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# The mutation rate in human evolution and demographic inference

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#### Abstract

The germline mutation rate has long been a major source of uncertainty in 7 human evolutionary and demographic analyses based on genetic data, but estimates 8 have improved substantially in recent years. I discuss our current knowledge of the 9 mutation rate in humans and the underlying biological factors affecting it, which 10 include generation time, parental age and other developmental and reproductive 11 timescales. There is good evidence for a slowdown in mean mutation rate during 12 great ape evolution, but not for a more recent change within the timescale of human 13 genetic diversity. Hence, pending evidence to the contrary, it is reasonable to use 14 a present-day rate of approximately  $0.5 \times 10^{-9}$  bp<sup>-1</sup> yr<sup>-1</sup> in all human or hominin 15 demographic analyses. 16

Population genetics provides a theoretical framework for inferring evolution, including 17 changes in demography, based on genetic variation between individuals. It is primarily 18 concerned with relative changes, in the sense that properties such as divergence time and 19 population size are expressed in scaled units whose relationship to the time in years or 20 number of individuals involved is not fixed. This is appropriate for genetic data, which 21 is generally comparative in nature and carries no explicit record of absolute time or 22 population size. However such data is only one of several sources of information about 23 the evolutionary past, and the question of a timescale must be addressed if we want to 24 relate genetic inferences to evidence from fossil, archaeological and paleoenvironmental 25 data. 26

<sup>27</sup> Most demographic analyses are based on differences due to genomic mutational <sup>28</sup> events, typically single-nucleotide polymorphisms, and the quantities they estimate are <sup>29</sup> naturally expressed as genetic divergence in units of substitutions per base pair. In sim-<sup>30</sup> ple terms, the genetic divergence d between two samples can be converted to a time t <sup>31</sup> in years since their common ancestor by the expression  $2t = d/\mu$ , where  $\mu$  is the mean <sup>32</sup> yearly germline mutation rate over that period. Unfortunately, the question of what

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value of  $\mu$  to use is less straightforward, as the germline mutation rate depends on multiple factors which may have varied substantially over time, and about which we may have little or no historical information. It also depends on which regions of the genome are analysed and at what level of sensitivity and specificity, making it potentially difficult to estimate an appropriate rate for a given demographic analysis or to compare estimates made using different approaches.

## <sup>39</sup> Mutation rates in present-day and recent human evolution

The first estimates of the human mutation rate predate the availability of molecular 40 genetic data, and were based on the incidence of *de novo* (uninherited) disease cases 41 where the causative allele was thought to be dominant [1, 2]. In recent years, taking 42 advantage of developments in genome sequencing technology, several new methods of 43 estimation using genomic data have been implemented (Figure 1). Of these, estimates 44 of the present-day genome-wide mutation rate have mostly agreed with each other, even 45 as sequencing technologies have developed and sample sizes have grown. In particular, 46 estimates based on whole-genome sequencing in family trios (the majority of studies) 47 have consistently fallen in the range  $1.1-1.3 \times 10^{-8}$  bp<sup>-1</sup> [3–12], as did the first esti-48 mate based on identity by descent (IBD) within a pedigree [13]. Other studies have 49 yielded slightly higher estimates however, including a more recent population-IBD esti-50 mate which obtained a value of  $1.66 \times 10^{-8}$  bp<sup>-1</sup> [14], and alternative approaches using 51 calibration against different genetic mutational processes [15, 16]. Since these methods 52 are sensitive to somewhat older timescales than sequencing in families, which detects 53 mutations accumulated over a generation or two at most, one possibility is that they 54 reflect higher ancient mutation rates which have slowed in recent human evolution. 55

