

## ORIGINAL ARTICLE

# Genome-wide signatures of male-mediated migration shaping the Indian gene pool

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Multiple questions relating to contributions of cultural and demographical factors in the process of human geographical dispersal remain largely unanswered. India, a land of early human settlement and the resulting diversity is a good place to look for some of the answers. In this study, we explored the genetic structure of India using a diverse panel of 78 males genotyped using the GenoChip. Their genome-wide single-nucleotide polymorphism (SNP) diversity was examined in the context of various covariates that influence Indian gene pool. Admixture analysis of genome-wide SNP data showed high proportion of the Southwest Asian component in all of the Indian samples. Hierarchical clustering based on admixture proportions revealed seven distinct clusters correlating to geographical and linguistic affiliations. Convex hull overlay of Y-chromosomal haplogroups on the genome-wide SNP principal component analysis brought out distinct non-overlapping polygons of F\*-M89, H\*-M69, L1-M27, O2a-M95 and O3a3c1-M117, suggesting a male-mediated migration and expansion of the Indian gene pool. Lack of similar correlation with mitochondrial DNA clades indicated a shared genetic ancestry of females. We suggest that ancient male-mediated migratory events and settlement in various regional niches led to the present day scenario and peopling of India.

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## INTRODUCTION

India has been a hub of early human expansion since the first wave of out of Africa migration through the southern route.<sup>1–3</sup> High phenotypic diversity and varied cultures of people of India along with recent genomic studies led to different views on how the peopling of India occurred. The population of India has been declared a Pleistocene gene pool,<sup>4–7</sup> living in a diverse landscape and practicing varying degrees of inbreeding and endogamy. In addition, various geographical niches and languages make their genetic history more complex. Our study on the people of Tamil Nadu, the southernmost state of India, highlighted the importance of considering the population structure along with cultural and subsistence elements in unraveling the peopling of India.<sup>8</sup>

Studies of genetic history of Indian population based on uniparental markers have produced some conflicting results. For example, non-recombinant Y-chromosomal (NRY) markers analysis suggested the presence of many autochthonous and non-autochthonous lineages in the subcontinent. NRY lineages such as F\*-M89, H-M69 and L-M20 may have had an autochthonous origin, whereas others such as J-M304, O2a-M95 and O3a3-M117 have an external origin, and the origin of certain other haplogroups such as R1a1-M17 are

disputed.<sup>6,9,10</sup> An external origin of NRY haplogroup R1a1-M17, the speculated marker of Indo-Aryan, was proposed based on the sharing of this haplogroup between Indo-European speakers of India and Eastern Europeans.<sup>2,11</sup> In contrast, a study by Sharma *et al.*,<sup>10</sup> supported the Indian origin of the NRY haplogroup R1a1-M17, and, therefore, of the Indo-European speakers.<sup>10,12</sup> Interestingly, the Dravidian speakers are characterized by NRY haplogroups F\*-M89 and L1-M27,<sup>6,8</sup> suggesting an *in situ* evolution, in contrast to the Proto Elamite theory of origin in the Fertile Crescent.<sup>13</sup> The origin of NRY haplogroup O2a-M95, mostly represented in Austro-Asiatic speakers of Eastern India, is also controversial, and both indigenous and Southeast Asian origins have been proposed.<sup>14,15</sup> However, mitochondrial DNA (mtDNA) markers suggest a shared maternal gene pool of India,<sup>16,17</sup> with 60% of Indian mtDNA being composed of mtDNA haplogroup M and its derivatives,<sup>18</sup> with a majority of the rest belonging to mtDNA haplogroup R and its derivatives.<sup>19,20</sup> Thus, studies of uni-parental markers point to a uniformity of a deep-rooted female gene pool of India. Interestingly, the male gene pool of India has had multiple origins (both inside and outside the subcontinent) and exhibit a strong correlation with the language family.

