, IM makes no *a priori* assumptions about these two demographic parameters. It is therefore a more flexible model system for inferring human history from genetic data.

Here, we apply a Bayesian inference framework together with a maximum likelihood algorithm [15] to determine demographic parameters for a range of human populations under the IM model. Marginal Bayesian posterior probabilities are calculated using Markov chain Monte

Carlo, and best-fit parameterizations are inferred for each population pair (N = 15) for each of the seven demographic parameters. We analyze a multilocus resequencing dataset comprising 20 intergenic regions on the X chromosome, each of which represents ~5 kb of DNA [16]. To minimize any potential confounding effects of natural selection, the sequenced loci were chosen from single-copy non-coding (i.e., putatively non-functional) DNA in regions of medium or high recombination ( $r \geq 0.9$  cM/Mb). Such regions are recombinationally unlinked from genic regions. Because we use resequence data (i.e., all sites were sequenced in each individual) and not pre-ascertained single nucleotide polymorphisms (SNPs) [3,17,18], we avoid some biases in aspects of the data that rely on the site frequency spectrum (e.g.,  $F_{ST}$ ) [19,20]. These data are also well suited for testing the role of gene flow in the history of anatomically modern humans because multiple, diverse populations are represented in our survey (i.e., Biaka from Central African Republic, Mandenka from Senegal, San from Namibia, Basque from southern France, Han from northern China, and Melanesians from Papua New Guinea).

**Results**

**Population differentiation**

Wright's  $F_{ST}$  for our global sample averages to 0.25. When we calculate  $F_{ST}$  between all pairs of populations, we find the greatest  $F_{ST}$  values between sub-Saharan African and non-African groups (i.e.,  $F_{ST}$  ranges from 0.160–0.450) (Table 1). However, there is also a substantial amount of differentiation within sub-Saharan African (mean  $F_{ST}$  of 0.137) and within non-African groups (mean  $F_{ST}$  of

0.174), with  $F_{ST}$  values as high as 0.226 between Melanesians and Basque [16].

**Demographic inference under the isolation-with-migration model**

Marginal Bayesian posterior probabilities were calculated using Markov chain Monte Carlo, and best-fit parameterizations were inferred for each unique population pair (e.g., see Figure 1 in Additional file 1). Results for the seven demographic parameters are discussed individually below (also see Table 1).

**Effective population sizes**

Modern effective population sizes (N) were inferred multiple times under the IM model (i.e., once for each paired population, Tables 1 and 2 in Additional file 1). Although individual estimates of N have some uncertainty, mean effective sizes are statistically larger for African populations (2,300–9,000) than non-African (300–3,300) populations ( $t_{20} = 6.9, P << 0.001$ ). Some non-African groups have especially small effective sizes, such as Melanesians ( $N_0 < 1,500$ ). Mean ancestral sizes (10,500, range 6,600–12,800) are generally larger than modern effective sizes, and are also often larger than the sum of their descendant populations ( $t_{19} = 3.42, P = 0.0029$ ).

**Population split proportions**

Our dataset has little power to infer how ancestral effective sizes were apportioned among descendent demes. Most estimates of the split proportion, S, have large confidence intervals (Table 3 in Additional file 1). The few informative estimates indicate substantial retention of

**Table 1: Mean effective population sizes, migration rates, divergence times and  $F_{ST}$ .**

	Pop 1	Pop 2	$N_A$	$N_1$	$N_2$	$m_{12}/gen \times 10^{-4}$	$m_{21}/gen \times 10^{-4}$	Nm	$\tau$ (kya)	$F_{ST}$
African										
	BIA	MAN	9,980	3,980	6,600	2.8	1.9	4.9	48.7	0.117
	BIA	SAN	6,620	5,560	5,340	0.86	1.9	3.0	50.0	0.169
	MAN	SAN	9,530	6,930	3,790	0.72	0.020	0.8	46.8	0.126
African/Non-African										
	BIA	BAS	11,200	4,650	3,250	1.1	0.43	1.2	61.4	0.311
	BIA	HAN	12,800	2,330	2,600	0.30	0.075	0.2	27.7	0.374
	BIA	MEL	11,600	6,900	1,570	0.48	0.71	1.0	88.5	0.331
	MAN	BAS	9,970	4,530	2,750	5.8	0.036	4.2	23.4	0.160
	MAN	HAN	11,000	2,750	nd	2.2	0.18	nd	15.5	0.236
	MAN	MEL	9,420	7,110	318	2.1	3.0	3.8	12.4	0.221
	SAN	BAS	10,400	5,820	2,490	0.42	0.0012	0.3	83.0	0.344
	SAN	HAN	10,200	7,270	1,880	0.24	0.46	0.6	151	0.450
	SAN	MEL	10,500	8,990	1,210	<<0.001	1.6	1.6	68.5	0.390
Non-African/Non-African										
	BAS	HAN	11,900	2,230	1,940	9.2	1.4	4.4	85.6	0.085
	BAS	MEL	11,600	2,120	283	0.26	12	3.0	62.5	0.226
	HAN	MEL	11,300	1,770	592	0.18	21	5.0	61.2	0.210
<i>Mean</i>			10,500	3,700			2.4	2.4	59.1	0.25

Abbreviations: BIA, Biaka; MAN, Mandenka; SAN, San; BAS, Basque; HAN, Han; MEL, Melanesians; nd: not determined.

ancestral effective size in African populations; for instance, less than ~10% of the ancestral population size of Mandenka and Papua New Guineans is retained in the latter population today. Similarly, among non-Africans, the Han Chinese retain less than ~10% of the diversity carried when their ancestral deme still included the ancestors of modern Papua New Guineans (upper bounds of the 95% confidence interval for S).

#### Migration rates

Stationary estimates of long-term unidirectional migration rates average to  $2.4 \times 10^{-4}$ /generation (range:  $8.7 \times 10^{-8} - 2.1 \times 10^{-3}$ /generation), thereby suggesting that gene flow between global populations is relatively frequent (Table 4 in Additional file 1). The highest bidirectional migration rate ( $2.1 \times 10^{-3}$ ; lowest rate:  $3.8 \times 10^{-5}$ ) implies a movement of ~1 X chromosome every 2 years. Bidirectional migration rates within and between continents vary significantly ( $F_{2,12} = 21.5$ ,  $P = 0.0001$ ,  $\eta = 0.78$ ), with continental assignment accounting for 61% of the variation in migration rates. Mean bidirectional migration rates within Africa ( $2.7 \times 10^{-4}$ ), and between Africans and Eurasians ( $2.1 \times 10^{-4}$ ), are relatively low compared to migration rates within Eurasia ( $1.5 \times 10^{-3}$ ). Furthermore, migration patterns between populations are largely symmetric. Han Chinese and Melanesians provide a key exception; migration from China to the Pacific ( $2.1 \times 10^{-3}$ /generation) has significantly exceeded migration in the opposite direction ( $1.8 \times 10^{-5}$ /generation) (see 95% confidence intervals in Table 4 in Additional file 1).