However, there are also reasons why sequencing family trios may slightly underes-56 timate the present-day mutation rate. The main advantage of this approach is that 57 potential samples are plentiful, allowing the measurement not just of mean rate but also 58 variation with factors such as parental age and genomic distribution [8, 20]. Also, unlike 59 in other methods the temporal baseline (usually a single generation) is unambiguous. Its 60 principal disadvantage is that single-generation *de novo* mutations are rare relative to 61 the error rate in variant calling (60–100 mutations per individual), so false negative and 62 false positive rates are both high and difficult to estimate. To mitigate this, genomic 63 regions where variants are difficult to call are generally excluded via filtering, but these 64 regions are not easy to identify and the callable genome length may be overestimated, 65 leading to an underestimate in the per-bp mutation rate. Most of the studies cited here 66 have attempted to quantify and account for this using simulations or validation against 67 other methods of variant discovery, but it remains possible that true *de novo* mutation 68 rates are consistently underestimated to some degree. 69

Another potential downward bias in mutation rate estimation from family trio sequencing arises from the fact that such experiments generally compare somatic cells rather than germ cells. An early post-zygotic mutation occurring prior to germline specification in either parent may be detected in that individual's soma as well as his or

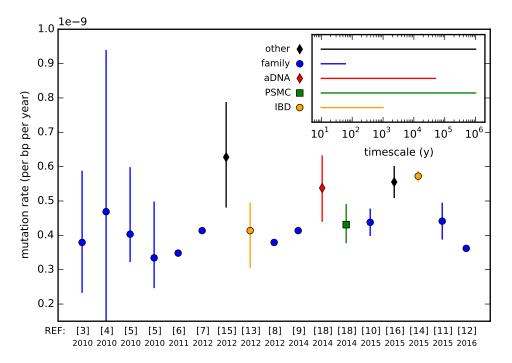


Figure 1: Recent estimates of the human genome-wide mutation rate. Estimates are shown as yearly rates, scaled where necessary using a mean generation time of 29 yrs [17]; confidence intervals (90% or 95%) are shown where reported. Citation numbers and publication years are given on the x-axis. family: Family sequencing compares genomes sampled from consecutive generations in one or more families, and within each one identifies de novo mutations present in offspring and in neither parent [3-12]. Per-generation mutation rate is calculated as the mean number of *de novo* mutations seen divided by the length of 'callable' genome sequenced (the number of genomic positions where a *de novo* mutation would have been called if present). **IBD**: Estimation based on identity by descent (IBD) detects *de novo* mutations as differences between chromosomal tracts which have been inherited IBD within or between individuals, for example in samples which are related to each other within a multi-generation pedigree. Information about the number of generations separating chromosomes may come from genealogical records [13] and/or from genetic inference [14]. **aDNA**: Estimation based on branch shortening in ancient DNA uses genome sequence data from an ancient human sample of known age (established with radioisotope dating) and divides the mean number of extra mutations found in present-day humans by the separation in time [18]. **PSMC**: The pairwise sequential Markovian coalescent method infers ancestral effective population size from diploid genome sequence data [19]. A mutation rate can be estimated as the one which best aligns effective population size histories inferred from modern and ancient samples after accounting for the known age difference between them [18]. other: Methods based on comparison with other mutational clocks: calibration using coalescent time estimates based on microsatellite mutations [15]; calibration against the recombination rate and expected variation of heterozygosity in diploid genomes [16]. Inset: Indicative timescales over which mutations detected by each method (or which otherwise influence its estimate) have accumulated.

<sup>74</sup> her offspring, and hence, seemingly present in both generations, might not be correctly
<sup>75</sup> identified as a *de novo* mutation [21–23]. This could be a significant factor if cellular
<sup>76</sup> mutation rates are particularly high in the earliest cell divisions of embryogenesis.