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Recently, many genome-wide studies using microarray chips containing ancestry informative markers revolutionized human population genetics. A seminal study based on 132 Indian samples, encompassing 560 123 single-nucleotide polymorphisms (SNPs) suggested the existence of ancient North Indian and ancient South Indian gene pools, therefore making the present day Indo-European and Dravidian speakers of India a result of recent admixture between the two ancient gene pools.<sup>21,22</sup> Further, high similarity between North and South Indian populations have been found in whole-exome sequencing as well.<sup>23</sup> These studies reiterate that the genetic variation of different linguistic groups may be a result of different migratory events.

The Genographic Consortium has developed the Geno 2.0 chip, a dedicated genotyping array containing only ancestry informative markers.<sup>24</sup> This tool is useful for detection of accurate admixture proportions for world-wide populations. The ancestral information predicted by this tool has been validated using Genographic and HapMap reference samples.<sup>25</sup> In the present study, 66 samples drawn from the entire geographical expanse of India, used previously in the GenoChip validation study, and 12 additional HapMap Gujarati samples were further analyzed. The study interrogated (i) how the Indian samples are stratified based on the ancestry informative markers studied in the GenoChip; (ii) does the genome-wide SNPs-based clustering correlate to covariates such as geography, language or other cultural traits?; and (iii) do the genome-wide signals correlate to variation of their uni-parental markers?

## MATERIALS AND METHODS

### Sampling

The 66 Indian samples used in this study were collected as part of the Genographic Project. Mouthwash was collected from volunteers and DNA was isolated using standard salting out method with ethanol precipitation.<sup>26</sup> A signed informed consent was obtained before the sample collection. The study protocol was approved by the Institutional Ethical Committee of Madurai Kamaraj University, India and University of Pennsylvania, USA. To increase the representation of the West Indian samples, we added a random subset of 12 Gujarati samples from the HapMap data set to get a snapshot of the genome diversity of from West India.<sup>25</sup>

### Genotyping

Genome-wide SNP genotyping was performed using the GenoChip array in an Illumina HD iSelect genotyping bead array.<sup>24</sup> These results have formed a part of the validation study.<sup>25</sup> We analyzed the data (Supplementary File 1) in the context of India and genotyped the Indian subset of samples for 23 Y-SNPs using custom-made Taqman assays (Applied Biosystems, Foster City, CA, USA) in 7900HT Fast Realtime System and a core set of 22 mtDNA SNPs using a custom-made SNaPSHOT assay.<sup>8,27</sup>

### Biogeography

We followed the protocol described in Elhaik *et al.*<sup>25</sup> the approach is briefly described below. We used the world-wide reference data set data on 127 000 autosomal SNPs of 615 individuals from 54 world-wide populations collected as part of the Genographic Project and genotyped on the GenoChip array.<sup>24</sup> High data quality was achieved by applying two criteria to the SNP data: (i) low missingness rate (<5%), calculated as the average number of null genotypes over all samples in a population and (ii) individuals that exhibit exceptional admixture proportions (> Δ5% in any admixture coefficient) compared to the mean population proportions were considered outliers and omitted. We therefore omitted 2423 SNPs and five samples from the analysis.

### Admixture framework

First, ADMIXTURE was used in an unsupervised manner to obtain nine allele frequencies for each SNP, corresponding to the allele frequencies of nine

putative ancestral populations. We then used the allele frequencies to generate the genotypes of the putative ancestral populations, simulating 15 individuals of each putative ancestry. Second, we used these simulated samples in a supervised manner for all further analyses so that ADMIXTURE associates each SNP of each test sample with one of the putative ancestral populations based on their simulated genotypes. In this manner, the admixture inference is sample independent and depends solely on the putative ancestral populations, and not on the other tested samples as in alternative approaches.<sup>28</sup> The relationship between admixture and geography was calculated using nine admixture coefficients and geographical position using the reference samples, as described in Elhaik *et al.*,<sup>25</sup> The bio-origin of a test sample of unknown origin was obtained using the GPS algorithm (Supplementary File 2).<sup>25,29</sup> f4 test was performed to estimate the admixture proportions in Indian populations in different combinations of clustering following approach described in Reich *et al.*<sup>21</sup>

