

# High-Resolution Sex-Specific Linkage Maps of the Mouse Reveal Polarized Distribution of Crossovers in Male Germline

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**ABSTRACT** Since the publication of the first comprehensive linkage map for the laboratory mouse, the architecture of recombination as a basic biological process has become amenable to investigation in mammalian model organisms. Here we take advantage of high-density genotyping and the unique pedigree structure of the incipient Collaborative Cross to investigate the roles of sex and genetic background in mammalian recombination. Our results confirm the observation that map length is longer when measured through female meiosis than through male meiosis, but we find that this difference is modified by genotype at loci on both the X chromosome and the autosomes. In addition, we report a striking concentration of crossovers in the distal ends of autosomes in male meiosis that is absent in female meiosis. The presence of this pattern in both single- and double-recombinant chromosomes, combined with the absence of a corresponding asymmetry in the distribution of double-strand breaks, indicates a regulated sequence of events specific to male meiosis that is anchored by chromosome ends. This pattern is consistent with the timing of chromosome pairing and evolutionary constraints on male recombination. Finally, we identify large regions of reduced crossover frequency that together encompass 5% of the genome. Many of these “cold regions” are enriched for segmental duplications, suggesting an inverse local correlation between recombination rate and mutation rate for large copy number variants.

**R**ECOMBINATION is a basic biological process that is shared among most sexually reproducing organisms (Morgan 1911; Gerton and Hawley 2005). It plays a key role in genome stability by ensuring the fidelity of chromosome segregation during meiosis (Sears *et al.* 1992; Hassold and Hunt 2001) and contributes to other processes such as DNA repair (Howard-Flanders and Theriot 1966; Niedzwiedz *et al.* 2004; Krejci *et al.* 2012). At the population level, recombination is an important generator of genetic diversity (Feldman *et al.* 1996; Otto and Lenormand 2002). Abnormal

recombination is associated with increased aneuploidy and decreased fitness of offspring and has been associated with several human diseases (Warren *et al.* 1987; Hassold and Hunt 2001; Kong *et al.* 2004). Recombination can be exploited experimentally to map loci associated with biological traits: indeed, the construction of linkage maps is among the oldest activities in genetics (Sturtevant 1913). Finally, the recombination machinery can be co-opted for genetic engineering of many organisms (Smithies *et al.* 1985; Court *et al.* 2002).

In mammals, many factors—including sex, taxon, and genetics—are known to affect the global, as opposed to local, rate of recombination. The total number of events per meiosis and the recombination rate per unit sequence length vary widely among mammals but are strongly correlated with the fundamental number (number of chromosome arms) present in the karyotype of each species (Pardo-Manuel De Villena and Sapienza 2001). Although the molecular process of recombination can result in either a noncrossover

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or a crossover event, to date the study of recombination in mammals has been limited almost exclusively to crossovers, which are more readily detected. Previous studies have shown that, as a general rule, the number of crossovers observed in autosomes is higher in female meiosis than in male meiosis and thus the linkage map is longer in the gametes of females (Dunn and Bennett 1967; Broman *et al.* 1998; Kong *et al.* 2002; Cox *et al.* 2009). These same studies demonstrated that the genomic distribution of crossovers between female and male meiosis is significantly different: uniform in females, but subtelomerically enhanced and pericentromerically suppressed in males. Crossover interference (Petkov *et al.* 2007) and sex-specific patterns of hotspot usage (Paigen *et al.* 2008; Kong *et al.* 2010) have been advanced as candidate explanations for these phenomena. Recently, based on evidence from flowering plants, a population genetics basis for the evolution of sex differences in recombination rates—differences in gametic selection between males and females—has been proposed (Lenormand and Dutheil 2005). Despite these advances the presence and causes of sex differences in the overall rate and spatial distribution of recombination remain the object of study and controversy.

Recent studies indicate that recombination rate also varies between closely related species and subspecies and that alleles responsible for these effects may in fact be segregating within species (Dumont *et al.* 2009; Murdoch *et al.* 2010; Dumont and Payseur 2011; Auton *et al.* 2012). In particular, crossover frequency in male mice is known to vary across different inbred strains (Koehler *et al.* 2002) and these differences have been exploited to map genetic loci affecting recombination rates in F<sub>2</sub> intercrosses (Murdoch *et al.* 2010; Dumont and Payseur 2011). Finally, mutations at several genes are known to lead to pathological changes in recombination (Niedzwiedz *et al.* 2004; Liebe *et al.* 2006).

Traditionally recombination has been studied in large pedigrees, using small numbers of informative markers. The first comprehensive linkage map of the laboratory mouse was developed in 1992 by genotyping hundreds of microsatellite markers in an interspecific backcross (Dietrich *et al.* 1992), work that was crucial to the success of the Mouse Genome Project (Waterston *et al.* 2002). Since then several linkage maps have been reported that have used larger experimental populations and taken advantage of denser single-nucleotide polymorphism (SNP) genotyping arrays (Shifman *et al.* 2006; Cox *et al.* 2009). Increasingly fine-grained linkage maps are an important technical resource for the research community, enabling the development of more sophisticated genetic mapping methods and the explosive growth of complex-traits analysis in the laboratory mouse (Flint and Mackay 2009; Flint and Eskin 2012). In addition, such maps provide a window into fundamental processes of transmission genetics.

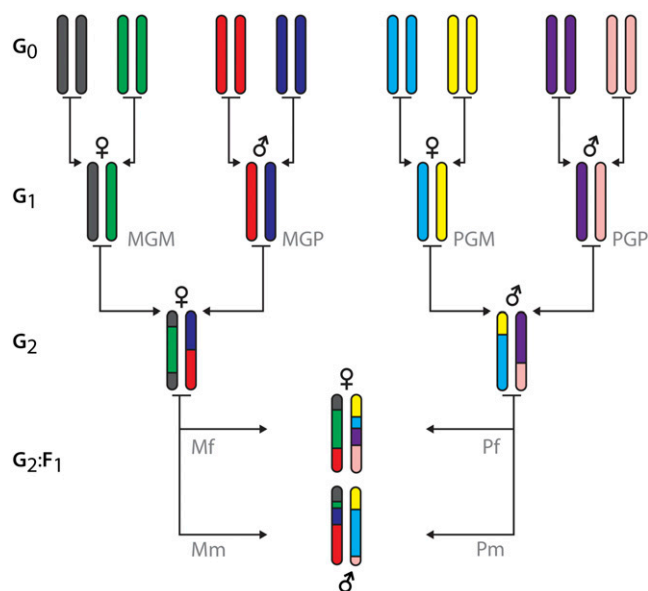
The development of very dense genotyping arrays and the concurrent genotyping of large numbers of unrelated human individuals opened the door to the development of

high-resolution genetic maps based on linkage disequilibrium (LD) (McVean *et al.* 2004; Myers *et al.* 2005). This type of analysis has been recently extended to mouse (Brunschwig *et al.* 2012). However, in contrast to human studies that use unrelated individuals, work in mouse has been limited to laboratory strains for which the presence of population structure and introgression between clades makes the interpretation of the data challenging (Yang *et al.* 2011; Collaborative Cross Consortium 2012). New mouse populations, in particular the highly randomized and fully traceable Collaborative Cross population, aim to mitigate these concerns (Churchill *et al.* 2004).

Even more recently the power of next-generation sequencing technologies has been applied to identify and characterize thousands of recombination hotspots by mapping meiotic double-strand breaks (DSBs) in male germ cells (Smagulova *et al.* 2011; Brick *et al.* 2012). These new approaches have focused attention on hotspots, short discrete regions of the genome with recombination frequencies that are significantly above the genome-wide average. This led to the identification of *Prdm9* (and its human homolog *PRDM9*) as the key *trans*-regulator of meiotic hotspot activity in mice and humans, respectively (Myers *et al.* 2010; Parvanov *et al.* 2010). The fact that *PRDM9* is a histone 3 lysine 4 trimethyltransferase that plays a role in epigenetic modification in the germline and that there are multiple alleles in both humans and mouse with different functional characteristics has resulted in the publication of a large body of literature in only a few years (Berg *et al.* 2010; Hinch *et al.* 2011; Brick *et al.* 2012; Hussin *et al.* 2013).

Despite the accomplishments of the LD and DSB approaches to study recombination, these methods are unsuited for the characterization of sex effects: LD represents a sex average and sequencing protocols to map DSBs have been implemented only for male germ cells. In addition, these approaches cannot determine the number of crossovers within a single chromosome in a given meiosis. As we demonstrate, these limitations obscure the important properties of mammalian meiosis.

Here we applied new high-density genotyping technology to the highly informative pedigree structure of the incipient Collaborative Cross (CC) to investigate the roles of sex and genetic background in mammalian recombination. The CC is a multiparental recombinant inbred population derived from eight founder inbred *Mus musculus* strains that collectively span 90% of the segregating variation in laboratory mice (Churchill *et al.* 2004; Roberts *et al.* 2007; Chesler *et al.* 2008; Collaborative Cross Consortium 2012). Each CC line is independently derived through three generations of outbreeding followed by multiple generations of inbreeding. The unique pedigree structure of this population during the first four generations (referenced hereafter as G<sub>0</sub>, G<sub>1</sub>, G<sub>2</sub>, and G<sub>2</sub>:F<sub>1</sub>) allows us to observe up to eight informative meioses by genotyping a single G<sub>2</sub>:F<sub>1</sub> sibling pair: each crossover observed in a G<sub>2</sub>:F<sub>1</sub> individual can be assigned with certainty to a specific meiosis (Figure 1). Due to



**Figure 1** Pedigree structure of  $G_2:F_1$  sibling pairs (representative funnel). Mice were bred in 237 funnels uniquely defined by the ordering of founder strains in the parental ( $G_0$ ) generation, as illustrated. This design balances the contribution of each of the eight founder strains through both the maternal and the paternal lineage. Using funnel order and genotypes for both members of a sib pair, it is possible to assign crossover events inferred in members of the sib pair to one of eight meioses occurring in the germline of a specific ancestor: in the  $G_1$  generation, maternal grandmother (MGM), maternal grandfather (MGP), paternal grandmother (PGM), or paternal grandfather (PGP); or in the  $G_2$  generation, mother (Mf, Mm) or father (Pf, Pm), with independent  $G_2$  meioses contributing to each sib pair. The method additionally distinguishes shared from singleton events.

randomization in the order of matings across breeding “funnels,” these meioses have balanced contributions from each of the eight founder inbred strains through both female and male germlines. We genotyped 237  $G_2:F_1$  sib pairs from independent CC lines, using the Mouse Diversity Array platform (Yang *et al.* 2009), which allowed us to map each individual crossover to a genome interval of 35 kbp on average. This level of resolution is similar to what can be attained in LD and DSB methods while retaining the ability to determine the detailed composition of individual meioses, against a randomized and extremely diverse genetic background, capturing variants known to influence global recombination rate.

The overall conclusions of our study provide insights into the cellular and molecular mechanisms of recombination, provide new hypotheses on its evolution, and have practical consequences for the design and interpretation of mapping experiments in the laboratory mouse.

## Materials and Methods

### Mouse breeding

The  $G_2:F_1$  population used in this study was bred at Oak Ridge National Laboratory (ORNL) beginning in 2005 as

described in detail previously (Chesler *et al.* 2008; Collaborative Cross Consortium 2012). Briefly, eight founder strains—five classical inbred strains (A/J, C57BL/6J, 129S1/SvImJ, NOD/ShiLtJ, and NZO/HILtJ) and three wild-derived strains (CAST/EiJ, PWK/PhJ, and WSB/EiJ)—were intercrossed in the  $G_0$  generation to generate  $G_1$  hybrids (Figure 1). These  $G_1$  progeny were intercrossed to create the four-way  $G_2$  generation. Finally, mice from the  $G_2$  generation were crossed to generate the eight-way progeny, known as the  $G_2:F_1$ . We refer to such a series of matings as a *funnel*. A funnel can be uniquely identified by the order of matings in the  $G_0$  generation. Each breeding funnel constitutes a unique and independent mosaic of the eight founder genomes (Collaborative Cross Consortium 2012). Under this breeding scheme, the genetic contribution of each of the eight founder strains to each line is expected to be equivalent. The present work considers sibling pairs (each consisting of one female and one male animal) from the  $G_2:F_1$  generation of 237 breeding funnels, for a total of 474 animals.

Two additional independent populations (to which we refer herein as the “intercrosses”) were generated at the University of North Carolina at Chapel Hill (UNC) by performing intersubspecific crosses between FVB/NJ females and either (PWK/PhJ  $\times$  CAST/EiJ) $F_1$  or (WSB/EiJ  $\times$  PWK/PhJ) $F_1$  males. Subsets of 96 offspring from a larger total progeny from each cross were selected for this study. Throughout the article the dam is listed first and the sire last in all crosses.

$G_2:F_1$  and intercross mice were treated in accordance with the recommendations of the Institutional Animal Care and Use Committee of ORNL and UNC, respectively.

### DNA preparation and genotyping

DNA from  $G_2:F_1$  mice was isolated at UNC according to a protocol for isolation of high-molecular-weight DNA using proteinase K and phenol (Sambrook and Russell 2006) and genotyped using the high-density Mouse Diversity Array (Yang *et al.* 2009) at the Jackson Laboratory. DNA samples from intercross progeny were isolated at UNC and genotyped using the MegaMUGA platform (Neogen/Geneseek, Lincoln, NE), a new 77,000-probe array based on the Illumina Infinium platform (Rogala *et al.* 2014).

### Haplotype reconstruction and inference of crossovers

We reconstructed founder contributions to the genomes of progeny, using microarray genotypes and pedigree information, and inferred crossovers as transitions between founder haplotypes. Crossovers are represented as intervals that span the physical genome between the nearest pair of markers that unambiguously flank the inferred event.  $G_2:F_1$  and intercross progeny were analyzed separately; tables of all crossovers identified in both populations are included in [Supporting Information, File S1](#) and [File S2](#), respectively.

**Collaborative Cross  $G_2:F_1$  population:** Haplotype reconstruction and localization of crossovers for CC funnels were

performed with GAIN (Liu *et al.* 2010), a hidden Markov model-based software that incorporates the CC pedigree structure in an efficient implementation of the Lander–Green algorithm (Lander and Green 1987) to obtain fully phased, highly accurate haplotype mosaics. Analysis was performed independently on each funnel but jointly on the siblings from the same funnel: crossovers are not shared across funnels but  $G_2:F_1$  siblings from the same funnel can share crossovers from the  $G_1$  generation, and the joint analysis can help to resolve ambiguity with respect to haplotype segment boundaries. Note that GAIN enforces all constraints imposed by the pedigree. For example, two of the strongest constraints (see Figure 1) are (1) for any  $G_2:F_1$  mouse, the two alleles at any marker must come from different halves of the funnel, and (2) two siblings cannot inherit different alleles from one quarter-funnel at any marker. If the input data contain errors (in either genotype calls or funnel order), GAIN will infer many more crossovers than predicted to satisfy these constraints. This provides an effective indicator to identify and correct (or remove) incorrectly labeled funnels and poorly performing markers.

For each funnel, GAIN takes the funnel order, the genotypes of the eight founder strains, and genotypes of the  $G_2:F_1$  sibling mice as input. It infers founder ancestry probabilities at each marker by building a descent model and evaluating the probability of crossover between adjacent markers, given the genotypes and a transition penalty. Founder ancestry at each marker is defined as the probability that each of  $\binom{8}{2} = 28$  possible pairs of founders (*e.g.*, C57BL/6J and CAST/EiJ) are the two founders from which the two alleles at that marker are inherited. With such information, haplotype segments and crossovers can be obtained by tracing the maximum *a posteriori* ancestry probability along chromosomes, using the forward–backward algorithm as in the Lander–Green procedure. Each crossover is described by (1) proximal and distal boundaries where the probability of the most likely founder ancestry falls below a threshold, (2) proximal and distal founder ancestry on the recombining chromosome segment, and (3) the specific meiosis in the breeding funnel [maternal grandmother (MGM), maternal grandfather (MGP), paternal grandmother (PGM), paternal grandfather (PGP), mother (Mf, Mm), or father (Pf, Pm)] to which it is ascribed. The crossover interval inferred (from proximal to distal boundary) is expected to contain the crossover event with high probability. Note that there are regions where multiple founder ancestries have similar probabilities due to sparsity of markers, low genotyping quality, or similarity of DNA sequence among multiple founders (*e.g.*, due to identity-by-descent); in such cases, crossovers can be localized only to long intervals.

Before performing haplotype reconstruction, high-quality markers were identified by examining completeness (genotypes called in  $\geq 99\%$  of samples) and concordance of genotypes called in  $G_2:F_1$  siblings,  $G_0$  founder mice, and  $G_1$  samples from previous studies, using the Mouse Diversity Array (Yang *et al.* 2009). A total of 121,504 markers (representing 15–25% of

markers on each chromosome) were retained in the high-quality group (File S3) and used for initial haplotype inference. The resulting crossover intervals were refined using the remaining 549,595 mid- to low-quality markers by examining the consistency of the additional markers with their expected genotypes within and around the uncertainty limits of each crossover. On average, this reduced the width of the crossover intervals by approximately half.

**Intercross population:** Owing to the simplicity of the intercross pedigrees, haplotype reconstruction in the intercross population is nearly trivial. The problem reduces to identifying markers that are segregating between two paternal strains and then clustering them into haplotype blocks in a manner that minimizes the total number of crossovers. The algorithm used to reconstruct haplotypes from MegaMUGA genotype calls is described in File S7. It produces consistent results across a broad range of parameter choices and is insensitive to genotyping errors and noncrossover products.

### Construction of genetic maps and estimation of local crossover density

Cumulative genetic maps for the CC funnels were computed directly from the interval representation of crossovers by integration across each chromosome to account for uncertainty in localization of crossovers. Maps were obtained separately for female and male meiosis and as a sex-averaged map. Genetic maps were computed from different subsets of the data, including separate maps for  $G_1$  and  $G_2$ , and for genotype classes at specific loci including the *Prdm9* locus on chromosome 17. Maps were computed for each strain based on the haplotypes involved in junction formation. Cumulative maps were normalized to centimorgan units as

$$\text{cM} = 100 \left( \frac{\text{count of crossovers}}{\text{count of meioses} \times \text{count of funnels}} \right) \quad (1)$$

and density estimates were obtained using a sliding window at variable widths. An R script to reproduce these analyses accompanies this article.