In principle, estimates based on IBD in a multi-generation pedigree should be less 77 susceptible to either of these biases. Multiple accumulated mutations in IBD tracts are 78 more easily distinguished from sequencing noise than in family sequencing, especially for 79 larger pedigrees, and this approach can detect all germline mutations (excepting perhaps 80 early post-zygotic mutations in the common ancestor of a given tract). However they are 81 not without their own methodological issues: genealogical information and uncertainty 82 in the inference of relatedness and IBD are potential sources of error. In particular the 83 boundaries of IBD tracts and the path of inheritance may be ambiguous, and the total 84 extent of regions in which mutations can be detected may be quite limited except in 85 close and inbred pedigrees. Pedigree datasets are also more difficult to collect, and since 86 the two such genome-wide estimates published to date have not overlapped [13, 14], it 87 is difficult to assess the significance of their disagreement with other methods. We can 88 expect forthcoming studies to help clarify this picture. 89

#### <sup>90</sup> The exomic mutation rate

Mutation rates are known to vary between genomic loci [24], and the estimates discussed 91 above are based either on whole genome data or (in the case of IBD estimates) on 92 regions sampled genome wide without regard to location or context. Other studies, 93 mostly using family trio sequencing, have been based on data sampled only from exomes 94 [25–30], and have tended to yield higher values than equivalent whole-genome studies 95 (ranging from  $1.3-2.0 \times 10^{-8}$  bp<sup>-1</sup> with a mean of  $1.5 \times 10^{-8}$  bp<sup>-1</sup>). This is consistent 96 with the elevated GC content of genic regions and the increased mutability of GC-rich 97 sequence (discussed below), but it may also be that the biases discussed above are of 98 less consequence for exome sequencing data. Consistent with the latter possibility is the 99 fact that a recent IBD-based estimate in exomes of  $1.45 \times 10^{-8}$  bp<sup>-1</sup> [31] is only slightly 100 below the mean of trio-based estimates published so far. 101

# <sup>102</sup> Mutation rates in great ape evolution

Before the advent of high-throughput genome sequence data, estimates of the human 103 mutation rate were generally based on phylogenetic calibration:  $\mu = d/2t_s$ , where d is 104 the genetic divergence between two species and  $t_s$  the time since speciation as estimated 105 from the fossil record. In principle, allowance must also be made for the difference 106 between speciation and genetic divergence times, corresponding to coalescence within 107 the ancestral population, but in practice the magnitude of this can usually only be 108 guessed [32]. Phylogenetic calibration has some potential advantages: fossils can often 109 be dated with relatively high accuracy using radiometric or stratigraphic methods, and 110 since it estimates the mean substitution rate over the time separating the two species, 111 it accounts automatically for selection and other time-varying factors which may com-112

<sup>113</sup> plicate extrapolation from present-day rates.

By the time the first mutation rate estimates from *de novo* sequencing appeared, 114 the field had largely settled on a consensus value of  $1.0 \times 10^{-9}$  bp<sup>-1</sup> yr<sup>-1</sup> for the yearly 115 rate in hominid evolution [33]. Thus the finding that de novo estimates were a factor 116 of two lower than this prompted considerable debate [34]. For some events, such as 117 the speciation of humans and chimpanzees, a higher rate had been increasingly difficult 118 to reconcile with fossil and archaeological data, and a lower value (implying older date 119 estimates) mostly improved concordance [35, 36]. However for more ancient events a 120 longer timescale was problematic, and to a large extent remains so still. For example, 121 applying a present-day human mutation rate of  $0.5 \times 10^{-9}$  bp<sup>-1</sup> yr<sup>-1</sup> to the 2.6% genetic 122 divergence between humans and orang-utans [37] yields an divergence time of 26 Mya. 123 Even allowing for a large ancestral coalescent time of 5 Myr this is substantially older 124 than the dates of 12–16 Mya typically quoted in paleoanthropological literature [38]. 125 The difference increases for older dates: the human-macaque divergence [39] implies a 126 speciation more than 40 Mya, whereas paleoanthropological studies generally place this 127 node at 25–30 Mya [40]. 128