### Principal component analysis

Principal component analysis (PCA) of the SNP genotype data of the samples was performed using 'Adegenet' package implemented in R v3.0.1.<sup>30</sup> Polygon overlay of 'Language family', 'Y-haplogroup' and 'mtDNA haplogroup' over the PCA plots were performed using the convex hull method implemented using grDevices package in R v3.0.1. Hierarchical clustering was conducted using the built-in function in R, *hclust*. In order to investigate hierarchical clustering of the sampled populations, we analyzed our data in TreeMix software.<sup>31</sup> We used linkage disequilibrium (LD) pruned data set, and we set Kenyan population as a root of the tree. Mean *Fst* values<sup>32</sup> were calculated in vcftools<sup>33</sup> on data set pruned for linkage disequilibrium.

## RESULTS

The design of the GenoChip has been earlier validated on 615 reference samples from 54 world-wide populations collected as part of the Genographic Project, including that used in the present study, and tested in admixture analyses.<sup>24,25</sup> The results have revealed the existence of a clear substructure of the world populations essentially determined by geography. This is in agreement with the accumulated knowledge on global population history.<sup>34–36</sup> In the present paper, we further carried out extensive analysis on the Indian data set in the context of other uni-parental data generated (Supplementary Table 1 and Supplementary File 1).

### Three major components of Indian gene pool

Unsupervised admixture analysis<sup>37</sup> identified three major components making the Indian gene pool, each contributing 30–50%, namely, Southwest Asian (pitch red), Southeast Asian (blue) and Northeast Asian components (brown) (Supplementary Figure 1).<sup>25</sup> Here, we clustered the Indian samples into six groups: five geographical and one cultural (pan-Indian Brahmins). The Brahmins were grouped separately because of their unique and common cultural traits and history.<sup>38</sup> The pan-Indian Brahmins and Western Indian samples (12 Gujarati [HapMap], 1 Parsee and 1 Katkari) showed a modest (~10% combined) Northern European and Mediterranean component that were not found in any other clusters (Supplementary Figure 1), thereby suggesting a limited shared genetic ancestry with these populations. The Southwest Asian component was ubiquitously present in all the Indian samples, whereas the Northeast Asian component was predominant among Northeast Indians.

### Clustering analysis

To further investigate the genetic affinities of the studied Indian samples, we performed hierarchical clustering based on their admixture proportions (Figure 1 and Table 1). The resulting tree showed seven distinct clusters, each containing a major proportion of samples with common linguistic or geographical affiliation or both. Cluster 1 was

made mostly of Tibeto-Burmese speakers from Northeast India; Cluster 2: Austro-Asiatic speakers from East India; Cluster 3: Tibeto-Burmese speakers from Northeast and North India (adjoining Himalayas); Cluster 4: Indo-European speaking Brahmins from various regions of India; Cluster 5: non-Brahmin Indo-European speakers dispersed across India; Cluster 6: South Indian Dravidian speakers; and Cluster 7: a single West Indian population, Parsee. This clustering analysis revealed a combined influence of geography and language in shaping the gene pool of India. PCA based on the admixture proportions also revealed similar distinct population

