ORIGINAL ARTICLE Commercial chicken breeds exhibit highly divergent patterns of linkage disequilibrium

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The analysis of linkage disequilibrium (LD) underpins the development of effective genotyping technologies, trait mapping and understanding of biological mechanisms such as those driving recombination and the impact of selection. We apply the Malécot-Morton model of LD to create additive LD maps that describe the high-resolution LD landscape of commercial chickens. We investigated LD in chickens (*Gallus gallus*) at the highest resolution to date for broiler, white egg and brown egg layer commercial lines. There is minimal concordance between breeds of fine-scale LD patterns (correlation coefficient <0.21), and even between discrete broiler lines. Regions of LD breakdown, which may align with recombination hot spots, are enriched near CpG islands and transcription start sites ($P < 2.2 \times 10^{-16}$), consistent with recent evidence described in finches, but concordance in hot spot locations between commercial breeds is only marginally greater than random. As in other birds, functional elements in the chicken genome are associated with recombination but, unlike evidence from other bird species, the LD landscape is not stable in the populations studied. The development of optimal genotyping panels for genome-led selection programmes will depend on careful analysis of the LD structure of each line of interest. Further study is required to fully elucidate the mechanisms underlying highly divergent LD patterns found in commercial chickens. *Heredity* (2016) **117**, 375–382; doi:10.1038/hdy.2016.47; published online 6 July 2016

INTRODUCTION

A detailed understanding of linkage disequilibrium (LD) structure is essential for designing single-nucleotide polymorphism (SNP) genotyping arrays, successful association mapping of genetic factors underlying traits of interest, establishing mechanisms of genetic recombination and elucidating patterns of selection and population structure. This is particularly true for agricultural species such as commercial chicken (*Gallus gallus*) where LD analysis has the potential to establish the genetic drivers of selection and therefore contribute to further commercial development of lines.

The chicken genome comprises macrochromosomes, intermediate chromosomes and microchromosomes. The macrochromosomes (GGA1–5) span 50–200 Mb, intermediate chromosomes (GGA6–10) range from 20 to 40 Mb and 28 microchromosomes (GGA11–38) that average ~ 12 Mb (Hillier *et al.*, 2004; Megens *et al.*, 2009; Schmid *et al.*, 2015). The microchromosomes are characterised as having higher GC content, gene density and much higher recombination rates compared with macrochromosomes (~50–100 versus ~ 300 kb cM⁻¹ in macrochromosomes). The latter may reflect the requirement for a minimum of at least one chiasma for each chromosome per meiosis and a higher density of cohesin-binding sites (Groenen *et al.*, 2009).

Previous studies of LD in the chicken have established that the microchromosomes show reduced LD compared with macrochromosomes, and that these differences are almost completely explained by differences in the recombination rate (Megens *et al.*, 2009). Studies of egg-laying chickens indicate higher levels of LD compared with

broilers (Heifetz *et al.*, 2005; Andreescu *et al.*, 2007). Despite relatively low levels of LD in broilers, Andreescu *et al.* (2007) determined that there is significant overlap in LD for marker pairs across nine different commercial broiler lines.

LD maps constitute the LD analogue of the genetic linkage map and have been extensively utilised for human data (Maniatis *et al.*, 2002; Tapper *et al.*, 2005), and have also been previously applied to agricultural species (Khatkar *et al.*, 2006). We here construct LD maps according to the Malécot-Morton model, using the program LDMAP (Maniatis *et al.*, 2002; Tapper *et al.*, 2005). This model is defined as:

$$\hat{\rho} = (1 - L)Me^{-\epsilon d} + L$$

where $\hat{\rho}$ is the association between SNPs; the asymptote *L* is the 'background' association between unlinked markers that is increased in small sample sizes and with residual population structure; *M* reflects association at zero distance with values ~1 consistent with monophyletic origin and <1 with polyphyletic inheritance; ϵ is the rate of LD decline; and *d* is the physical distance in kb between SNPs (Maniatis *et al.*, 2002).