### Pooled analysis of spatial distribution of crossovers across autosomes

To analyze the distribution of crossovers along all autosomes jointly, distinct crossovers on autosomes identified in the  $G_2:F_1$  population and all autosomal crossovers in the intercross population were analyzed together. Event positions were normalized against the length of the chromosome on which they occurred such that the normalized position of all events fell on the interval [0, 1]. For the purposes of this analysis, crossovers, inferred as intervals, were converted to points (at the midpoint between the proximal and the distal boundary): after normalization against chromosome length, event positions can be directly compared but interval widths are no longer meaningful. Kernel density estimates of

crossover frequency with respect to normalized chromosomal position were obtained with the KernSmooth package (Wand and Jones 1995) for the R language (R Core Team 2012: <http://www.r-project.org/>), using a Gaussian kernel with bandwidth selected according to the direct plug-in method (Wand and Jones 1995). Confidence intervals about the density estimate were obtained by repeating the kernel-fitting procedure on 10,000 bootstrap samples of the crossovers, taking the 2.5th and 97.5th percentiles at each point at which the original kernel was evaluated.

Sex differences in spatial distribution of crossovers were analyzed in two ways. First, we conducted a formal test of the hypothesis that the distribution of events along chromosomes is uniform in single-recombinant meiotic products. Events on single-recombinant chromosomes in each sex (which can be identified with certainty only at the G<sub>2</sub> generation) were compared to a uniform distribution by the Kolmogorov–Smirnov test, stratified by chromosome, and the resulting *P*-values were adjusted by the method of Benjamini and Hochberg to control the false-discovery rate. Second, we used quantile regression to test for sex differences in location at quantiles along the spatial distribution of crossovers. The following model was fitted for each chromosome,

$$y_q = \beta + \beta_{\text{male}} + \varepsilon, \quad (2)$$

where  $y_q$  is the physical position corresponding to the  $(100 \times q)$ th percentile of the spatial distribution of crossovers. In this model  $\beta_{\text{male}}$  gives the displacement of the male vs. the female distribution at the given quantile, such that values of  $\beta_{\text{male}} > 0$  indicate a distally biased distribution in males.

The distribution of crossovers in males was compared to the distribution of recombination hotspots identified through high-resolution analysis of DSBs in Smagulova *et al.* (2011; Brick *et al.* 2012), using a simulation approach. For each chromosome,  $n$  DSBs (where  $n$  is the number of crossovers observed in the G<sub>2</sub>:F<sub>1</sub> population) were sampled at random with replacement with probability proportional to hotspot strength. The distribution of DSBs and crossovers was compared by a Kolmogorov–Smirnov test. For each chromosome, a simulation *P*-value was obtained by taking the median *P*-value across 1000 random samples of DSBs. Simulation *P*-values for each chromosome were adjusted by the method of Benjamini and Hochberg to control the rate of false discovery.

### Detection of cold regions

We initially identified cold regions, using a one-dimensional dynamic programming algorithm to identify regions with  $\geq 10$ -fold reduction in frequency of crossovers via a generic scoring scheme (Karlin and Altschul 1990). Briefly, we first compute local crossover density  $\rho_i$  at a grid of points  $i = 0, \dots, n$  along a chromosome. Those densities are converted to initial scores  $e_i$  as

$$e_i = \lambda(1 - \theta) + \rho_i \log \theta, \quad (3)$$

where  $\lambda$  is the mean crossover density across the chromosome and  $\theta$  is a prespecified enrichment threshold (and

here,  $\theta = 0.1$ ). Then a forward pass is made over the scores to compute the dynamic-programming scores  $E_i$ ,

$$E_{i+1} = \max\{0, E_i + e_{i+1}\}, \quad (4)$$

with the score at the first grid point initialized to zero ( $e_0 \equiv 0$ ). Regions of interest are finally identified by performing a traceback on the  $E_i$ .

The dynamic programming method allows us to identify regions of reduced recombination without resorting to a fixed-width sliding window and can identify regions of any size. We applied the algorithm to male and female recombination separately and took the union of the results, which overlapped extensively. We retained only those regions of length  $> 500$  kbp and refined the boundaries of individual regions by manual inspection of their flanking crossovers.

### Genomic analysis of cold regions

To capture the most up to date sequence information in all these analyses we used the newest mouse assembly, GRCm38, released by the Genome Reference Consortium in January 2012. Having obtained a list of candidate cold regions, we first determined the fraction of no calls (N's) in the reference genome sequence for a given interval and excluded those with  $> 10\%$  no calls. We then determined the following for each region: (1) the number and identity of crossovers in the region in the G<sub>2</sub>:F<sub>1</sub> population; (2) the recombination rate in the population reported in Cox *et al.* (2009); (3) the DSB density in C57BL/6J, 9R, 13R, and (9R  $\times$  13R)F<sub>1</sub> males based on the data reported in Brick *et al.* (2012); (4) whether the region overlaps a “recombination desert” reported in (C57BL/10.S  $\times$  C57BL/10.F)F<sub>1</sub> mice by Smagulova *et al.* (2011); (5) the number of crossovers in the 192 intercross progeny of (PWK  $\times$  CAST)F<sub>1</sub> and (WSB  $\times$  PWK)F<sub>1</sub> males; (6) the fraction of C+G base composition in the reference genome sequence; (7) the fraction of the region's sequence spanned by segmental duplications (of length  $> 20$  kbp); (8) the number of genes in the cold region; and finally (9) the number of structural variants reported in the region in the 18 strains sequenced by Yalcin *et al.* (2011).

### Analysis of structural variation in cold regions

Segmental duplications were identified using dotplots generated by the software Gepard (Krumisiek *et al.* 2007). For each cold region, we compared the sequence in the region against itself to identify local segmental duplications (tandem or inverted) of length  $> 20$  kbp and computed the duplication rate as the fraction of the region spanned by such duplications. In determining the genome-wide segmental duplication rate, we used a sliding window of 1 Mbp with 500-kbp overlap between adjacent windows and calculated the average duplication rate across all windows.

To explore the relationship between segmental duplication, coldness for recombination, and structural variation we examined probe intensities for 62 representatives of the G<sub>0</sub>



founders genotyped using the MegaMUGA platform. Each probe on this platform yields two intensity values per sample ( $x$  and  $y$ ), locating samples in a two-dimensional intensity space that is partitioned into three discrete clusters (a homozygous cluster along each of the  $x$ - and  $y$ -axes and a heterozygous cluster along a  $45^\circ$  line drawn from the origin) for genotype calling. For a well-behaved SNP probe, the sum intensity ( $x + y$ ) of all samples is approximately equal independent of genotype. Violations of this criterion provide evidence in support of structural variation. To capture the totality of information contained in probe intensities to provide evidence for structural variation between inbred strains, we performed principal components analysis (PCA) on the  $n \times p$  matrix  $P$  of probe intensities for  $n = 62$  individuals and  $p$  probes in each cold region to yield a new matrix  $P'$  containing the projection of  $M$  onto the subspace defined by the  $p$  principal components. Pairwise Minkowski distances (a generalization of the Euclidean distance metric) between samples were computed on  $M'$ , and an unrooted neighbor-joining tree was constructed from the resulting  $n \times n$  distance matrix, using the R package *ape* (<http://ape-package.ird.fr/>). We repeated the analysis using pairwise intensities (and thus an  $n \times 2p$  data matrix).

Because off-target variation in or near the probe sequence may influence hybridization efficiency (Didion *et al.* 2012), such that samples more genetically distant from the reference used to design the array have systematically lower probe intensities, we restricted this analysis to the five closely related classical inbred strains (A/J, C57BL/6J, 129S1/SvImJ, NOD/ShiLtJ, and NZO/H1LtJ).

## Results

### Overview of the mapping population and recombination map

The genotypes of 237  $G_2:F_1$  sibling pairs were combined with the funnel information (see *Materials and Methods*) to infer fully phased founder haplotypes for each chromosome (Figure 1). Note that each  $G_2:F_1$  female is the product of six meioses and her male sib is also the product of six meioses with four meioses shared between them. The four shared meioses (denoted as MGM, MGP, PGM, and PGP in Figure 1) occur at the  $G_1$  generation. The four unique meioses (Mf, Mm, Pf, and Pm in Figure 1) occur at the  $G_2$  generation. Crossovers are identified as transitions between founder haplotypes. Given the structure of the pedigrees, every crossover can be unambiguously assigned to one of the eight meioses, since at any given locus, any pair of founder haplotypes can be paired only in one of these eight meioses. Therefore, the identification and analysis of crossovers relies on knowledge of the order of the founder strains in the  $G_0$  generation.

The breeding scheme ensures equal and balanced contribution of each of the eight founder strains in the autosomes and equal representation of male and female meioses.

Genotyping of both male and female offspring allows the study of recombination on the X chromosome while retaining the ability to test whether the distribution of the observed crossovers is influenced by sex of the offspring analyzed.

We identified 25,038 crossovers in the 474 individual  $G_2:F_1$  mice (Table 1). Of these, 18,948 events are observed only once and 3,045 crossovers are shared by both siblings in the pair (*i.e.*, were observed exactly twice). Therefore, we have identified 21,993 distinct crossovers in our population, 21,368 on the autosomes and 625 on the X chromosome. Because a crossover in generation  $G_1$  can be observed only if it is transmitted to at least one  $G_2:F_1$  individual (which occurs with probability  $3/4$ ) while all  $G_2$  events are observable, the effective number of observed autosomal meioses per funnel is  $(3/4)(4 \text{ meioses}) + 1(4 \text{ meioses}) = 7$  and the thus the sex-averaged autosomal map length is 1288 cM. The effective number of meioses observed per funnel on the X chromosome is 3.5, by similar logic, giving an overall length of 75 cM.

We subjected the raw recombination data to a comprehensive quality-control pipeline to detect errors and to test expectations regarding the ratio at which different types of events should be observed according to Mendelian rules (File S7 and Table 2). In all cases the data conform closely to expectations, providing strong evidence for the integrity of both the breeding process and our methods for constructing the recombination map.

A key feature of our experiment is that crossovers are mapped with high precision. The median uncertainty interval is 34.9 kbp but the range is wide (19–25,150,032 bp) and the distribution bimodal (Figure S1). The uncertainty intervals in the right tail of the distribution are due to either the lack of SNPs in some genomic regions (Yang *et al.* 2009) or the lack of informative SNPs between the strains involved in particular crossovers, as a consequence of recent shared ancestry (Yang *et al.* 2011). All analyses of the spatial distribution of recombination account for these uncertainties (see *Materials and Methods*).

The resolution of our map is  $\sim 114$  kbp (8.8 crossovers per megabase pair). The spatial distribution of crossover density estimated over large windows (for example, 5 Mbp; see panel 1 in Figure S2) in the  $G_2:F_1$  population is qualitatively similar to that of the most current mouse linkage map (Cox *et al.* 2009). This similarity gradually disappears as the window is narrowed, likely due to a combination of technical (density and informativeness of the marker panel) and biological (sex and strain effects) differences between these experiments (panel 2 in Figure S2). The linkage map reported by Cox *et al.* (2009) was based on reanalysis of pedigrees from the eight-way heterogeneous stock (HS). The HS founders are classical inbred strains; these partially overlap the CC founders but do not include the wild-derived strains. The Cox map is based on 3546 informative meioses—roughly double the number of meioses in the  $G_2:F_1$  population—but the HS animals were genotyped at only 10,202 informative markers.

**Table 1 Crossover counts in the G<sub>2</sub>:F<sub>1</sub> population**

Sex	Meiosis	Sib	Autosomes			X chromosome			Total
			Singleton	Shared	Unique	Singleton	Shared	Unique	
Female	Mf	Female	3,282	NA	3,282	183	NA	183	3,465
Female	Mm	Male	3,255	NA	3,255	150	NA	150	3,405
Male	Pf	Female	2,871	NA	2,871	NA	NA	NA	2,871
Male	Pm	Male	2,783	NA	2,783	NA	NA	NA	2,783
Female	MGM	Female	826	756	1,582	35	48	83	2,467
		Male	767	756	1,523	35	48	83	
		All	1,593	756	2,349	70	48	118	
		Female	733	730	1,463	NA	NA	NA	
		Male	768	730	1,498	NA	NA	NA	
Male	MGP	All	1,501	730	2,231	NA	NA	NA	2,231
		Female	807	766	1,573	174	NA	174	
		Male	782	766	1,548	NA	NA	NA	
Female	PGM	All	1,589	766	2,355	174	NA	174	2,529
		Female	740	745	1,485	NA	NA	NA	
		Male	757	745	1,502	NA	NA	NA	
Male	PGP	All	1,497	745	2,242	NA	NA	NA	2,242
		All							
Female	All	All	9,719	1,522	11,241	577	48	625	11,866
Male	All	All	8,652	1,475	10,127	NA	NA	NA	10,127
Total	All	All	18,371	2,997	21,368	577	48	625	21,993

### Sex and strain effects on overall level of recombination

As expected, the total number of crossovers in autosomes is significantly smaller in male meiosis than in female meiosis (10,127 events and 11,241 events, respectively, Table 1;  $P = 2.5 \times 10^{-14}$  by  $t$ -test,  $H_0$ : equal number of events in both sexes). Table 3 provides point estimates and 95% bootstrap confidence intervals for sex-specific map length at each generation (lack of overlap between two such intervals is asymptotically equivalent to rejection of the null hypothesis that the corresponding point estimates are equal by Student's  $t$ -test). The sex effect on recombination is more pronounced in G<sub>2</sub> than in G<sub>1</sub>. Note that the female map expands in G<sub>2</sub> compared to G<sub>1</sub> (although the effect is not statistically significant) while the male map contracts significantly between these two generations (Figure 2). The sex difference is also observed in the distribution of total number of crossovers per individual (Figure S3). A greater number of crossovers in female meiosis are observed in both the G<sub>1</sub> and G<sub>2</sub> generations ( $P = 0.019$  and  $P = 1.3 \times 10^{-15}$  by  $t$ -test, respectively;  $H_0$ : equal number of events in both sexes). Table 3 provides point estimates and 95% bootstrap confidence intervals for sex-specific map length at each generation.

To investigate the possible causes of these differences we determined the effect of strain in the sex-specific maps at each generation. Two previous studies have mapped a strong quantitative trait locus (QTL) controlling male map length on the X chromosome (Murdoch *et al.* 2010; Dumont and Payseur 2011). Both studies reported that a QTL associated with the inheritance of the CAST/EiJ chromosome X resulted in significant expansion of the male map. To confirm and extend this observation we compared the number of crossovers in the

progeny of G<sub>1</sub> males, which are hemizygous for chromosome X and are heterozygous for exactly two founder haplotypes on the autosomes, classified according to the subspecific origin of the X chromosome (Figure 3). We observe that the *M. m. castaneus* (CAST/EiJ, discounting regions of intersubspecific introgression) X chromosome is associated with an expansion of the male map, the *M. m. musculus* (PWK/PhJ) X chromosome is associated with contraction of the male map, and the *M. m. domesticus* X chromosomes yield intermediate male map length. We conclude that one or more loci on the X chromosome controlling the length of the male map segregate in the CC.

We additionally observed an overall effect of the autosomal genome on recombination rate that is in opposition to the effect of chromosome X. The CAST/EiJ autosomal background is associated with a contraction of the male map while the PWK/PhJ autosomal background is associated with expansion of the male map. We attempted to identify specific autosomal loci and estimate their effects by performing genome scans for both the number of crossovers observed and magnitude of crossover interference in the G<sub>2</sub> generation, but no locus reached genome-wide significance. The generational difference in sex-specific map lengths (Table 3) is consistent with a model in which the genotypes of the X chromosome and autosomes influence total map length additively but in opposite directions. In generation G<sub>1</sub> the X and autosomal loci are tightly coupled and the increasing effect of CAST/EiJ autosomal loci offsets the decreasing effects of the CAST/EiJ X chromosome. The same kind of balance occurs in the PWK/PhJ background but with directions of X and autosomal effects reversed. In generation G<sub>2</sub> the segregation of X and autosomal genotypes is less tightly

**Table 2** Expectations regarding autosomal recombination in  $G_2:F_1$  pedigrees based on Mendelian rules

Relationship	Expected	Observed
Observed events in $G_1$ vs. $G_2$	3:4	0.747 ( $P = 0.78$ )
Same event type from opposite half-funnels	1:1	1.00 ( $P = 1.00$ )
Mf vs. Mm		1.02
Pf vs. Pm		1.03
MGM vs. PGM		0.975
MGP vs. PGP		0.999
Singleton vs. shared events in $G_1$	2:1	0.673 ( $P = 0.17$ )
MGM		0.678
MGP		0.672
PGM		0.675
PGP		0.668

Except when noted otherwise, the counts to which this table refers are those in Table 1. All  $P$ -values were obtained via a  $\chi^2$ -test with a single degree of freedom. A more detailed discussion of these expectations is provided in File S7.

coupled, giving rise to transgressive allelic combinations such as CAST/EiJ autosomal genotypes in combination with a PWK/PhJ X chromosome and leading to increased difference between the two sexes.

#### Sex and strain effects on spatial distribution of crossovers and interference

In addition to the sex differences in map length, we observe dramatic sex differences in the spatial pattern of crossovers along the autosomes. The raw distribution is presented in Figure 4, left, while Figure 4, right, displays a smoothed representation of their spatial distribution after standardizing chromosomes to unit length and estimating the density of crossovers on all autosomes jointly. Because mouse chromosomes are acrocentric and the function of their short arms is poorly understood, we follow the convention of taking “distal” and “telomeric” to refer to position on the long arm. Approximately half of the crossovers occur in the distal quarter of the chromosomes and almost one-third of events occur in the distal 10% of the autosomes in male meioses (Figure S4A). To demonstrate that this effect is independent of chromosome size or identity, we used quantile regression to assess the effect of sex on the cumulative spatial distribution of events along chromosomes. Figure S4B confirms that the distal portions of all 19 autosomes bear a disproportionate number of crossovers in male vs. female meioses.

The spatial distribution of crossovers on single- and double-recombinant chromosomes differs as expected due to interference, but preserves the excess of crossovers in the distal ends of chromosomes in males (Figure 5). Considering only single-recombinant chromosomes to reduce the confounding effect of interference, the distribution of events is indistinguishable from a uniform distribution in females for 11 of 19 autosomes (chromosomes 2, 4, 5, 6, 8, 9, 10, 11, 12, 13, and 18) at false-discovery rate 0.05 (by a Kolmogorov–Smirnov test) and is qualitatively uniform and symmetric on the remaining autosomes. The distribution in males for single-recombinant chromosomes differs from the uniform case for all chromosomes (median  $P = 1.7 \times$

**Table 3** Cumulative autosomal map length in the  $G_2:F_1$  by sex and generation

Sex	Generation	
	$G_1$ (cM)	$G_2$ (cM)
Female	1330 (1296, 1365)	1381 (1351, 1409)
Male	1279 (1247, 1311)	1211 (1182, 1236)

Confidence intervals were obtained from a nonparametric bootstrap procedure with 100 replicates.

