

Failure to Replicate a Genetic Signal for Sex Bias in the Steppe Migration into Central Europe

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Goldberg et al.(1) used genome-wide ancient DNA data (2) from central European Bronze Age (BA) populations, and their three ancestral sources of steppe pastoralists (SP), Anatolian farmers (AF), and European hunter-gatherers (HG), to investigate whether the SP migration into central Europe after 5,000 years ago (3, 4) was sex biased. By estimating a lower proportion of SP ancestry on the X-chromosome (36.6%) which is primarily carried in females than on the autosomes (61.8%), they suggested that the migration involved a ratio of 5-14 SP males for every female.

We attempted to replicate this finding using *qpAdm* (3), which leverages allele frequency correlations between the admixed (BA) and source (SP, AF, HG) populations with distant outgroups to eliminate potential biases due to genetic drift between the true source populations and the ones used as surrogates for them. Our outgroups are: Mota (5), Ust_Ishim (6), Kostenki14 (7), GoyetQ116-1 (7), Vestonice16 (7), MA1(8), AfontovaGora3 (7), and Levantine Neolithic farmers (9). We ran *qpAdm* with allsnps: YES and Mota as the basis population. The model fits the data ($P=0.072$ autosomes, $P=0.747$ chromosome X). For the BA population, we estimate $61.4\pm2.9\%$ SP, $31.0\pm1.2\%$ AF, $7.6\pm2.9\%$ HG ancestry using all autosomal SNPs and $67.5\pm17\%$ SP, $26.5\pm6.9\%$ AF, $6.0\pm16.4\%$ HG using all X-chromosome SNPs; thus we do not find less SP ancestry on the X-chromosome.

To diagnose why we do not replicate the finding of (1), we simulated pseudo-BA individuals with known admixture proportions and then used supervised ADMIXTURE (10) – the method used in (1) – on the same 4,605 X-chromosome SNPs. We started our simulations using all possible combinations of (20 AF) x (9 HG) x (8 SP) individuals. For each of these 1,440 triples we simulated 16 individuals, randomly sampling alleles from the source individuals according to the *qpAdm*-estimated proportions of the 16 real BA individuals, and removing simulated individuals with fewer than 1,000 SNPs as in (1) (results were little changed with no filtering or a 2,000 SNP threshold). We estimated ancestry for each individual by performing 10 random-seeded supervised ADMIXTURE replicates and averaging the results (we used the remaining 19 AF, 8 HG, 7 SP individuals as source populations) (Figure 1a). Supervised ADMIXTURE predicts real ancestry poorly in this setting

(Figure 1b). The estimation error (estimated – real ancestry) is strongly correlated ($r=0.91$) with the estimated SP ancestry, allowing us to predict it by a regression (Figure 1c), which indicates upward bias for high SP ancestry estimates and downward bias for low ones. For the pool of 16 individuals that the authors of (1) estimated had 36.6% ancestry, the error is predicted to be -19.5%, largely eliminating the discrepancy between the X-chromosome estimate of (1) and the autosomal ancestry estimates of ADMIXTURE (1) and *qpAdm*. These results show that bias in the estimation of admixture proportions, rather than sex bias in the steppe migration, drives the findings of (1).

Acknowledgements

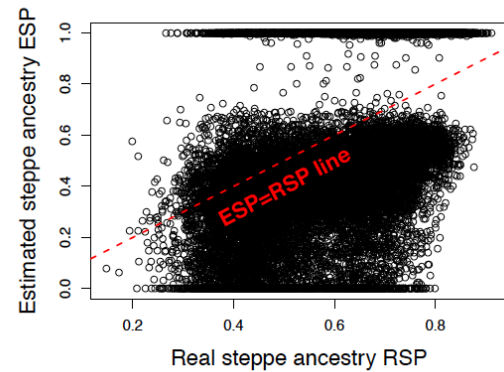
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Figure 1: (a) *qpAdm* estimates of autosomal ancestry of 16 BA individuals. (b) Real X-chromosome steppe ancestry (RSP) is not well-predicted by supervised ADMIXTURE-estimated X-chromosome steppe ancestry (ESP) (c) Error (ESP-RSP) is correlated with ESP, allowing us to infer a 19.5% downward bias at the 36.6% ESP ancestry level.

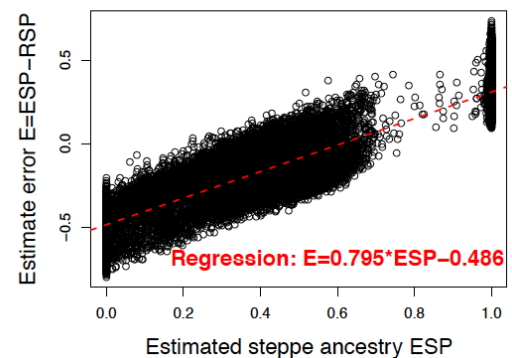
a

Individual	SP	AF	HG
I0059	39±8%	35±3%	26±8%
I1532	71±8%	25±4%	4±8%
I0049	78±9%	19±4%	3±9%
I0099	41±7%	40±3%	19±7%
I0115	48±9%	34±4%	17±9%
I0117	50±8%	35±3%	15±7%
I0803	65±11%	31±5%	4±10%
I0047	59±8%	34±3%	8±8%
I0164	54±8%	33±3%	12±8%
RISE00	75±8%	26±4%	0±8%
RISE150	71±8%	28±3%	1±8%
RISE577	71±8%	38±3%	-9±8%
I0103	84±8%	19±3%	-3±7%
I0104	72±8%	22±3%	6±8%
I0116	71±9%	33±4%	-3±8%
I0118	42±8%	38±3%	20±7%
Mean	62%	31%	7%

b



c



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