One LD unit (LDU, equal to ϵd) corresponds to the (highly variable) physical distance over which LD declines to 'background' levels. Compared with the physical map, the LDU scale delimits regions of LD breakdown (that may represent recombination hot spots) as steps, and broader regions of low haplotype diversity (blocks) as plateaus. The overall LDU map length reflects time since an

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effective population bottleneck (Zhang *et al.*, 2002; Service *et al.*, 2006). Therefore, populations with shorter LDU maps have been founded more recently, experienced a more recent selective sweep or have a smaller effective population size compared with those with longer maps.

The close correspondence between LD patterns and much lowerresolution linkage maps suggest a dominant role for recombination in LD structure. However, unlike linkage maps that provide a lowresolution description of recombination over recent generations, LD maps are constructed from population data and reflect the historical impacts of recombination, mutation, selection and population history. LDU maps of commercial chicken lines may provide new insights into patterns of recombination and selection. Previous studies have begun to describe differences in recombination across *Gallus* genomes based on linkage and LD structure (Megens *et al.*, 2009), and high-resolution genome-wide LD maps have the potential to yield further insights.

Birds appear to lack the zinc-finger protein PRDM9 that is required for recombination hot spot localisation in humans and other mammals (Fumasoni *et al.*, 2007; Oliver *et al.*, 2009; Myers *et al.*, 2010). Despite this, recent work by Singhal *et al.* (2015) has shown that hot spots are highly concordant between wild bird (finch) populations, apparently because of the concentration of recombination events near functional elements of the genome, namely CpG islands and transcription start sites (TSSs).

Here, we construct genome-wide LDU maps for three chicken breeds: broilers (BRO), white egg layers (WEL) and brown egg layers (BEL). We contrast the LD structure across the three breeds, and evaluate the consistency of LD patterns between breeds, potential recombination hot spots and differences between chromosome types and motifs underlying major features of the maps. In addition, we compare patterns between specific commercial lines (sub-populations) within breeds.

MATERIALS AND METHODS

Genotypic data used in this work are as reported in the validation populations of Kranis *et al.* (2013), with all genomic coordinates based on the Gallus_gallus-4.0 (galGal4) reference assembly. The samples described by Kranis *et al.* (2013) were supplied by Aviagen (Huntsville, AL, USA; broilers), Hy-line International (West Des Moines, IA, USA) and Lohmann of Synbreed Consortium (the white and brown egg layers). As described in this paper the variants genotyped were selected to provide an overall uniform distribution of allele frequencies, across the three breed types, best capturing the diversity of each. All of the genotype data used in this study are from individuals that share <80% identity by similarity genome-wide to minimise population substratification and have >95% genotyping completeness. Genotype assessment was performed using PLINK v1.07 (Purcell *et al.*, 2007). Multidimensional scaling was undertaken using all autosomal markers in order to evaluate the population structure of the samples.

Once the analytical cohorts were defined, SNP marker filtering was undertaken independently for each cohort. Markers with <95% genotyping completeness, minor allele frequency <0.05 or Hardy–Weinberg equilibrium deviation *P*-value <0.001 were removed to leave a data set containing only common, high-quality markers. Within each breed the inbreeding coefficient (*F*) (Wright, 1922) was calculated using the PLINK program. LD maps were generated for the assembled autosomes GGA1–28 on filtered data according to the Malécot-Morton model using LDMAP (Morton *et al.*, 2001; Kuo *et al.*, 2007). Where necessary, filtered genotype data were split into ~ 25 000 marker segments (with 200 marker overlap) to allow for parallelised processing. Overlapping map segments were then trimmed of the terminal 25 markers, and merged to form complete, contiguous whole-chromosome LD maps for the assembled autosomes. Comparisons of LD maps with existing linkage maps were made. The order of markers in linkage maps from Elferink *et al.* (2010) was revised in line with galGal4 from the native assembly based upon SNP positions within dbSNP (Sherry *et al.*, 2001). Following transition to the galGal4 order, a small number of disordered markers in the linkage map, which distorted the cumulative map, were removed.