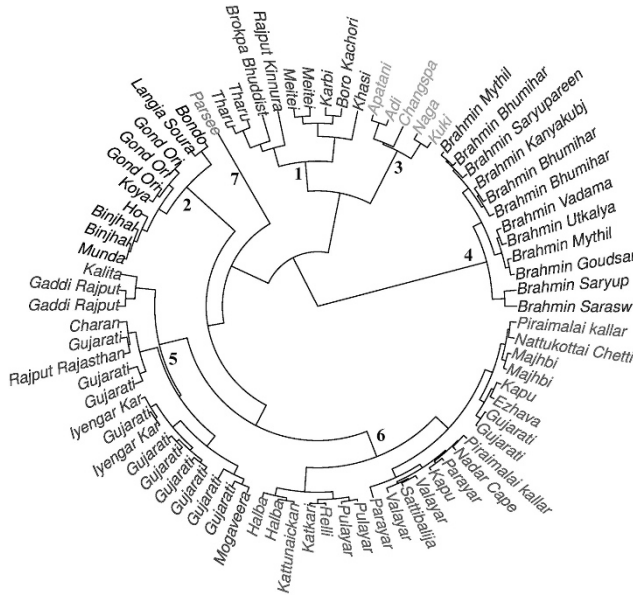
clusters, thus adding strength to our proposition (Supplementary Figure 2).

To further investigate the individual effect of various covariates of population classification, we performed the  $\chi^2$ -test between the population classification and the hierarchical cluster membership (Table 2). The most significant association ( $P$ -value of  $2.95 \times 10^{-33}$ ) was obtained for the classification based on regional clusters plus the Brahmin population. It is to be noted that we considered Brahmins as a unique entity irrespective of their present day geographical domicile owing to their historically common cultural traits. States of India (mostly geo-linguistic entities) and linguistic classification also showed significant  $P$ -values ( $7.0 \times 10^{-24}$  and  $1.57 \times 10^{-17}$ ).

The proportion of various global components in the seven clusters, as with admixture analysis (Supplementary Figure 1), revealed that the majority of Indian samples contained three global components: Northeast Asian, Southwest Asian and Southeast Asian, ranging from 57.3 to 64.3%. Clusters 1 and 3 contained 64.3 and 41.9% of the Northeast Asian component. All seven clusters, except for the Cluster 1, showed a high proportion of the Southwest Asian component. This component was observed at high frequencies only in the Indian populations with >35% of Indian samples with a frequency of 65% (Supplementary Figure 3). Therefore, this effect can be attributed to the Indian origin of this component.

The South Indian Dravidian speakers (Cluster 6) had the maximum proportion of the Southwest Asian component (58%), suggesting a probable *in situ* origin or expansion of their gene pool. The accuracy of this analysis was supported by the distinct genetic makeup of Cluster 7 (Parsee samples), with 39.9% of Mediterranean component. Parsees are believed to have migrated from the Greater Iran region to India during the eighth to tenth centuries.<sup>39</sup> Parsee is genetically closer to the Iranian population than any other Indian populations.

We also confirmed the results of the clustering analysis by using the Treemix algorithm (Supplementary Figure 4). All Indo-European speakers clustered together in one branch, with the exception of Indo-European speakers from North India. Indian Indo-European speaking groups clustered at the base of the branch, whereas European populations have a terminal position at the branch. Dravidian speakers separated according to geographical location while the southern Dravidian populations were placed in proximity of the Indo-European speakers' branch; the Dravidian speakers from east/central India were located at the extremity of the tree, near the Austro-Asiatic speakers. Indian Tibeto-Burmese speakers formed an individual branch together with China, Japan and Vietnam.



**Figure 1** Admixture proportion based hierarchical clustering of Indian samples. The Indian populations clustered into six groups, each reflecting their overall geographical or linguistic affiliations. The Brahmins across India, irrespective of their present domicile, clustered as a separate entity reflecting their unique shared ancestry. Cluster 1—Tibeto-Burmese speakers from Northeast India; Cluster 2—Austro-Asiatic speakers from East India; Cluster 3—Tibeto-Burmese speakers from Northeast and North India; Cluster 4—Indo-European speaking Brahmins from various regions of India; Cluster 5—non-Brahmin Indo-European speakers dispersed across India; Cluster 6—South Indian Dravidian speakers; and Cluster 7—Parsee population of Western India.