#### Population divergence times

Marginal posterior distributions for  $t$  indicate that divergence times between African populations all occur ~50 kya, with the largest upper confidence interval for any two African populations at ~140 kya (Table 5 in Additional file 1). Estimates of non-African split times are made difficult by diffuse posterior distributions with very high variance, and thus caution is advised in interpreting the higher mean non-African divergence time (~67 kya). Estimates of the lower bounds for non-African divergence times, with a mean of ~30 kya, are more consistent with previous estimates. The mean divergence time between African and non-African populations is ~58 kya (or ~2,100 generations), which is very similar to previous estimates of the out-of-Africa expansion inferred from other genetic data [21-23].

#### Validation of inferred demographic parameters

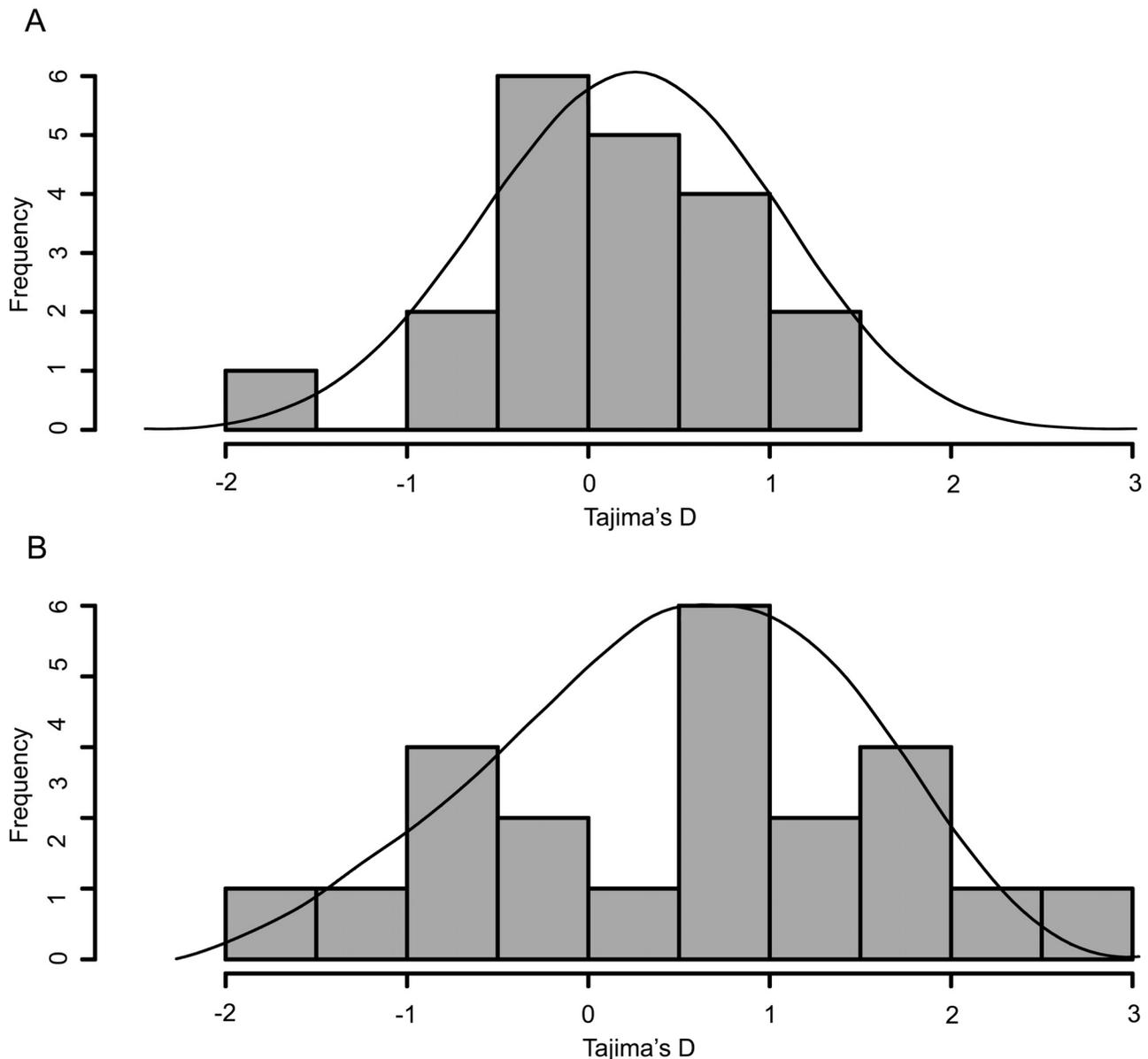
The inference system employed here has been validated elsewhere [15], and our own tests indicate that known demographic parameters (including  $m$ ) for data simulated under an IM model are recovered within 95% confidence intervals (unpublished data). However, to further assess the suitability of the IM model to explain observed

patterns of variation, we used coalescent simulation to model each population pair ( $N = 15$ ) using the parameter values of  $N_A$ ,  $N_1$ ,  $N_2$ ,  $m_1$ ,  $m_2$  and  $t$  inferred above. Due to poor estimates of the split proportion, we assumed  $S = 0.5$ . To check whether these coalescent simulations return data similar to the empirical loci, we compared observed summary statistics for all twenty X chromosome loci with summary distributions from these parameterized simulation models. We focused on four summaries of the data: i)  $F_{ST}$ , which describes the genetic distance between populations; ii and iii)  $\theta_W$  and  $\theta_\pi$  which are unbiased estimators of the population mutation rate  $\theta (= 3N_e\mu)$ ; and iv) Tajima's D, which summarizes the site frequency spectrum.