To compare map structure between breeds, we focussed on the macrochromosomes GGA1–5. These were chosen to avoid confounding factors such as potentially incomplete reference assemblies, as well as varying recombination rates for the microchromosomes (Hillier *et al.*, 2004; Groenen *et al.*, 2009; Elferink *et al.*, 2010; Schmid *et al.*, 2015). Spearman's rank correlation of LDU lengths for all 40 kb regions among the three breeds was calculated, after Rubin *et al.* (2010).

For finer-scale interrogation of the LDU length of 5 kb regions, we investigated the concordance seen for these regions with the longest LDU length. We performed these comparisons based upon LDU percentiles, as opposed to absolute LDU lengths, to allow for the differing global LD map lengths for the breeds. This analysis gives an indication of the extent to which narrow regions of intense LD breakdown (that may align with recombination hot spots) are shared between breeds/lines. A high degree of concordance between long LDU segments might suggest a high proportion of shared recombination hot spots between the samples considered. For comparison, we also compared human European and African populations (Pengelly *et al.*, 2015), the two larger BRO2/3 lines, as well as BRO3a/b, a random bisection of the largest population, BRO3. As a final control, a randomised data set was used for which an equal number of 5 kb regions were randomly selected independently for each data set, and the concordance calculated; 100 pseudo-replicates were performed for each percentile cutoff.

For comparing LDU decline rates with genome features we focussed on the BRO data set as it has the largest sample size in the data set. GC content was calculated directly from the reference sequence for 5 kb regions, CpG islands were defined according to the UCSC (University of California, Santa Cruz) genome browser and Ensembl annotations were used to define transcripts (Karolchik *et al.*, 2014). BEDTools was used to calculate the distance between elements and regions (Quinlan and Hall, 2010).

RESULTS

Input data

The genotype data used in this work are as reported in the validation populations of Kranis *et al.* (2013), with ~ 1.8 million genotyped SNPs in total. Multidimensional scaling of all samples shows distinct clustering of breeds, though with three distinct population clusters within each breed, consistent with the three genotyped lines (Supplementary Figure S1). For initial LDU map construction, all lines of a breed were pooled. Sample groups used are described in Table 1. For clarity, we use BRO, BEL and WEL to refer to each pooled breed data set, and BRO2, BRO3 and so on to refer to a distinct line within breed where analysed.

Global map properties

LD maps were generated for all assembled autosomal chromosomes for the three breeds (Supplementary Figure S2). A representative chromosomal LD map for GGA8 is shown in Figure 1. The physical map of the chromosome is represented on the x axis, whereas the y axis shows the LDU maps for each breed and the linkage map in centiMorgans (cM) (Elferink *et al.*, 2010). As in human LDU and cM maps, there is a large central region showing little change in LDU or cM, consistent with the location of the submetacentric centromere, where recombination is suppressed and there is therefore intense LD (Tapper *et al.*, 2005; Krasikova *et al.*, 2006). Summary length statistics for all autosomes are shown in Table 2.

LDU map lengths reflect haplotypic diversity within that population (Service *et al.*, 2006; Pengelly *et al.*, 2015) and can be compared with independent measures of population diversity such as F inbreeding

coefficients. The mean F inbreeding coefficients are 0.21, 0.26 and 0.51 for the BRO, BEL and WEL populations, respectively, with the greater value for WEL indicating more limited genetic diversity within the population. In comparison, the ratio of LDU/Mb map lengths is also variable between breeds (3.50, 3.18 and 1.74 for BRO, BEL and WEL, respectively, across the autosomes; Table 2). This ranking of breeds by LDU length is consistent with the trend obtained from the F-statistic, in line with expectations. There is a general trend towards a lower LDU/cM ratio of map lengths for the smaller chromosomes (Figure 2), with a negative exponential relationship between length of chromosome in megabases and the LDU/cM ratio ($r^2 > 0.75$, $P < 1.7 \times 10^{-9}$ for all breeds).