$10^{-8}$ ). To confirm these results using independent data we performed a similar analysis of 192 intercross offspring from two types of  $F_1$  males [(CAST/EiJ  $\times$  PWK/PhJ) $F_1$  and (WSB/EiJ  $\times$  PWK/PhJ) $F_1$ ] that were genotyped with the 77,000-SNP MegaMUGA array. In this cross only crossovers in male meioses are observable, but their distribution (bottom row of Figure 5) closely mirrors that in the  $G_2:F_1$  population. Notably, the spatial pattern of crossovers in male meiosis is significantly different from the distribution of DSBs and of the X chromosome effect described in the previous section (Figure S5 and File S5). This pattern is consistent with a model in which recombination is spatially polarized in the male but not the female germline (see Discussion).

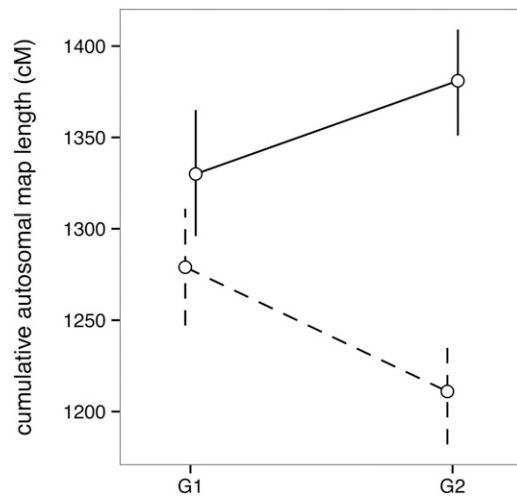
The large-scale ( $>5$  Mbp) recombination landscape and differences between males and females in the distribution of crossovers are conserved across all eight strain backgrounds. However, at the fine scale ( $<0.5$  Mbp) we begin to observe heterogeneity in the distribution of crossovers with respect to strain genotypes at the recombination breakpoint (Figure S6). While our study lacks the resolution required to identify individual hotspots of recombination or recombination-associated sequence motifs, these fine-scale patterns almost certainly reflect the strain-specific nature of most hotspots. Tightly clustered strain- and sex-specific breakpoints are observed for both male and female meiosis across all chromosomes. A male-specific PWK/PhJ cluster on chromosome 15, in which a physical region of  $<0.1$  Mbp encompasses 6 cM, is a notable example (Figure S7).

#### Identification of cold regions in the $G_2:F_1$ population

We define *cold regions* as long ( $>500$  kbp) contiguous genomic intervals that have a  $>10$ -fold reduction in crossovers compared to the genome-wide average. Given the total number of crossovers in our experiment (21,993) we established this 500-kbp threshold in the initial identification of cold regions to minimize the number of false positives (*i.e.*, on average we expect 4.4 crossovers per 500 kbp).

We initially identified the 50 coldest regions in male and female meioses separately to allow for possible cold regions on chromosome X. Because of the substantial overlap between these sets, we took their union, totaling 68 regions, as our candidate set. Candidate regions underwent several filtering steps. First, we excluded regions in which N's in the reference genome sequence represent a large fraction ( $>12.5\%$ ) of the nominal length. We refined the boundaries





**Figure 2** Sex-specific cumulative autosomal map length. Map length was computed within each generation among females (solid line) and males (dashed line). Vertical bars indicate 95% bootstrap confidence intervals.

of the 59 remaining cold regions, using the crossover uncertainty intervals in the  $G_2:F_1$  population. After refinement, 51 of these regions have no crossovers; they are bounded proximally by the distal boundary of the proximal crossover and distally by the proximal boundary of the distal crossover (File S4). The remaining 8 cold regions have only one or two crossovers. Overall, cold regions span 124.1 Mbp ( $\approx 5\%$  of the genome), distributed along 18 chromosomes (all chromosomes except 10 and 11), with an enrichment for proximal and distal sections of the chromosomes. On average, cold regions are almost 2.1 Mbp in length (range 582,221–10,217,265 bp). Importantly, cold regions are consistently “cold” across strains, sexes, and generations. The refined cold regions are plotted against their genomic position in Figure 6.

**External validation of cold regions:** To determine whether the cold regions seen in the  $G_2:F_1$  population are cold in other populations, we examined these regions in the HS used to construct a recent linkage map of the mouse (Cox *et al.* 2009). On average, there is a fourfold reduction in crossover density in cold regions (0.14 cM/Mbp vs. the expected 0.5 cM/Mbp that is observed genome-wide; File S4). In fact, 57 of the 59 regions are below the genome-wide average and for 16 regions the recombination density in the HS is zero. The two exceptions are located on chromosome 7 (positions 7,231,821–12,298,098 and 110,909,130–111,734,201). The extent of validation is striking given the differences in genetic background between the two populations: of the eight strains contributing to the HS, only A/J, C57BL/6J, 129S1/SvImJ, NOD/ShiLtJ, and NZO/HILtJ—all of which are of nearly pure *M. m. domesticus* origin—are shared with the  $G_2:F_1$  population. The strains not shared include two wild-derived strains representing subspecies (CAST/EiJ, *M. m. castaneus*; and PWK/PhJ, *M. m. musculus*, respectively) that are rare or absent in the genetic makeup of

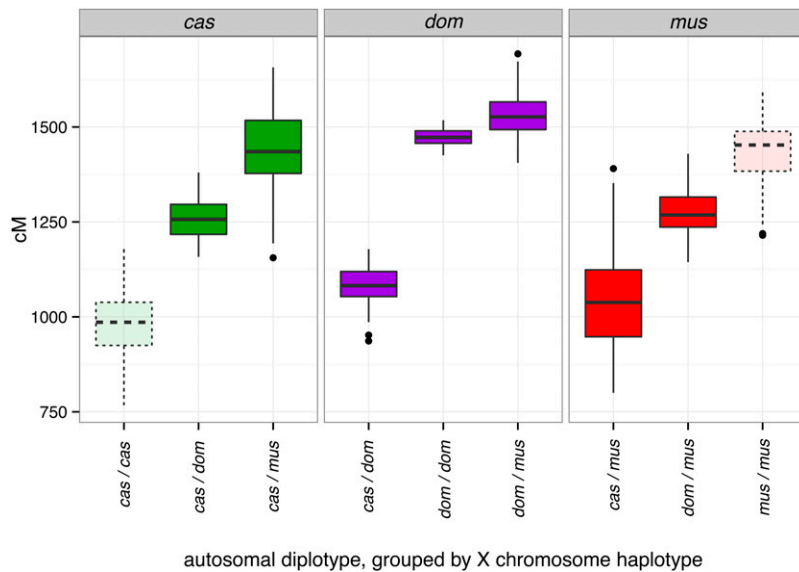
the strains in the Cox study and are separated from *M. m. domesticus* by 500,000 years of evolution (Yang *et al.* 2011). Furthermore, marker density and methods used to estimate local recombination density were quite different between the present study and the Cox study.

Recently, several maps of recombination-initiation sites in the mouse have been published (Smagulova *et al.* 2011; Brick *et al.* 2012). These studies identified regions with significant enrichment of DSBs in the male germline of mice of different genetic backgrounds [(C57BL/10.S  $\times$  C57BL/10.F) $F_1$ , 9R, 13R, C57BL/6, and (9R  $\times$  13R) $F_1$ ]. The initial study (Smagulova *et al.* 2011) identified 21 recombination deserts  $>3$  Mbp, but noted that it was not possible to identify DSBs in some regions due to gaps in the reference sequence or highly repetitive DNA. Eleven of the cold regions identified in the  $G_2:F_1$  population overlap with those described previously in one of these two studies. This level of concordance is even more remarkable in light of the fact that one of the Smagulova deserts was eliminated from our analysis because of a complete lack of sequence (chromosome 7, 39 Mbp; see also new GRCm38 assembly of the mouse genome), and 9 additional regions that fail to pass thresholds for inclusion in our list nonetheless show low levels of recombination in the  $G_2:F_1$  population. More importantly, data from the second study (Brick *et al.* 2012) can be used to estimate the density of DSBs in any given region. On average, there is an 18-fold reduction in DSB density (range 14- to 24-fold; Wilcoxon’s rank-sum test,  $P = 1.4 \times 10^{-50}$ ;  $H_0$ : equal number of DSBs per 500-kbp window in cold regions vs. noncold regions) in cold regions compared to the genome-wide average (Figure S8), with the caveat that DSBs in repetitive sequence typically cannot be mapped via high-throughput sequencing. Across the four strain backgrounds of these two studies, an average of 9 (range 8–11) of our cold regions have no DSBs and less than half of these have low-complexity or nonunique sequence that may interfere with sequencing-based DSB identification (File S4).

We conclude that the vast majority of cold regions identified in the  $G_2:F_1$  population represent *bona fide* regions of suppressed recombination that are independent of genetic background and strongly associated with a reduction in density of recombination-precursor sites.

**Genomic analysis of cold regions:** We analyzed cold regions with regard to several genomic features that have been associated with suppressed crossing over in other regions (such as centromeres): low C+G content, low gene content, and enrichment for complex duplications and repeated sequences (López-Flores and Garrido-Ramos 2012). The results are presented in File S4.

The overall C+G content in cold regions is lower than the genome-wide average (38.7% vs. 42%), but the distribution is multimodal (Figure S9). We observed a marked enrichment for relatively long ( $>20$  kbp) segmental duplications, either in tandem or inverted, in cold regions. On average,



**Figure 3** Effect of the X chromosome on overall recombination rate in male meiosis at  $G_1$ . Males at the  $G_1$  generation are hemizygous for a single founder haplotype along the entire X chromosome and heterozygous for that founder haplotype everywhere else, allowing a direct test for the effect of the X chromosome against a varying genetic background. Alleles were defined on the basis of subspecific origin: CAST/EiJ, *M. m. castaneus* (*cas*); PWK/PhJ, *M. m. musculus* (*mus*); and all others, *M. m. domesticus* (*dom*), with the caveat that regions of intersubspecific introgression will be misclassified. Unique crossovers attributed to  $G_1$  male meioses (classes MGP and PGP, Figure 1) were counted within all seven possible combinations of X chromosome haplotype and autosome diplotype (e.g., *cas/dom*) for the  $G_1$  offspring of a CAST/EiJ dam and an A/J sire. Boxplots represent map lengths computed on 100 bootstrap replicates of the observed  $G_1$  crossovers. The two boxes with dotted outlines represent predicted values for allelic combinations not observed in the  $G_2:F_1$  population.

almost 32% of the sequence of a single cold region is composed of segmental duplications; but in aggregate, segmental duplications account for 47.7% of the total sequence spanned by the 59 cold regions. In fact, the size and segmental duplication content of cold regions are correlated ( $r^2 = 0.664$ ). However, 16 cold regions are completely devoid of segmental duplication.

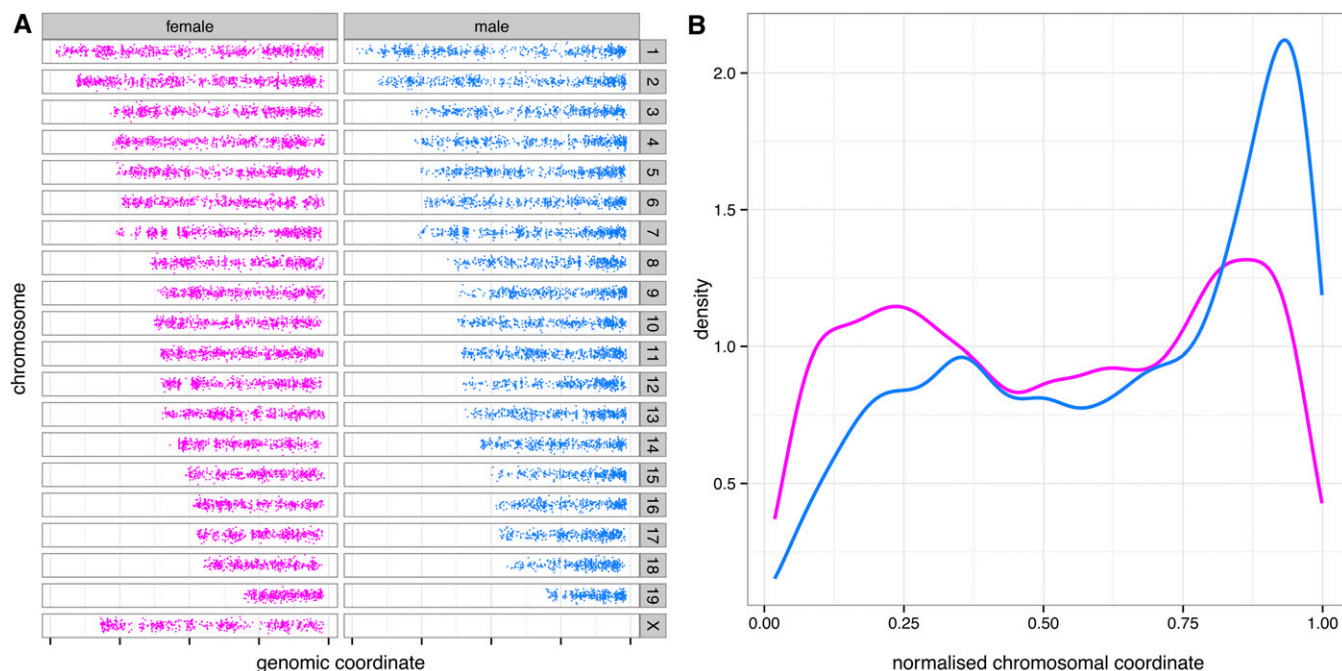
## Discussion

Using a unique multiparental intercross design, we have produced a new linkage map for the mouse genome that extends our understanding of the genetic and genomic underpinnings of meiotic recombination. Our map has three key features: very dense genotyping, balanced contributions from each sex, and the presence of uniformly high levels of genetic diversity across the genome. We observe that genetic background influences the overall level of recombination in a sex-specific manner. The pattern of genetic effects in  $G_1$  males implicated loci on both the X chromosome and the autosomes. Interestingly, these effects worked additively and in opposition to produce relatively similar levels of recombination across founder strains. We were unable to precisely map any QTL and it appears likely that multiple unmapped autosomal loci may contribute to the overall recombination rate, a conclusion in line with previous QTL-mapping experiments (Murdoch *et al.* 2010; Dumont and Payseur 2011). However, our measure of recombination in each individual, the number of crossovers inferred in at most two offspring, is substantially noisier than cytological approaches to estimate recombination used in those previous studies. Such techniques usually involve visualization and counting of crossover-associated proteins via immunofluorescence in a sample of single spermatocytes (Anderson *et al.* 1999) and yield tens of observations (*i.e.*, independent meioses) per individual. In practice, such techniques are difficult to apply in the female germline and cannot precisely

resolve the genomic location of crossovers. Our design, by contrast, allows both the counting of crossovers (through both male and female meioses) and the localization of those events with great precision, enabling us to analyze the effects of sex on both the level and the genomic distribution of recombination and to identify cold regions for recombination. Larger sample sizes and experimental designs that randomize the autosomal allelic combinations more efficiently, such as the diversity outbred (DO) population (Svenson *et al.* 2012), will be required to map loci affecting overall recombination rates.

We observe an increase in crossover density in the distal ends of every mouse autosome in male meiosis. This observation holds independent of the genetic background, chromosome size, and number of crossovers per chromosome and leads to the concentration of almost one-third of all crossover events in the distal 10th of autosomes in male meiosis. Similar patterns are observed in humans and chimpanzees (Broman *et al.* 1998; Auton *et al.* 2012).

Sex effects on overall map length in eutherian mammals (Dunn 1920; Dunn and Bennett 1967), and to a lesser extent sex differences in regional crossover density (Broman *et al.* 1998; Dumont and Payseur 2011), are not novel observations. However, the spatial and temporal precision with which we identify crossover events in this experiment allows us to link meiotic outcomes to their generating processes. We do so by exploiting the asymmetry of peaks of crossover density among chromosomes with different numbers of crossover events (Figure 4). That both the chromosomal position and the shape of the distal peak in male meiosis are identical on single- and double-recombinant chromosomes—independent of strain background, chromosome size, or sequence content—suggests that the distal event occurs via a regulated process. A process that consistently results in a concentration of crossover events in the distal portion of chromosomes must be polarized either in space or in time. Remarkably, the distribution of crossover events is



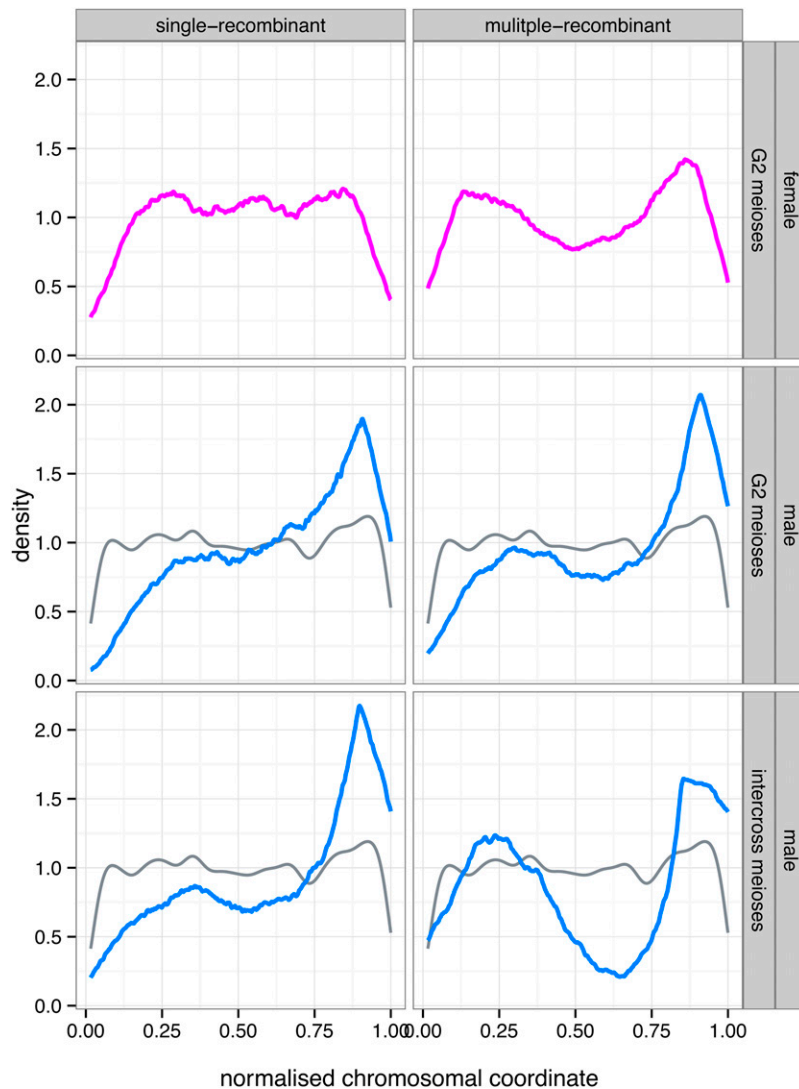
**Figure 4** Spatial distribution of crossover events in male and female meioses in the CC  $G_2:F_1$ . (A) spatial distribution of crossover events in each experiment: each dot represents the midpoint between the proximal and distal boundaries of a unique crossover event occurring in a female (pink) or a male (blue) meiosis. Chromosomes are aligned at the distal ends of their long arms. (B) Kernel density estimates of crossover frequency across all autosomes in female (pink lines) or male (blue lines) meioses, after scaling all chromosomes to equal length. Note the dramatic difference in distribution of events in female vs. male meioses: crossover events are distributed almost uniformly across autosomes in females, but are concentrated in the distal end of autosomes in males.

clearly different from the density and individual strength of hotspots identified through high-resolution analysis of DSBs (Brick *et al.* 2012; Khil *et al.* 2012) (Figure S5). The fact that nonrecombining regions of the sex chromosomes are nonetheless marked by DSBs in male germ cells (Wojtasz *et al.* 2012) provides further evidence for an additional layer of regulation between DSB formation and their resolution as crossovers in males.