**Table 1** Quality measure of the hierarchical clusters showing means of seven global components

Cluster	Cluster means of various components							Implied correlates			
	Northeast Asian	Mediterranean	Southern African	Southwest Asian	Native American	Oceanian	Southeast Asia	Northern European	Subsaharan African	Language	Region within India
1	0.64	0.00	0.00	0.03	0.01	0.01	0.32	0.00	0.00	TB	Northeast
2	0.02	0.00	0.00	0.39	0.00	0.02	0.57	0.00	0.00	AA	East
3	0.42	0.01	0.00	0.21	0.01	0.01	0.33	0.02	0.00	IE, TB	North
4	0.01	0.11	0.00	0.55	0.01	0.00	0.21	0.11	0.00	IE	Brahmin—Pan India
5	0.02	0.10	0.00	0.58	0.01	0.01	0.21	0.07	0.00	IE	North
6	0.00	0.03	0.00	0.58	0.00	0.00	0.38	0.01	0.00	Dr	South
7	0.06	0.40	0.00	0.43	0.00	0.01	0.04	0.06	0.00	IE	Parsee—West

Abbreviations: AA, Austro Asiatic; Dr, Dravidian; IE, Indo European; TB, Tibeto Burmese.

**Table 2**  $\chi^2$ -test of the differences of various descriptor (covariates) clusters of the study populations

Proxy/cluster	No of proxies (clusters)	P-value
Longitude/latitude	39	2.27 E <sup>-14</sup>
Region in admixture analysis+Brahmin	6	2.95 E <sup>-33</sup>
States of India	17	7.00 E <sup>-24</sup>
Language family	4	1.57 E <sup>-17</sup>
Status (caste/tribe)	2	6.91 E <sup>-06</sup>
Ethnicity (individual caste/tribe based)	15/12 <sup>a</sup>	1.18 E <sup>-09</sup>
Y-haplogroup	12	2.21 E <sup>-02</sup>
mtDNA haplogroup	6	2.64 E <sup>-02</sup>

State, the linguistic states of India representing various language speaking people in distinct geographical terrain influence the membership the most. The significance of distribution of various proxies revealed, State of origin of samples and the Language family as the most influencing factors, due to non-random distribution of these proxies in various clusters.

<sup>a</sup>Proxies with single samples were not used.

In order to additionally validate the conclusions based on admixture proportions in the Indian samples, we calculated *f4* statistics for two trees with two ancestral populations and one Indian population: (Yoruba, ancestral 1; ancestral 2, tested Indian) and (Yoruba, ancestral 2; ancestral 1, tested Indian). Ratio of statistics results gives the estimate of which tree better reflects the data. In the next step, we carried out linear regression and extrapolated line to obtain *x* and *y* intercepts. These intercepts represent respectively 0 and 100% of ancestry of ancestral population 1. For every data point, we found closest point on the regression line and we interpolated ancestry proportions from this point. Results of regression ancestry estimate corroborate clinal pattern observed in results of Admixture and TreeMix. South and West Indian populations are more close to Indo-European speaking populations (Italian or Brahmin), whereas North and North East Indian populations exhibit greater affinity to North-East Asian populations (Chinese) (Supplementary Figure 5).

### Diversity of uni-parental markers in India

Having found the relationship between geography and spoken language with genomic variation based on admixture components, we investigated whether the observed variation could be attributed to the diversity of uni-parental markers observed in India, considering the regional differences in NRY composition in India.<sup>6</sup> In the global PCA based on genotype data of GenoChip SNPs, Indian samples were placed in the midst of Asians and Europeans, whereas African samples clustered away from this main cluster (Figure 2a). The same was demonstrated using the *smartPCA* algorithm (Supplementary Figure 6). *smartPCA* is a Bayesian extension of a traditional PCA approach allowing incorporation of external knowledge. Inclusion of the 'reference populations' was necessary for the separation of Indian samples along the *x*, and particularly the *y*, coordinates in the PCA. Plot of the PCA3 vs PCA1 showed: (i) separation between Indian samples and the reference groups (American Indian, Asian, African and European); (ii) closer affinity of Indian samples to European and Asian samples than to African and American Indian ones; and, (iii) existence of clusters within Indian samples. The PCA using the whole-genome SNPs of Indian samples alone without the 'reference populations' revealed distinct geographical clusters of the samples (Figure 2b). East, South and Northeast Indians formed distinct clusters while the Brahmin and West Indian samples clustered together. The North Indian samples did not form a distinct cluster.

