

# The Effect of Consanguinity on Between-Individual Identity-by-Descent Sharing

Alissa L. Severson,<sup>\*,1</sup> Shai Carmi,<sup>†</sup> and Noah A. Rosenberg<sup>‡</sup>

<sup>\*</sup>Department of Genetics and <sup>‡</sup>Department of Biology, Stanford University, California 94305-5020 and <sup>†</sup>Braun School of Public Health and Community Medicine, Hebrew University of Jerusalem, Ein Kerem, 91120 Israel

**ABSTRACT** Consanguineous unions increase the rate at which identical genomic segments are paired within individuals to produce runs of homozygosity (ROH). The extent to which such unions affect identity-by-descent (IBD) genomic sharing *between* rather than *within* individuals in a population, however, is not immediately evident from within-individual ROH levels. Using the fact that the time to the most recent common ancestor ( $T_{\text{MRCA}}$ ) for a pair of genomes at a specific locus is inversely related to the extent of IBD sharing between the genomes in the neighborhood of the locus, we study IBD sharing for a pair of genomes sampled either within the same individual or in different individuals. We develop a coalescent model for a set of mating pairs in a diploid population, treating the fraction of consanguineous unions as a parameter. Considering mating models that include unions between sibs, first cousins, and  $n$ th cousins, we determine the effect of the consanguinity rate on the mean  $T_{\text{MRCA}}$  for pairs of lineages sampled either within the same individual or in different individuals. The results indicate that consanguinity not only increases ROH sharing between the two genomes within an individual, it also increases IBD sharing between individuals in the population, the magnitude of the effect increasing with the kinship coefficient of the type of consanguineous union. Considering computations of ROH and between-individual IBD in Jewish populations whose consanguinity rates have been estimated from demographic data, we find that, in accord with the theoretical results, increases in consanguinity and ROH levels inflate levels of IBD sharing between individuals in a population. The results contribute more generally to the interpretation of runs of homozygosity, IBD sharing between individuals, and the relationship between ROH and IBD.

**KEYWORDS** coalescent; consanguinity; identity by descent; runs of homozygosity; time to the most recent common ancestor

**C**ONSANGUINEOUS unions, in which mating pairs have a close genetic relationship, produce offspring whose two genomic copies have higher levels of identity-by-descent (IBD) sharing than is seen for corresponding offspring of nonconsanguineous unions. The offspring of consanguineous unions can inherit two copies of a segment of the genome from the same recent ancestor—a shared close relative of both mother and father—through separate maternal and paternal lines of descent. Because this ancestor is recent, little time has been available for recombination to break the segment, so that the two copies can be identical over a long distance (Figure 1A).

Long runs of homozygosity (ROH)—regions in which the two homologous chromosomes of an individual are identical over long distances—have been observed to co-occur with known high rates of consanguinity (Woods *et al.* 2006; Hunter-Zinck *et al.* 2010; Scott *et al.* 2016; Ceballos *et al.* 2018). In humans, many populations with a high rate for consanguineous unions have been seen to be among the populations with the largest fractions of their genomes residing in long ROH (Kirin *et al.* 2010; Pemberton *et al.* 2012; Karafet *et al.* 2015; Kang *et al.* 2016).

Measurement of IBD sharing between genomes in distinct individuals has emerged as a powerful method for analysis of population relationships and demographic history (Browning and Browning 2012; Palamara *et al.* 2012; Harris and Nielsen 2013; Ralph and Coop 2013; Thompson 2013). IBD sharing is computed for pairs of genomes in individuals at different geographic scales or in comparisons of pairs from the same or different populations. The pattern of sharing is then used to infer demographic histories.

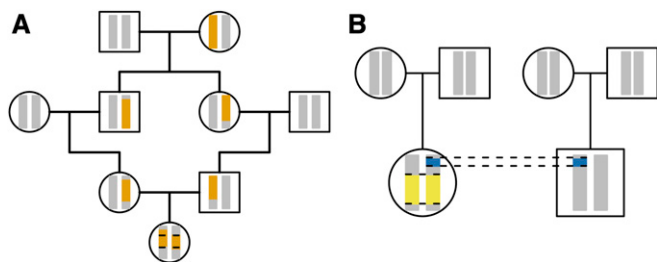
Copyright © 2019 by the Genetics Society of America

doi: <https://doi.org/10.1534/genetics.119.302136>

Manuscript received September 25, 2018; accepted for publication March 22, 2019; published Early Online March 28, 2019.

Available freely online through the author-supported open access option.

<sup>1</sup>Corresponding author: Department of Genetics, Stanford University, Stanford, CA 94305-5120. E-mail: [aseverso@stanford.edu](mailto:aseverso@stanford.edu)



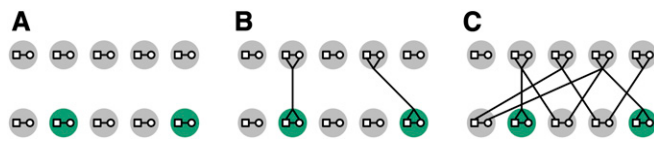
**Figure 1** Consanguinity and genomic sharing. (A) In a consanguineous pedigree, an inbred individual can possess two copies of a long genomic segment inherited from a common ancestor along two paths. (B) In a population with consanguineous mating, individuals experience increased genomic sharing of their two genomic copies (yellow); this article considers the effect of consanguinity on genomic sharing between genomes in two “unrelated” individuals (blue).

Informally, high levels of IBD sharing between individuals within populations have been seen in some of the same populations that possess high ROH levels (Kang *et al.* 2016). However, it is not clear from a theoretical understanding of the determinants of IBD sharing that ROH levels, measured within individuals, and levels of between-individual IBD sharing would have a direct relationship. Consanguinity increases the probability that the same genomic segment appears in two copies in the same individual; the way in which consanguinity relates to genomic sharing *between* individuals does not directly follow from the within-individual pattern (Figure 1B).

It is possible that the increased IBD sharing within individuals that is produced by consanguinity increases IBD sharing between individuals, as an enlarged inbreeding coefficient decreases effective population size, and, hence, might increase genomic sharing between all pairs of individuals. On the other hand, it is possible that the increased genomic sharing within offspring resulting from consanguinity has little or no effect on sharing between pairs of genomes in individuals from different families; increased IBD sharing for individuals within a family that has many consanguineous unions might be counteracted by decreased IBD sharing for individuals from different families that are not closely related.

A difficulty in evaluating the effect of relationships among consanguinity, ROH, and IBD sharing between individuals is that the phenomena of interest concern properties of a diploid population pedigree. Unlike in many problems in population genetics, in which a diploid population of size  $2N$  exchangeable individuals can be approximated by a model of a corresponding haploid population of size  $4N$  (Wakeley 2009, Chapter 6.1), for the study of consanguinity, it is important to consider mating pairs of diploid individuals, and to account for the possibility that individuals might have many consanguineous mating pairs in their ancestry.

Here, adapting a model of  $N$  diploid mating pairs, each of which can represent a consanguineous pair or a nonconsanguineous pair, we study the effect of consanguinity on the mean time to the most recent common ancestor ( $T_{\text{MRCA}}$ ) for



**Figure 2** Diploid model of monogamous mating pairs, some of which are sib mating pairs. (A) Each generation has  $N = 5$  mating pairs, a fraction  $c_0 = 0.4$  of which represent sib mating pairs. (B) Each sib mating pair is assigned one parental pair from the previous generation, representing parents of both sibs. (C) Each nonconsanguineous pair is assigned two distinct parental pairs from the previous generation, representing the two sets of parents for the members of the pair.

pairs of gene lineages sampled either as the two genomic copies within an individual or as two copies from different individuals. In the model, not only does consanguinity decrease  $\mathbb{E}[T_{\text{MRCA}}]$  for pairs of genomic copies within an individual, thereby increasing ROH levels, it also decreases  $\mathbb{E}[T_{\text{MRCA}}]$  for pairs of genomic copies in separate individuals in a population, thereby increasing between-individual IBD sharing. We verify the prediction of the model by examining ROH and IBD sharing in data from human populations.

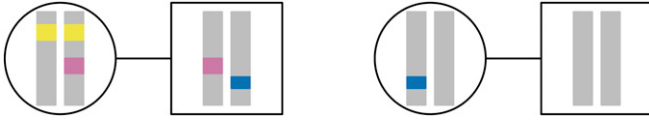
## Model

### $T_{\text{MRCA}}$ , ROH, and IBD

Our goal is to study the relationship between ROH within individuals and IBD sharing between individuals. To do so, we examine a model of a genetic locus in a population, in which we can consider two random variables:  $T$ , the  $T_{\text{MRCA}}$  for the two gene lineages sampled from the same individual chosen at random in the population, and  $V$ , or  $T_{\text{MRCA}}$  for a pair of lineages from two individuals chosen at random in separate mating pairs. The choice to study  $T_{\text{MRCA}}$  arises from the fact that the length of genome shared around a focal site is closely related to  $T_{\text{MRCA}}$  at the site (Palamara *et al.* 2012; Carmi *et al.* 2014; Browning and Browning 2015). Thus, lower values of  $T$  lead to longer homozygous segments within individuals, and lower values of  $V$  lead to longer IBD segments in pairs of individuals. The relationship between  $T$  and  $V$ , and its dependence on model parameters, then provide insight into the relationship between ROH and IBD.