The conservation of the broad-scale features of the recombination landscape across divergent species strongly suggests that the recombination landscape in male meiosis is controlled in large part at the chromosomal level. Such a model is consistent with the observation that in many organisms, including male mammals, chromosome pairing and synapsis progress from the telomeres inward (reviewed in Hunter 2003). The early steps of meiosis thus provide a simple and universal mechanism for identifying chromosome ends independently of the number, morphology, and sequence composition of the chromosomes in a given species. It is attractive to speculate that enrichment for crossovers in the distal ends of chromosomes in males evolved as a result of the obligation for a crossover in the short and subtelomerically located region of homology between the X and Y chromosomes known as the *pseudoautosomal region* (PAR) (Burgoyne 1982; Mohandas *et al.* 1992). Once the mechanism that ensures the presence of a crossover in the PAR evolved in males, it is easy to imagine that it was co-opted to act in every other chromosome. The absence of this

constraint in females would explain the sex differences in crossover density. Marsupials, an outgroup to eutherian mammals whose sex chromosomes lack a PAR, provide preliminary support for this hypothesis. The program for pairing and segregating the sex chromosomes in marsupials differs in important ways from that in eutherians (Page *et al.* 2005), and the most recent linkage maps for marsupial species including wallaby (Zenger *et al.* 2002) and opossum (Samollow 2004) show no evidence for male-specific expansion in subtelomeric regions. The evolution of eutherian sex chromosomes may thus be intimately linked to chromosome-scale behavior of the recombination machinery.

The observed sex differences in map length and spatial distribution of recombination have practical implications for the design of mapping experiments. While the female map is longer, mapping through males will provide improved resolution for loci in the distal regions of chromosomes. Furthermore, the field of mouse genetics is increasingly embracing the use of multiparental reference populations such as the CC (Collaborative Cross Consortium 2012), the HS (Valdar *et al.* 2006), and the DO (Svenson *et al.* 2012). Genetic analysis in these populations relies on the accurate identification of the founder haplotype inherited locally by each individual, a task that becomes increasingly difficult in the chromosome ends and in the presence of increasing levels of recombination. Genotyping platforms can be designed to overcome these challenges: the new Mega-MUGA array spaces markers on a grid defined by genetic



**Figure 5** Asymmetric spatial distribution of crossovers in male meiosis in singly vs. multiply recombinant chromosomes. Shown are kernel density estimates of crossover frequency across single-recombinant (left) and double-recombinant (right) autosomes in female (pink lines) and male (blue lines) meioses. The sharp peak in crossover density observed at the distal end of autosomes in males is present in both single- and double-recombinant autosomes. An additional broader peak is present in the proximal region of double-recombinant chromosomes. This effect is independent of the distribution of double-strand breaks (DSBs) in male meiosis reported by Brick *et al.* (2012), plotted in gray.

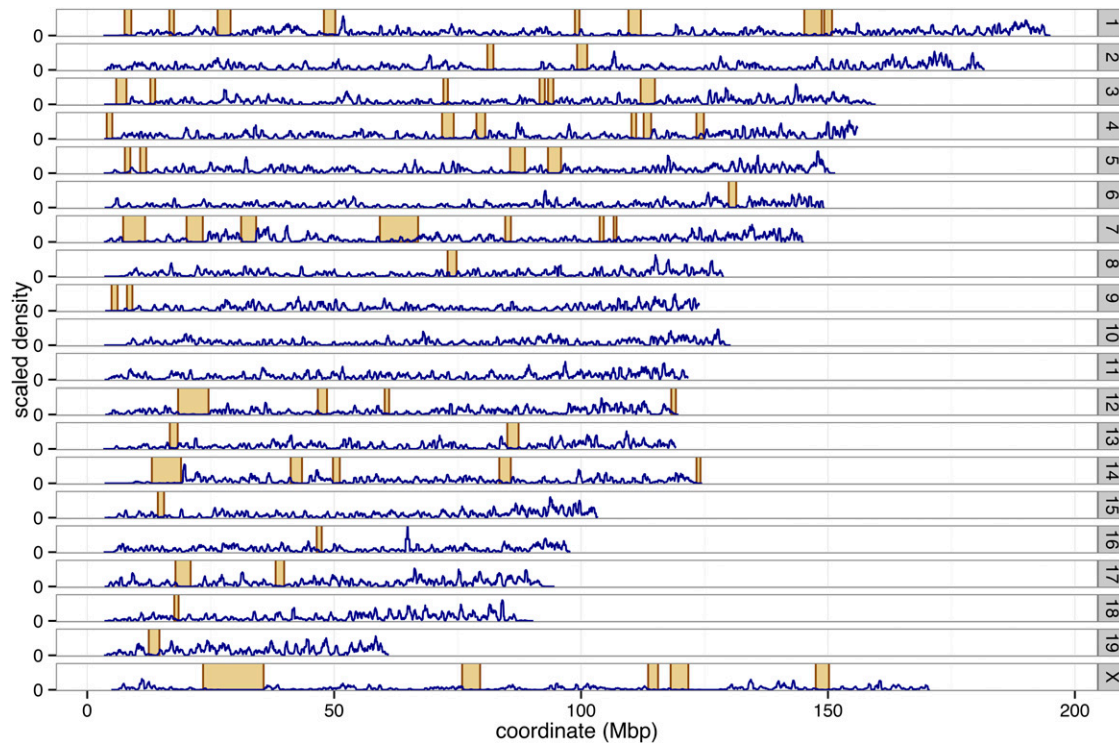
rather than physical distance (Rogala *et al.* 2014), allowing precise and accurate detection of subtelomeric crossovers.

Finally, we have identified >50 regions of dramatically reduced recombination that we term *cold regions*. These regions represent the left tail of the sampling distribution of local recombination rate. If cold regions are purely artifacts of sampling, then we would expect their location to be random, such that they should not be replicated in independent experiments and that their number and size should decrease as an increasing number of meioses are sampled. However, a majority of our cold regions are replicated in three independent experiments—the HS, the DO, and an intercross between CAST/EiJ, PWK/PhJ, and WSB/EiJ—representing at least an order of magnitude more independent meioses than were captured in the G<sub>2</sub>:F<sub>1</sub> (summarized in File S4). Furthermore, our cold regions are depleted for DSBs (Wilcoxon's rank-sum test,  $P = 1.4 \times 10^{-50}$ ; H<sub>0</sub>: equal number of reads per 1-Mbp window in cold regions vs. noncold regions) in a range of genetic backgrounds. In an F<sub>2</sub> or backcross design a cold region could arise due to a simple inversion, but this is

unlikely to be case in our experiment: all eight G<sub>0</sub> founder strains would have to carry a different large inversion allele.

One-third of cold regions span genomic regions enriched for segmental duplications, and local recombination rate and density of segmental duplications are inversely correlated genome-wide [Pearson's  $\rho = -0.26$ , 95% C.I.,  $(-0.28, -0.23)$ ; Figure S10 and File S6]. In fact, some of the larger and more complex tandem duplications and rearrangements in mice are among the coldest regions for recombination (Figure S11). As in pericentromeric regions, accumulation of repeated sequences could be either a cause or an effect of suppressed recombination. Either case leads to a paradox: tandem duplications are generated through unequal (*i.e.*, nonallelic) recombination, but levels of crossing over in these regions are exceedingly low. A simple explanation for this paradox is that some cold regions can be hotspots for *de novo* structural variation. This hypothesis predicts that cold regions with segmental duplications should be enriched for structural variants and that multiple independent variants should arise over short evolutionary times.





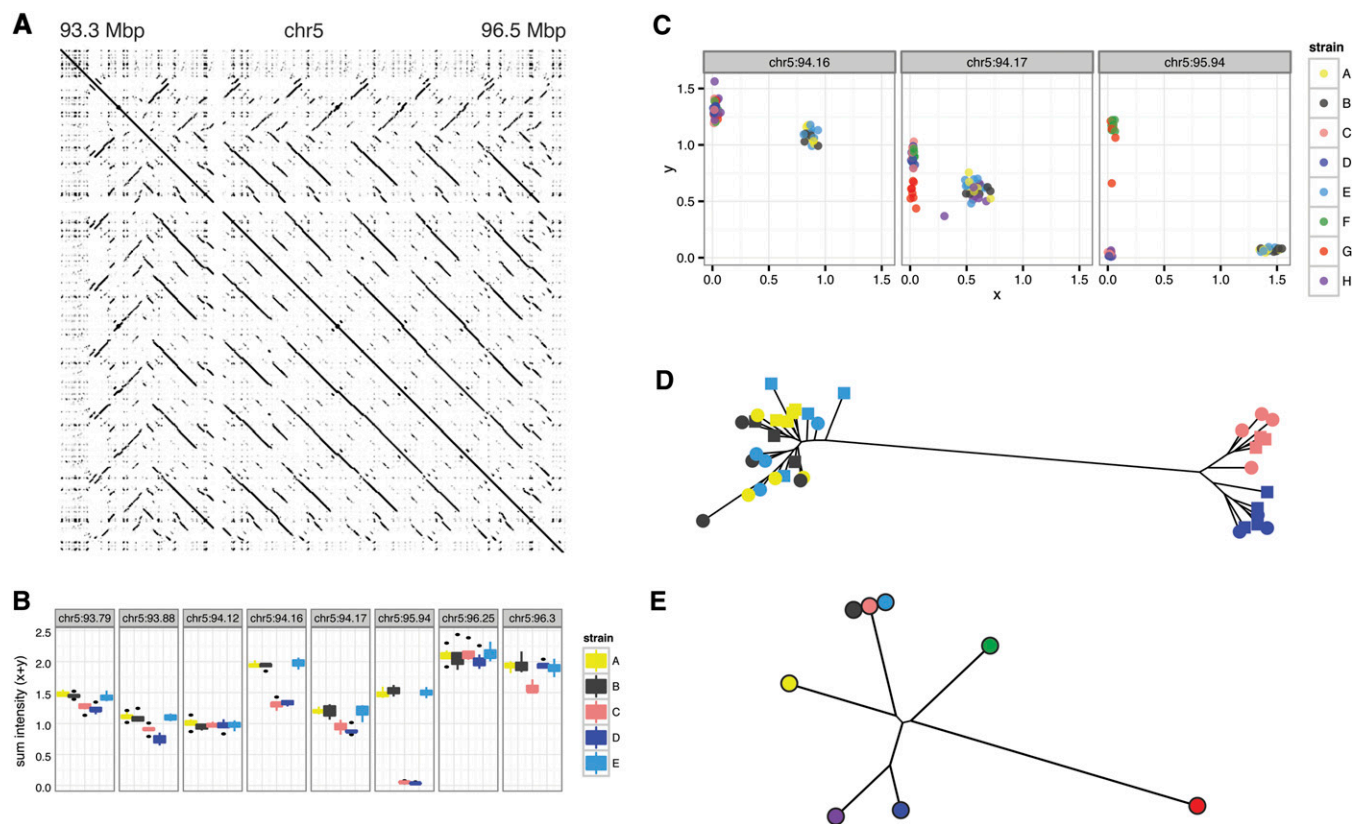
**Figure 6** A catalog of 59 cold regions of dramatically reduced crossover frequency. Cold regions are represented as yellow-shaded boxes. Local rate of crossing over (in arbitrary units) is plotted as a dark blue line.

Support for this hypothesis can be found first and foremost in a previous study that observed *de novo* structural variants within a single inbred strain, C57BL/6J, in four of our cold regions, using tiling arrays (Egan *et al.* 2007). In fact, structural variants are twice as common in cold regions as in the rest of the genome—in the eight founders of the CC; in the five founders that are classical laboratory strains; and in comparisons between two sister inbred strains, C57BL/6J and C57BL/6NJ (File S4). However, the true relative incidence of structural variants in cold regions likely exceeds this estimate. The best available catalog of structural variants in 18 laboratory inbred strains (Yalcin *et al.* 2011) has limited coverage of regions rich in segmental duplications (including our cold regions) due to the inherent difficulty in accurately aligning short reads to repeated sequences (Figure S12).

To circumvent the limitations of sequencing, we took advantage of data from the MegaMUGA genotyping array to explore the relationship between segmental duplications, coldness for recombination, and structural variation. This approach finds evidence for structural variation in segmentally duplicated portions of our cold regions. A representative example (chromosome 5: 93–96 Mbp) is displayed in Figure 7. This region has complex segmental duplication in the C57BL/6J reference sequence (see dotplot in Figure 7A). The wide variation in sum intensity at probes within the region (Figure 7B) suggests differences in copy number between strains. Inspection of the two-dimensional intensity plots (Figure 7C) demonstrates that the three strains (A/J,

C57BL/6J, and NZO/HILtJ) with highest sum intensity carry at least two paralogous alleles at the first two probes, while the remaining classical inbred strains carry only one allele. At the third probe three strains (again A/J, C57BL/6J, and NZO/HILtJ) carry a different allele but in equal copy number to two wild-derived strains, CAST/EiJ and PWK/PhJ. In contrast, three strains (129S1/SvImJ, NOD/ShiLtJ, and WSB/EiJ) have intensities consistent with the presence of zero copies. Finally, the tree derived from principal components analysis of intensities in this region (Figure 7D) clearly segregates the classical inbred strains in a pattern consistent with panel sum intensities (Figure 7B) but inconsistent with local phylogeny based only on SNPs (Figure 7E) (Yang *et al.* 2011; Wang *et al.* 2012; Welsh *et al.* 2012). Taken together, these data provide additional evidence that structural variants arise multiple times in cold regions with segmental duplication. Studies in wild mice, both from *Mus* and sister clades, can provide further insights regarding the evolutionary significance of cold regions with respect to both genome stability and patterns of linkage disequilibrium.

In conclusion we report here the newest version of the linkage map for the laboratory mouse, with more precise localization of crossover events and more comprehensive coverage of segregating variation than previous maps. Although a study of this type is the most basic and traditional work in genetics, our results provide several new and important insights into the nature and spatial pattern of recombination across generations. First, we expand knowledge of sex differences in regional crossover



**Figure 7** Cold regions enriched for complex tandem duplications and inversions show evidence of structural variation between inbred strains. Strain abbreviations are as follows: A, A/J; B, C57BL/6J; C, 129S1/SvImJ; D, NOD/ShiLtJ; E, NZO/H1LtJ; F, CAST/EiJ; G, PWK/PhJ; and H, WSB/EiJ. Color coding of strains is consistent across panels. (A) Dotplot from self-alignment of reference sequence (GRCm38/mm10 assembly) in a representative cold region. A dark dot represents >95% sequence identity between a pair of 100-bp windows. Linear clusters parallel to the main diagonal thus represent tandem duplications, and linear clusters perpendicular to the main diagonal represent duplication with inversion. (B) Profile of sum intensity at the eight probes (GRCm38/mm10 coordinates) within the region, for classical inbred strains only (strains A–E). (C) Two-dimensional intensity plots for three representative probes in the region whose nominal coordinates lie within a segmental duplication. Normalized intensity for the A and B alleles is plotted on the x- or the y-axis, respectively; definition of A and B alleles is arbitrary. Each point represents a single individual. (D) Unrooted tree based on principal components analysis on sum intensities (see *Materials and Methods*) at the eight probes in the region, for classical inbred strains only. (E) Local phylogeny based on SNPs across the compatible interval (chromosome 5: 91,477,046–96,609,347) spanning the region (Wang *et al.* 2010, 2012).

density by describing sex-specific properties of the recombination landscape that are general across all autosomes and strain backgrounds. Second, we demonstrate that by selecting a unique experimental design that combines a highly informative population with very dense genotyping we are able to infer dynamic properties from static data. Finally, we provide a catalog of cold regions for recombination that reveals a paradoxical inverse relationship between recombination and segmental duplication. This work provides a foundation for testing specific hypotheses regarding the effect of sex and genetics in recombination.

## Data Accession

The recombination maps from the G<sub>2</sub>:F<sub>1</sub> population—sex specific, sex averaged, strain specific, and strain averaged—will be made publicly available via the Mouse Map Converter tool (<http://cgd.jax.org/mousemapconverter/>) hosted by the Center for Genome Dynamics (CGD) at the Jackson Laboratory. Raw genotype data in the form of Affymetrix \*.cel files

will be made available for download on the CGD repository page (<http://cgd.jax.org/datasets/diversityarray/CELfiles.shtml>). Code to generate and analyze genetic maps is available via GitHub: <http://github.com/andrewparkermorgan/cc-g2f1/>.