LD map structure between breeds

To compare map structure between breeds, we focussed on the macrochromosomes GGA1–5. These were chosen because they are known to have more complete reference assemblies (compared with

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the microchromosomes), and have less variable recombination rates than the microchromosomes (Hillier et al., 2004; Groenen et al., 2009; Elferink et al., 2010; Schmid et al., 2015). Following map generation, we interrogated the fine map structure for the breeds to establish the extent to which patterns of LD are conserved between the breeds. There was a weak, though highly significant, correlation between breeds of LDU lengths of corresponding 40 kb regions (Spearman's $\rho < 0.21$; $P < 2.2 \times 10^{-16}$ for all pairwise comparisons; Figure 3). Narrow regions where there is strong breakdown of LD may align with recombination hot spots, for which there is a high degree of concordance across human populations (Jeffreys et al., 2004; Myers et al., 2005; Tapper et al., 2005; Pengelly et al., 2015). We investigated the extent to which regions with LD breakdown are conserved across the three breeds. In humans, recombination hot spots span just 1-2 kb (Jeffreys et al., 2004). To test concordance of narrow regions of LD breakdown we obtained LDU lengths within 5 kb windows; this window size was selected to allow for the incomplete resolution of

		BRO	BRO2ª	BRO3	BRO3a	BRO3b	BEL	WEL
Founders	Males	58	_	50	26	24	12	8
	Females	17	_	9	4	5	40	38
	Total	123 ^a	48	59	30	29	52	46
SNPs	Raw count	966 355	790 531	789 359	692 467	778 135	891 200	691 954
	MAF ^b	833 639	658 548	638 947	631 449	645 713	796 430	627 294
	HWE ^c	760 893	789 450	788 284	691 625	777 771	763 931	420 130
	Missingness ^d	966 346	788 594	787 732	690 038	776 114	888 903	690 298
	Final count	630 435	655 905	636 535	628 382	643 554	667 605	354 737

Abbreviations: BEL, brown egg layers; BRO, broilers; HWE, Hardy–Weinberg equilibrium; MAF, minor allele frequency; SNP, single-nucleotide polymorphism; WEL, white egg layers. ^aSex data unavailable for BRO2 line.

^bMarkers with minor allele frequency < 0.05 within the cohort excluded.

^cMarkers with Hardy–Weinberg equilibrium deviation *P*-value <0.001 within the cohort.

^dMarkers with >5% data missing excluded.



Figure 1 Linkage and LD maps of GGA8 for all breeds. The broadly analogous structure of the linkage map and LD maps for the three populations can be seen. All maps contain a large plateau of ~ 10000 kb, corresponding to the centromere region. Overall length of the LD maps is inversely related to the strength of LD within a breed. BRO show the lowest LD overall reflecting relatively high haplotype diversity, whereas WEL show strongest LD and lowest population haplotype diversity. Note that there is no expectation that cM and LDU maps be of similar lengths, as the LDU map length is dependent upon population diversity.