### Diploid mating model

We study a diploid discrete-generation model with sib mating that was introduced by Campbell (2015), extending it to permit other forms of consanguinity. The model of Campbell (2015) considers a constant-sized diploid population with  $N \geq 2$  monogamous mating pairs,  $2N$  individuals, and  $4N$  allelic copies at a locus. Some of the mating pairs are consanguineous, and the others are nonconsanguineous. In particular, in each generation, a constant fraction ( $c_0$ ) of the pairs represent sib matings (Figure 2A). Although in principle,  $c_0$  can be viewed as a probability of consanguinity that ranges from 0 to 1, in our model, to ensure that the number of sib mating pairs is an integer,  $c_0$  must be a multiple of  $1/N$ .



**Figure 3** Three states possible for a pair of alleles. State 1: within the same individual (yellow). State 2: in two individuals in a mating pair (pink). State 3: in two individuals in different mating pairs (blue).

One generation back in time, for each of the  $c_0N$  sib mating pairs, a single parental mating pair is chosen uniformly at random with replacement to represent the parents of the mating sibs (Figure 2B). For each of the remaining  $(1 - c_0)N$  nonconsanguineous mating pairs, two parental mating pairs in the previous generation are chosen uniformly at random from the  $\binom{N}{2}$  possibilities, representing the parents of the two members of the pair in the current generation (Figure 2C). Because each nonconsanguineous mating pair chooses two distinct parental mating pairs, chance sib mating does not occur.

In this model, two allelic copies at a locus have three possible states (Figure 3). They can be the two alleles of the same individual (state 1). Alternatively, they can be in the two individuals of a mating pair, one in each member of the pair (state 2). Finally, they can be in two individuals in separate mating pairs (state 3). We define three random variables corresponding to these three states:  $T$  is  $T_{\text{MRCA}}$  for two alleles in the same individual,  $U$  is  $T_{\text{MRCA}}$  for two alleles in two individuals in a mating pair, and  $V$  is  $T_{\text{MRCA}}$  for two alleles in two individuals in separate mating pairs (Figure 3).

Campbell (2015) derived the mean coalescence time  $\mathbb{E}[T]$  for two alleles in an individual as a function of the population size  $N$  and the fraction of sib mating pairs  $c_0$ . We begin by recapitulating the results of Campbell (2015) in the diploid model with sib mating, also examining  $\mathbb{E}[U]$  and  $\mathbb{E}[V]$ . Next, we extend the model to consider  $\mathbb{E}[T]$ ,  $\mathbb{E}[U]$ , and  $\mathbb{E}[V]$  in other consanguinity regimes: first cousin mating,  $n$ th cousin mating, and a superposition of multiple degrees of cousin mating. We find that, in all regimes, consanguinity decreases  $\mathbb{E}[T]$ ,  $\mathbb{E}[U]$ , and  $\mathbb{E}[V]$ , thereby predicting that consanguinity increases both ROH lengths within individuals and IBD sharing between individuals. A single result unifies the consanguinity regimes in terms of the kinship coefficient of the pairs of individuals in consanguineous unions.

### Sib Mating

Following Campbell (2015), we first rederive  $\mathbb{E}[T]$ ,  $\mathbb{E}[U]$ , and  $\mathbb{E}[V]$  in units of generations by setting up recursions using a first-step analysis. For  $\mathbb{E}[T]$ , if two alleles are present within one individual (state 1), then they must have been present in two individuals in a mating pair in the previous generation (state 2). Hence,  $T = U + 1$  and

$$\mathbb{E}[T] = \mathbb{E}[U] + 1. \quad (1)$$

For  $\mathbb{E}[U]$ , if two alleles are in the two individuals of a mating pair (state 2), then, with probability  $c_0$ , the pair is a sib mating pair. Three cases are possible for the previous generation. With probability  $\frac{1}{4}$ , the two alleles coalesce, giving a coalescence time of 1 generation. With probability  $\frac{1}{4}$ , they are the two alleles of the same individual (state 1), giving a mean coalescence time of  $\mathbb{E}[T] + 1$ . With probability  $\frac{1}{2}$ , they are two alleles in the two individuals of a mating pair (state 2), generating mean coalescence time  $\mathbb{E}[U] + 1$ .

Chance sib mating is forbidden among the pairs that are not among the  $c_0N$  sib mating pairs. If the two individuals in the mating pair are not sibs, then, in the previous generation, the alleles trace to two separate mating pairs (state 3), giving mean coalescence time  $\mathbb{E}[V] + 1$ . Combining the various cases, we have

$$\mathbb{E}[U] = c_0 \left( \frac{1}{4} + \frac{\mathbb{E}[T] + 1}{4} + \frac{\mathbb{E}[U] + 1}{2} \right) + (1 - c_0)(\mathbb{E}[V] + 1). \quad (2)$$

Finally, for  $\mathbb{E}[V]$ , because parental pairs are chosen uniformly at random with replacement among  $N$  possible pairs, two individuals in separate mating pairs are sibs with probability  $\frac{1}{N}$ . In the previous generation, if the two individuals are sibs, then the two alleles can either coalesce, be in the same parent in the previous generation (state 1), or be in separate parents (state 2). If they are not sibs, then the alleles lie in two individuals in separate mating pairs in the previous generation (state 3). Combining these cases, we have:

$$\mathbb{E}[V] = \frac{1}{N} \left( \frac{1}{4} + \frac{\mathbb{E}[T] + 1}{4} + \frac{\mathbb{E}[U] + 1}{2} \right) + \left( 1 - \frac{1}{N} \right) (\mathbb{E}[V] + 1). \quad (3)$$

Equations 1–3 form a linear system of equations in  $\mathbb{E}[T]$ ,  $\mathbb{E}[U]$ , and  $\mathbb{E}[V]$ , the solution to which is

$$\mathbb{E}[T] = 4N(1 - c_0) + 6 \quad (4)$$

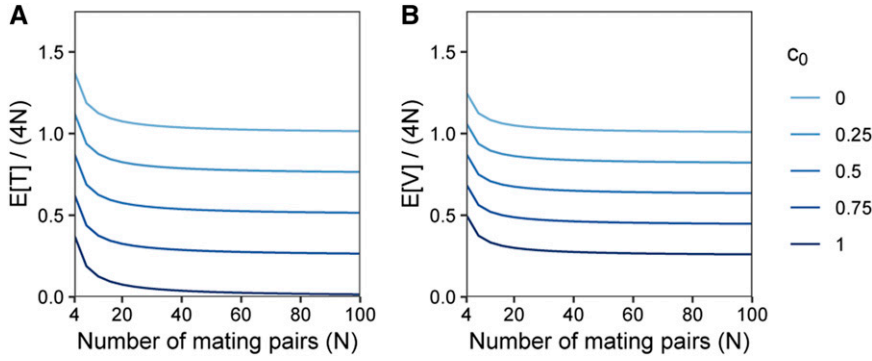
$$\mathbb{E}[U] = 4N(1 - c_0) + 5 \quad (5)$$

$$\mathbb{E}[V] = 4N \left( 1 - \frac{3}{4}c_0 \right) + 4. \quad (6)$$

Note that although Campbell (2015) presented only Equation 4, Equations 5 and 6 also result from solving the system.

We can immediately observe that  $\mathbb{E}[V] - \mathbb{E}[T] = c_0N - 2$ , so that if  $c_0$  exceeds  $\frac{2}{N}$ , or the population has more than two consanguineous mating pairs each generation, then  $\mathbb{E}[V] > \mathbb{E}[T]$ , and the mean coalescence time for two alleles in different mating pairs exceeds the mean coalescence time within individuals. For  $c_0 \leq \frac{2}{N}$ ,  $\mathbb{E}[V]$  and  $\mathbb{E}[T]$  differ by at most two generations.

If  $c_0 = 0$ , then the reduced model of  $N$  monogamous diploid pairs with sib mating avoidance produces mean coalescence times close to the mean coalescence time of  $4N$  for two lineages chosen uniformly at random in a haploid population



**Figure 4** Normalized mean coalescence times under sib mating as functions of the number of mating pairs  $N$  and the fraction of sib mating pairs  $c_0$ . (A)  $\mathbb{E}[T]/(4N)$ , the normalized mean coalescence time for two alleles within an individual (Equation 4). (B)  $\mathbb{E}[V]/(4N)$ , the normalized mean coalescence time for two alleles in two separate mating pairs (Equation 6).

of size  $4N$  (Wakeley 2009, Chapter 6.1). The factors of  $1 - c_0$  in Equations 4 and 5 and  $1 - \frac{3}{4}c_0$  in Equation 6 provide linear reductions in mean coalescence time owing to increasing consanguinity  $c_0$ .

