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# Improved Genome Assembly and Annotation for the Rock Pigeon (*Columba livia*)

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**ABSTRACT** The domestic rock pigeon (*Columba livia*) is among the most widely distributed and phenotypically diverse avian species. *C. livia* is broadly studied in ecology, genetics, physiology, behavior, and evolutionary biology, and has recently emerged as a model for understanding the molecular basis of anatomical diversity, the magnetic sense, and other key aspects of avian biology. Here we report an update to the *C. livia* genome reference assembly and gene annotation dataset. Greatly increased scaffold lengths in the updated reference assembly, along with an updated annotation set, provide improved tools for evolutionary and functional genetic studies of the pigeon, and for comparative avian genomics in general.

## KEYWORDS

*Columba livia*  
rock pigeon  
HiRise assembly  
MAKER annotation  
Genome Report

Intensive selective breeding of the domestic rock pigeon (*Columba livia*) has resulted in more than 350 breeds that display extreme differences in morphology and behavior (Levi 1986; Domyan and Shapiro 2017). The large phenotypic differences among different breeds make them a useful model for studying the genetic basis of radical phenotypic changes, which are more typically found among different species rather than within a single species.

In genetic and genomic studies of *C. livia*, linkage analysis is important for identifying genotypes associated with specific phenotypic traits of interest (Domyan and Shapiro 2017); however, short scaffold

sizes in the Cliv\_1.0 draft reference assembly (Shapiro *et al.* 2013) hinder computationally-based comparative analyses. Short scaffolds also make it more difficult to identify structural changes, such as large insertions or deletions, that are responsible for traits of interest (Domyan *et al.* 2014; Kronenberg *et al.* 2015).

Here we present the Cliv\_2.1 reference assembly and an updated gene annotation set. The new assembly greatly improves scaffold length over the previous draft reference assembly, and updated gene annotations show improved concordance with both transcriptome and protein homology evidence.

## MATERIALS & METHODS

### Genome sequencing and assembly

Genomic DNA from a female Danish tumbler pigeon (full sibling of the male bird used for the original Cliv\_1.0 assembly; Shapiro *et al.* 2013) was extracted from blood using a modified “salting out” protocol (Miller *et al.* 1988; modifications from <http://www.protocol-online.org/prot/Protocols/Extraction-of-genomic-DNA-from-whole-blood-3171.html>, accessed February 06, 2018). Blood was frozen immediately after collection and stored at -80°, and purified DNA was resuspended in 10 mM Tris-HCl. The sample went through 2 freeze-thaw cycles before being used to construct the libraries described below.

Extracted DNA was used to produce long-range sequencing libraries using the “Chicago” method (Putnam *et al.* 2016) by Dovetail

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Genomics (Santa Cruz, CA). Two Chicago libraries were prepared and sequenced on the Illumina HiSeq platform to a final physical coverage (1-50 kb pairs) of 390x.

Scaffolding was performed by Dovetail Genomics using HiRise assembly software and the Cliv\_1.0 assembly as input. Briefly, Chicago reads were aligned to the input assembly to identify and mask repetitive regions, and then a likelihood model was applied to identify mis-joins and score prospective joins for scaffolding. The final assembly was then filtered for length and gaps according to NCBI submission specifications.

### Custom repeat library

A repeat library for *C. livia* was built by combining libraries from existing avian genome assemblies (Zhang *et al.* 2014a) together with repeats identified *de novo* for the Cliv\_2.1 assembly. *De novo* repeat identification was performed using RepeatScout (Price *et al.* 2005) with default parameters (>3 copies) to generate consensus repeat sequences. Identified repeats with greater than 90% sequence identity and a minimum overlap of 100 bp were assembled using Sequencher (Gene Codes Corporation, Ann Arbor, MI). Repeats were classified into transposable element (TE) families using multiple lines of evidence, including homology to known elements, presence of terminal inverted repeats (TIRs), and detection of target site duplications (TSDs). Homology-based evidence was obtained using RepeatMasker (Smit *et al.* 1996), as well as the homology module of the TE classifying tool RepClass (Feschotte *et al.* 2009). RepClass was also used to identify signatures of transposable elements (TIRs, TSDs). We then eliminated non-TE repeats (simple repeats or gene families) using custom Perl scripts (available at <https://github.com/4ureliek/ReannTE>).

Our custom repeat analysis used the script ReannTE\_FilterLow.pl to label consensus sequences as simple repeats or low complexity repeats if 80% of their length could be annotated as such by RepeatMasker (the library was masked with the -noint option). Next, we used the ReannTE\_Filter-mRNA.pl script to compare consensus sequences to RefSeq (Pruitt *et al.* 2007) mRNAs (as of March 7<sup>th</sup> 2016) with TBLASTX (Altschul *et al.* 1990). Sequences were eliminated from the library when: (i) the e-value of the hit was lower than 1E-10; (ii) the consensus sequence was not annotated as a TE; and (iii) the hit was not annotated as a transposase or an unclassified protein. The script ReannTE\_MergeFasta.pl was then used to merge our library with a library combining RepeatModeler (Smit and Hubley 2008) outputs from 45 bird species (Kapusta *et al.* 2017) and complemented with additional avian TE annotations (International Chicken Genome Sequencing Consortium 2004; Warren *et al.* 2010; Bao *et al.* 2015). Merged outputs were manually inspected to remove redundancy, and all DNA and RTE class transposable elements were removed and replaced with manually curated consensus sequences, which were either newly (DNA elements) or previously generated (RTEs) (Suh *et al.* 2016).