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Table 2	Physical,	linkage a	nd LDU	map	lengths	for 1	the	three	breeds
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	Linkage		В	RO	В	EL	WEL		
Chr	Length (Mb)	сМ	LDU	LDU/cM	LDU	LDU/cM	LDU	LDU/cM	
1	195.2	413.5	713.7	1.7	612.4	1.5	363.8	0.9	
2	148.8	281.3	452.1	1.6	462.8	1.6	207.8	0.7	
3	110.4	236.9	439.2	1.9	359.4	1.5	186.3	0.8	
4	90.2	195.2	309.8	1.6	277.1	1.4	164.1	0.8	
5	59.5	154.4	198.6	1.3	207.1	1.3	126.3	0.8	
6	34.9	93.8	171.9	1.8	114.7	1.2	81.4	0.9	
7	36.2	103.1	150.3	1.5	153.1	1.5	76.3	0.7	
8	28.7	96.6	134.5	1.4	112.2	1.2	57.0	0.6	
9	23.4	88.1	123.4	1.4	101.4	1.2	61.0	0.7	
10	19.9	80.6	97.4	1.2	77.0	1.0	65.3	0.8	
11	19.3	64.0	73.9	1.2	85.4	1.3	34.5	0.5	
12	19.9	69.1	101.4	1.5	88.4	1.3	51.6	0.7	
13	17.7	62.7	76.3	1.2	85.7	1.4	38.5	0.6	
14	15.1	67.4	65.9	1.0	68.1	1.0	46.2	0.7	
15	12.6	53.6	61.6	1.1	54.6	1.0	24.8	0.5	
16	0.5	59.1	2.0	0.0	2.3	0.0	1.1	0.0	
17	10.3	50.9	65.7	1.3	52.6	1.0	24.5	0.5	
18	11.2	51.7	56.4	1.1	53.9	1.0	31.1	0.6	
19	10.0	52.3	67.9	1.3	57.6	1.1	31.3	0.6	
20	14.2	55.1	61.5	1.1	58.6	1.1	31.1	0.6	
21	6.8	56.9	56.8	1.0	51.1	0.9	29.8	0.5	
22	4.1	56.4	21.9	0.4	21.7	0.4	9.5	0.2	
23	5.7	52.3	46.6	0.9	39.2	0.7	27.6	0.5	
24	6.2	53.2	57.6	1.1	47.6	0.9	33.0	0.6	
25	2.1	57.1	17.8	0.3	23.8	0.4	6.8	0.1	
26	4.9	52.3	37.4	0.7	39.5	0.8	21.9	0.4	
27	5.2	51.0	32.6	0.6	34.3	0.7	28.2	0.6	
28	4.7	53.6	30.4	0.6	37.1	0.7	20.9	0.4	
Total	917.7	2762.2	3724.6	1.3	3378.7	1.2	1881.7	0.7	

Abbreviations: BEL, brown egg layers; BRO, broilers; Chr, chromosome; LDU, linkage disequilibrium unit; WEL, white egg layers.

array-based genotyping (Pengelly *et al.*, 2015). We assessed whether regions with the longest LDU lengths within a breed were conserved between breeds. For pairwise comparisons between breeds, there is low concordance in the top LDU length percentile of 5 kb windows, with just ~5% concordance between breeds for the top 5th percentile (Figure 4). This is far lower than the concordance seen in humans, as well as that seen for the BRO3a/3b comparison that is derived from a random split of the BRO3 line.

Characteristics of regions of LD breakdown

Despite the low concordance of the alignment of narrow regions of LD breakdown for interbreed comparisons for chickens, the concordance seen is approximately twofold greater than that expected by chance. Recombination intensity is known to be dependent on sequence context, and therefore hot spots are not expected to be randomly distributed (Groenen *et al.*, 2009; Elferink *et al.*, 2010). One key determinant of recombination rate, GC content (Groenen *et al.*, 2009), was found to be significantly increased in 5 kb regions in the top first percentile of LDU length of any breed when compared with regions of zero LDU length in all breeds (42.0% GC vs 39.2% respectively, $P < 2.2 \times 10^{-16}$). We further compared the LDU/kb ratio for 5 kb regions with their distance to the nearest CpG islands and TSS and found a highly significant, though weak, negative correlation in our data for both TSS and CpG islands, consistent with previous findings in finches (Figure 5) (Singhal *et al.*, 2015).