Equations 4 and 6, normalized by  $4N$ , are plotted in Figure 4 as functions of  $N$  for various values of  $c_0$ . As  $N$  increases, the constant terms in Equations 4–6 become unimportant, and the mean coalescence times are dominated by a product of  $4N$ , the number of allelic copies in the population, and the reduction factor due to consanguinity,  $1 - c_0$  or  $1 - \frac{3}{4}c_0$ .

### First Cousins

Next, we extend the model to first cousin mating and again derive  $\mathbb{E}[T]$ ,  $\mathbb{E}[U]$ , and  $\mathbb{E}[V]$  in the same manner as in the sib mating case. In each generation, the fraction of first cousin mating pairs is a constant value  $c_1$ . Similarly to the sib mating case, both chance first-cousin mating and chance sib mating are forbidden among the remaining nonconsanguineous pairs. Consanguineous pairs are assumed not to be double-first cousins, and chance double-first-cousin mating is also forbidden among nonconsanguineous pairs.

$\mathbb{E}[T]$  is the same as with sib mating: if two alleles are present within one individual (state 1), then they must have been present in two individuals in a mating pair in the previous generation (state 2), and Equation 1 still holds.

For  $\mathbb{E}[U]$ , if two alleles are in two individuals of a mating pair (state 2), then, with probability  $c_1$ , those individuals are first cousins. If they are first cousins, then each has a parent who is the offspring of the shared grandparental mating pair (Figure 5B). For each individual in the first cousin mating pair, the probability that the sampled allele is inherited from the sib parent is  $\frac{1}{2}$ . Consequently, the probability that the sampled alleles in both individuals are inherited from the sib parents is  $\frac{1}{4}$ . If both alleles are inherited from the sib parents, then—similar to sib mating—two generations ago, three cases are possible. First, with probability  $\frac{1}{4}$ , the two alleles coalesce, giving a coalescence time of two generations. With probability  $\frac{1}{4}$ , they are the two alleles of the same individual (state 1), giving a mean coalescence time of  $\mathbb{E}[T] + 2$ . Finally, with probability  $\frac{1}{2}$ , they are two alleles in the two individuals of a mating pair (state 2), generating mean coalescence time  $\mathbb{E}[U] + 2$ .

With probability  $1 - \frac{c_1}{4}$ , two alleles in two individuals in a mating pair are not inherited from a shared grandparental mating pair. Because both chance sib and first-cousin mating are forbidden, two generations ago the alleles are in separate mating pairs, giving mean coalescence time  $\mathbb{E}[V] + 2$ . Combining the cases gives

$$\mathbb{E}[U] = \frac{c_1}{4} \left( \frac{2}{4} + \frac{\mathbb{E}[T] + 2}{4} + \frac{\mathbb{E}[U] + 2}{2} \right) + \left( 1 - \frac{c_1}{4} \right) (\mathbb{E}[V] + 2). \quad (7)$$

Lastly, for  $\mathbb{E}[V]$ , the formula is the same as Equation 3 because parental pairs of individuals are still chosen uniformly at random with replacement from the  $N$  pairs.

Equations 1, 7, and 3 form a linear system of equations, with solution

$$\mathbb{E}[T] = 4N \left( 1 - \frac{1}{4}c_1 \right) + 10 \quad (8)$$

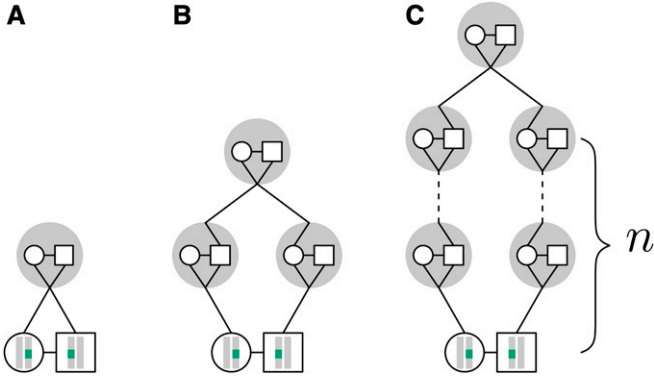
$$\mathbb{E}[U] = 4N \left( 1 - \frac{1}{4}c_1 \right) + 9 \quad (9)$$

$$\mathbb{E}[V] = 4N \left( 1 - \frac{3}{16}c_1 \right) + 7. \quad (10)$$

We first note that  $\mathbb{E}[V] - \mathbb{E}[T] = \frac{c_1 N}{4} - 3$ , so if  $c_1 > \frac{12}{N}$ , or the number of consanguineous mating pairs exceeds 12, then the mean coalescence time for two alleles in different mating pairs,  $\mathbb{E}[V]$ , exceeds the mean coalescence time for two alleles within an individual,  $\mathbb{E}[T]$ . As  $c_1$  approaches 0, the mean coalescence times are near  $4N$ , the mean coalescence time for two lineages from a randomly mating haploid population of size  $4N$ . On the other hand, for  $c_1$  near 1,  $\mathbb{E}[T] \approx 3N$  and  $\mathbb{E}[V] \approx \frac{13}{4}N$ . The mean coalescence times are reduced linearly due to consanguinity, by a factor of  $1 - \frac{1}{4}c_1$  in Equations 8 and 9, and by a factor of  $1 - \frac{3}{16}c_1$  in Equation 10.

Equations 8 and 10, normalized by  $4N$ , are plotted in Figure 6. As the number of mating pairs  $N$  increases, the mean coalescence times approach the product of  $4N$  and a reduction factor due to consanguinity. In contrast to sib mating, for which  $\mathbb{E}[T]/(4N)$  decreases to 0 and  $\mathbb{E}[V]/(4N)$  to  $\frac{1}{4}$  for large  $N$  and  $c_0 = 1$ ,  $\mathbb{E}[T]/(4N)$  is bounded below by  $\frac{3}{4}$  and  $\mathbb{E}[V]/(4N)$  by  $\frac{13}{16}$ .





**Figure 5** The path by which two sampled alleles (green) in a consanguineous union of individuals with a specified relationship are inherited from a recent shared ancestral mating pair. (A) Sibs. (B) First cousins. (C)  $n$ th cousins.

### $n$ th Cousins

The similarity of the derivation in the cases of sib mating and first-cousin mating suggests a generalization to  $n$ th cousin mating, where  $n = 1$  represents first-cousin mating and  $n = 0$  represents sib mating. As before,  $c_n$  is the fraction of mating pairs that represent  $n$ th cousins. It will be convenient to assume that chance mating of  $i$ th cousins is forbidden for all  $i$  from 0 to  $n$ . Beginning with  $\mathbb{E}[T]$ , if two alleles are within one individual, then, as before, they must have been in two individuals in a mating pair in the previous generation. Equation 1 continues to hold.

For  $\mathbb{E}[U]$ , with probability  $c_n$ , the individuals in the mating pair are  $n$ th cousins. They then share an ancestral mating pair  $n + 1$  generations in the past and have ancestors that are sibs  $n$  generations ago (Figure 5C). The probability that a pair of alleles, one in an offspring of one sib and one in an offspring of the other sib, both trace to the sibs is  $\frac{1}{4}$ . For each of the next  $n - 1$  generations connecting the sibs to the  $n$ th cousins, the conditional probability that the transmitted alleles are both from the sibs given that they are from the sibs in the previous generation is  $\frac{1}{4}$ . Consequently, with probability  $\frac{1}{4^n}$ , the sampled alleles in the current generation are inherited from the sib ancestors.

Conditional on tracing to the sibs, three cases exist for the two alleles in the shared ancestral mating pair: with probability  $\frac{1}{4}$ , the alleles coalesce  $n + 1$  generations ago. With probability  $\frac{1}{4}$ , the two alleles are in state 1 and have mean coalescence time  $\mathbb{E}[T] + n + 1$ . Lastly, with probability  $\frac{1}{2}$ , the two alleles are in state 2 and have mean coalescence time  $\mathbb{E}[U] + n + 1$ . If the two alleles are not inherited from the ancestral sibs, or if the individuals in the mating pair in the current generation are not  $n$ th cousins, then because chance mating of cousins of degree 0, 1, 2,  $\dots$ ,  $n$  is forbidden, the two alleles are in separate mating pairs  $n + 1$  generations ago and have mean coalescence time  $\mathbb{E}[V] + n + 1$ . Combining the cases gives

$$\mathbb{E}[U] = \frac{c_n}{4^n} \left( \frac{n+1}{4} + \frac{\mathbb{E}[T] + n + 1}{4} + \frac{\mathbb{E}[U] + n + 1}{2} \right) + \left( 1 - \frac{c_n}{4^n} \right) (\mathbb{E}[V] + n + 1). \quad (11)$$

Lastly, for  $\mathbb{E}[V]$ , because parental pairs are chosen uniformly at random with replacement from the  $N$  possible pairs, Equation 3 continues to hold.