## Acknowledgments

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## Literature Cited

- Anderson, L. K., A. Reeves, L. M. Webb, and T. Ashley, 1999 Distribution of crossing over on mouse synaptonemal complexes using immunofluorescent localization of MLH1 protein. *Genetics* 151: 1569–1579.
- Auton, A., A. Flédél-Alon, S. Pfeifer, O. Venn, L. Séguirel *et al.*, 2012 A fine-scale chimpanzee genetic map from population sequencing. *Science* 336: 193–198.
- Berg, I. L., R. Neumann, K.-W. G. Lam, S. Sarbajna, L. Odenthal-Hesse *et al.*, 2010 PRDM9 variation strongly influences recombination hot-spot activity and meiotic instability in humans. *Nat. Genet.* 42: 859–863.
- Brick, K., F. Smagulova, P. Khil, R. D. Camerini-Otero, and G. V. Petukhova, 2012 Genetic recombination is directed away from functional genomic elements in mice. *Nature* 485: 642–645.
- Broman, K. W., J. C. Murray, V. C. Sheffield, R. L. White, and J. L. Weber, 1998 Comprehensive human genetic maps: individual and sex-specific variation in recombination. *Am. J. Hum. Genet.* 63: 861–869.
- Brunschwig, H., L. Levi, E. Ben-David, R. W. Williams, B. Yakir *et al.*, 2012 Fine-scale maps of recombination rates and hot-spots in the mouse genome. *Genetics* 191: 757–764.
- Burgoyne, P. S., 1982 Genetic homology and crossing over in the X and Y chromosomes of mammals. *Hum. Genet.* 61: 85–90.
- Chesler, E. J., D. R. Miller, L. R. Branstetter, L. D. Galloway, B. L. Jackson *et al.*, 2008 The Collaborative Cross at Oak Ridge National Laboratory: developing a powerful resource for systems genetics. *Mamm. Genome* 19: 382–389.
- Churchill, G. A., D. C. Airey, H. Allayee, J. M. Angel, A. D. Attie *et al.*, 2004 The Collaborative Cross, a community resource for the genetic analysis of complex traits. *Nat. Genet.* 36: 1133–1137.
- Collaborative Cross Consortium, 2012 The genome architecture of the Collaborative Cross mouse genetic reference population. *Genetics* 190: 389–401.
- Court, D. L., J. A. Sawitzke, and L. C. Thomason, 2002 Genetic engineering using homologous recombination. *Annu. Rev. Genet.* 36: 361–388.
- Cox, A., C. L. Ackert-Bicknell, B. L. Dumont, Y. Ding, J. T. Bell *et al.*, 2009 A new standard genetic map for the laboratory mouse. *Genetics* 182: 1335–1344.
- Didion, J. P., H. Yang, K. Sheppard, C.-P. Fu, L. McMillan *et al.*, 2012 Discovery of novel variants in genotyping arrays improves genotype retention and reduces ascertainment bias. *BMC Genomics* 13: 34.
- Dietrich, W., H. Katz, S. E. Lincoln, H. S. Shin, J. Friedman *et al.*, 1992 A genetic map of the mouse suitable for typing intraspecific crosses. *Genetics* 131: 423–447.
- Dumont, B. L., and B. A. Payseur, 2011 Genetic analysis of genome-scale recombination rate evolution in house mice. *PLoS Genet.* 7: e1002116.
- Dumont, B. L., K. W. Broman, and B. A. Payseur, 2009 Variation in genomic recombination rates among heterogeneous stock mice. *Genetics* 182: 1345–1349.
- Dunn, L. C., 1920 Linkage in mice and rats. *Genetics* 5: 325–343.
- Dunn, L. C., and D. Bennett, 1967 Sex differences in recombination of linked genes in animals. *Genet. Res.* 9: 211–220.
- Egan, C. M., S. Sridhar, M. Wigler, and I. M. Hall, 2007 Recurrent DNA copy number variation in the laboratory mouse. *Nat. Genet.* 39: 1384–1389.
- Feldman, M. W., S. P. Otto, and F. B. Christiansen, 1996 Population genetic perspectives on the evolution of recombination. *Annu. Rev. Genet.* 30: 261–295.
- Flint, J., and E. Eskin, 2012 Genome-wide association studies in mice. *Nat. Rev. Genet.* 13: 807–817.
- Flint, J., and T. F. C. Mackay, 2009 Genetic architecture of quantitative traits in mice, flies, and humans. *Genome Res.* 19: 723–733.
- Gerton, J. L., and R. S. Hawley, 2005 Homologous chromosome interactions in meiosis: diversity amidst conservation. *Nat. Rev. Genet.* 6: 477–487.
- Hassold, T., and P. Hunt, 2001 To err (meiotically) is human: the genesis of human aneuploidy. *Nat. Rev. Genet.* 2: 280–291.
- Hinch, A. G., A. Tandon, N. Patterson, Y. Song, N. Rohland *et al.*, 2011 The landscape of recombination in African Americans. *Nature* 476: 170–175.
- Howard-Flanders, P., and L. Theriot, 1966 DNA repair in genetic recombination. *Genetics* 53: 1137–1150.
- Hunter, N., 2003 Synaptonemal complexities and commonalities. *Mol. Cell* 12: 533–535.
- Hussin, J., D. Sinnett, F. Casals, Y. Idaghdour, V. Bruat *et al.*, 2013 Rare allelic forms of PRDM9 associated with childhood leukemogenesis. *Genome Res.* 23: 419–430.
- Karlin, S., and S. F. Altschul, 1990 Methods for assessing the statistical significance of molecular sequence features by using general scoring schemes. *Proc. Natl. Acad. Sci. USA* 87: 2264–2268.
- Khil, P. P., F. Smagulova, K. M. Brick, R. D. Camerini-Otero, and G. V. Petukhova, 2012 Sensitive mapping of recombination hot-spots using sequencing-based detection of ssDNA. *Genome Res.* 22: 957–965.
- Koehler, K. E., J. P. Cherry, A. Lynn, P. A. Hunt, and T. J. Hassold, 2002 Genetic control of mammalian meiotic recombination. I. Variation in exchange frequencies among males from inbred mouse strains. *Genetics* 162: 297–306.
- Kong, A., D. F. Gudbjartsson, J. Sainz, G. M. Jonsdottir, S. A. Gudjonsson *et al.*, 2002 A high-resolution recombination map of the human genome. *Nat. Genet.* 31: 241–247.
- Kong, A., J. Barnard, D. F. Gudbjartsson, G. Thorleifsson, G. Jonsdottir *et al.*, 2004 Recombination rate and reproductive success in humans. *Nat. Genet.* 36: 1203–1206.
- Kong, A., G. Thorleifsson, D. F. Gudbjartsson, G. Masson, A. Sigurdsson *et al.*, 2010 Fine-scale recombination rate differences between sexes, populations and individuals. *Nature* 467: 1099–1103.
- Krejci, L., V. Altmannova, M. Spirek, and X. Zhao, 2012 Homologous recombination and its regulation. *Nucleic Acids Res.* 40: 5795–5818.
- Krumsiek, J., R. Arnold, and T. Rattei, 2007 Gepard: a rapid and sensitive tool for creating dotplots on genome scale. *Bioinformatics* 23: 1026–1028.
- Lander, E. S., and P. Green, 1987 Construction of multilocus genetic linkage maps in humans. *Proc. Natl. Acad. Sci. USA* 84: 2363–2367.
- Lenormand, T., and J. Dutheil, 2005 Recombination difference between sexes: a role for haploid selection. *PLoS Biol.* 3: e63.
- Liebe, B., G. Petukhova, M. Barchi, M. Bellani, H. Braselmann *et al.*, 2006 Mutations that affect meiosis in male mice influence the dynamics of the mid-preleptotene and bouquet stages. *Exp. Cell Res.* 312: 3768–3781.
- Liu, E. Y., Q. Zhang, L. McMillan, F. P.-M. de Villena, and W. Wang, 2010 Efficient genome ancestry inference in complex pedigrees with inbreeding. *Bioinformatics* 26: i199–i207.
- López-Flores, I., and M. A. Garrido-Ramos, 2012 The repetitive DNA content of eukaryotic genomes. *Genome Dyn.* 7: 1–28.
- McVean, G. T., S. R. Myers, S. Hunt, P. Deloukas, D. R. Bentley *et al.*, 2004 The fine-scale structure of recombination rate variation in the human genome. *Science* 304: 581–584.
- Mohandas, T. K., R. M. Speed, M. B. Passage, P. H. Yen, C. Chandley *et al.*, 1992 Role of the pseudoautosomal region in sex-chromosome pairing during male meiosis: meiotic studies in a man with a deletion of distal Xp. *Am. J. Hum. Genet.* 51: 526–533.
- Morgan, T. H., 1911 Random segregation vs. coupling in Mendelian inheritance. *Science* 34: 384.

- Murdoch, B., N. Owen, S. Shirley, S. Crumb, K. W. Broman *et al.*, 2010 Multiple loci contribute to genome-wide recombination levels in male mice. *Mamm. Genome* 21: 550–555.
- Myers, S., L. Bottolo, C. Freeman, G. McVean, and P. Donnelly, 2005 A fine-scale map of recombination rates and hotspots across the human genome. *Science* 310: 321–324.
- Myers, S., R. Bowden, A. Tumian, R. E. Bontrop, C. Freeman *et al.*, 2010 Drive against hotspot motifs in primates implicates the PRDM9 gene in meiotic recombination. *Science* 327: 876–879.
- Niedzwiedz, W., G. Mosedale, M. Johnson, C. Y. Ong, P. Pace *et al.*, 2004 The Fanconi anaemia gene FANCC promotes homologous recombination and error-prone DNA repair. *Mol. Cell* 15: 607–620.
- Otto, S. P., and T. Lenormand, 2002 Resolving the paradox of sex and recombination. *Nat. Rev. Genet.* 3: 252–261.
- Page, J., S. Berríos, M. T. Parra, A. Viera, J. A. Suja *et al.*, 2005 The program of sex chromosome pairing in meiosis is highly conserved across marsupial species: implications for sex chromosome evolution. *Genetics* 170: 793–799.
- Paigen, K., J. P. Szatkiewicz, K. Sawyer, N. Leahy, E. D. Parvanov *et al.*, 2008 The recombinational anatomy of a mouse chromosome. *PLoS Genet.* 4: e1000119.
- Pardo-Manuel de Villena, F., and C. Sapienza, 2001 Recombination is proportional to the number of chromosome arms in mammals. *Mamm. Genome* 12: 318–322.
- Parvanov, E. D., P. M. Petkov, and K. Paigen, 2010 Prdm9 controls activation of mammalian recombination hotspots. *Science* 327: 835.
- Petkov, P. M., K. W. Broman, J. P. Szatkiewicz, and K. Paigen, 2007 Crossover interference underlies sex differences in recombination rates. *Trends Genet.* 23: 539–542.
- Roberts, A., F. Pardo-Manuel de Villena, W. Wang, L. McMillan, and D. W. Threadgill, 2007 The polymorphism architecture of mouse genetic resources elucidated using genome-wide resequencing data: implications for QTL discovery and systems genetics. *Mamm. Genome* 18: 473–481.
- Rogala, A. R., A. P. Morgan, A. M. Christensen, T. J. Gooch, T. A. Bell *et al.*, 2014 The Collaborative Cross as a resource for modeling human disease: CC011/Unc, a new mouse model for spontaneous colitis. *Mamm. Genome* DOI: 10.1007/s00335-013-9499-2.
- Sambrook, J., and D. W. Russell, 2006 Isolation of high-molecular-weight DNA from mammalian cells using proteinase K and phenol. *Cold Spring Harb. Protoc.* DOI: 10.1101/pdb.prot4036.
- Samollow, P. B., 2004 First-generation linkage map of the gray, short-tailed opossum, *Monodelphis domestica*, reveals genome-wide reduction in female recombination rates. *Genetics* 166: 307–329.
- Sears, D. D., J. H. Hegemann, and P. Hieter, 1992 Meiotic recombination and segregation of human-derived artificial chromosomes in *Saccharomyces cerevisiae*. *Proc. Natl. Acad. Sci. USA* 89: 5296–5300.
- Shifman, S., J. T. Bell, R. R. Copley, M. S. Taylor, R. W. Williams *et al.*, 2006 A high-resolution single nucleotide polymorphism genetic map of the mouse genome. *PLoS Biol.* 4: e395.
- Smagulova, F., I. V. Gregoretti, K. Brick, P. Khil, R. D. Camerini-Otero *et al.*, 2011 Genome-wide analysis reveals novel molecular features of mouse recombination hotspots. *Nature* 472: 375–378.
- Smithies, O., R. G. Gregg, S. S. Boggs, M. A. Koralewski, and R. S. Kucherlapati, 1985 Insertion of DNA sequences into the human chromosomal  $\beta$ -globin locus by homologous recombination. *Nature* 317: 230–234.
- Sturtevant, A. H., 1913 The linear arrangement of six sex-linked factors in *Drosophila*, as shown by their mode of association. *J. Exp. Zool.* 14: 43–59.
- Svenson, K. L., D. M. Gatti, W. Valdar, C. E. Welsh, R. Cheng *et al.*, 2012 High-resolution genetic mapping using the Mouse Diversity outbred population. *Genetics* 190: 437–447.
- Valdar, W., L. C. Solberg, D. Gauguier, S. Burnett, P. Klennerman *et al.*, 2006 Genome-wide genetic association of complex traits in heterogeneous stock mice. *Nat. Genet.* 38: 879–887.
- Wand, M., and C. Jones, 1995 *Kernel Smoothing*, Ed. 1. CRC Press, Boca Raton, FL.
- Wang, J., K. J. Moore, Q. Zhang, F. P.-M. de Villena, W. Wang *et al.*, 2010 Genome-wide compatible SNP intervals and their properties, pp. 43–52 in *Proceedings of the First ACM International Conference on Bioinformatics and Computational Biology -BCB '10*, edited by A. Zhang and M. Borodovsky. ACM Press, New York.
- Wang, J. R., F. P.-M. de Villena, and L. McMillan, 2012 Comparative analysis and visualization of multiple collinear genomes. *BMC Bioinformatics* 13(Suppl 3): S13.
- Warren, A., A. Chakravarti, C. Wong, S. Slaugenhaupt, S. Halloran *et al.*, 1987 Evidence for reduced recombination on the non-disjoined chromosomes 21 in Down syndrome. *Science* 237: 652–654.
- Waterston, R. H., K. Lindblad-Toh, E. Birney, J. Rogers, J. F. Abril *et al.*, 2002 Initial sequencing and comparative analysis of the mouse genome. *Nature* 420: 520–562.
- Welsh, C. E., D. R. Miller, K. F. Manly, J. Wang, L. McMillan *et al.*, 2012 Status and access to the Collaborative Cross population. *Mamm. Genome* 23: 706–712.
- Wojtasz, L., J. M. Cloutier, M. Baumann, K. Daniel, J. Varga *et al.*, 2012 Meiotic DNA double-strand breaks and chromosome asynapsis in mice are monitored by distinct HORMAD2-independent and -dependent mechanisms. *Genes Dev.* 26: 958–973.
- Yalcin, B., K. Wong, A. Agam, M. Goodson, T. M. Keane *et al.*, 2011 Sequence-based characterization of structural variation in the mouse genome. *Nature* 477: 326–329.
- Yang, H., Y. Ding, L. N. Hutchins, J. Szatkiewicz, T. A. Bell *et al.*, 2009 A customized and versatile high-density genotyping array for the mouse. *Nat. Methods* 6: 663–666.
- Yang, H., J. R. Wang, J. P. Didion, R. J. Buus, T. A. Bell *et al.*, 2011 Subspecific origin and haplotype diversity in the laboratory mouse. *Nat. Genet.* 43: 648–655.
- Zenger, K. R., L. M. McKenzie, and D. W. Cooper, 2002 The first comprehensive genetic linkage map of a marsupial: the tammar wallaby (*Macropus eugenii*). *Genetics* 162: 321–330.

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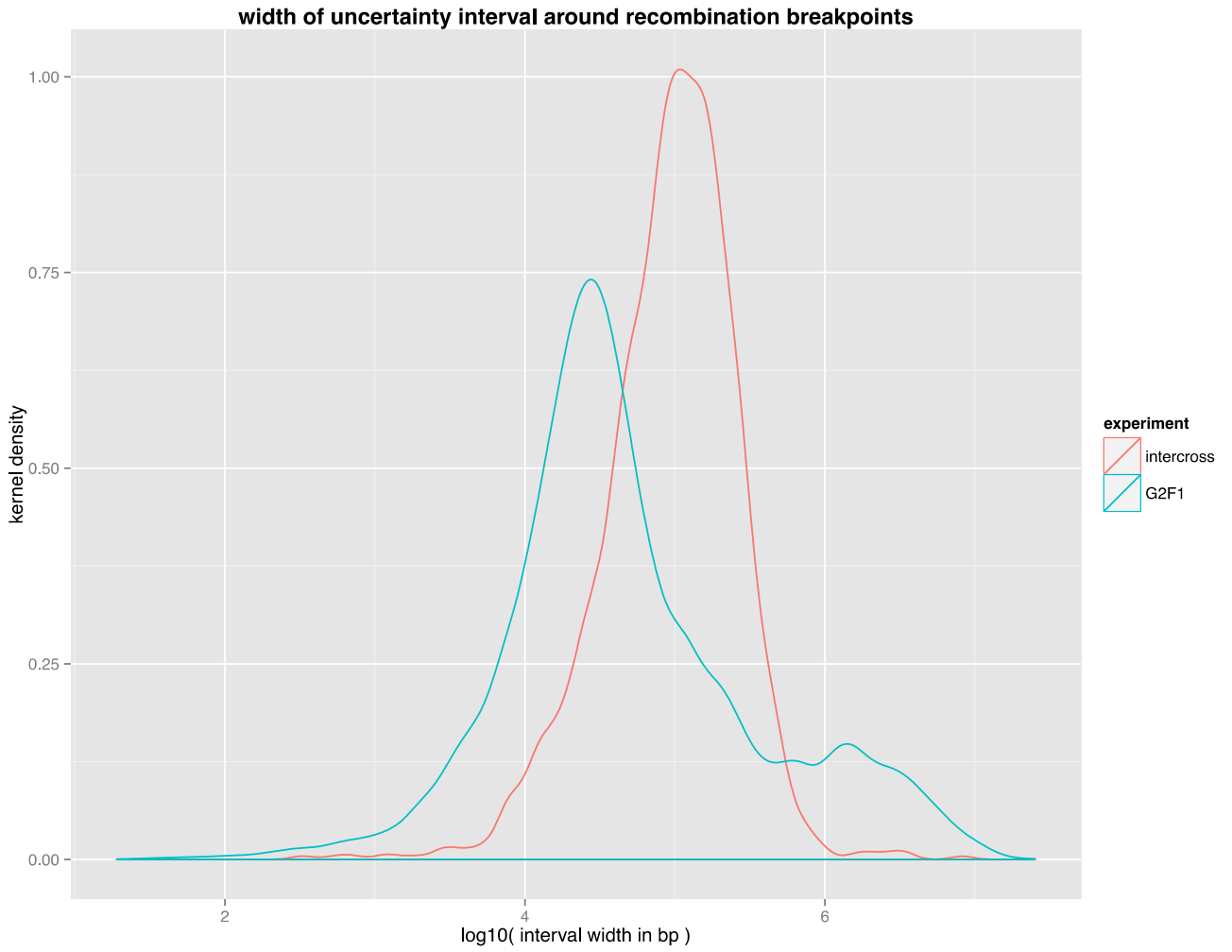
# GENETICS