Observed  $F_{ST}$  values are correlated with  $F_{ST}$  values simulated under these 15 simulation models (Mantel test,  $r = 0.49$ ,  $P = 0.039$ ). Although this only explains 24% of the variance, we obtain mean  $F_{ST}$  values that are just slightly lower than those actually observed (i.e., mean  $F_{ST}$  of 0.21 versus 0.25, not significantly different). The simulation models also provide good fits to observed data for the remaining summaries, all of which reflect aspects of the population site frequency spectrum. A Bonferroni correction holding the experiment-wise type-I error rate constant at  $\alpha = 0.05$  was applied to accommodate multiple tests for each population and each summary. We observe 2% of loci as outliers under the corrected 95% confidence intervals for the 360 tests performed on our parameterized simulation models (i.e., 6 populations, 20 loci, and 3 summary statistics) (Table 6 in Additional file 1). This degree of consistency between observed and simulated data is similar for both African and non-African populations (e.g., Figure 2). This similarity suggests that our estimates of demographic parameters are not strongly biased by the inference method, and that the IM model is capable of portraying the evolutionary processes underlying human population structure, at least at the geographic scale examined here [24].

#### Discussion

It is generally appreciated that migration affects many important ecological and evolutionary properties of populations [25]. Yet there is little consensus in the literature on the role of gene flow in shaping patterns of human population structure. Equilibrium models, like the island model [9], were favored historically because analytical expectations are relatively simple to obtain. On the other hand, while it is accepted that migration occurs frequently among human populations [26-31], gene flow is often ignored in models of human demography. Recent examples ignoring gene flow include studies of African replacement models [32] and serial-founder models for the settlement of Eurasia [5]. Other studies of human demographic history analyze data separately for each popula-



**Figure 2**

**Observed values (bars) of Tajima's D for 20 X chromosome loci in (A) Biaka pygmies and (B) Melanesians compared to simulated distributions for each population (curves).** Tajima's D values for the majority of empirical loci are consistent with simulated distributions that are obtained from an isolation-with-migration model parameterized with the inferred demography of these two populations.

tion sample and simply neglect any effects of shared common ancestry or gene flow [7].

As pointed out by Whitlock and McCauley [25], both direct and indirect measures of migration and gene flow are fraught with difficulty. The use of summary statistics such as  $F_{ST}$  is limiting because it provides no insight into which historical processes are responsible for the

observed genetic differences between populations. It is therefore left up to individual investigators to choose which model of population structure is used to interpret data, and inferences depend heavily upon the assumptions inherent in each model. We set out to directly estimate rates of gene flow between human populations through the use of the isolation-with-migration (IM) model, which incorporates both population splitting and

gene flow. For this purpose, we have analyzed a large DNA sequence database collected with the expressed purpose of constructing models of human demographic history, and hence, is focused on intergenic (i.e., putatively neutral) regions on the X chromosome [16]. Values of  $F_{ST}$  for this dataset were found to be slightly higher than those estimated from other large X chromosome resequence datasets [11,12]. This difference is probably driven, at least in part, by the inclusion of more isolated groups than were included in other DNA sequence surveys of X-linked loci (i.e., the San from Namibia, Biaka from Central African Republic, and Melanesians from Papua New Guinea) [16].

To disentangle the evolutionary processes underlying  $F_{ST}$  in real human populations, we inferred  $N$ ,  $m$  and  $t$  separately for the six populations in our survey using the IM model. While the mean global value for ancestral population size,  $\sim 10^4$ , is consistent with previous estimates of the global population size of modern humans [33-37], no individual population approaches the effective size of modern humans as a whole. Although sizes of individual populations estimated from nuclear loci remain sparse, other studies have produced similar results [2,38-40], including previous applications of the IM model to human genomic sequences [41]. Non-African population sizes ( $N_0 \approx 3000$ ) estimated from linkage disequilibrium (LD) [42] are particularly noteworthy because recombination information is independent of the site frequency spectrum, which we used to infer effective sizes here. That similar results are obtained using unrelated subsets of the genetic information, and different populations, reinforces our confidence in these low estimates of effective population size.

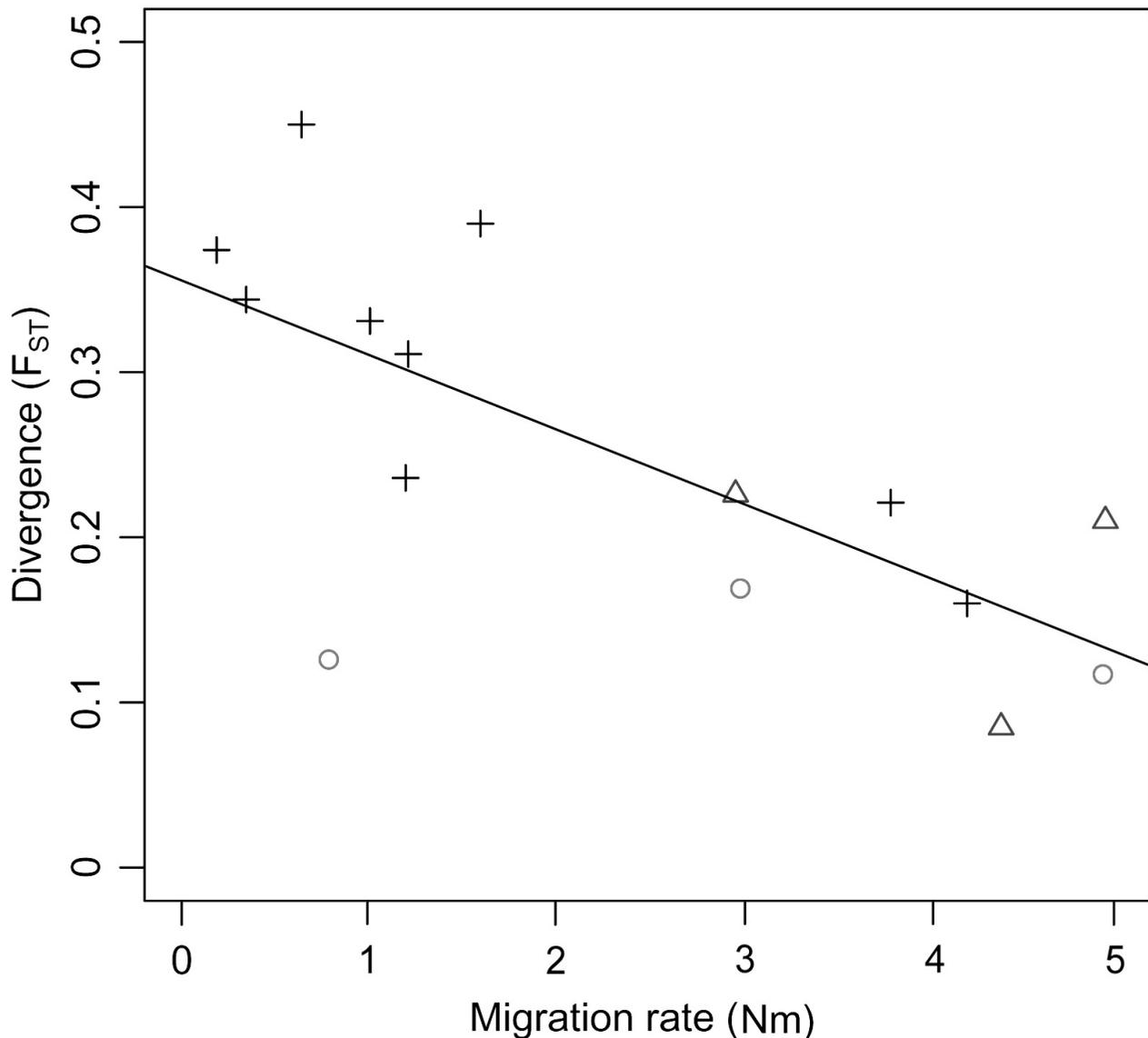
This finding is important because many studies make the simplifying assumption that individual human populations have an effective population size of  $10^4$  [e.g., [43]]. We note that estimates of  $N$  based on the standard neutral model (i.e.,  $\theta = 3N\mu$ ) are 2-4 times higher than those returned by IM for individual African and Eurasian samples, and are even higher for our Melanesian sample (see Table 1 in Wall et al. [16]). We suspect that this difference is largely due to violations of assumptions of the Wright-Fisher model rather than a systematic bias in parameters returned by IM (see Results). For example, population substructure and gene flow are expected to upwardly bias estimates of within population diversity (e.g.,  $\theta$ ) when applying models that do not incorporate these variables.