Equations 1, 11, and 3 form a linear system of equations, the solution to which is

$$\mathbb{E}[T] = 4N \left( 1 - \frac{1}{4^n} c_n \right) + 4n + 6 \quad (12)$$

$$\mathbb{E}[U] = 4N \left( 1 - \frac{1}{4^n} c_n \right) + 4n + 5 \quad (13)$$

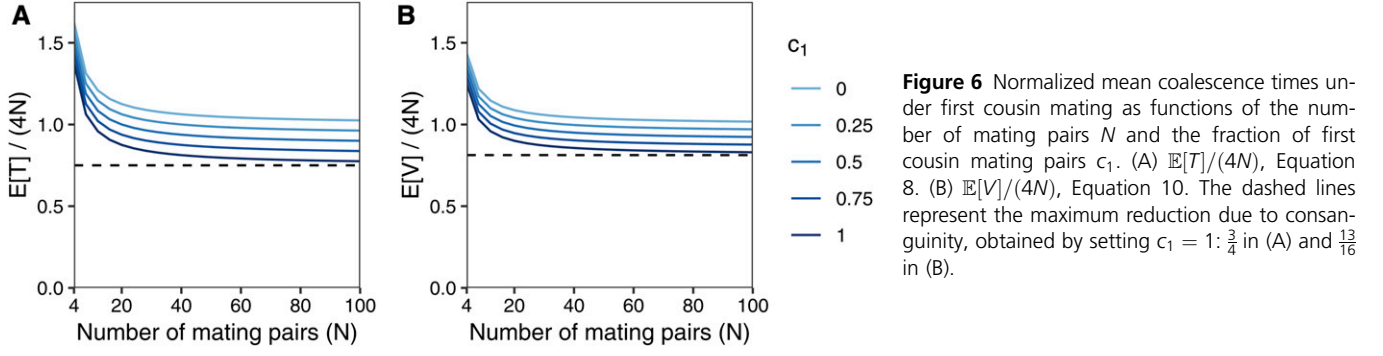
$$\mathbb{E}[V] = 4N \left( 1 - \frac{3}{4^{n+1}} c_n \right) + 3n + 4. \quad (14)$$

Note that Equations 12–14 give Equations 4–6 as a special case when  $n = 0$ , and Equations 8–10 when  $n = 1$ . We can consider the difference  $\mathbb{E}[V] - \mathbb{E}[T] = c_n N / 4^n - (n + 2)$ . If  $c_n > 4^n(n + 2)/N$ , or the number of consanguineous pairs exceeds  $4^n(n + 2)$ , then the mean coalescence time for two alleles in different mating pairs,  $\mathbb{E}[V]$ , exceeds the mean coalescence time for two alleles within an individual,  $\mathbb{E}[T]$ . As  $n$  increases, the first term  $c_n N / 4^n$  approaches zero and the two means differ by approximately  $n + 2$ . For fixed  $n$ , the mean coalescence times are reduced linearly due to consanguinity, by a factor of  $1 - c_n / 4^n$  in Equations 12 and 13, and by  $1 - 3c_n / 4^{n+1}$  in Equation 14.

Equations 12 and 14, normalized by  $4N$ , are plotted in Figure 7 as functions of the degree  $n$  of the cousin relationship. The terms in these equations that reduce coalescence times are  $c_n / 4^n$  in Equation 12 and  $3c_n / 4^{n+1}$  in Equation 14. As the degree  $n$  of the cousin relationship increases, these terms decrease exponentially to zero, and the mean coalescence times approach  $4N$ . The ratio  $\mathbb{E}[V] / \mathbb{E}[T]$ , taking the ratio of Equations 14 and 12, is plotted in Figure 8 as a function of  $c_n$  for  $n$  from 0 to 5. As the fraction of cousin mating  $c_n$  increases, the ratio increases above 1, so  $\mathbb{E}[V] > \mathbb{E}[T]$ ; however, as the degree of the relationship  $n$  increases for fixed  $c_n$ , the ratio decreases toward 1.

### Superposition of Multiple Mating Levels

We now combine all forms of consanguinity examined thus far into a superposition of levels of cousin mating, in which  $i$ th cousin mating is permitted for each  $i$  from 0 to  $n$ . For each  $i$  from 0 to  $n$ , let  $c_i$  be the fraction of  $i$ th cousin mating pairs in each generation, and let  $n$  be the degree of the most distant cousin relationship allowed. For each  $i \leq n$ , chance  $i$ th cousin mating is prohibited. We assume individuals in a consanguineous mating pair cannot be related by more than one path; for example, they cannot be both first and third cousins. This assumption is designed for use with a large population and a small value of  $\sum_{i=0}^n c_i \ll 1$ . For fixed  $n$ , as  $N$  becomes large, the probability that two individuals in a consanguineous mating pair share more than one recent ancestor is regarded as negligible.



**Figure 6** Normalized mean coalescence times under first cousin mating as functions of the number of mating pairs  $N$  and the fraction of first cousin mating pairs  $c_1$ . (A)  $\mathbb{E}[T]/(4N)$ , Equation 8. (B)  $\mathbb{E}[V]/(4N)$ , Equation 10. The dashed lines represent the maximum reduction due to consanguinity, obtained by setting  $c_1 = 1$ :  $\frac{3}{4}$  in (A) and  $\frac{13}{16}$  in (B).

$\mathbb{E}[T]$  is the same as in the previous models: two alleles within one individual must have been in two individuals in a mating pair in the previous generation (Equation 1).

For  $\mathbb{E}[U]$ , for each  $i \leq n$ , with probability  $c_i$  the individuals in the mating pair are  $i$ th cousins. As was seen with  $n$ th cousins, with probability  $\frac{1}{4^i}$ , the two alleles were inherited from sib ancestors  $i$  generations ago. Then,  $i + 1$  generations ago, there are three possible cases: with probability  $\frac{1}{4}$ , the alleles coalesce. With probability  $\frac{1}{4}$ , the alleles are in state 1 and have mean coalescence time  $\mathbb{E}[T] + i + 1$ . Finally, with probability  $\frac{1}{2}$ , the alleles are in state 2 and have mean coalescence time  $\mathbb{E}[U] + i + 1$ .

The probability is  $1 - \sum_{i=0}^n \frac{c_i}{4^i}$  that the two alleles are either not in a consanguineous mating pair for all  $i$  from 0 to  $n$ , or not inherited from the shared ancestral mating pair. Then, because chance mating of cousins of degree 0, 1, 2,  $\dots$ ,  $n$  is forbidden, the two alleles are in separate mating pairs  $n + 1$  generations ago and have mean coalescence time  $\mathbb{E}[V] + n + 1$ . Combining the cases for all  $i \leq n$  gives

$$\mathbb{E}[U] = \sum_{i=0}^n \frac{c_i}{4^i} \left( \frac{i+1}{4} + \frac{\mathbb{E}[T] + i + 1}{4} + \frac{\mathbb{E}[U] + i + 1}{2} \right) + (\mathbb{E}[V] + n + 1) \left( 1 - \sum_{i=0}^n \frac{c_i}{4^i} \right). \quad (15)$$

Because parental pairs are chosen uniformly at random with replacement from the  $N$  possible pairs, for two alleles in separate mating pairs, Equation 3 holds as before.

We define  $c$  as the sum over  $i$  of the probability that two alleles in a mating pair chosen at random are inherited by descent from the same allele in a shared ancestral mating pair  $i + 1$  generations in the past:

$$c = \sum_{i=0}^n \frac{c_i}{4^{i+1}}. \quad (16)$$

In other words,  $c$  is defined in the same way as the kinship coefficient of the two individuals in a randomly chosen mating pair (Jacquard 1972; Lange 1997); it is the probability that two alleles selected at random from a randomly chosen mating pair are identical by descent.