In order to better characterise the relationship between TSS and CpG islands with narrow regions of LD breakdown we constructed a 2×4 contingency table for 5 kb regions exhibiting limited LD breakdown (<0.003 LDU/kb) or intense LD breakdown (≥ 0.003 LDU/kb) against whether the regions are within 125 kb of a CpG island, TSS, both or neither (Table 3). These values were selected based upon the approximate points of inflection in Figure 5. There was a highly significant deviation from the expected distributions under the null hypothesis ($P=9.5 \times 10^{-224}$, χ^2 test). Regions within 125 kb of both a TSS and CpG island were 1.36-fold more likely to show strong LD breakdown; this is in excess of the additive enrichment for TSS solely and CpG island solely. This suggests that it is an interplay of factors that underlies the localisation of hot spots, with the location of CpG islands having the strongest effect in isolation.

DISCUSSION

The analysis of LD maps for the three breeds indicates extensive genome-wide LD. As one LD unit represents the distance over which LD declines to background levels, the genome-wide Mb/LDU ratio gives an indication of the average extent of LD, or 'swept radius'. Average swept radii for the three breeds are 246 kb for BRO, 272 kb for BEL and 488 kb for WEL. In contrast, the corresponding figures for human populations are 55 kb for Europeans and 39 kb for Africans (Lau *et al.*, 2007). Although estimates of swept radii are weakly influenced by SNP marker density (Pengelly *et al*, 2015), they provide



Figure 2 Relationship between physical chromosome length and LDU/cM ratio for all autosomes in the three breeds. There is a clear trend for the physically smaller chromosomes to exhibit lower LDU/cM ratios, with a negative exponential relationship. Lines indicate best fit for log₁₀ (length) vs LDU/cM.



Figure 3 Comparison of LD breakdown intensity on GGA2 for the three breeds. The LDU/kb ratio is shown for sliding 40 kb windows. A common region of strong LD is shown at ~50 Mb, corresponding to the centromere. There are minimal other trends apparent in the localisation of LD intensities between breeds (ρ <0.21; P<2.2×10⁻¹⁶ for all pairwise comparisons).

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an indication of, as expected, the strong LD found in commercial chicken populations that have been subject to intense selection. However, the profound differences in fine-scale LD structure we have identified are less expected. Although some large-scale genomic features such as centromeric regions, which typically have extensive and intense LD, are shared across breeds for some chromosomes (see, for example, Figure 1), there is relatively little concordance in genomewide LD structure. The contours of the LD maps show many genome regions with widely divergent LD structure (Figure 3) and the overall correlation in LDU lengths of 40 kb windows is low ($\rho = 0.21$). In contrast, the fine-scale LD structure between human populations is sufficiently concordant to support a merged 'cosmopolitan' LD map that recovers 91–95% of the information within population-specific maps (Gibson *et al.*, 2005).

The LDU/cM ratio of chromosome lengths is known to be virtually constant in human populations, strongly suggesting that recombination is the primary determinant of LD structure. However, for the three chicken breeds the linear relationship breaks down, with smaller



Figure 4 Pairwise concordance of regions of LD breakdown (indicative of recombination hot spots) between populations. Shown is the proportion of regions in the top *n* percentile that intersect between the breeds. For pairwise comparisons between BRO/BEL/WEL $\sim 5\%$ of regions in the top 5 percentile are concordant. This proportion is also similar where two separate BRO lines (BRO2/BRO3) are compared. The low level of concordance between regions of LD breakdown, even between lines within breed, suggests there may be marked differences in haplotype structure as regions of LD breakdown align with increased haplotype diversity (Daly *et al.*, 2001). When the largest population is bisected (BRO3*a*/b), this proportion is $\sim 27\%$, still far lower than the equivalent comparison between European and African human populations (Pengelly *et al.*, 2015). All comparisons show a greater proportion of concordance than the randomised data set, showing that the patterns are not wholly stochastic. Shaded regions indicate 95% confidence intervals of the trendlines, and concordance was calculated for 0.1% increments.