Indeed, we demonstrate here that rates of gene flow between subdivided human populations are non-zero. For unidirectional migration rates ( $m_1, m_2$ ),  $\sim 87\%$  of pairwise comparisons (i.e., 42 of 48) showed gene flow in at least one direction (i.e., their 95% confidence intervals

exclude zero migration; Table 4 in Additional file 1). When bidirectional migration rates ( $m = m_1 + m_2$ ) are considered, lower bounds of 95% confidence intervals are greater than zero for all 15 pairwise comparisons. Furthermore, mean bidirectional migration rates within Africa ( $2.7 \times 10^{-4}$ /generation), and between Africans and Eurasians ( $2.1 \times 10^{-4}$ ), are significantly lower than migration rates within Eurasia ( $1.5 \times 10^{-3}$ ).

Correspondingly, estimates of the population migration rate range from 0.2-4.9 (mean  $Nm = 2.4$ ). This implies that 2-3 X chromosome copies, on average, move between human populations every generation, although this stationary estimate does not explain how migration events are distributed through time. We infer slightly higher population migration rates within Africa and within Eurasia than between continents (Figure 3). Interestingly, because effective sizes and migration rates are inversely related in African and non-African populations, values of  $Nm$  are similar within Africa and Eurasia (Figure 4). Furthermore, migration rates are not associated with geographic proximity in any simple fashion. For instance, Basque and Han are located far apart geographically, but exhibit one of the highest rates of gene flow. This presumably reflects factors affecting historical mobility that are more complex than simple isolation-by-distance.

Clearly, our results cannot be interpreted under either the pure splitting or island models, which assume no gene flow and no shared ancestry, respectively. In any case, under an island model, a population migration rate  $Nm$  greater than  $\sim 0.25$  would be too high to explain the value of  $F_{ST}$  observed here (cf. Figure 2A in Additional file 1). Indeed, no further differentiation of local island populations is expected when  $Nm > 1$  [44,45]. Note, however, that the axiom whereby exchanging one gene copy per generation inhibits population divergence does not hold for the IM model; populations can continue to diverge, albeit slowly, even when  $Nm = 3.3$  (Figure 2C in Additional file 1). Importantly too,  $F_{ST}$  depends on interactions between a suite of demographic parameters, including  $N$ ,  $m$  and  $t$  (Figure 3 in Additional file 1). These results highlight the limited power of  $F_{ST}$  to yield insights into human demographic processes without further knowledge of population divergence times, effective sizes and migration rates (i.e., the very parameters that we often attempt to infer from  $F_{ST}$ ). Although  $F_{ST}$  is often considered directly proportional to divergence time, where migration is assumed to be absent and all population sizes identical [46:29-30], these assumptions do not hold for the human populations examined here. Thus, caution is warranted when interpreting  $F_{ST}$  as a simple proxy for population history [e.g., [5,46]].