Equations 1, 15, and 3 form a system of equations, the solution to which is

$$\mathbb{E}[T] = 4N(1 - 4c) + 4n(1 - 4c) + 16d + 6 \quad (17)$$

$$\mathbb{E}[U] = 4N(1 - 4c) + 4n(1 - 4c) + 16d + 5 \quad (18)$$

$$\mathbb{E}[V] = 4N(1 - 3c) + 3n(1 - 4c) + 12d + 4, \quad (19)$$

where

$$d = \sum_{i=0}^n \frac{ic_i}{4^{i+1}}. \quad (20)$$

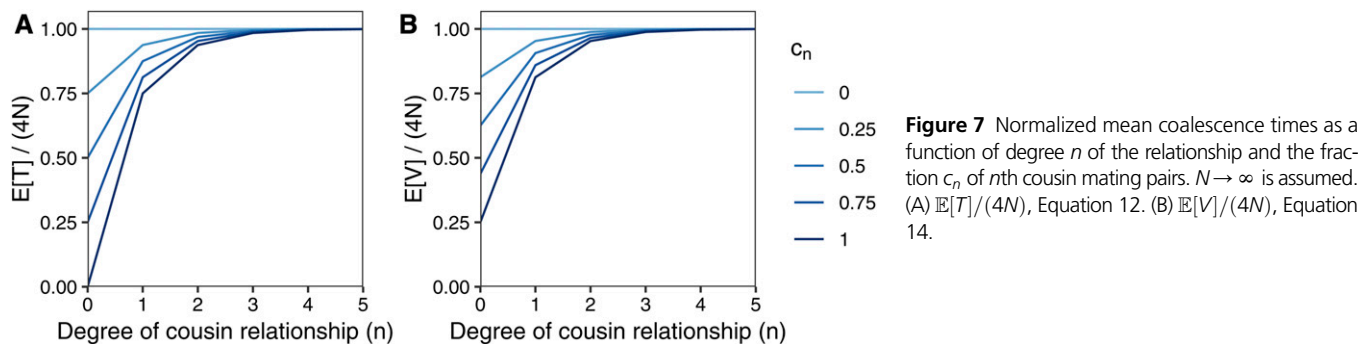
First, if  $c = c_n/4^{n+1}$  for any  $n$ , then Equations 17–19 reduce to Equations 12–14. The difference  $\mathbb{E}[V] - \mathbb{E}[T] = 4Nc - n(1 - 4c) - 4d - 2$  for large  $N$  is approximately  $4Nc$ .

For sufficiently large  $N$ , the constant terms in Equations 17–19 contribute little. Next, for each  $i$ ,  $c_i \leq 1$ , so  $d < \sum_{i=0}^n i/4^{i+1} = \frac{1}{8}$ , and the contributions from  $16d$  in Equations 17 and 18 and from  $12d$  in Equation 19 are relatively small. Finally, noting that for probabilities  $(c_0, \dots, c_n)$  with  $\sum_{i=0}^n c_i \leq 1$ , the sum in Equation 16 is maximized if  $c_0 = 1$  and all other  $c_i$  equal 0, so  $0 \leq c \leq \frac{1}{4}$  and  $0 \leq 1 - 4c \leq 1$ . If  $n \ll N$ , then the maximal contribution of  $4n$  in Equations 17 and 18 and  $3n$  in Equation 19 is also relatively small. Then, except in the sib mating case of  $c_0 = 1$  and  $c = \frac{1}{4}$ , the means in Equations 17–19 are dominated by the product of  $4N$  and the linear reduction factors  $1 - 4c$  in Equations 17 and 18 and  $1 - 3c$  in Equation 19.

## Application to Data

### Background

Previously, Kang *et al.* (2016) demonstrated that ROH sharing increases with consanguinity. Specifically, in their Figure 7, they observed a positive correlation between population means of the total ROH length and population levels of consanguinity available from demographic studies. This relationship accords with our prediction that increased consanguinity reduces within-individual mean pairwise coalescence



**Figure 7** Normalized mean coalescence times as a function of degree  $n$  of the relationship and the fraction  $c_n$  of  $n$ th cousin mating pairs.  $N \rightarrow \infty$  is assumed. (A)  $\mathbb{E}[T]/(4N)$ , Equation 12. (B)  $\mathbb{E}[V]/(4N)$ , Equation 14.

times  $\mathbb{E}[T]$  (Equations 4, 8, 12, and 17), and, hence, increases ROH length.

We use the data of Kang *et al.* (2016) to test predictions about the relationship between consanguinity, ROH, and IBD. Our model of the effect of consanguinity on coalescence times predicts that increased consanguinity decreases mean coalescence times both for pairs of alleles within individuals ( $\mathbb{E}[T]$ ), and for pairs of alleles in individuals in different mating pairs ( $\mathbb{E}[V]$ ), with a larger reduction for within-individual coalescence times. Because more recent coalescence times for pairs of lineages are expected to give rise to elevated genomic sharing, we expect IBD and ROH sharing to be correlated, owing to the fact that their associated coalescence times both decrease with increasing consanguinity. In addition, we expect a larger increase in ROH sharing relative to the corresponding increase in IBD, due to the larger relative decrease of coalescence times for  $\mathbb{E}[T]$  compared to  $\mathbb{E}[V]$ .

#### Data set

We use data from Kang *et al.* (2016) consisting of 202 individuals from 18 Jewish populations, and 2903 individuals from 123 non-Jewish populations, with genotypes available at 257,091 SNPs. We focus our analysis on Jewish individuals classified by Kang *et al.* (2016) into six regional groups: Ethiopian, European, Middle Eastern, North African, South Asian, and Yemenite. The remaining non-Jewish individuals are a combination of the HGDP-CEPH and HapMap III data sets and were included only for phasing.

#### Data analysis

ROH lengths for each individual were taken from Kang *et al.* (2016). Following Pemberton *et al.* (2012), Kang *et al.* (2016) classified ROH segments into three length categories: Class A for short segments, Class B for segments of intermediate length, and Class C for long segments. Kang *et al.* (2016) further examined the relationship between length class and consanguinity, demonstrating that the total length of the Class C segments drives the correlation between ROH length and consanguinity.

To calculate IBD, we first phased the full data set with Beagle 4.1 (Browning and Browning 2007) using the default parameters (maxlr = 5000, lowmem = false, window = 50,000, overlap = 3000, niterations = 5, impute = false, cluster = 0.005, ne = 1,000,000, err = 0.001, seed =

–99,999, modelscale = 0.8) and HapMap GRCh36 genetic maps for the map parameter. From the phased data, we called IBD segments with Refined IBD (Browning and Browning 2013) using the default parameters (window = 40.0, lod = 3.0, length = 1.5, trim = 0.15, scale = 3) and the same map files.

Total ROH length sums segments shared between two haplotypes within an individual, whereas total IBD length is a sum of four haplotype comparisons between two diploid individuals. To make IBD directly comparable with ROH, we calculated total IBD length by summing all segments shared between two individuals (reported by Refined IBD) and dividing by 4. This computation gives the mean total IBD length shared between two haplotypes chosen at random from the two individuals. We averaged this length across all pairs of distinct individuals within populations.

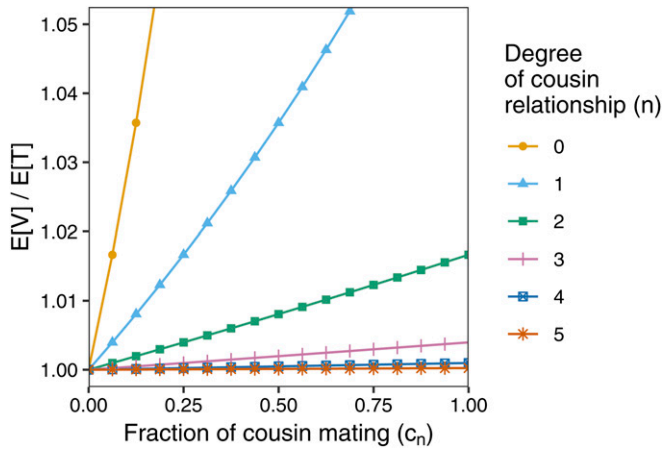
#### Data availability

See Kang *et al.* (2016) for the data used in this study.

#### Results

In Figure 9A, we compare the relationship between mean total IBD across all pairs of individuals and mean total ROH across all individuals in 18 Jewish populations. As noted by Kang *et al.* (2016), the longest ROH lengths occur primarily in the two South Asian Jewish populations and several of the Middle Eastern Jewish populations. Our new computation of IBD length generally accords with those of Atzmon *et al.* (2010), Campbell *et al.* (2012), and Waldman *et al.* (2016a,b), in that the South Asian Jewish populations have the highest IBD sharing, followed by most Middle Eastern and North African Jewish populations, with European, Syrian, and Ethiopian Jews having the least sharing. Note that the particularly high level of IBD sharing in the Mumbai population has been observed previously in an independent sample (Waldman *et al.* 2016a).

IBD and ROH are positively correlated, with  $\rho = 0.63$ . The regression has positive slope 0.12 with  $P = 0.012$ , indicating that, at a population level, a 1 Mb increase in mean total ROH is expected to increase total IBD by 120 kb on average. The positive relationship between ROH and IBD is consistent with the prediction under the model of a correlated relationship for within-and between-individual coalescence times.



**Figure 8** The ratio  $\mathbb{E}[V]/\mathbb{E}[T]$ , or Equation 14/Equation 12, as a function of the fraction of cousin mating  $c_n$ , and the degree of the cousin relationship  $n$ .  $N \rightarrow \infty$  is assumed.