Figure 5 Association of LD breakdown with displacement from nearest functional element, namely CpG islands and TSS. There is a strong negative correlation between the distance from the functional elements and LDU/kb ($\rho = -0.12$ for CpG islands, $\rho = -0.10$ for TSS, $P < 2.2 \times 10^{-16}$ for each comparison). Shown is the mean LDU/kb ratio for 5 kb bins, and shaded area indicates 95% confidence interval.

Table 3	Odds ratios for recombination hot spot regions
(LDU/kb	\ge 0.003) being within 125 kb of genomic features

Feature	Odds ratio
Neither CpG nor TSS	1.00
CpG only	1.12
TSS only	1.06
Both CpG and TSS	1.37

Abbreviations: LDU, linkage disequilibrium unit; TSS, transcription start site.

chromosomes having a lower LDU/cM ratio (Figure 2). Similarly, Megens *et al.* (2009) found that recombination rates estimated from LD data were discordant with those obtained from the linkage map. Specifically, they found that the recombination frequency for two microchromosomes (GGA26 and GGA27) estimated from LD was only 2.8 times greater than that of macrochromosomes (GGA1 and GGA2) when the expectation from the linkage map was 4.5-fold greater recombination on the microchromosomes (Groenen *et al.*, 2009). This discrepancy was attributed to biases in fitting a model using effective population sizes computed in physical rather than genetic distance windows.

The breakdown in linear correlation between LDU and cM map lengths could have one or more causes. The evidence suggests that the apparent historical recombination intensity (based on LD maps) is lower than current recombination intensity (based on the linkage map) for the smaller chromosomes. One possible explanation for the deviation from a linear relationship between LD and cM lengths is the intense selection that has underpinned the recent population history of these commercial chicken lines. Selection has been previously reported to distort LD-based maps of recombination (O'Reilly et al., 2008) because of the expected reduced haplotypic diversity at loci under purifying selection. This leads to an underestimation of recombination in these regions compared with the linkage map. As an extension of this, genes will be, on average, more conserved than intergenic regions and thus genes will have a reduced LDU/cM ratio, on average (Gibson et al., 2013). As the smaller chicken chromosomes have higher gene density, the impact of selection on reducing haplotypic diversity may have been more intense as compared with chromosomes with lower gene density. There is a strong exponential inverse correlation between chromosome size and gene transcripts per megabase ($r^2 = 0.745$, $P = 3.42 \times 10^{-9}$). The differential impact of selection on increased gene density for the smaller chromosomes may therefore at least partly explain the reduced LDU/cM ratio observed.

However, it is important to recognise that the reference genome sequence is incomplete for several chromosomes, particularly the microchromosomes (Schmid *et al.*, 2015). As the construction of linkage maps requires lower density markers and measurable linkage extends much further than LD, the construction of a complete linkage map of a chromosome is less sensitive to the omission of small regions with missing or unreliable sequence. In contrast, LD is much shorter range and LD maps will be truncated in regions where SNP coverage is incomplete because of assembly gaps and poor SNP coverage. This is however unlikely to be the sole explanation for the lower LDU/cM ratios in the smaller chromosomes due to the close negative exponential relationship between the physical chromosome size and LDU/cM ratio, perhaps indicative of an underlying biological mechanism as opposed to solely a technical artefact because of the incomplete assemblies.

Our finding that the LD structure across the three breeds is highly discordant is in marked contrast to comparisons across human populations (Pengelly *et al.*, 2015). Specifically, the pattern seen in humans of narrow regions of LD breakdown, which align with recombination hot spots and are highly concordant across populations, is not observed in chickens that show little concordance of similar regions across breeds. Comparisons between breeds, and even between lines within a breed (BRO2–BRO3, Figure 4) show alignment of such regions that is only slightly greater than 'random'. Concordance within a random split of a sub-population (BRO3–BRO3b) is much higher, but even then does not show the degree of alignment in the hot spot landscape of human European and African populations.