One way to resolve this discrepancy is to regard it as evidence for a faster mutation 129 rate 20 Mya or more, and hence a slowdown in mean rates since that time. In fact, such a 130 hypothesis is also supported by differing branch lengths within the primates as measured 131 from an outgroup or common ancestor, with hominid (great ape) lineages being shorter 132 than those of other primate groups by a factor of 1.4-1.6 [41-43]. Because the branch 133 shortening applies to all great apes (albeit to varying degrees), such a slowdown cannot 134 have occurred only on the human branch, and if it occurred more recently than the 135 hominoid ancestor (so that a higher mean mutation rate applies to dating the orang-utan 136 divergence), it must have involved a degree of parallelism across all hominid lineages. 137 This is not impossible for closely-related species, but might be regarded as unlikely a138 priori. It is estimated that compared to humans, chimpanzees have evolved only 2% 139 faster since divergence, and gorillas 7% faster [41]. Indeed, a measurement of present-140 day mutation rate in chimpanzees based on sequencing de novo mutations in a multi-141 generation pedigree has also produced a value of  $1.2 \times 10^{-8}$  bp<sup>-1</sup> [44], very similar to 142 equivalent human estimates. 143

However, timing constraints based on fossil evidence should be handled with cau-144 tion. Even where fossils are themselves well dated, their correct placing relative to a 145 particular speciation event may be far from straightforward [45, 46]. There may also 146 be important differences between the evolution of anatomical phenotypes represented 147 in fossil taxa and the genetic differences involved in speciation, particularly when the 148 possibility of ancestral population substructure around the time of speciation is taken 149 into account. More fundamentally, fossil evidence tends to be more informative about 150 lower bounds than upper bounds on speciation dates (essentially because the presence of 151 derived characteristics is more informative than their absence), and so 'stem' taxa which 152 appear ancestral to a speciation event provide only weak constraints on its earliest pos-153 sible date [45, 47, 48]. Thus it may be premature to conclude that a genetic estimate of 154 20–23 Mya for the orang-utan speciation is irreconcilable with fossil evidence, and the 155

implied slowdown in mutation rate may be less than expected both in magnitude and
(especially if prior to the orang-utan speciation) in the degree of any parallel evolution
involved.

# <sup>159</sup> Causes and correlates of mutation rate variability

In addition to direct evidence from present-day and ancient genomic data, it may also be possible to learn about past mutation rates indirectly by studying the underlying physiological and population genetic factors affecting them. Some understanding of these factors, and how they may have varied in the past, comes from considering the cellular origins of germline mutation.

Germline mutations can arise from disruption of the DNA molecule at any time 165 within a germline cell, but most are believed to result from errors in DNA replication 166 during cell division, referred to as replicative mutation [49]. Over multiple generations 167 the rate of replicative mutation will depend strongly on the mean number of cell di-168 visions from zygote to zygote, and this can differ between species, between sexes, and 169 perhaps also between populations due to variation in reproductive behaviour. Differ-170 ences between the germline in males and females reside primarily in the sex-specific 171 nature of gametogenesis [50], where there is a much greater number of cell divisions on 172 the paternal lineage due to the fact that spermatogenesis involves a continuous process 173 of stem cell division throughout adult life. This in turn contributes to a greater accu-174 mulation of *de novo* replicative mutations passed on by the father than by the mother, 175 a phenomenon referred to as the male mutation bias and found in many species, with 176 important evolutionary consequences [51]. Its effect in humans has been quantified in 177 recent sequencing studies, with estimates of the male/female ratio in mean number of 178 transmitted mutations ranging from 3.1–3.9 [8,9,12,15]. 179