Moreover, the slope is less than 1, reflecting the greater reduction in within-individual coalescence times due to consanguinity compared to between-individual coalescence times.

In Figure 9, B–D, we consider the relationship between mean total IBD and each of the ROH length classes. We observe the strongest correlation of IBD with total Class C or long ROH, with  $\rho = 0.62$ . Classes A (short) and B (intermediate) have positive, but weaker, correlations, with  $\rho = 0.45$  and  $\rho = 0.44$ , respectively. The regression line for Class C is significant with  $P = 0.004$ , whereas for Classes A and B it is not significant, with  $P = 0.113$  and  $P = 0.200$ , respectively. The relationship between IBD length and Class C ROH length suggests that, in general, IBD and ROH are correlated because both are affected by consanguinity, in agreement with our theoretical predictions. The weaker correlations between IBD length and Classes A and B might result from comparatively less accurate calling of short IBD segments.

## Discussion

### Summary

We have studied the effect of consanguinity on within- and between-individual coalescence times. We extended the sib mating model of Campbell (2015) to permit first cousin mating,  $n$ th cousin mating, and a superposition of multiple levels of cousin mating, deriving mean coalescence times for two alleles within an individual ( $\mathbb{E}[T]$ ) and two alleles in separate mating pairs ( $\mathbb{E}[V]$ ). We found that consanguinity linearly reduces both means, with a greater reduction for within-individual coalescence times. To test our theoretical predictions, we studied ROH and IBD patterns in 18 Jewish populations, finding that they are correlated, and that the correlation is driven by long Class C ROH. These results support the prediction of the modeling framework that ROH and IBD levels are both amplified by consanguinity.

In each of our various models, for large  $N$ ,  $\mathbb{E}[T]$  and  $\mathbb{E}[V]$  are approximately equal to the product of  $4N$ , the mean  $T_{MRCA}$  in a haploid population of size  $4N$ , and a linear reduction term that depends on the fraction of consanguineous pairs and their degree of consanguinity. Thus, although the model considers diploids with a rigid monogamous mating structure, its coalescence times produce a close relationship to those of the standard haploid model.

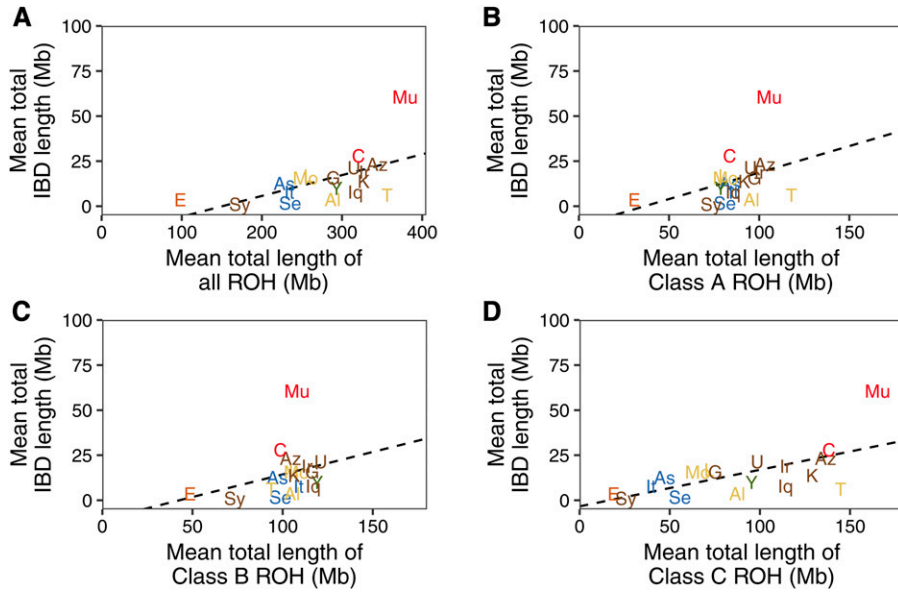
The difference  $\mathbb{E}[V] - \mathbb{E}[T]$  is approximately  $c_n N / 4^n$  for  $n$ th cousin mating and  $4Nc$  for the superposition of different mating levels. The quantity  $4Nc$  can be viewed as the expected number of coalescence events due to consanguinity, as it is the product of the number of pairs of alleles in two individuals in a mating pair ( $4N$ ) and the probability that two alleles in a mating pair are identical by descent, and, therefore, coalesce quickly rather than on a coalescent timescale ( $c$ ). In other words, two alleles in the same individual have probability  $c$  of having a coalescence time near zero, so that on average their coalescence time is expected to be  $4Nc$  less than that of two alleles that are in different mating pairs and that do not have the probability  $c$  of near-immediate coalescence. Note that this perspective, based on the superposition case, also applies in the  $n$ th cousin mating case, as the difference  $\mathbb{E}[V] - \mathbb{E}[T]$  for  $n$ th cousins is  $c_n N / 4^n = 4Nc_n / 4^{n+1}$ , and  $c_n / 4^{n+1}$  is the probability that two alleles in two individuals in a mating pair are identical by descent in this case.

### Theoretical population genetics of ROH and IBD

If two genomes share a recent common ancestor at a site, then the length of the shared segment surrounding that site is likely to be long, because recombination has had little time to break down the segment. If the genomes share a distant common ancestor, then the surrounding segment is likely to be short because recombination will have had many generations to break it. In this way, recombination produces an inverse relationship between coalescence times at a genomic site and the length of the surrounding shared segment (Palamara *et al.* 2012; Carmi *et al.* 2014; Browning and Browning 2015). The results of our model, that increased consanguinity decreases both within-individual and between-individual coalescence times, suggest that populations with higher rates of consanguinity will have more recent coalescence times and will share longer ROH and IBD segments. Moreover, the result  $\mathbb{E}[T] < \mathbb{E}[V]$  suggests that the reduction is greater for ROH than for IBD, and that consanguinity will have a stronger effect on ROH sharing.

To study ROH and IBD together in the same model, we generalized a diploid coalescent model of sib mating. The Campbell (2015) model and its generalization represent examples of the increasing integration of coalescent perspectives into models that consider a diploid pedigree structure (Wollenberg and Avise 1998; Wakeley *et al.* 2012, 2016; Wilton *et al.* 2017; King *et al.* 2018). For example, Wakeley *et al.* (2012) found that, in a pedigree-based coalescent model, compared to a standard haploid model, the distribution of pairwise coalescence times for random pairs of





**Figure 9** Mean total ROH and mean total IBD length for 18 Jewish populations. Populations are color-coded by regional group as in Kang *et al.* (2016); Ethiopian (orange), European (blue), Middle Eastern (brown), North African (yellow), South Asian (red), and Yemenite (green). Al, Algerian; As, Ashkenazi; Az, Azerbaijani; C, Cochin; E, Ethiopian; G, Georgian; Iq, Iraqi; Ir, Iranian; It, Italian; K, Kurdish; L, Libyan; Mo, Moroccan; Mu, Mumbai; Se, Sephardi; Sy, Syrian; T, Tunisian; U, Uzbekistani; Y, Yemenite. (A) All ROH. The regression equation is  $y = 0.12x - 17.37$  ( $r^2 = 0.337$ ,  $P = 0.012$ ). (B) Class A short ROH. The regression equation is  $y = 0.29x - 10.71$  ( $r^2 = 0.150$ ,  $P = 0.113$ ). (C) Class B intermediate ROH. The regression equation is  $y = 0.25x - 10.67$  ( $r^2 = 0.100$ ,  $P = 0.200$ ). (D) Class C long ROH. The regression equation is  $y = 0.20x - 3.34$  ( $r^2 = 0.407$ ,  $P = 0.004$ ).

individuals was altered, most strongly for the most recent coalescence times. Otherwise, the two models have similar coalescence time distributions. In our case, consideration of the pedigree—with no consanguinity—produced mean pairwise coalescence times close to the haploid mean pairwise coalescence time of  $4N$ . The inclusion of consanguinity in the model decreased the mean coalescence time by a linear factor dependent on the kinship coefficient of a randomly chosen mating pair.

Contrasting two hypotheses—one in which both within-individual ROH and between-individual IBD are increased by consanguinity, and the other in which consanguinity increases ROH but not IBD—we found support for the former rather than the latter view. According to our model, consanguinity inflates relatedness not only within families, but in the population in general, so that mean pairwise coalescence times decrease with increasing consanguinity, both for pairs of alleles within individuals and for pairs of alleles in separate mating pairs. We can understand this phenomenon through the concept of coalescent effective population size. In this perspective (Sjödin *et al.* 2005), mean pairwise coalescence times have a direct relationship with effective size. Consequently, the direct relationship that we observed between coalescence times associated with ROH and those associated with IBD can be viewed as resulting from a decreased coalescent effective size that in turn results from consanguinity, and which decreases coalescence times both within and between individuals.