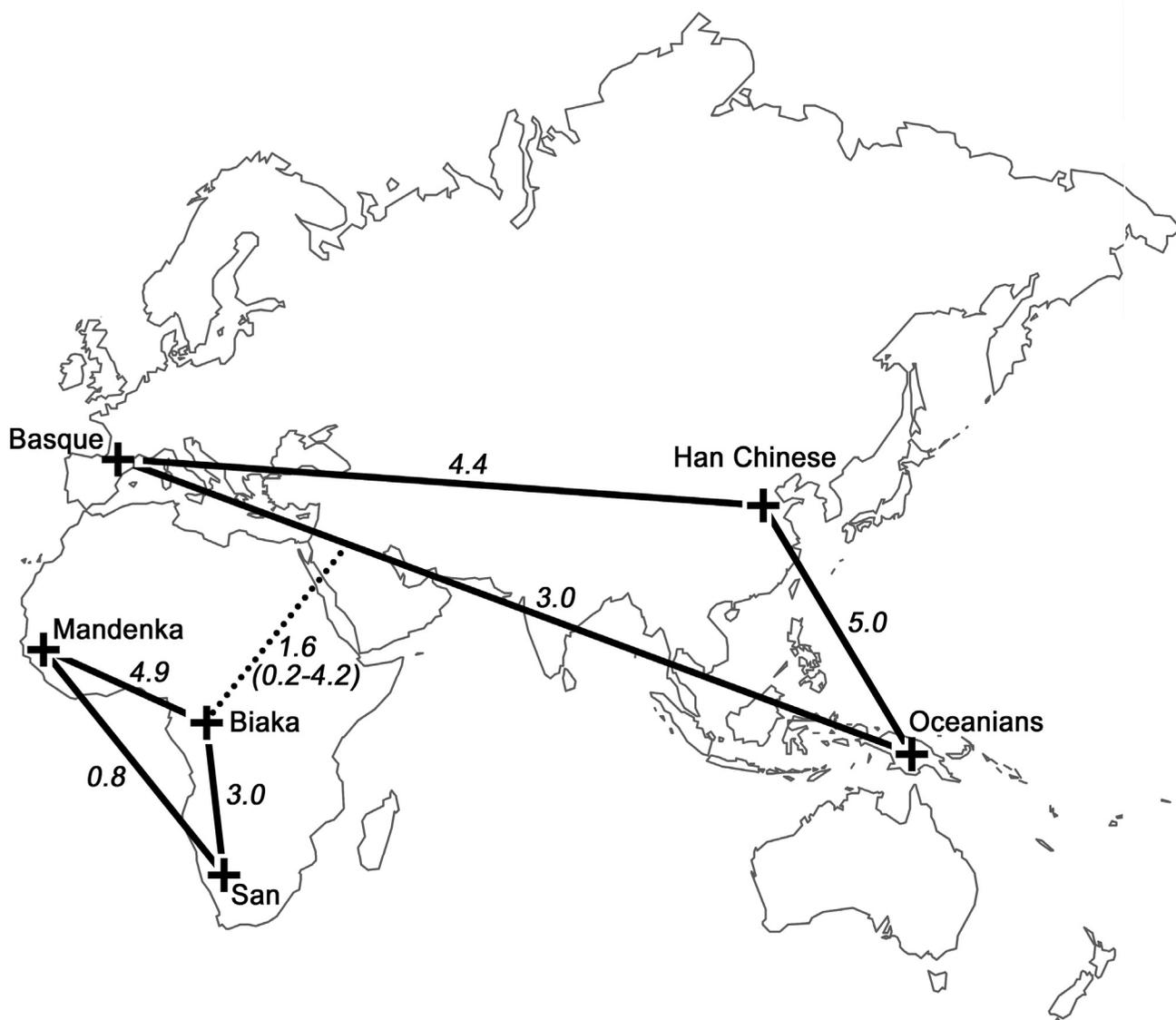


**Figure 3**

**Correlation between population divergence ( $F_{ST}$ ) and inter-deme migration ( $Nm$ ).** African population pairs are indicated by circles, non-African population pairs by triangles, and African/non-African population pairs by crosses.

In sum, we have independently inferred effective population sizes, times of divergence and rates of migration under an IM model of population structure based on the analysis of a large X chromosome DNA sequence database. The parameters that we have estimated for six globally distributed populations indicate relatively high levels of migration (e.g., mean  $Nm = 2.4$ ) (Figure 4). A simple interpretation of our results is that human populations have exchanged migrants at a constant high rate during the entire history since their divergence from a common ancestral population. A more realistic interpre-

tation is that they have experienced changing migration rates through time. Unfortunately, we cannot currently discriminate between these two scenarios; IM can only infer a stationary rate of gene flow (i.e., a time averaged rate). Our initial explorations permitting migration rates to change through time suggest that this process can have significant effects on the value of  $F_{ST}$  (e.g., see Figure 4 in Additional file 1). There is also independent evidence that rates of gene flow may be increasing towards the present. For example, the very large and asymmetric gene flow that we observe between Chinese Han and Melanesians may



**Figure 4**  
**Geographic representation of population migration rates Nm.** Mean and range of Nm are provided for African/non-African population pairs.

well result from the late Holocene (3–4 kya) expansion of agricultural populations recorded not only by haploid genetic loci [47,48], but also archaeologically and linguistically [49]. This is similar to Wakeley's [50] inference based on a maximum likelihood analysis of restriction fragment length polymorphisms (RFLPs) from across the genome that human populations have transitioned from a period of higher to lower population structure through an increased rate of migration towards the present. We also acknowledge that long-term mean rates of migration may be affected by both recurrent gene flow restricted by geographical distance [51] and long range dispersals by

groups of migrants (i.e., range expansions), which can occur sporadically and still have large effects on global values of  $F_{ST}$  [29,52,53]. Interestingly, population genetic models with spatial and temporal fluctuation in the population migration rate (averaging around  $Nm \sim 1$  in an island model) have been shown to be conducive both to the rapid spread of beneficial mutations throughout the species and local population differentiation [54]. We note that theoretical predictions based upon other models of subdivision (such as metapopulation models) [8,52] would be worth developing to further explore the nature and extent of human population structure.

Finally, the finding of high rates of gene flow among human populations has important implications for how we interpret the distribution of SNPs associated with disease [55] and the role of natural selection in shaping patterns of diversity [31,52,53]. For instance, recent migration produces haplotypes with extended linkage disequilibrium that could be misinterpreted as recent selection [56]. Gene flow can also significantly skew the site frequency spectrum within populations [8], and may therefore lead to erroneous inferences regarding demography.

## Conclusion

While the maximum effective size of modern humans is estimated at  $\sim 10,000$ , individual populations vary substantially in size. African populations tend to be larger (2,300–9,000) than non-African populations (300–3,300). We independently estimate mean rates of bidirectional gene flow at  $4.8 \times 10^{-4}$ /generation, and these rates are higher among non-African populations ( $1.5 \times 10^{-3}$ ) than among African populations ( $2.7 \times 10^{-4}$ ). Interestingly, because effective sizes and migration rates are inversely related in African and non-African populations, effective migration rates are similar globally (e.g., mean  $Nm = 2.4$ ). While significant theoretical challenges remain in disentangling the evolutionary factors that structure human populations, it is clear that migration can no longer be treated as a simple, equilibrium parameter – or ignored – as it often is in reconstructions of human history.

## Methods

### Genomic data

Our database comprises 20 loci from intergenic regions on the X chromosome. Each region chosen for sequencing spans  $\sim 20$  kb of primarily single-copy non-coding (i.e., putatively non-functional) DNA in regions of medium or high recombination, which are at least 50 kb away and recombinationally unlinked from the nearest gene [16]. No two regions are within one megabase of each other. Within each region, there are  $\sim 4$ –6 kb of sequence data from 3 discrete subsections that span most of the distance of each region. 10–24 X chromosomes are sampled from each population, which include 3 from Africa (10 San from Namibia, 16 Biaka pygmies from Central African Republic, 18 Mandenka from Senegal) and 3 from Eurasia/Oceania (16 French Basque, 16 Han Chinese, 24 Melanesians) (see Wall et al. [16] for a complete description of the sequencing strategy).