**Supporting Information**

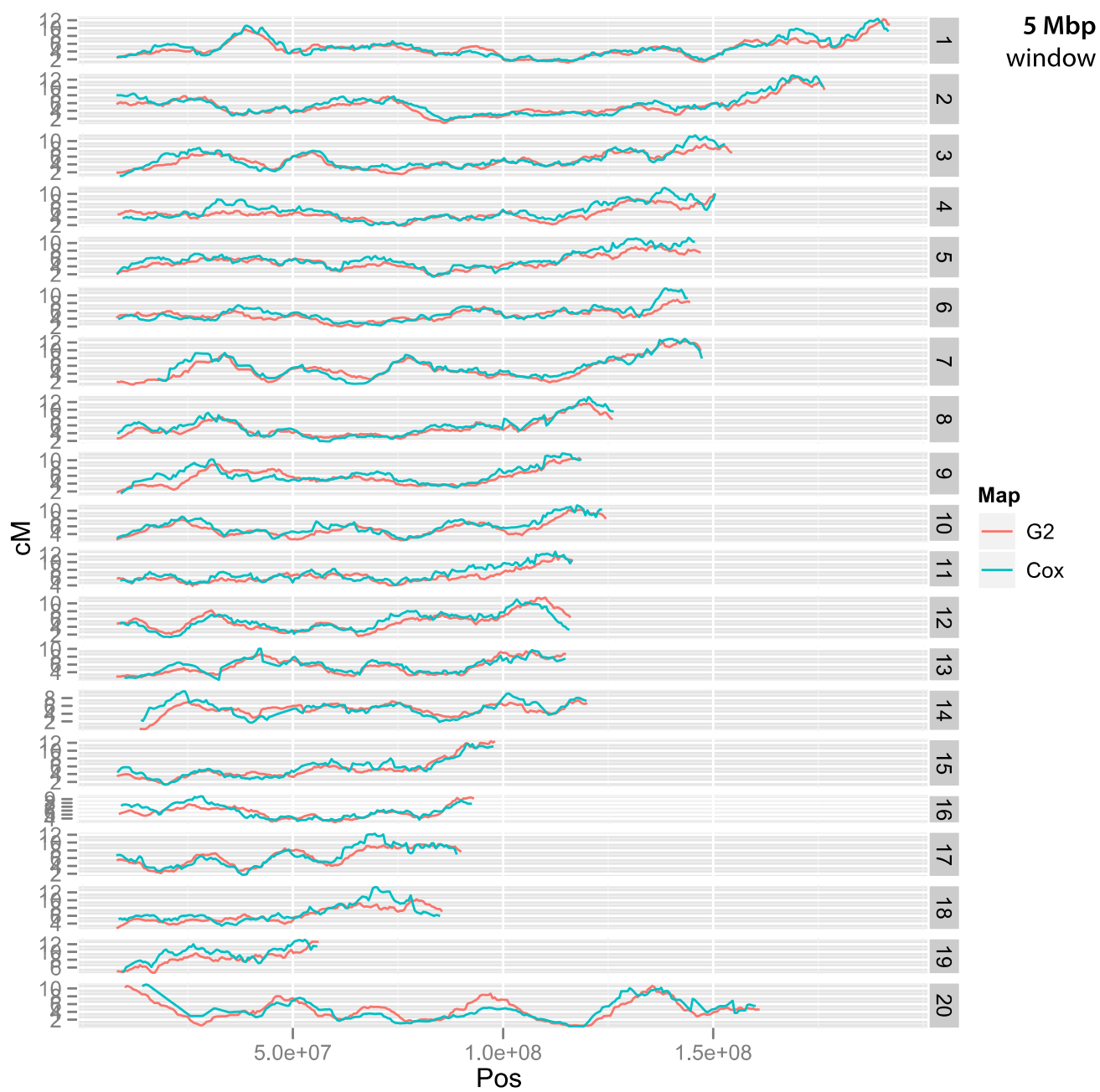
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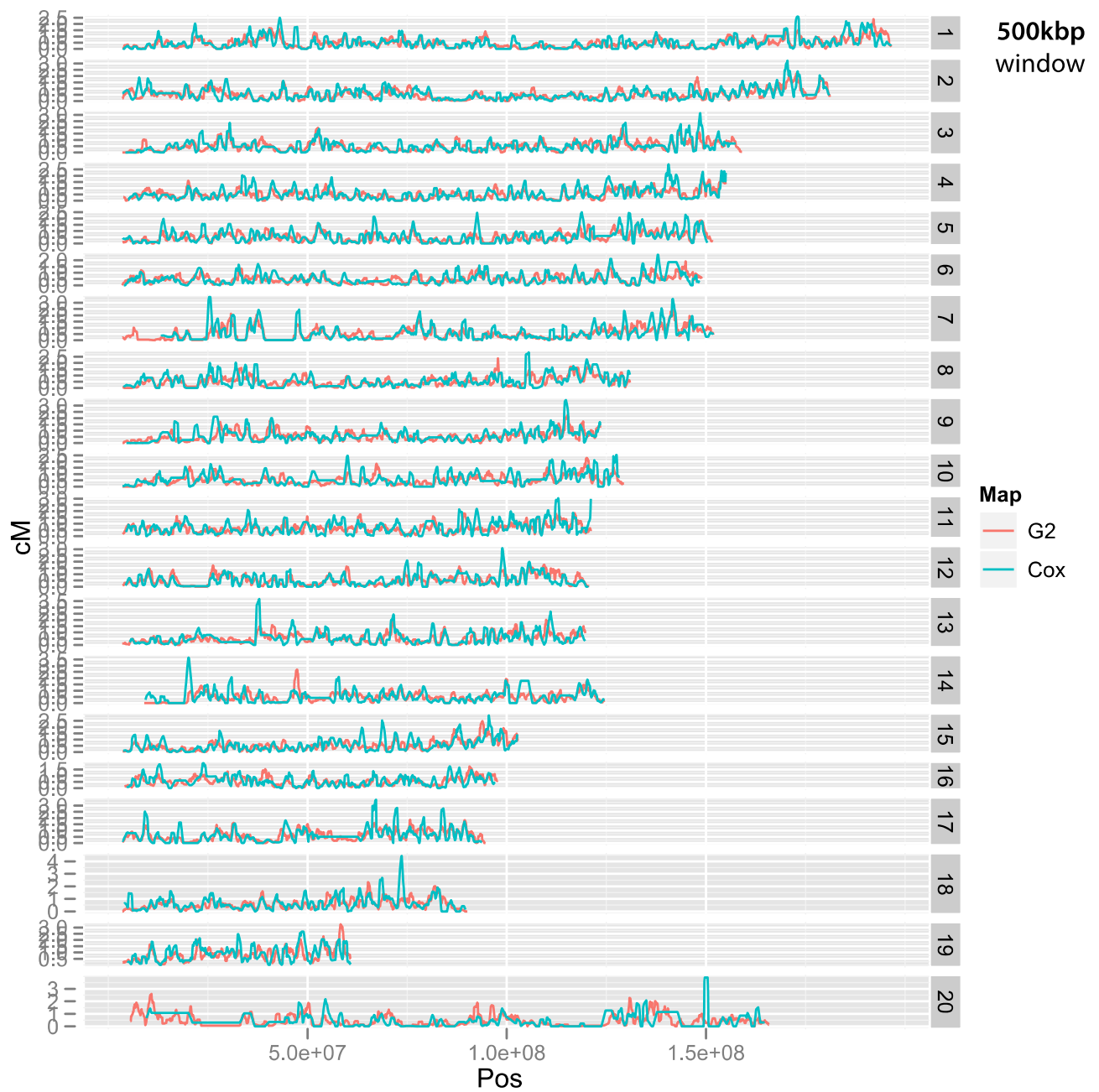
## **High-Resolution Sex-Specific Linkage Maps of the Mouse Reveal Polarized Distribution of Crossovers in Male Germline**

**Eric Yi Liu, Andrew P. Morgan, Elissa J. Chesler, Wei Wang, Gary A. Churchill,  
and Fernando Pardo-Manuel de Villena**



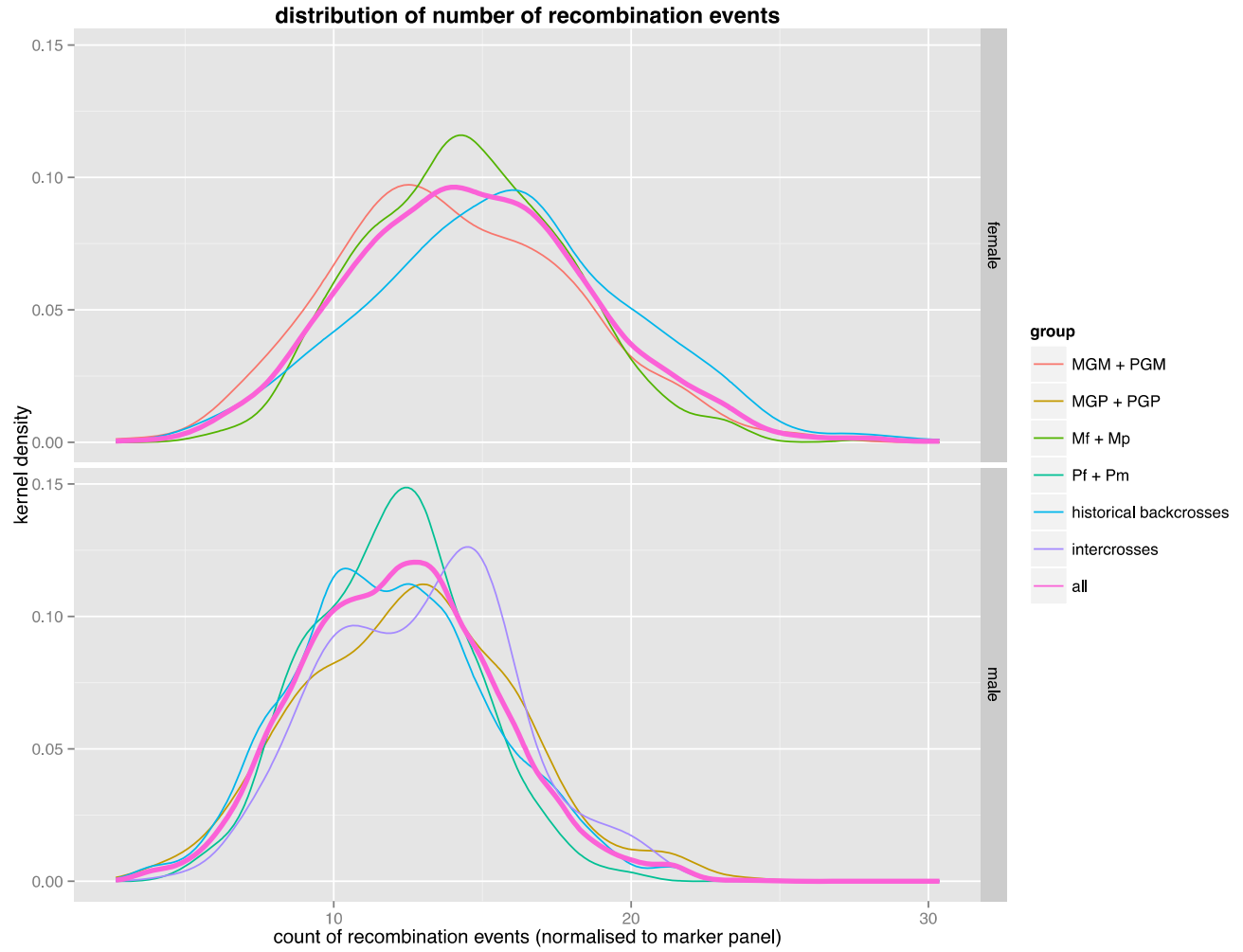
**Figure S1** Distribution of width of uncertainty intervals for crossover events in the  $G_2:F_1$  and intercross populations. The average precision in the  $G_2:F_1$  population is approximately 35 kbp, although the distribution is skewed by the presence of a few very long uncertainty intervals.





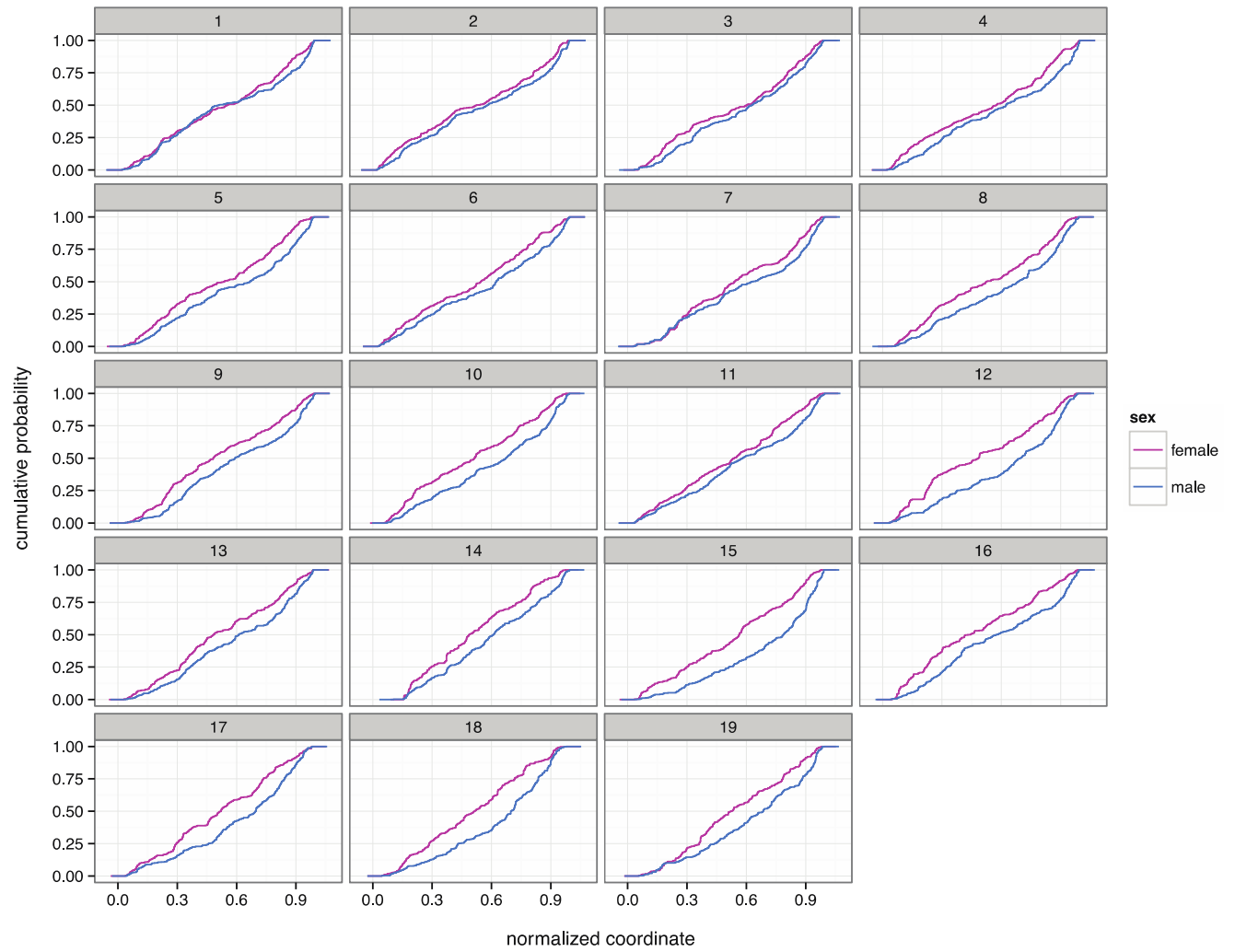
**Figure S2** Sex-averaged crossover density in the  $G_2:F_1$  (pink line) and Heterogeneous Stock (Cox *et al.* 2009, from) computed in 5 Mbp (first panel) or 500 kbp (second panel) windows along the genome.