Previously, Jacquard (1970) studied the effect of inbreeding avoidance on effective population size. He modeled a two-sex, diploid population of  $N$  individuals with equally many males and females, considering cases with and without sib mating avoidance (Jacquard 1970, p. 175, 245). Sib mating avoidance generated a slightly larger effective size compared to the case in which sib mating was permissible, analogous to our observation that coalescence times decrease with increasing sib mating.

The sib mating case of our model is also similar to models of partial selfing in plants (Charlesworth 2003). Such models can be viewed as having a linear combination of “consanguinity” (selfing) and “random mating” (outcrossing). In our sib mating model, two alleles have probability  $\frac{c_0}{4}$  of coalescing in the previous generation, whereas, under partial selfing, alleles have probability  $\frac{s}{2}$  of coalescing in the previous generation, where  $s$  is the selfing rate. In a partially selfing population of  $2N$  diploid individuals, taking  $N \rightarrow \infty$ , the effective population size is  $2N(1 - \frac{s}{2})$  individuals (Pollak 1987; Nordborg and Donnelly 1997), a product of the effective size in a randomly mating population and a linear reduction factor proportional to the probability of coalescence, similar to our findings for  $\mathbb{E}[T]$  and  $\mathbb{E}[V]$ . Our results are analogous to those of Milligan (1996), who studied the effect of partial selfing on within- and between-individual coalescence times,  $T_w$  and  $T_b$ , respectively, finding  $\mathbb{E}[T_w] = 4N(1 - s)$  and  $\mathbb{E}[T_b] = 4N(1 - \frac{s}{2})$  for a population of size  $2N$  diploid individuals. The greater reduction in coalescence time for within- vs. between-individual comparisons echoes our results for  $\mathbb{E}[T]$  and  $\mathbb{E}[V]$ . Moreover,  $\mathbb{E}[T_b] - \mathbb{E}[T_w] = 4N\frac{s}{2}$ , the product of the number of alleles and the probability of rapid coalescence from selfing, analogous to the difference  $4Nc$  that we found for  $\mathbb{E}[V] - \mathbb{E}[T]$ .

### IBD in Jewish populations

Our population ordering by ROH and IBD accords with previous studies in Jewish populations (Atzmon *et al.* 2010; Campbell *et al.* 2012; Waldman *et al.* 2016a,b). Kang *et al.* (2016) observed that their ordering of populations by mean total ROH lengths was similar to the ordering reported by Waldman *et al.* (2016b). We find that the ordering of mean total IBD length in the data of Kang *et al.* (2016) is also similar to that of Waldman *et al.* (2016b). For the populations included in both studies, Waldman *et al.* (2016b) reported, in decreasing order, Mumbai, Cochin, Iranian, Libyan, Italian,

Iraqi, Tunisian, Georgian, Yemenite, Syrian, Ashkenazi, Moroccan, Algerian, and Sephardi. Here we find a similar ordering: Mumbai, Cochin, Iranian, Libyan, Georgian, Moroccan, Ashkenazi, Yemenite, Iraqi, Italian, Tunisian, Algerian, Sephardi, and Syrian. Although some specific rankings differ, South Asian Jewish populations generally share the most IBD, followed primarily by some of the Middle Eastern and North African Jewish populations, with European Jewish populations tending toward intermediate and lower levels.

From our model, we expect ROH and IBD to be correlated because  $\mathbb{E}[T]$  and  $\mathbb{E}[V]$  both depend on consanguinity. Because  $\mathbb{E}[T] < \mathbb{E}[V]$ , we expect a stronger effect of consanguinity on ROH than on IBD. Indeed, we find that ROH and IBD are correlated with positive regression slope less than 1, reflecting the weaker effect of consanguinity on IBD. In particular, the correlation is strongest with Class C (long) ROH, though Classes A and B might produce larger correlations if IBD calling for short segments was more accurate. Long ROH in a population reflect consanguinity because long segments are the most likely to share a recent ancestor (Pemberton *et al.* 2012; Kang *et al.* 2016); the correlation between Class C ROH and IBD supports the prediction of our model that ROH and IBD are correlated because they are both amplified by consanguinity.

### Limitations and extensions

Our analysis has a number of limitations. First, we assumed a constant population size and a constant fraction of consanguineous unions each generation. It might be possible to generalize these assumptions to accommodate temporal changes in population size and consanguinity that could affect ROH and IBD distributions. We also did not consider population substructure, which is potentially relevant if consanguinity is practiced as a culturally transmitted trait in subgroups of a population. Substructure would affect within- and between-individual coalescence probabilities, and, in turn, coalescence times. In the same manner that inbreeding and substructure can be viewed as forms of the same general phenomenon of deviation from random mating, it is possible that a structured population in which random mating occurs within subpopulations, but not between them, could produce similar phenomena to those we have seen in our consanguinity model.

Second, we focused only on neutral loci. Loci experiencing balancing selection can exhibit evidence of excess genetic differences for pairs of alleles sampled within individuals compared to that seen between individuals, so that a reverse effect  $\mathbb{E}[T] > \mathbb{E}[V]$  might be observed. For example, for the HLA locus, Robertson *et al.* (1999) studied identity of haplotypes for haplotypes in the same individual and for haplotypes in different individuals, quantities expected to be inversely related to pairwise coalescence times under a neutral model. In a population with no first cousin and closer matings, they found an excess in the number of within-individual vs. between-individual haplotype differences

compared to a neutral prediction, suggesting an increase in within-individual vs. between-individual coalescence times at the HLA locus. This result, which contrasts with our prediction of greater difference for between-individual comparisons, suggests that caution is warranted in interpreting ROH and IBD with our model for regions experiencing balancing selection.

A third limitation is that for  $n$ th cousin mating, we assumed  $n \ll N$ . However, in practical scenarios, if  $n$  is large, then randomly mating pairs are related to some degree, and if  $N$  is small, then double-first cousin mating is non-negligible. It might therefore be unrealistic to consider  $n$  large in our model. A fourth limitation is that we did not examine the full distributions of  $T$  and  $V$ ; further information about these distributions will be important for clarifying the theoretical relationship between ROH and IBD more precisely.

The same approach we took here can also be applied to other consanguinity regimes. Double-first cousins, for example, have twice the number of paths to a recent common ancestor as first cousins. In Equation 7,  $\frac{c_1}{4}$  is the probability that two alleles in a mating pair are inherited from a shared grandparental mating pair. If, instead, we consider double-first cousins, and if  $d_1$  is the fraction of double-first cousin mating pairs, then  $\frac{d_1}{2}$  is the probability that two alleles in the two individuals of a mating pair are inherited from a shared grandparental mating pair. Substituting  $\frac{d_1}{2}$  for  $\frac{c_1}{4}$  in Equation 7 gives a computation for double-first cousin mating.

Our model has implications for empirical studies of ROH and IBD. Studies have used properties of IBD for inference of demographic parameters (*e.g.*, Palamara *et al.* 2012; Harris and Nielsen 2013; Ralph and Coop 2013), and joint interpretation of ROH and IBD can potentially provide information about consanguinity. One method for distinguishing between the effects of small population size and those of consanguinity is to examine the relationship between the number and length of ROH segments (Ceballos *et al.* 2018). Our results suggest that examining the number and length of IBD segments could also assist in disentangling these effects, as such features of IBD segments are also affected by consanguinity.

The reduction we observed in coalescence times owing to consanguinity implies that assuming random mating when inferring effective population size may produce underestimates. Under random mating, the mean coalescence time is  $4N$ , whereas we find that, with consanguinity, it is  $4N(1 - 3c)$ . Thus, in populations with consanguinity, an apparent estimate of  $4N$  might actually be an estimate of  $4N(1 - 3c)$ . Lastly, our finding that  $\mathbb{E}[T]$  and  $\mathbb{E}[V]$  depend on the population size  $N$  and the kinship coefficient  $c$  suggests that given the full distributions of these random variables, it may be possible to infer  $N$  and  $c$  from joint analysis of ROH and IBD sharing.

We have introduced a model for the simultaneous analysis of ROH and IBD, finding that both are driven by the same phenomena of consanguinity and reduction in effective population size. ROH and IBD have often been analyzed separately, with different motivations and techniques. Our results provide a formal connection between ROH and IBD,

demonstrating the utility of considering them together in the same analysis.

## Acknowledgments

We thank J. Kang for bioinformatics assistance. Support was provided by National Institutes of Health grant R01 HG005855, Unites States-Israel Binational Science Foundation grant 2017024, and by a National Science Foundation Graduate Research Fellowship.