A further consequence is that the older the father, the more cell divisions his gametes 180 will have passed through, and hence the more mutations they are likely to carry. The 181 resulting age effect in paternally transmitted mutations has been measured at 1.2–2.0 182 additional de novo mutations per year of paternal age in recent studies [8-10, 15, 52], 183 corresponding to a doubling from puberty to age 30. In fact this is substantially less than 184 expected under the standard model for spermatogenesis [50,53], which predicts a factor of 185 ten increase over the same period based on the number of cell divisions involved. Possible 186 explanations for this discrepancy include a revised model of spermatogenesis in which 187 gonial stem cells pass through fewer cell divisions, or strong variation in per-cell-division 188 mutation rates during development, with much higher rates prior to gametogenesis [11, 189 23, 53]. 190

Sequencing studies initially measured no significant age effect in maternally transmitted mutations [8,9,15], consistent with replicative mutation under the longstanding reproductive model in which, after proliferation during fetal development, oocytes are held in stasis until maturation later in life and experience no postnatal cell divisions [54]. However, two more recent studies have estimated significant effects amounting to 0.51– 0.86 additional mutations per year of maternal age [12, 52, 55]. The initial negative findings may have resulted from methodological factors (for example, strong correlation in the data between maternal and paternal ages makes the effect difficult to discover if information on parent of origin for *de novo* mutations is not available). The distribution of parental ages sampled, which can differ even between large cohorts, particularly at the extremes of the distribution, has also been suggested as an important factor [12, 53, 56].

The measured maternal age effect is weaker than the paternal effect, but nevertheless 202 supports the view that aspects of our longstanding model of gametogenesis need revision. 203 In fact, evidence for a maternal age effect in larger-scale mutations such as chromosomal 204 abnormalities has been available for some time [57,58], motivating the 'production line' 205 hypothesis for oogenesis [59], which attributes the effect to a correlation between the 206 number of pre-natal cell divisions experienced by oocytes and the age at which they are 207 matured for ovulation. Other hypotheses have been proposed however [60], including 208 the possibility that previously undetected post-natal orgenetic cell divisions may occur, 209 analogous to the gametogenetic process in males [61, 62]. This is supported by the 210 discovery of germline stem cells in the ovaries of adult female humans and mice [63], and 211 thus perhaps also by the finding of a non-zero maternal age effect in genomic mutations. 212

Alternatively, or in addition, non-replicative or spontaneous germline mutations may 213 play a greater role than is generally assumed and contribute to age effects in both 214 sexes [64]. Such mutations can arise from instability or disruption of the DNA molecule 215 itself, for example due to oxidative mutagens within the nucleus or exposure to ionis-216 ing radiation. Unlike replicative mutation, we might expect spontaneous mutations to 217 accumulate on germline lineages at a rate which is independent of the number of cell 218 divisions or life history parameters such as generation time, and hence to behave more 219 like a molecular clock. (Purely clock-like behaviour is perhaps unlikely however, as the 220 production of oxidative mutagens is a causative factor for spontaneous mutation and is 221 itself proportional to metabolic rate, which also scales with generation time [65].) It has 222 been shown that the relative contribution of spontaneous mutation depends to a large 223 extent on the efficiency of DNA repair [49]: if such repair is rapid relative to the length 224 of the cell cycle then most spontaneous mutations will be corrected prior to replication, 225 and replicative processes will dominate. This is believed to be the case for most mutation 226 on the human germline; however this is largely due to the correspondence between the 227 paternal age effect and the number of mitotic divisions in males, an assumption which is 228 perhaps undermined by the finding of a non-negligible maternal effect (assuming female 229 post-natal mitoses are negligible). 230

There are also genomic loci where spontaneous mutation is expected to play a dom-231 inant role, notably CpG sites, in which the cytosine when methylated (as is usually the 232 case in mammals [66]) is prone to spontaneous deamination from C to T. (As an aside, 233 if spontaneous mutation contributes substantially to the maternal age effect we might 234 expect an even stronger effect at CpG sites [49]. This was not observed in the only study 235 so far to have examined it [12, 55], but larger studies in future may have greater power 236 to detect a difference.) The more clock-like behaviour of CpG mutations is borne out in 237 branch length comparisons within the primates and other mammals (for example, root-238 to-tip distances vary by 2-4 times less than for other mutational types) [41,42,67]. This 239

makes CpG sites potentially appealing for ancestral demographic inference. However they are rare in the genome, particularly in intergenic regions (1% of sites genome-wide and 3% in exons, where they have presumably been maintained by purifying selection) [68], so their use in this way is limited to site-wise analyses ignoring haplotype information. Moreover their behaviour is not strictly clock-like but only more so than other mutations, so branch-specific factors must still be taken into account.