Polygons representing linguistic family, NRY haplogroups and mtDNA haplogroups of Indian samples overlaid on the PCA clusters

revealed a varied picture. The linguistic polygon overlay on the global PCA plot (Supplementary Figure 7a) showed a clear distinction between Dravidian, Austro-Asiatic and Tibeto-Burmese speakers similar to previous observations.<sup>21</sup> The Dravidian and Indo-European speakers showed a larger overlap, whereas the Dravidian and Austro-Asiatic speakers showed a minimal overlap. The picture became clearer when PCA was restricted to Indian samples (Supplementary Figure 7b).

The NRY haplogroup polygon overlay on the global and Indian PCA brought out five distinct, non-overlapping polygons relevant to five different NRY haplogroups, namely: F\*-M89, H\*-M69, L1-M27, O2a-M95 and O3a3c-M117 (Supplementary Figure 8). The correlation between the NRY haplogroup variation and the whole-genome SNP variation was confirmed by a significant Mantel test *P*-value of 0.0003. On the other hand, the less common mtDNA haplogroups B, R8 and M36 were the only ones showing non-overlapping polygons (Supplementary Figure 9). The absence of non-overlapping mtDNA haplogroup polygons in genome-wide SNP PCAs (Mantel *P*-value = 0.1275) supports the observation that almost 80% of Indian mtDNA lineages are descendants of only two mtDNA haplogroups, M and R, and that the female genepool of India is highly fluid, which may be attributed to patriarchal social practices.<sup>7,16,18,19,40</sup>

## DISCUSSION

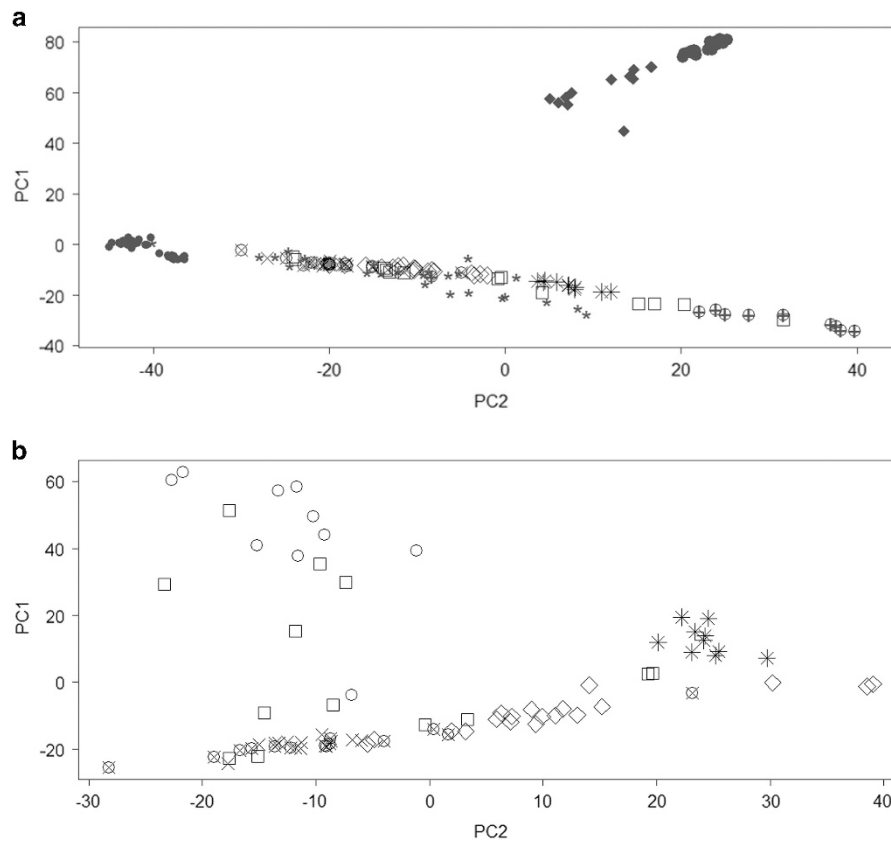
The present study is a snapshot of Indian genetic variation based on ancestry informative markers spanning the entire genome. The results highlighted a correlation of genetic variation with geographical and linguistic affiliation of the samples. In addition, a correlation to Y-chromosomal variation suggested a male-dominated genetic structure.