### $F_{ST}$ estimates

$F_{ST}$  can be calculated using several different algorithms. Here, we adopt the approach of Hudson et al. [57], defined in terms of polymorphic site heterozygosity,

which we have amended to accommodate unequal sample sizes [58] and missing data.

$$F_{ST} = 1 - \frac{H_w}{H_b} = 1 - \frac{\pi_w}{\pi_b} \quad (1)$$

where  $H_w$  ( $\equiv \pi_w$ ) is the mean distance per polymorphic site sampled from the same population, and  $H_b$  ( $\equiv \pi_b$ ) is the mean distance per polymorphic site sampled from both populations. Reported values represent the mean  $F_{ST}$  at all segregating sites across all 20 X chromosome loci.

The expected value of  $F_{ST}$  for X chromosome loci under the island model with an infinite number of demes depends only on the product of the effective population size  $N$ , and the migration rate per generation  $m$  [10: 294–5]

$$\langle F_{ST} \rangle \approx (1 + 3Nm)^{-1} \quad (2)$$

$F_{ST}$  estimates must be corrected if a finite number of demes  $d$  are intended instead [59]

$$\langle F_{ST} \rangle \approx \left( 1 + \frac{d^2}{(d-1)^2} (3Nm) \right)^{-1} \quad (3)$$

The population-scaled rate of gene flow  $Nm$  can be derived by simple rearrangement of equation 3.

Correspondingly, the expected value of  $F_{ST}$  for X chromosome loci under a divergence model depends only on the divergence time  $t$ , in generations, scaled by the effective population size  $N$  [13]

$$\langle F_{ST} \rangle = 1 - e^{-\frac{t}{3/2N}} \quad (4)$$

### Demographic inference

Genetic diversity at twenty X chromosome loci is applied to determine the most likely parameterization for a series of paired population isolation-with-migration models. Seven demographic parameters are inferred from the genomic data under each two-deme IM model: effective population size of the ancestral deme ( $N_A$ ), effective population sizes of the two descendent demes ( $N_1$  and  $N_2$ ), unidirectional migration rates between descendent populations ( $m_1$  and  $m_2$ ), proportion of the ancestral population founding the first deme ( $S$ ), and population divergence time ( $t$ ). Populations are analyzed in all pairwise combinations using the Markov chain Monte Carlo Bayesian/maximum likelihood framework implemented in the 31 July 2006 version of IM <http://lifesci.rutgers.edu/~heylab/heylabsoftware.htm#IM>. More complete descriptions of this method are available elsewhere

[14,15,41,60,61]. The IM software infers all coalescent parameters, except  $S$ , as mutation-scaled rates –  $\theta_1 = 3N_1\mu$ ,  $\theta_2 = 3N_2\mu$ ,  $\theta_A = 3N_A\mu$ ,  $m_1 = m_1/\mu$ ,  $m_2 = m_2/\mu$ , and  $t = t\mu$  – which, if mutation rates are known, can subsequently be transformed to real world values (i.e., actual population sizes, migration rates and chronological dates). Mutation rates per year are estimated for each locus from mean *Homo/Pan* sequence divergence assuming a split time of  $6 \times 10^6$  years. Per generation rates assume a mean generation interval of 28 years, as estimated from cross-cultural ethnographic data [62]. A 1:1 mating ratio is also assumed throughout. Migration rates  $m_1$  and  $m_2$  are inferred in the coalescent (i.e., backward in time), and bidirectional migration rates  $m$  are simply the summation of  $m_1$  and  $m_2$ .

Because the IM algorithm has most power with perfectly treelike data (an infinite sites implementation), datasets with no evidence of recombination were extracted from each locus using the four-gamete approach of Hudson and Kaplan [63]. Individuals and segregating sites are given equal weighting, and the largest non-recombining block maximizing overall information content is selected for each locus, a practice that minimizes any bias in the resulting dataset [64]. Analyses are run at a mean CPU speed of 2.5 GHz on an  $\sim 100$  core Condor grid at the University of Arizona Computer Science Department. All datasets are initially parameterized from a single run with bounded uniform priors:  $\theta_1, \theta_2, \theta_A \in U(0, 40)$ ,  $m_1, m_2 \in U(0, 20)$ ,  $S \in U(0, 1)$  and  $t \in U(0, 3)$ . Ranges are raised or lowered in subsequent runs to incorporate complete marginal posterior probability densities. Once these bounds are established, a minimum of four replicate jobs each of  $>5$  chains are run for a minimum of  $10^7$  steps. Chain mixing by Metropolis-Hasting coupling, long run times and multiple independent runs allow us to identify convergence on each parameter's underlying stationary distribution.

Because we observe little variation among multiple independent runs (e.g., Figure 1 in Additional file 1), marginal posterior probability densities for a given parameter are combined and analyzed as a single probability distribution. Maximum probability estimates and 95% confidence intervals are reported as modes and  $\{0.025, 0.975\}$  quantiles of posterior probability densities, respectively. We estimate all seven parameters of the model (Tables 1–5 in Additional file 1) for all population pairs. Uninformative posterior distributions are sometimes encountered for some population pairs; in particular, the ancestral population split time parameter  $t$  often proves difficult to infer (Table 5 in Additional file 1). However, the seven demographic parameters are inferred as marginal densities, and therefore uncertainty in one parameter has no impact on the remaining parameters. Parameter

values are treated as unknown unless we observe clear maximum likelihood peaks that are replicated across multiple independent IM jobs.

#### Coalescent simulations for demographic parameter validation

The nonlinear relationship between gene flow, divergence time and  $F_{ST}$  under the isolation-with-migration model is explored using coalescent simulation with the software ms [65]. An IM model conditioned on mean values for the seven demographic parameters, as inferred from the empirical dataset (Tables 1–5 in Additional file 1), is implemented for each population pair. A suite of summary statistics is explored under these models:  $\theta_W$  and  $\theta_\pi$ , which are unbiased estimators of the population mutation rate; Tajima's  $D$ , which summarizes the population site frequency spectrum; and  $F_{ST}$ , which summarizes the joint site frequency spectrum. Observed values of these four summary statistics, calculated from the empirical dataset, are compared to the summary statistic distributions returned by coalescent simulation. A Bonferroni correction holding the experiment-wise type-I error rate constant at  $\alpha = 0.05$  is applied to account for the use of multiple per-population tests. A Mantel test is used to determine the correlation for  $F_{ST}$ , a between-population (i.e., matrix) test.

#### Authors' contributions

MPC participated in the design of the study, contributed to data collection, ran analyses, and wrote the manuscript. AEW contributed to data collection. JDW advised on data analysis, and provided comments on the manuscript. MFH participated in the design of the study, advised on data analysis, and helped revise the manuscript. All authors read and approved the final manuscript.