## <sup>246</sup> Discussion

The first proposed solution to the mutation rate problem was the molecular clock hy-247 pothesis of Zuckerkandl and Pauling [69], essentially a zeroth-order approximation which 248 ignored rate variation, yet which proved surprisingly successful (in Crick's words, 'much 249 truer than people thought at the time' [70]). In the decades since, the quest to improve 250 upon this approximation has focused primarily on calibration against the fossil record, 251 using increasingly sophisticated models to account for rate variation and stochasticity 252 in fossil creation and discovery [71]. Notwithstanding the advances made in this direc-253 tion, it is clear that the recent accessibility and availability of genome sequence data in 254 humans and other species has opened a new window on the germline mutation rate. 255

It is also clear that generation time alone, while important, is insufficient to fully 256 describe the dependence of mutation rates on developmental and reproductive processes. 257 Germline mutation depends on a plurality of related biological timescales: the ages 258 of puberty and reproduction, the duration of fertility and of key stages in embryonic 259 development, the cycle times of cellular processes in gametogenesis, and the efficiency of 260 DNA repair, each potentially differing by sex or species [23, 53, 72, 73]. The sequencing 261 studies discussed here have begun to explore these phenomena, and although some initial 262 findings have differed or disagreed, further insights into their present-day effects and 263 how they might have varied in the past can be expected from future sequencing on 264 population scales. Important evidence for ancestral reproductive behaviour and life 265 history parameters may also come from paleontological and archaeological data [74–76], 266 and more direct evidence continues to come from ancient DNA. In particular, a recent 267 analysis has shown that the mean generation time has not changed appreciably over at 268 least the last 45,000 years, based on the rate of decline in linkage disequilbrium resulting 269 from Neanderthal admixture in several ancient human samples [77]. 270

We return therefore to the question of what mutation rate to use in analyses of 271 human demographic evolution. Figure 1 provides a weak indication that methods sen-272 sitive to older mutation events tend to yield higher estimates, but this is somewhat 273 confounded with potential downward bias in whole-genome estimates from family se-274 quencing. Branch length comparisons within the apes provide no support for a sub-275 stantial human-specific slowdown [41]. It may be that future developments will reveal 276 recent modest changes in mutation rate, perhaps differing between modern human pop-277 ulations [31, 78], driven by evolution in one or more of the factors discussed here, and 278 possibly more substantial differences in other hominins if data become available. Pend-279 ing such refinements however, a reasonable (and conservative) approach is to apply a 280

yearly mutation rate of  $0.5 \times 10^{-9}$  bp<sup>-1</sup> yr<sup>-1</sup> uniformly to analyses of demographic events within or between human populations, including between modern and archaic humans.

Finally, and notwithstanding that there are many gaps in our understanding, it is 283 worth noting that the role of the mutation rate in human demographic inference has 284 changed markedly in recent years. Whereas genetic data were formerly regarded as 285 definitive about topological relationships between taxa but uninformative about their 286 timescale, this distinction has vanished or even reversed in the case of recent human 287 evolution. Estimates of the mutation rate have begun to converge, and it has become 288 clear that many events in human demographic history are more complex than previously 289 assumed, with populations diverging gradually or in convoluted ways with ongoing gene 290 flow and admixture [79, 81, 82]. It is fair to say that in many, perhaps even most cases, 291 the mutation rate is no longer the principal source of ambiguity in human demographic 292 inference. 293

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