### Genetic structure of India

Previous studies have proposed two major genetic elements that have shaped the Indian gene pool. One, termed Ancestral North Indian, is closer to European, Middle Eastern and Central Asian, and the other is a distinct Ancient South Indian.<sup>21,22</sup> The present study described three major components in the Indian gene pool, namely, Southwest Asian, Southeast Asian and Northeast Asian. The Southwest Asian component was present in highest proportions in the Indian samples only (Supplementary Figure 3), thus postulating it to be a native Indian component. On the other hand, the Southeast Asian component was present in moderate levels in Chinese and other East Asian populations.

A unique identity of Brahmin populations surpassing geographic differences was brought out as evidenced from the unique cluster in the hierarchical clustering analysis based on admixture proportions (Figure 1). The Brahmin samples from all over India contained 11.4 and 10.6% of Northern Eurasian and Mediterranean components, thereby suggesting a shared ancestry with the Europeans (Table 1; Cluster 4). This was also reflected in the genetic relatedness based on *Fst* values between Brahmins and Europeans (Supplementary Table 2). Note that our *Fst* values agree with those previously reported.<sup>21</sup> Earlier studies describing Ancestral North Indian genetic variance and NRY haplogroup R1a1-M17 suggested similar shared ancestries with Europeans and Mediterraneans.<sup>10,21</sup>

We compared consistency of Brahmin and Western Indian samples using the GPS algorithm.<sup>25</sup> We conducted the leave-one-out analysis, removing one sample at a time and re-computed mean admixture vector for the remaining individuals in the population, and predicted the origin of the removed sample using GPS. In this analysis, all 13 Brahmin samples were mapped to Brahmins; however, among the 12



**Figure 2** Principal component analysis (PCA) of Global and Indian populations based on the GenoChip single-nucleotide polymorphism (SNPs). Legend: (a) PCA of global samples, and (b) PCA of Indian samples. Each point represents samples and the symbols represent geographical origin of samples. Cross—Brahmin; square—North India; diamond—South India; star—East India; circle—Northeast India; circle cross—West India; bullet (small grey circle)—European; grey-filled diamond—African-American; grey-filled solid circle—African; grey colour star '\*'—South America; grey colour '+'—East Asian.

Gujarati samples, only 25% were mapped to Gujarat. This indicates that the Western India samples studied were not homogeneous, or that the Gujarati samples were admixed while the pan Indian Brahmins might have had a common genetic ancestry. Other Indian populations were too small for the leave-one-out analysis.