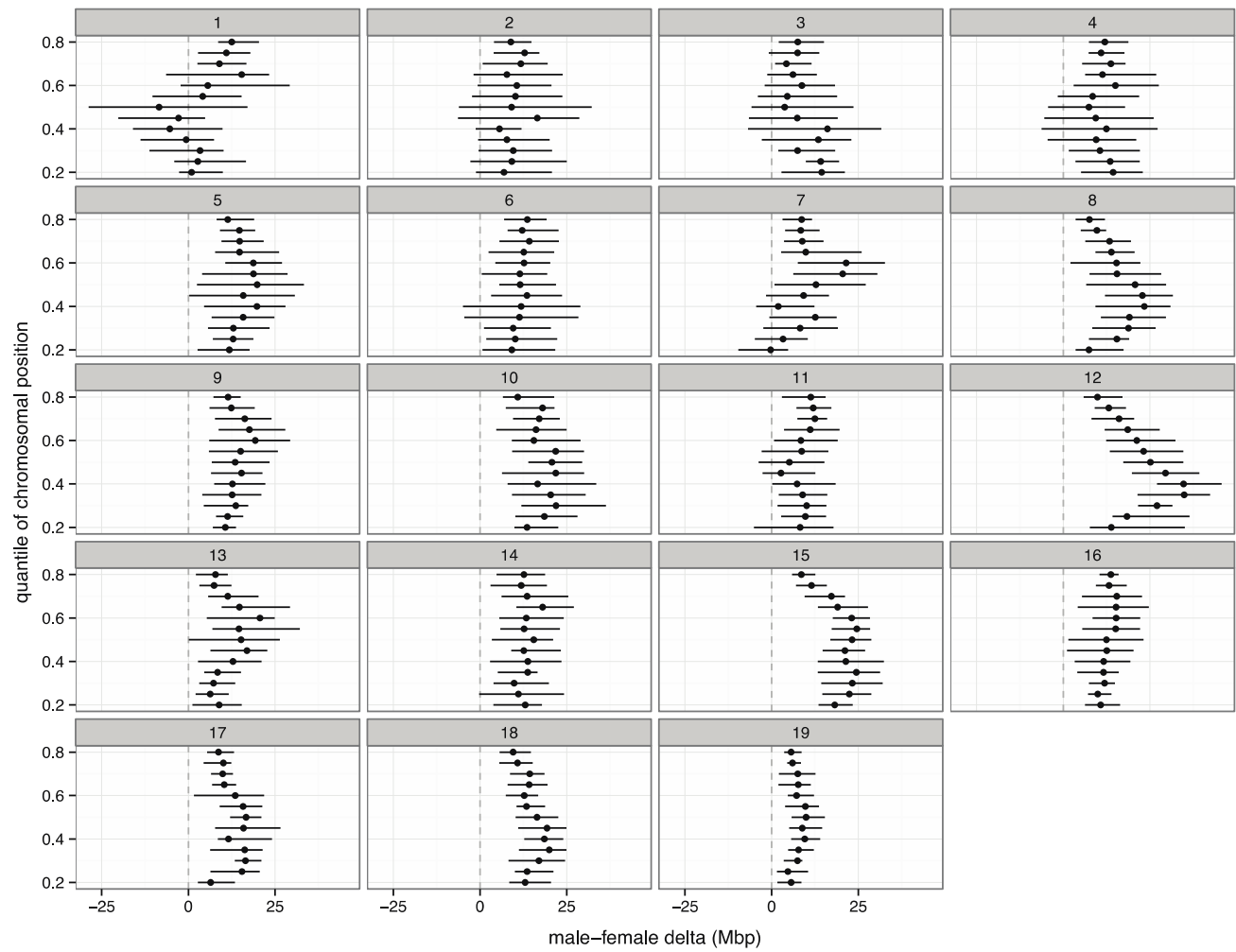




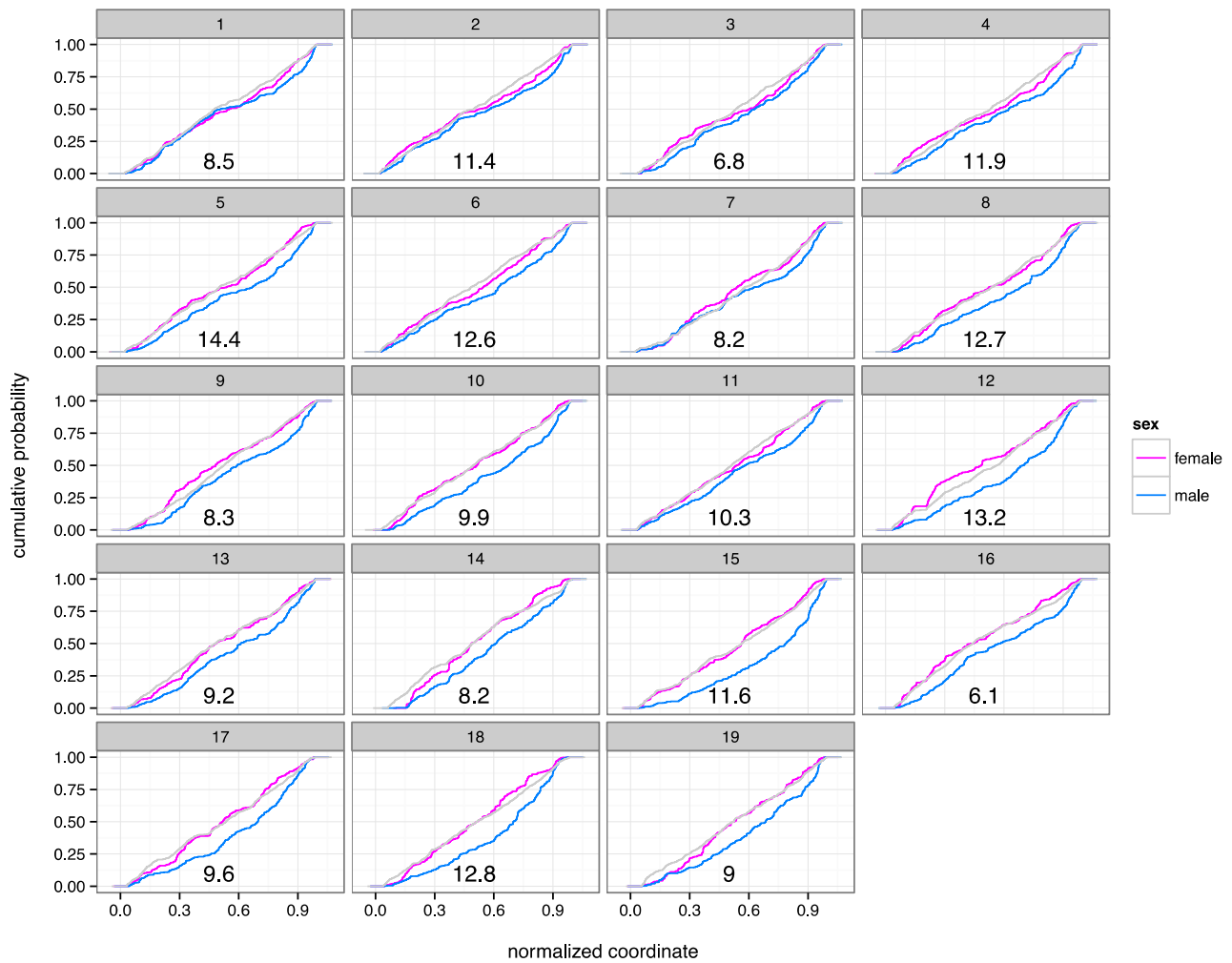
**Figure S3** Distribution of the number of crossover events observed in the genome of  $G_2:F_1$  offspring, subdivided by the meiosis and sex of the parent to which the events are ascribed (see Materials & Methods). A similar distribution computed from a panel of historical backcrosses is included for reference.

**A**



**B**

**Figure S4** Sex differences in spatial distribution of crossover events. (A) Cumulative distribution of crossovers along scaled, normalized autosomes in the  $G_2:F_1$  population. More than one-third of all autosomal crossover events occur in the distal tenth of chromosomes in males; this effect is absent in females. (B) Location shift of male distribution vs female distribution estimated by quantile regression. Intervals represent 95% confidence intervals for displacement of the male distribution at the specified quantiles along the empirical cumulative distribution. The male distribution is displaced towards the distal end at nearly every quantile across all autosomes.

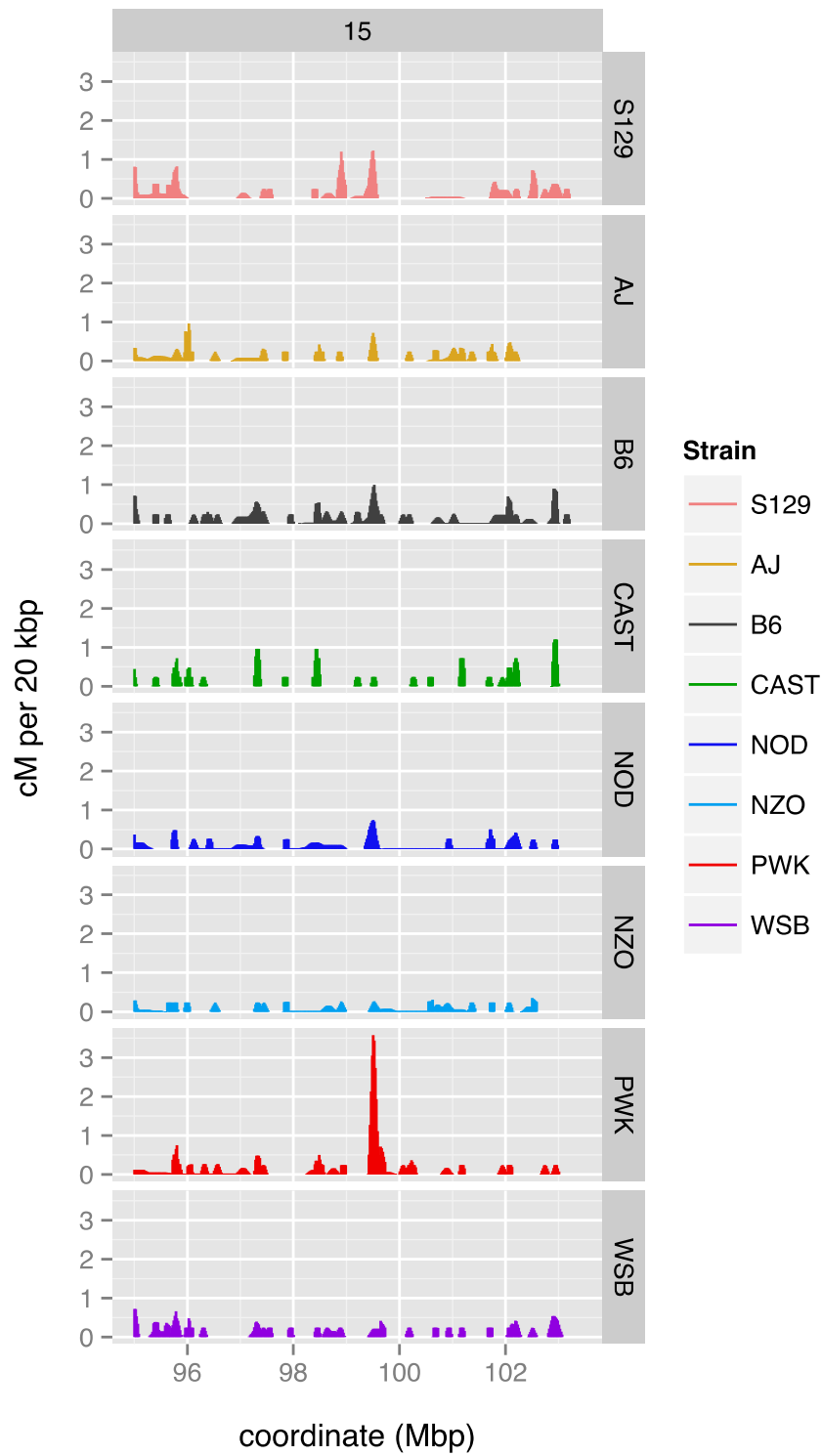


**Figure S5** Spatial distribution of crossover events vs distribution of double-strand breaks (DSBs) reported by Smagulova *et al.* (2011); Brick *et al.* (2012). Cumulative distribution of crossover events along scaled, normalized chromosomes by sex is shown as in Figure S4. Cumulative distribution of DSBs is shown in grey. Values in each panel give  $-\log_{10}(p\text{-values})$  for a two-tailed Kolmogorov-Smirnov test of difference between male distribution and DSB distribution on each chromosome.

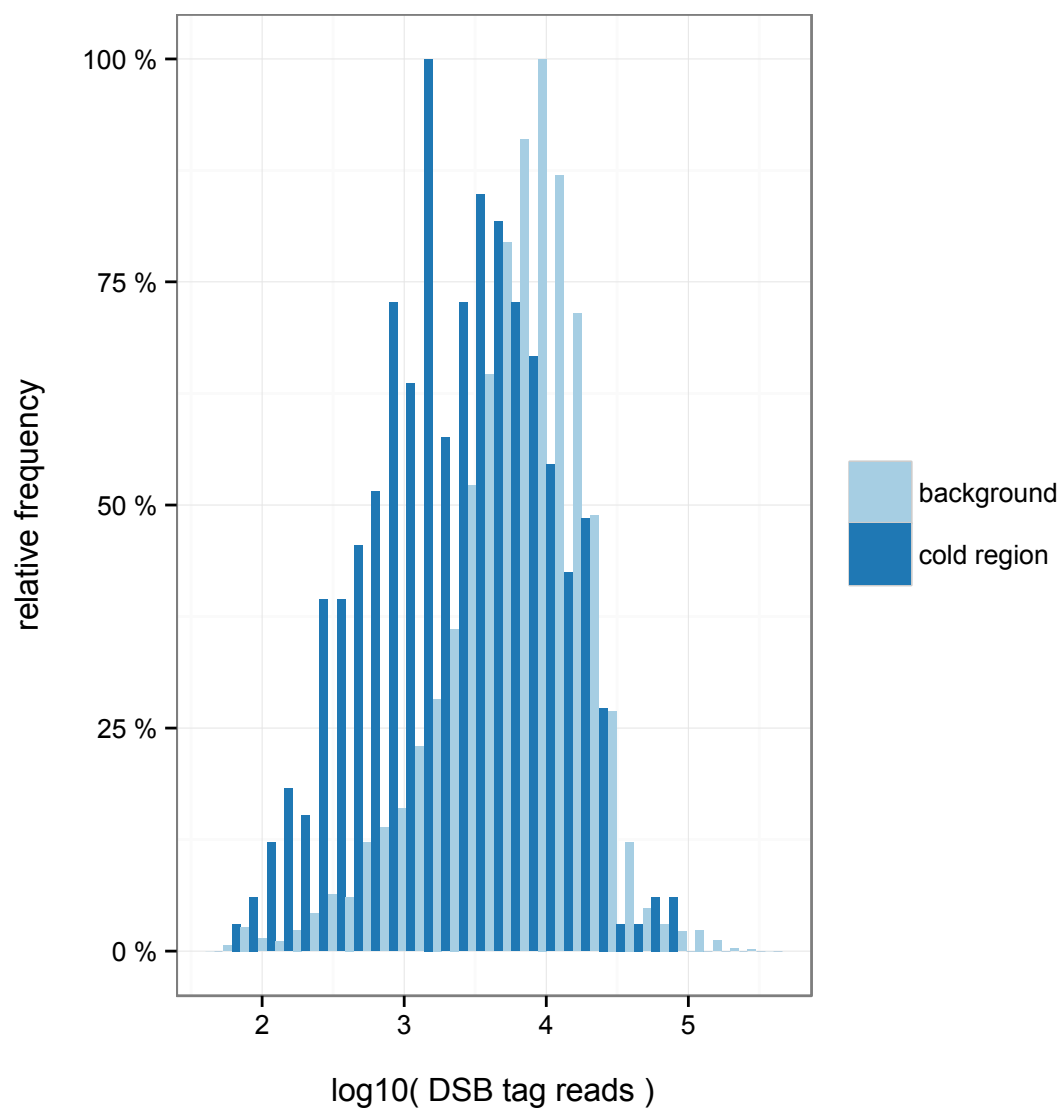


**Figure S6**

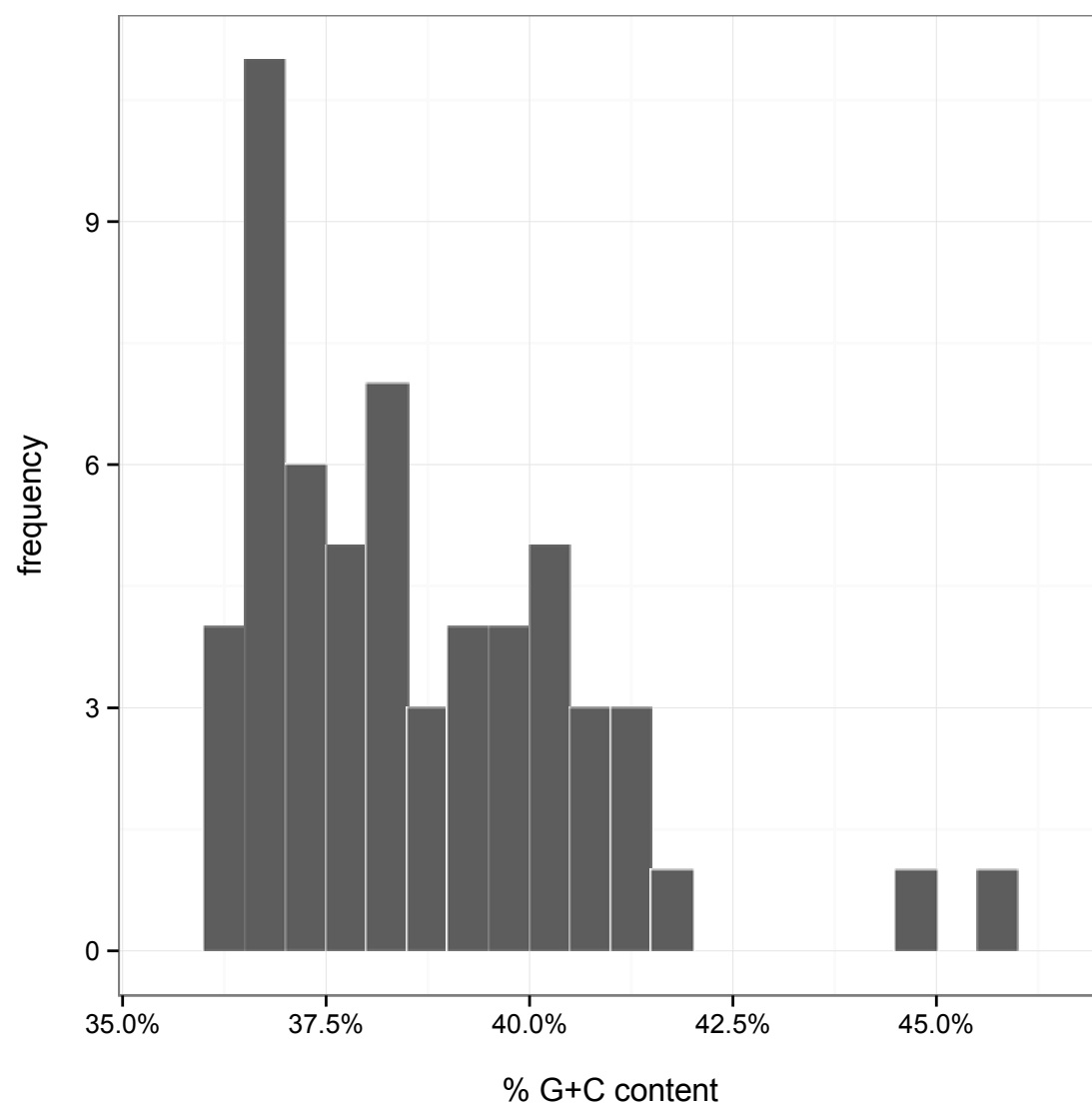
Available for download at <http://www.genetics.org/lookup/suppl/doi:10.1534/genetics.114.161653/-/DC1>