#### Additional material

##### Additional file 1

Supplemental Materials for "Intergenic DNA sequences from the human X chromosome reveal high rates of global gene flow". This document contains tables and figures showing additional results referenced in the main text.

Click here for file

[<http://www.biomedcentral.com/content/supplementary/1471-2156-9-76-S1.pdf>]

#### Acknowledgements

We are grateful to J Hey (Rutgers University) and F Mendez (University of Arizona) for helpful discussion; and S Kobourov for access to the dispersed-computing cluster in the Department of Computer Science (University of Arizona). The National Science Foundation helped fund genetic data collection and analysis via the grant BCS-0423670 to M.F.H. and J.D.W., as well as providing computational support via the San Diego Supercomputing Center under TeraGrid grant DBS060002T to M.P.C.

## References

- Garrigan D, Hammer MF: **Reconstructing human origins in the genomic era.** *Nat Rev Genet* 2006, **7**:669-680.
- Frisse L, Hudson RR, Bartoszewicz A, Wall JD, Donfack J, Di Rienzo A: **Gene conversion and different population histories may explain the contrast between polymorphism and linkage disequilibrium levels.** *Am J Hum Genet* 2001, **69**:831-843.
- Keinan A, Mullikin JC, Patterson N, Reich D: **Measurement of the human allele frequency spectrum demonstrates greater genetic drift in East Asians than in Europeans.** *Nat Genet* 2007, **39**:1251-1255.
- Prugnolle F, Manica A, Balloux F: **Geography predicts neutral genetic diversity of human populations.** *Curr Biol* 2005, **15**:R159-160.
- Ramachandran S, Deshpande O, Roseman CC, Rosenberg NA, Feldman MW, Cavalli-Sforza LL: **Support from the relationship of genetic and geographic distance in human populations for a serial founder effect originating in Africa.** *Proc Natl Acad Sci USA* 2005, **102**:15942-15947.
- Ray N, Currat M, Excoffier L: **Intra-deme molecular diversity in spatially expanding populations.** *Mol Biol Evol* 2003, **20**:76-86.
- Voight BF, Adams AM, Frisse LA, Qian Y, Hudson RR, Di Rienzo A: **Interrogating multiple aspects of variation in a full resequencing data set to infer human population size changes.** *Proc Natl Acad Sci USA* 2005, **102**:18508-18513.
- Wakeley J, Aliacar N: **Gene genealogies in a metapopulation.** *Genetics* 2001, **159**:893-905.
- Wright S: **Breeding structure of populations in relation to speciation.** *Amer Nat* 1940, **74**:232-248.
- Wright S: **Evolution and the Genetics of Populations.** In *The Theory of Gene Frequencies Volume 2*. Chicago: University of Chicago Press; 1969.
- Akey JM, Zhang G, Zhang K, Jin L, Shriver MD: **Interrogating a high-density SNP map for signatures of natural selection.** *Genome Res* 2002, **12**:1805-1814.
- International HapMap Consortium: **A haplotype map of the human genome.** *Nature* 2005, **437**:1299-1320.
- Nei M: **Molecular Evolutionary Genetics.** New York: Columbia University Press; 1987.
- Nielsen R, Wakeley J: **Distinguishing migration from isolation: A Markov chain Monte Carlo approach.** *Genetics* 2001, **158**:885-896.
- Hey J, Nielsen R: **Multilocus methods for estimating population sizes, migration rates and divergence time, with applications to the divergence of *Drosophila pseudoobscura* and *D. persimilis*.** *Genetics* 2004, **167**:747-760.
- Wall JD, Cox MP, Mendez FL, Woerner A, Severson T, Hammer MF: **A novel DNA sequence database for analyzing human demographic history.** *Genome Res* 2008, **18**:1354-1361.
- Jakobsson M, Scholz SW, Scheet P, Gibbs JR, VanLiere JM, Fung H-C, Szpiech ZA, Degnan JH, Wang K, Guerreiro R, et al.: **Genotype, haplotype and copy-number variation in worldwide human populations.** *Nature* 2008, **451**:998-1003.
- Li JZ, Absher DM, Tang H, Southwick AM, Casto AM, Ramachandran S, Cann HM, Barsh GS, Feldman MW, Cavalli-Sforza LL, et al.: **Worldwide human relationships inferred from genome-wide patterns of variation.** *Science* 2008, **319**:1100-1104.
- Clark AG, Hubisz MJ, Bustamante CD, Williamson SH, Nielsen R: **Ascertainment bias in studies of human genome-wide polymorphism.** *Genome Res* 2005, **15**:1496-1502.
- Weir BS, Cardon LR, Anderson AD, Nielsen R, Hill WG: **Measures of human population structure show heterogeneity among genomic regions.** *Genome Res* 2005, **15**:1468-1476.
- Liu H, Prugnolle F, Manica A, Balloux F: **A geographically explicit genetic model of worldwide human-settlement history.** *Am J Hum Genet* 2006, **79**:230-237.
- Ingman M, Kaessmann H, Pääbo S, Gyllensten U: **Mitochondrial genome variation and the origin of modern humans.** *Nature* 2000, **408**:708-713.
- Karafet TM, Mendez FL, Meilerman MB, Underhill PA, Zegura SL, Hammer MF: **New binary polymorphisms reshape and increase resolution of the human Y chromosomal haplogroup tree.** *Genome Res* 2008, **18**:830-838.
- Wilkins JF, Marlowe FW: **Sex-biased migration in humans: what should we expect from genetic data?** *Bioessays* 2006, **28**:290-300.
- Whitlock MC, McCauley DE: **Indirect measures of gene flow and migration:  $F_{ST} \neq 1/(4Nm + 1)$ .** *Heredity* 1999, **82**:117-125.
- Eller E: **Population substructure and isolation by distance in three continental regions.** *Am J Phys Anthropol* 1999, **108**:147-159.
- Fix AG: **Migration and Colonization in Human Microevolution.** Cambridge: Cambridge University Press; 1999.
- Jorde LB: **Human genetic distance studies: Present status and future prospects.** *Ann Rev Anthropol* 1985, **14**:343-373.
- Relethford JH: **Genetics and modern human origins.** *Evol Anthropol* 1995, **4**:53-63.
- Santos EJM, Epplen JT, Epplen C: **Extensive gene flow in human populations as revealed by protein and microsatellite DNA markers.** *Hum Hered* 1997, **47**:165-172.
- Wijsman EM, Cavalli-Sforza LL: **Migration and genetic population structure with special reference to humans.** *Ann Rev Ecol Syst* 1984, **15**:279-301.
- Fagundes NJR, Ray N, Beaumont M, Neuenschwander S, Salzano FM, Bonatto SL, Excoffier L: **Statistical evaluation of alternative models of human evolution.** *Proc Natl Acad Sci USA* 2007, **104**:17614-17619.
- Erlich HA, Bergstrom TF, Stoneking M, Gyllensten U: **HLA sequence polymorphism and the origin of humans.** *Science* 1996, **274**:1552-1554.
- Haigh J, Maynard Smith J: **Population size and protein variation in man.** *Genet Res* 1972, **19**(1):73-89.
- Lahr MM, Foley RA: **Towards a theory of modern human origins: Geography, demography and diversity in recent human evolution.** *Am J Phys Anthropol* 1998:137-176.
- Sherry ST, Harpending HC, Batzer MA, Stoneking M: **Alu evolution in human populations: Using the coalescent to estimate effective population size.** *Genetics* 1997, **147**:1977-1982.
- Takahata N: **Allelic genealogy and human evolution.** *Mol Biol Evol* 1993, **10**:2-22.
- Garrigan D, Kingan SB, Metni Pilkington M, Wilder JA, Cox MP, Soodyall H, Strassmann B, Destro-Bisol G, de Knijff P, Novelletto A, et al.: **Inferring human population sizes, divergence times and rates of gene flow from mitochondrial, X and Y chromosome resequencing data.** *Genetics* 2007, **177**:2195-2207.
- Bataillon T, Mailund T, Thorlacius S, Steingrimsdottir E, Rafnar T, Halldorsdottir MM, Calian V, Schierup MH: **The effective size of the Icelandic population and the prospects for LD mapping: Inference from unphased microsatellite markers.** *Eur J Hum Genet* 2006, **14**:1044-1053.
- Harris EE, Hey J: **X chromosome evidence for ancient human histories.** *Proc Natl Acad Sci USA* 1999, **96**:3320-3324.
- Hey J: **On the number of New World founders: A population genetic portrait of the peopling of the Americas.** *PLoS Biol* 2005, **3**:e193.
- Tenesa A, Navarro P, Hayes BJ, Duffy DL, Clarke GM, Goddard ME, Visscher PM: **Recent human effective population size estimated from linkage disequilibrium.** *Genome Res* 2007, **17**:520-526.
- Harpending H, Rogers A: **Genetic perspectives on human origins and differentiation.** *Annu Rev Genomics Hum Genet* 2000, **1**:361-385.
- Crow J, Kimura M: **An Introduction to Population Genetics Theory.** Minneapolis, MN: Burgess Publishing Company; 1970.
- Spieth PT: **Gene flow and genetic differentiation.** *Genetics* 1974, **78**:961-965.
- Cavalli-Sforza LL, Menozzi P, Piazza A: **The History and Geography of Human Genes.** Princeton: Princeton University Press; 1994.
- Cox MP: **Indonesian mitochondrial DNA and its opposition to a Pleistocene era origin of proto-Polynesians in Island Southeast Asia.** *Hum Biol* 2005, **77**:179-188.
- Cox MP, Lahr MM: **Y-Chromosome diversity is inversely associated with language affiliation in paired Austronesian- and Papuan-speaking communities from Solomon Islands.** *Am J Hum Biol* 2006, **18**:35-50.
- Bellwood P: **The First Farmers: The Origins of Agricultural Societies.** Oxford: Blackwell Publishing; 2005.
- Wakeley J: **Nonequilibrium migration in human history.** *Genetics* 1999, **153**:1863-1871.
- Wright S: **Isolation by distance.** *Genetics* 1943, **28**:114-138.
- Slatkin M: **Gene flow in natural populations.** *Ann Rev Ecol Syst* 1985, **16**:393-430.