The Northeast Asian component was predominant among the Northeast Indian Tibeto-Burmese speakers who share genetic elements with East Asians.<sup>9</sup> The presence of varying degrees of Northeast Asian component (Supplementary Figure 1, Brown) in Northern Indian sample studies was attributed to the inclusion of Tibeto-Burmese speakers of the Himalayan ranges in this group (Changspa, Rajput Kinnura), whose genetic history supports a migration from the Northeast Asian region.<sup>40,41</sup>

Patterns observed in result of TreeMix (Supplementary Figure 4) reflect documented migration events and gene flow. The separation of Dravidian into two (South and East) is expected. The Dravidian speakers of East/Central India speak a subgroup of Dravidian language called Central Dravidian languages. These people live in close proximity with Austro-Asiatic speakers of East India (many within the same village). Gene flow between these two groups (central Dravidian and Austro Asiatic) is documented.<sup>15,42</sup> The Indo-European speakers of North India seem to have diverse ancestral elements. Six out of the 11 Indo-European-North samples are living in close proximity with Tibeto-Burmese speakers of the Himalayan ranges (Tibeto Burmese-North). Hence, there is a small genetic affinity with them that pulls the Indo-European North away from other Indo-European speakers.

### Y-chromosomal signatures of Indian gene pool

Studies based on uni-parental marker have shown diverse Y-chromosomal haplogroups making up the Indian gene pool. Many of these Y-chromosomal markers show a strong correlation to the linguistic affiliation of the population.<sup>6,8</sup> The genome-wide variation of the Indian samples in the present study correlated with the linguistic affiliation of the sample (Supplementary Figure 7). However, Dravidian speakers showed genetic relatedness with Austro-Asiatic and Indo-European speakers. This could be a result of a shared Southeast Asian genetic component (Table 1). This relatedness has been earlier shown with Y-markers as well. The central Dravidian speakers (a subfamily of Dravidian languages), living amidst the Austro-Asiatic speakers in East India, share uni-parental markers (Y-haplogroups H1a-M52 and O2a-M95).<sup>15,42</sup> Similarly, Indo-European and Dravidian speakers show genetic relatedness described by sharing of NRY markers such as R1a1-M17 and H1a-M52.<sup>8</sup> This scenario supports the historical evidences of Indo-European speakers' entry into South India.<sup>38,43</sup>

The disparate Y-chromosomal polygons overlaid on genome-wide PCA highlighted the effect of male-dominated genetic elements shaping the Indian gene pool (Supplementary Figure 7). Interestingly, these NRY markers have earlier been correlated to various languages. For example, the NRY haplogroup F\*-M89 and L1-M27 are present in higher proportions among Dravidian speakers, and their origin was proposed to be autochthonous.<sup>6,8</sup> The NRY haplogroup O2a-M95 and O3a3c-M117 are characteristics of Austro-Asiatic and Tibeto-Burmese speakers of India, respectively.<sup>9,14,16,44</sup> The unique genome-wide

signatures of individuals with deep-rooted NRY haplogroups F\*-M89 and H\*-M69, dating back to mid Pleistocene, suggest an ancient settlement in the subcontinent.<sup>6,8,45</sup> On the other hand, lack of correlation of mtDNA haplogroups may suggest the fluidity of female gene pools when in a patriarchal and patrilocality society, such as that of India.

### Limitations of the study

We note that the present study involved a limited sample size, but the disparate genetic clustering and information obtained provides a snapshot of the large genetic diversity present in India. This pilot study will aid formulating hypotheses to be tested in larger sample-sized studies from this region in the future.

In conclusion, the present observations suggest the following four likely scenarios: (i) the Indian gene pool is primarily composed of native Indian components; (ii) the genome-wide SNP variation correlates to both geographical and linguistic variation among the study populations; (iii) the correlation of non-overlapping deep-rooted NRY haplogroup polygons to genome-wide SNPs suggests that male-mediated migratory events primarily shaped the Indian gene pool; and (iv) the absence of non-overlapping mtDNA haplogroup polygons over genome-wide SNP variation suggests a shared female genetic ancestry of India surpassing the geographical and linguistic barriers. We suggest that ancient male-mediated migratory events and settlement in various regional niches led to the present day scenario and peopling of India.

### CONFLICT OF INTEREST

The authors declare no conflict of interest.

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### DISCLAIMER

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### THE GENOGRAPHIC CONSORTIUM

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