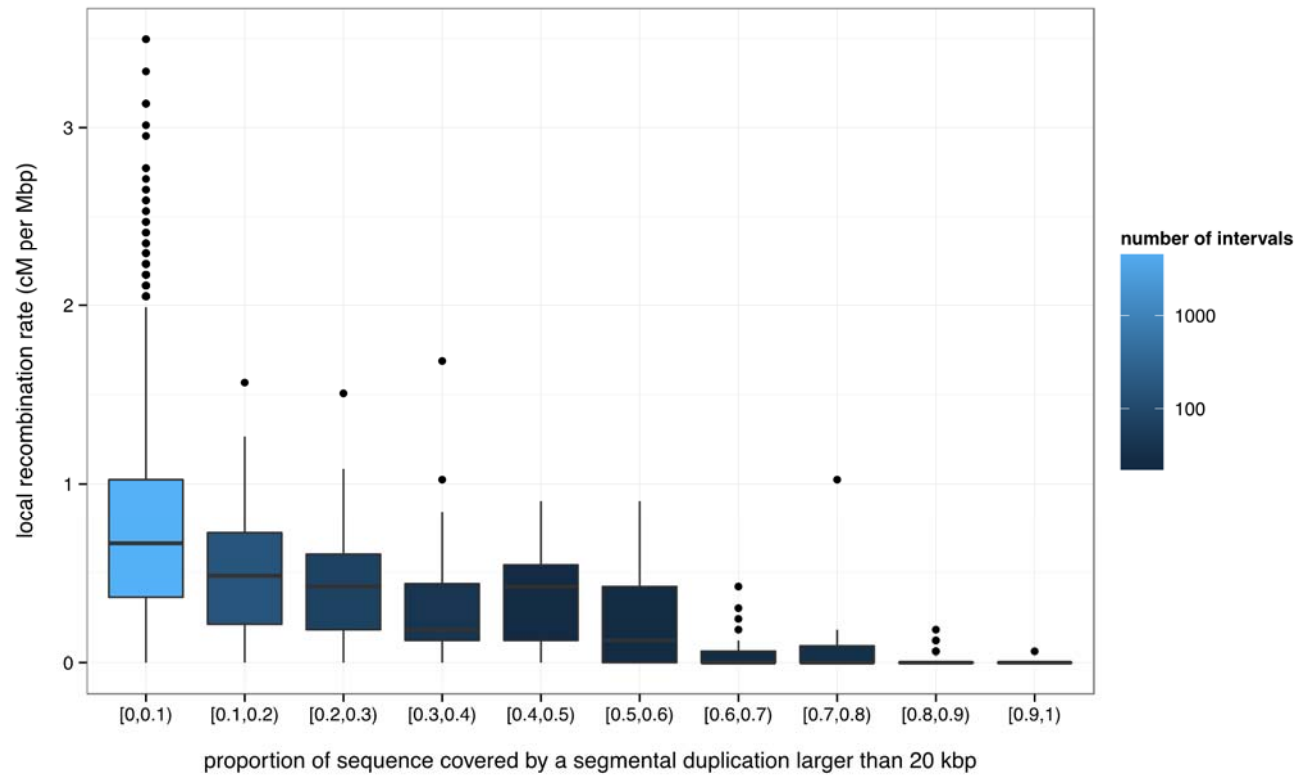
**Figure S7** Example of a strain-specific recombination hotspot: a cluster of crossover events on distal chromosome 15 involving PWK/PhJ. The 100-kbp interval at the center of the plot has a genetic length of 6 cM.



**Figure S8** Frequency distribution of double-strand break (DSB) density in Smagulova *et al.* (2011); Brick *et al.* (2012) weighted by strength, measured as  $\log_{10}(\text{number of tag reads})$  in 500 kbp windows (with 250 kbp overlap). Windows are considered to lie in a cold region if they overlap the region by more than 50% of their length; otherwise they are designated as background.



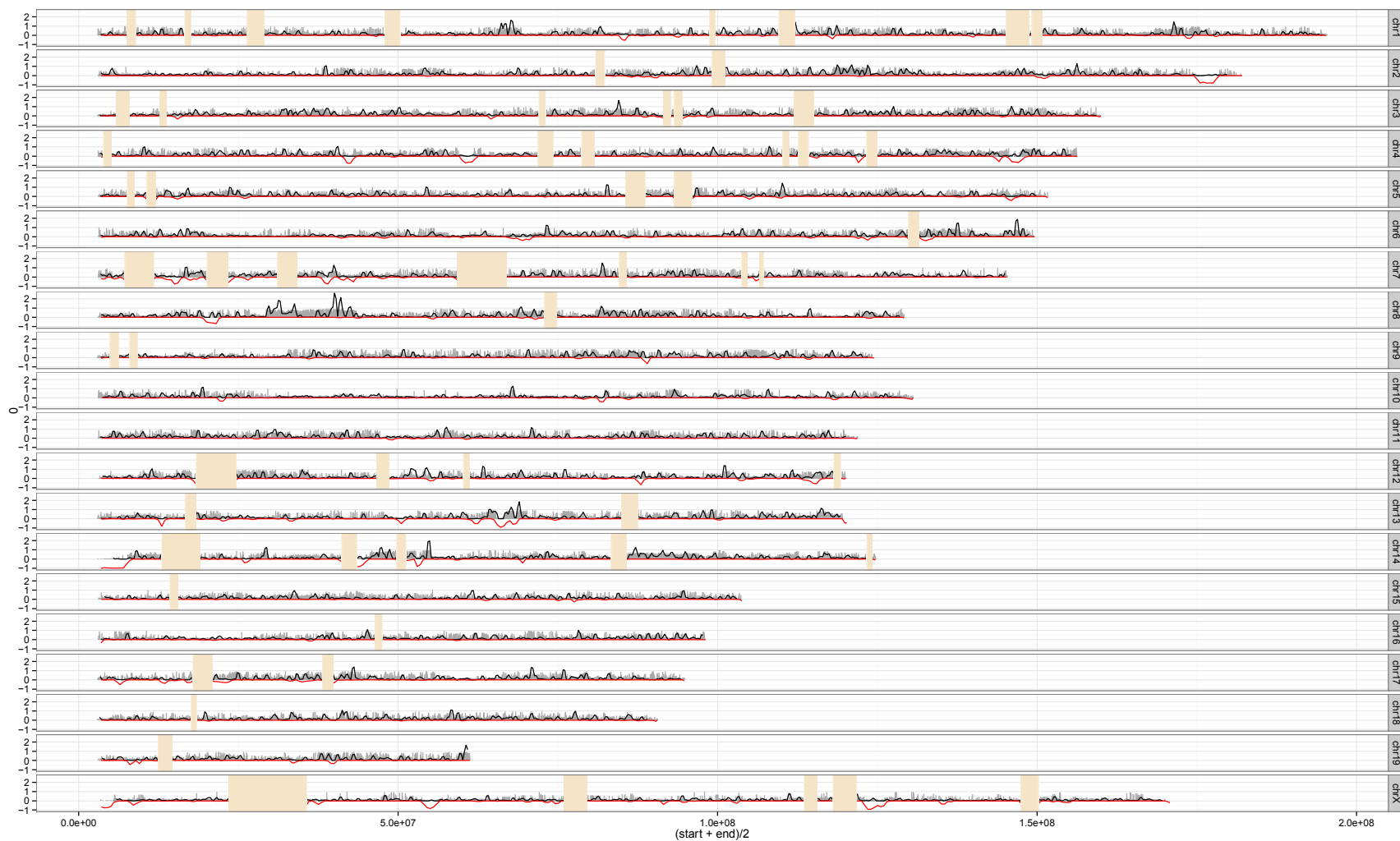
**Figure S9** Distribution of C+G content of the 59 recombination-cold regions



**Figure S10** Correlation between segmental duplication rate and local recombination rate computed in 1 Mbp windows genome-wide.



**Figure S11** Dotplots of self-alignment of reference sequence (GRCm38/mm10 assembly), as described in Materials & Methods, for all cold regions; one image per cold region, in ZIP-compressed archive. Available for download at <http://www.genetics.org/lookup/suppl/doi:10.1534/genetics.114.161653/-/DC1>



**Figure S12** Genome-wide density of structural variants (SVs) in 18 laboratory mouse strains (Yalcin *et al.* 2011) (black line above abscissa) compared to segmental duplication rate (red line below abscissa). Individual SVs are plotted as grey bars with height proportional to the number of strains in which they were observed.

#### Files S1-S6

Available for download at <http://www.genetics.org/lookup/suppl/doi:10.1534/genetics.114.161653/-/DC1>

**File S1** Crossover events inferred in  $G_2:F_1$  population.

**File S2** Crossover events inferred in intercross population.

**File S3** Mouse Diversity Array markers used for haplotype inference in  $G_2:F_1$  population, according to quality tier, as ZIP-compressed archive.

**File S4** Coordinates and genomic features of cold regions.

**File S5** Sequence coordinates of double-strand breaks identified in Smagulova *et al.* (2011); Brick *et al.* (2012), converted to GRCm38/mm10 coordinates, for use in recapitulating analyses of their spatial distribution.

**File S6** Fraction of genome spanned by segmental duplications > 20 kbp in size, computed in 1 Mbp bins with 500 kbp overlap.

## File S7

Starting at the ends: high-resolution  
sex-specific linkage maps of the mouse indicate  
that recombination in male germline is  
anchored at telomeres

### SUPPLEMENTARY TEXT

## 1 Mendelian expectations for $G_2:F_1$ pedigrees

Here we derive, from first principles applied to the Collaborative Cross breeding scheme, a set of strong predictions regarding the expected number and distribution of recombination events observed in  $G_2:F_1$  offspring. Figure 1 from the main text is reproduced for reference as Figure [A](#). Although we restrict our discussion to the autosomes for simplicity, similar logic can be applied to the X chromosome.

### 1.1 Observable meioses per funnel

A recombination event occurring in one of the eight meioses comprised by each breeding funnel (4 at  $G_1$  and 4 at  $G_2$ ) can be observed only if its crossover products are transmitted to at least one member of the  $G_2:F_1$  sib pair. Transmission of a  $G_1$  event can occur via one or both of two  $G_2$  meioses: for MGM or MGP events, via Mf or Mm; and for PGM or PGP events, via Pf or Pm. Each  $G_2$  meiosis is independent, so by Mendel's first law the probability that a  $G_1$  event is transmitted to at least one  $G_2:F_1$  sib is  $1 - P(\text{transmitted to neither sib}) = 1 - (\frac{1}{2})(\frac{1}{2}) = \frac{3}{4}$ .

All (transmitted) crossover products of  $G_2$  meioses are observable as they are transmitted directly to  $G_2:F_1$  offspring. Thus the expected number of observable meioses per funnel is  $4(\frac{3}{4}) + 4(1) = 7$ .

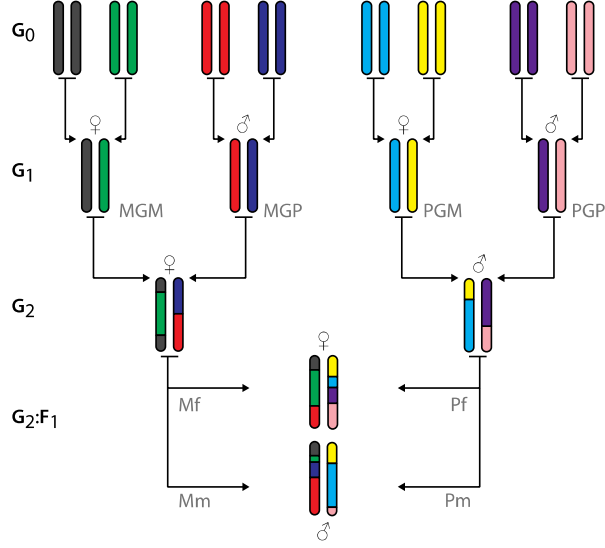


Figure A: Pedigree structure of  $G_2:F_1$  sibling pairs (representative funnel), with each of eight independent meioses labelled.

## 1.2 $G_1$ vs $G_2$ events

It follows directly from the logic above that the expected ratio of  $G_1$  to  $G_2$  events is 3 : 4.

## 1.3 Balance between half-funnels

Each breeding funnel can be divided into halves, the left ( $G_2$  maternal) half comprising meioses MGM, MGP, Mf and Mm and the right ( $G_2$  paternal) half comprising PGM, PGP, Pf and Pm. Because the halves are balanced for both the number of meioses (4) and the number of meioses per sex (2), the expected ratio of events from the left to the right half-funnel is 1 : 1.

## 1.4 Singleton vs shared events at $G_1$

We call an event *shared* if it is observed in both members of a  $G_2:F_1$  sib pair, and a *singleton* if it is observed in only one member of the pair. Each sib is



descended from one paternal  $G_2$  meiosis (Pf or Pm for the female or male sib, respectively) and one maternal  $G_2$  meiosis (Mf or Mm), none of which are shared between sibs. Thus all events assigned to  $G_2$  must be singletons. (The likelihood of observing two independent but indistinguishable recombination events — that is, two events with the same strains proximal and distal to the junction, whose uncertainty intervals share the same boundaries — is negligibly small in our design.)

However, grandpaternal meioses, those occurring at  $G_1$  (MGM, MGP, PGM, PGP), are shared between members of the sib pair. By Mendel's first law, the probability that a  $G_1$  event transmitted to one member of the sib pair is also transmitted to the other is  $\frac{1}{2}$ . The expected ratio of singleton to shared events in  $G_1$  is thus 2 : 1.

## 2 Algorithm for haplotype reconstruction in intercross population

Intercross offspring — (FVB/NJ  $\times$  (PWK/PhJ  $\times$  CAST/EiJ)) $F_1$  or (FVB/NJ  $\times$  (WSB/EiJ  $\times$  PWK/PhJ)) $F_1$  — were genotyped using the MegaMUGA Array (Fu, Didion *et al.*, in preparation.) Inference of haplotype blocks from MegaMUGA genotype calls proceeds in three steps, illustrated in Figure [2](#). As in the CC population, we seek to determine the founder ancestry of chromosomal segments, and subsequently to localize recombination events which generate transitions between founders on a given chromosome. The method described here takes advantage of the simplicity of pedigrees in the intercross: for all offspring, the maternal haplotype is always FVB/NJ and the paternal haplotype can be only one of two strains (CAST/EiJ or PWK/PhJ; WSB/EiJ or PWK/PhJ, respectively).

### 2.1 Founder ancestry assignment of genotypes at each marker

Using genotypes from 32 control samples representing the founder strains in the intercross population (FVB/NJ, CAST/EiJ, PWK/PhJ, and WSB/EiJ), each genotype call from an intercross offspring is assigned to a pair of founder strains: one from the maternal side of the cross and one from the paternal side. (Markers which are not segregating between paternal founder strains

are uninformative for haplotype reconstruction.) Heterozygous calls are resolved to a pair of founder strains by considering segregation patterns between founder strains: for example, if founder strains 1 and 2 have (homozygous) genotype A and founder 3 has genotype B at a given marker, a heterozygous call at that marker is consistent with the founder assignments (1, 3) or (2, 3) but not (1, 2).

## 2.2 Clustering of founder assignments into haplotype blocks

Founder assignments per marker are clustered into blocks from left to right (*i.e.* proximal to distal) along each chromosome, ignoring uninformative markers. A block is defined as a run of consecutive markers with the same founder assignment; it is described by its left and right endpoints (which may span the entire chromosome) and its founder assignment. Blocks thus define chromosome segments inherited from a given founder strain, and owing to the duality between haplotype structure and the recombination which generates it, boundaries between adjacent blocks define recombination events. The uncertainty interval for a recombination event is the distance between the distal-most marker in the proximal block and the proximal-most marker in the distal block.

## 2.3 Refinement of haplotype blocks

Two constraints are applied to the resulting haplotypes blocks to improve the inferred haplotypes. First, internal blocks — those for which neither boundary is a chromosome end (such as the one marked with an “X” in Figure B, last panel) — are required to be longer than 25 Mbp. This is because these blocks are defined by multiple recombination events, which in this population must have occurred during the same meiosis; interference is expected to space such consecutive recombination events widely along the chromosome. Because the 25 Mbp threshold represents approximately the 0.1<sup>st</sup> percentile of interference distance in our experiment, blocks shorter than this are biologically highly unlikely. We subsume internal blocks smaller than 25 Mbp into neighboring blocks. (Note that, because only two founder strains can be present on the paternal haplotype, it does not matter if the small block is subsumed into its right- or left-hand neighbor.) Second, each block must consist of at least 10 markers, in order to mitigate effects of genotyping error

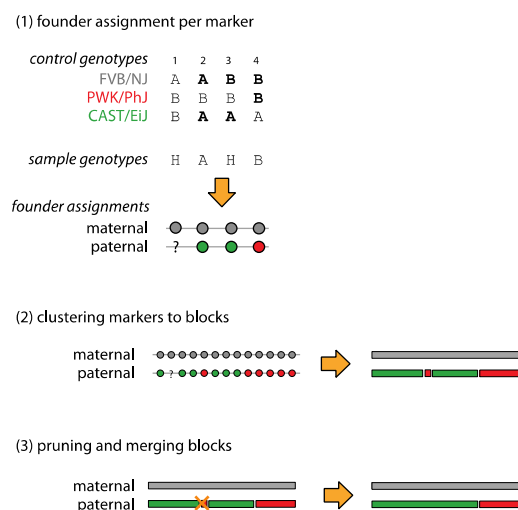


Figure B: Algorithm for haplotype reconstruction in intercross population.

or noncrossovers. The far distal regions are exempted from this constraint in order to capture subtelomeric recombination events, and such events were confirmed as true recombinations by manual inspection of probe intensity data at underlying markers.

In practice this algorithm returns identical results across a wide range of choices for the minimum-interference and minimum-markers-per-block parameters, except for a highly-repetitive, poorly-assembled region of proximal chromosome 14 for which several markers are known to be problematic in heterozygosity (YANG *et al.* 2011; COLLABORATIVE CROSS CONSORTIUM 2012). Likewise, clustering of markers into blocks from right to left instead of from left to right has no effect on results.

## References

COLLABORATIVE CROSS CONSORTIUM, 2012 The genome architecture of the Collaborative Cross mouse genetic reference population. *Genetics* **190**:

389–401.

YANG, H., J. R. WANG, J. P. DIDION, R. J. BUUS, T. A. BELL, *et al.*,  
2011 Subspecific origin and haplotype diversity in the laboratory mouse.  
Nat Genet **43**: 648–55.