## Literature Cited

- Atzmon, G., L. Hao, I. Pe'er, C. Velez, A. Pearlman *et al.*, 2010 Abraham's children in the genome era: major Jewish diaspora populations comprise distinct genetic clusters with shared Middle Eastern ancestry. *Am. J. Hum. Genet.* 86: 850–859. <https://doi.org/10.1016/j.ajhg.2010.04.015>
- Browning, B. L., and S. R. Browning, 2013 Improving the accuracy and efficiency of identity by descent detection in population data. *Genetics* 194: 459–471. <https://doi.org/10.1534/genetics.113.150029>
- Browning, S. R., and B. L. Browning, 2007 Rapid and accurate haplotype phasing and missing-data inference for whole-genome association studies by use of localized haplotype clustering. *Am. J. Hum. Genet.* 81: 1084–1097. <https://doi.org/10.1086/521987>
- Browning, S. R., and B. L. Browning, 2012 Identity by descent between distant relatives: detection and applications. *Annu. Rev. Genet.* 46: 617–633. <https://doi.org/10.1146/annurev-genet-110711-155534>
- Browning, S. R., and B. L. Browning, 2015 Accurate non-parametric estimation of recent effective population size from segments of identity by descent. *Am. J. Hum. Genet.* 97: 404–418. <https://doi.org/10.1016/j.ajhg.2015.07.012>
- Campbell, C. L., P. F. Palamara, M. Dubrovsky, L. R. Botigué, M. Fellous *et al.*, 2012 North African Jewish and non-Jewish populations form distinctive, orthogonal clusters. *Proc. Natl. Acad. Sci. USA* 109: 13865–13870. <https://doi.org/10.1073/pnas.1204840109>
- Campbell, R. B., 2015 The effect of inbreeding constraints and offspring distribution on time to the most recent common ancestor. *J. Theor. Biol.* 382: 74–80. <https://doi.org/10.1016/j.jtbi.2015.06.037>
- Carmi, S., P. R. Wilton, J. Wakeley, and I. Pe'er, 2014 A renewal theory approach to IBD sharing. *Theor. Popul. Biol.* 97: 35–48. <https://doi.org/10.1016/j.tpb.2014.08.002>
- Ceballos, F. C., P. K. Joshi, D. W. Clark, M. Ramsay, and J. F. Wilson, 2018 Runs of homozygosity: windows into population history and trait architecture. *Nat. Rev. Genet.* 19: 220–234. <https://doi.org/10.1038/nrg.2017.109>
- Charlesworth, D., 2003 Effects of inbreeding on the genetic diversity of populations. *Philos. Trans. R. Soc. Lond. B Biol. Sci.* 358: 1051–1070. <https://doi.org/10.1098/rstb.2003.1296>
- Harris, K., and R. Nielsen, 2013 Inferring demographic history from a spectrum of shared haplotype lengths. *PLoS Genet.* 9: e1003521. <https://doi.org/10.1371/journal.pgen.1003521>
- Hunter-Zinck, H., S. Musharoff, J. Salit, K. A. Al-Ali, L. Chouchane *et al.*, 2010 Population genetic structure of the people of Qatar. *Am. J. Hum. Genet.* 87: 17–25. <https://doi.org/10.1016/j.ajhg.2010.05.018>
- Jacquard, A., 1970 *The Genetic Structure of Populations*. Springer-Verlag, New York.
- Jacquard, A., 1972 Genetic information given by a relative. *Bio-metrics* 28: 1101–1114. <https://doi.org/10.2307/2528643>
- Kang, J. T. L., A. Goldberg, M. D. Edge, D. M. Behar, and N. A. Rosenberg, 2016 Consanguinity rates predict long runs of homozygosity in Jewish populations. *Hum. Hered.* 82: 87–102. <https://doi.org/10.1159/000478897>
- Karafet, T. M., K. B. Bulayeva, O. A. Bulayev, F. Gurganova, J. Omarova *et al.*, 2015 Extensive genome-wide autozygosity in the population isolates of Dagestan. *Eur. J. Hum. Genet.* 23: 1405–1412. <https://doi.org/10.1038/ejhg.2014.299>
- King, L., J. Wakeley, and S. Carmi, 2018 A non-zero variance of Tajima's estimator for two sequences even for infinitely many unlinked loci. *Theor. Popul. Biol.* 122: 22–29. <https://doi.org/10.1016/j.tpb.2017.03.002>
- Kirin, M., R. McQuillan, C. S. Franklin, H. Campbell, P. M. McKeigue *et al.*, 2010 Genomic runs of homozygosity record population history and consanguinity. *PLoS One* 5: e13996. <https://doi.org/10.1371/journal.pone.0013996>
- Lange, K., 1997 *Mathematical and Statistical Methods for Genetic Analysis*. Springer, New York. <https://doi.org/10.1007/978-1-4757-2739-5>
- Milligan, B. G., 1996 Estimating long-term mating systems using DNA sequences. *Genetics* 142: 619–627.
- Nordborg, M., and P. Donnelly, 1997 The coalescent process with selfing. *Genetics* 146: 1185–1195.
- Palamara, P. F., T. Lencz, A. Darvasi, and I. Pe'er, 2012 Length distributions of identity by descent reveal fine-scale demographic history. *Am. J. Hum. Genet.* 91: 809–822. <https://doi.org/10.1016/j.ajhg.2012.08.030>
- Pemberton, T. J., D. Absher, M. W. Feldman, R. M. Myers, N. A. Rosenberg *et al.*, 2012 Genomic patterns of homozygosity in worldwide human populations. *Am. J. Hum. Genet.* 91: 275–292. <https://doi.org/10.1016/j.ajhg.2012.06.014>
- Pollak, E., 1987 On the theory of partially inbreeding finite populations. I. Partial selfing. *Genetics* 117: 353–360.
- Ralph, P., and G. Coop, 2013 The geography of recent genetic ancestry across Europe. *PLoS Biol.* 11: e1001555. <https://doi.org/10.1371/journal.pbio.1001555>
- Robertson, A., D. Charlesworth, and C. Ober, 1999 Effect of inbreeding avoidance on Hardy-Weinberg expectations: examples of neutral and selected loci. *Genet. Epidemiol.* 17: 165–173. [https://doi.org/10.1002/\(SICI\)1098-2272\(1999\)17:3<165::AID-GEPI2>3.0.CO;2-L](https://doi.org/10.1002/(SICI)1098-2272(1999)17:3<165::AID-GEPI2>3.0.CO;2-L)
- Scott, E. M., A. Halees, Y. Itan, E. G. Spencer, Y. He *et al.*, 2016 Characterization of greater Middle Eastern genetic variation for enhanced disease gene discovery. *Nat. Genet.* 48: 1071–1076. <https://doi.org/10.1038/ng.3592>
- Sjödin, P., I. Kaj, S. Krone, M. Lascoux, and M. Nordborg, 2005 On the meaning and existence of an effective population size. *Genetics* 169: 1061–1070. <https://doi.org/10.1534/genetics.104.026799>
- Thompson, E. A., 2013 Identity by descent: variation in meiosis, across genomes, and in populations. *Genetics* 194: 301–326. <https://doi.org/10.1534/genetics.112.148825>
- Wakeley, J., 2009 *Coalescent Theory: An Introduction*. Roberts & Company, Greenwood Village, CO.
- Wakeley, J., L. King, B. S. Low, and S. Ramachandran, 2012 Gene genealogies within a fixed pedigree, and the robustness of Kingman's coalescent. *Genetics* 190: 1433–1445. <https://doi.org/10.1534/genetics.111.135574>
- Wakeley, J., L. King, and P. R. Wilton, 2016 Effects of the population pedigree on genetic signatures of historical demographic events. *Proc. Natl. Acad. Sci. USA* 113: 7994–8001. <https://doi.org/10.1073/pnas.1601080113>
- Waldman, Y. Y., A. Biddanda, N. R. Davidson, P. Billing-Ross, M. Dubrovsky *et al.*, 2016a The genetics of Bene Israel from India reveals both substantial Jewish and Indian ancestry. *PLoS One* 11: e0152056. <https://doi.org/10.1371/journal.pone.0152056>

- Waldman, Y. Y., A. Biddanda, M. Dubrovsky, C. L. Campbell, C. Oddoux *et al.*, 2016b The genetic history of Cochin Jews from India. *Hum. Genet.* 135: 1127–1143. <https://doi.org/10.1007/s00439-016-1698-y>
- Wilton, P. R., P. Baduel, M. M. Landon, and J. Wakeley, 2017 Population structure and coalescence in pedigrees: comparisons to the structured coalescent and a framework for inference. *Theor. Popul. Biol.* 115: 1–12. <https://doi.org/10.1016/j.tpb.2017.01.004>
- Wollenberg, K., and J. C. Avise, 1998 Sampling properties of genealogical pathways underlying population pedigrees. *Evolution* 52: 957–966. <https://doi.org/10.1111/j.1558-5646.1998.tb01825.x>
- Woods, C. G., J. Cox, K. Springell, D. J. Hampshire, M. D. Mohamed *et al.*, 2006 Quantification of homozygosity in consanguineous individuals with autosomal recessive disease. *Am. J. Hum. Genet.* 78: 889–896. <https://doi.org/10.1086/503875>

*Communicating editor: R. Nielsen*