Although the different extent of genome-wide LD between the breeds has been known for some time (Aerts *et al.*, 2007) and the LD pattern between white and brown egg layers has been recognised as clearly different (Qanbari *et al.*, 2010), this is the among the first studies to recognise highly divergent fine-scale LD structure between breeds, as well as distinct lines of each breed. This finding has implications for trait mapping as it suggests that to ensure coverage, panels of tagging SNPs would be optimally selected only within the line of interest and that, unlike in human analyses, a 'standard' linkage map may be less useful if it is not representative of the breed-specific recombination landscape.

Analyses of human LD maps have established that the recombination landscape can be recovered from LD structure (Jeffreys et al., 2004; Tapper et al., 2008; Myers et al., 2010). From the derived recombination landscape the chromatin-modifying zinc-finger protein PRDM9 was shown to regulate recombination at 40% of human hot spots by binding to a degenerate 13 base pair motif (Baudat et al., 2010; Myers et al., 2010). Remarkably, despite genomic similarity between humans and chimpanzees, there is virtually no sharing of recombination hot spot locations. Myers et al. (2010) found chimpanzee PRDM9 has a dramatically different predicted binding sequence to that of humans. PRDM9 sequences are known to exhibit extremely rapid evolution that explains lack of hot spot conservation in other species that have PRDM9. However, chicken genomes, along with all other avian genomes tested (48 species) appear to lack PRDM9 (Oliver et al., 2009; Singhal et al., 2015). Singhal et al. (2015) examined the genomes of the zebra finch (Taeniopygia guttata) and long-tailed finch (Poephia acuticauda) and found recombination hot spots are enriched near CpG islands and TSSs. In marked contrast to the lack of hot spot sharing between humans and chimpanzees, they found a high degree of sharing between these birds that were selected as showing divergence comparable to humans and chimpanzees. They argue that whereas the binding specificity of PRDM9-mediated recombination leads to rapid turnover and evolution of hot spots, association with functional genomic features, such as CpG islands and TSSs, leads to stasis in which there is conservation of hot spot locations over, potentially, tens of millions of years. However, in contrast, the evidence presented here suggests very limited sharing of regions of LD breakdown for the three chicken breeds based on LD structure.

We have established that the relationship between TSS and CpG islands with regions of LD breakdown/recombination hot spots, as identified in finches by Singhal *et al.* (2015), is also found in chickens. It is possible that although recombination in chickens is associated with these functional elements, this relationship has not resulted in convergence to the point where recombination hot spots are recognisably stable between lines. Perhaps the population history of the commercial lines studied has not been sufficiently long to allow for convergence of LD patterns. Furthermore, it is possible that small effective population sizes of these breeds also contributes to the

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observed limited convergence in LD structure. Further work, including the studying of outbred, wild *Gallus* populations, as well as wholegenome sequence-based LD mapping, would allow for further elucidation of mechanisms underlying the architecture of patterns of LD in chickens (Gheyas *et al.*, 2015). Improvements to the reference assembly currently underway will provide more complete assemblies for the microchromosomes (Schmid *et al.*, 2015), allowing for further investigation into differential properties of the chromosomes. It would be informative to extend these investigations to other agricultural species in order to determine whether this effect is specific to *Gallus*, or can also be observed in other selected avian, piscine and mammalian species.

LD maps have been shown to be of use in refining the order and orientation of contigs during compilation of reference genomes where there is ambiguity that may be of utility for enabling further improvements to the assembly (Ennis *et al.*, 2001). LD maps, as described herein, are readily produced for any population for which genotype data are available, without requiring pedigree data. Given the high level of discordance in LD patterns between lines, data derived from the line of interest would provide far greater precision when utilised for trait mapping and other studies, as well as the optimisation of genotyping arrays to allow for maximal coverage for the minimal number of SNP markers for each line.

DATA ARCHIVING

Genotype data used herein are available in the Dryad Digital Repository, http://dx.doi.org/10.5061/dryad.48gp0.

CONFLICT OF INTEREST

The authors declare no conflict of interest.

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Supplementary Information accompanies this paper on Heredity website (http://www.nature.com/hdy)