53. Templeton AR: **Human races: A genetic and evolutionary perspective.** *Am Anthropologist* 1999, **100**:632-650.
54. Barton NH, Rouhani S: **Adaptation and the 'shifting balance'.** *Genet Res Camb* 1993, **61**:57-74.
55. Reich DE, Cargill M, Bolk S, Ireland J, Sabeti PC, Richter DJ, Lavery T, Kouyoumjian R, Farhadian SF, Ward R, et al.: **Linkage disequilibrium in the human genome.** *Nature* 2001, **411**:199-204.
56. Hawks J, Wang ET, Cochran GM, Harpending HC, Moyzis RK: **Recent acceleration of human adaptive evolution.** *Proc Natl Acad Sci USA* 2008, **104**:20753-20758.
57. Hudson RR, Slatkin M, Maddison WP: **Estimation of levels of gene flow from DNA sequence data.** *Genetics* 1992, **132**:583-589.
58. Plagnol V, Wall JD: **Possible ancestral structure in human populations.** *PLoS Genet* 2006, **2**:e105.
59. Slatkin M, Voelm L: **F<sub>ST</sub> in a hierarchical island model.** *Genetics* 1991, **127**:627-629.
60. Hey J, Won YJ, Sivasundar A, Nielsen R, Markert JA: **Using nuclear haplotypes with microsatellites to study gene flow between recently separated Cichlid species.** *Mol Ecol* 2004, **13**:909-919.
61. Won YJ, Hey J: **Divergence population genetics of chimpanzees.** *Mol Biol Evol* 2005, **22**:297-307.
62. Fenner JN: **Cross-cultural estimation of the human generation interval for use in genetics-based population divergence studies.** *Am J Phys Anthropol* 2005, **128**:415-423.
63. Hudson RR, Kaplan NL: **Statistical properties of the number of recombination events in the history of a sample of DNA sequences.** *Genetics* 1985, **111**:147-164.
64. Woerner AE, Cox MP, Hammer MF: **Recombination-filtered genomic datasets by information maximization.** *Bioinformatics* 2007, **23**:1851-1853.
65. Hudson RR: **Generating samples under a Wright-Fisher neutral model of genetic variation.** *Bioinformatics* 2002, **18**:337-338.

Publish with **BioMed Central** and every scientist can read your work free of charge

"BioMed Central will be the most significant development for disseminating the results of biomedical research in our lifetime."

Sir Paul Nurse, Cancer Research UK

Your research papers will be:

- available free of charge to the entire biomedical community
- peer reviewed and published immediately upon acceptance
- cited in PubMed and archived on PubMed Central
- yours — you keep the copyright

Submit your manuscript here:  
[http://www.biomedcentral.com/info/publishing\\_adv.asp](http://www.biomedcentral.com/info/publishing_adv.asp)