### Repeat landscape

We used RepeatMasker software v4.0.7 (Smit *et al.* 2015) and our custom library to annotate the repeats in Cliv\_2.1. RepeatMasker was run with the NCBI/RMBLAST v2.6.0+ search engine (-e ncbi), the sensitive (-s) option, the -a option in order to obtain the alignment file, and without RepeatMasker default libraries. We then used the par-

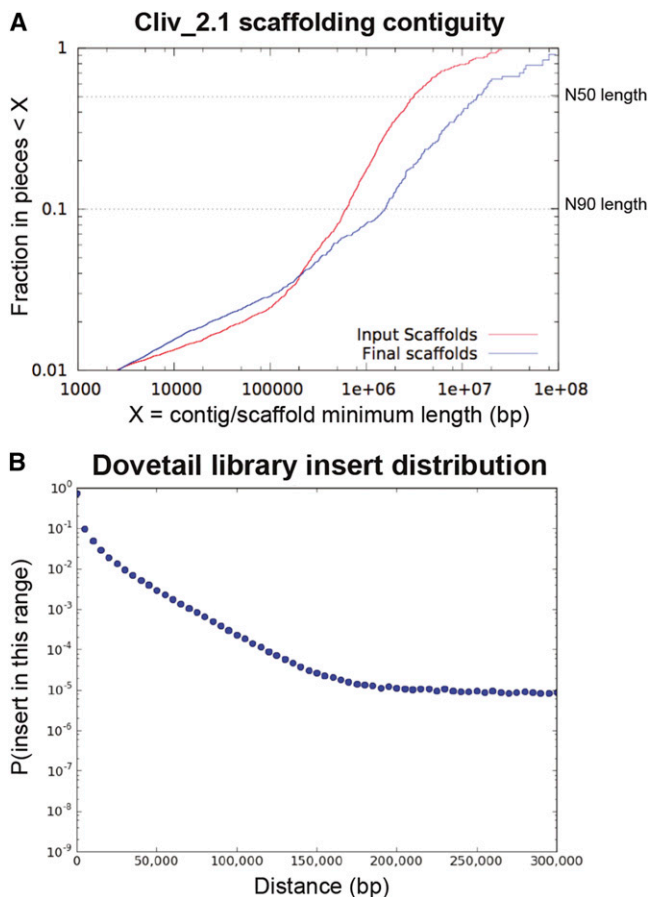
■ **Table 1 Assembly statistics for Cliv\_2.1**

| Parameter                   | Value            |
|-----------------------------|------------------|
| Estimated Physical Coverage | 389.7x           |
| Total Length                | 1,108,534,737 bp |
| Total scaffolds             | 15,057           |
| Total scaffolds >1kb        | 4,062            |
| Total scaffolds >10kb       | 848              |

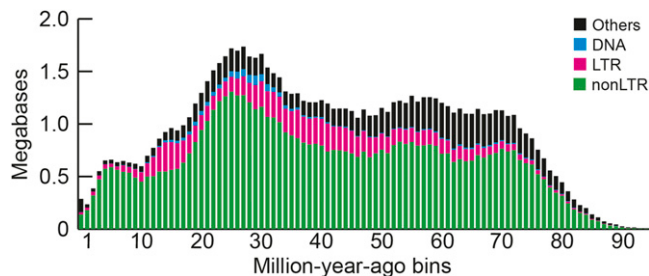
■ **Table 2 Assembly version comparison**

|                       | Cliv_1.0                      | Cliv_2.1                     |
|-----------------------|-------------------------------|------------------------------|
| Total Length          | 1110.8 Mb                     | 1110.9 Mb                    |
| N50 Length            | 3.15 Mb and<br>82 scaffolds   | 14.3 Mb and<br>17 scaffolds  |
| N90 Length            | 0.618 Mb and<br>394 scaffolds | 1.56 Mb and<br>113 scaffolds |
| Completeness Estimate | 72.3–86.4%                    | 72.9–86.2%                   |

seRM.pl script v5.7 (available at <https://github.com/4ureliek/Parsing-RepeatMasker-Outputs>; Kapusta *et al.* 2017), on the alignment files from RepeatMasker, with the -l option and a substitution rate of 0.002068 substitutions per site per million years (Zhang *et al.* 2014b). The script collects the percentage of divergence from the consensus for each TE fragment, after correction for higher mutation rate at CpG sites and the Kimura 2-Parameter divergence metric (provided in the alignment files from RepeatMasker). The percentage of divergence to the consensus is a proxy for age (the older the TE invasion, the more mutations will accumulate in TE fragments), to which the script applies the substitution rate in order to split TE fragments into bins of 1 My.



**Figure 1** Assembly scaffolding contiguity and scaffolding library insert size distributions. (a) Scaffolding comparison between Cliv\_1.0 (input scaffolds) and Cliv\_2.1 (final scaffolds) assemblies. (b) Distribution of Dovetail Genomics “Chicago” library inserts.



**Figure 2** Temporal landscape of transposable elements. The amounts of DNA in each TE class were split into bins of 1 My, shown on the x axis (see Methods). We note that the lower detection of older elements (right of the graph) comes from a combination of lack of detection and TE removal, and that the amount of DNA corresponding to recent elements may be underestimated (recent copies are often collapsed in assemblies). The “Others” category primarily includes unclassified repeats.

### Transcriptomics

RNA was extracted from adult tissues (brain, retina, subepidermis, cochlear duct, spleen, olfactory epithelium) of the racing homer breed, and one whole embryo each of a racing homer and a parlor roller (approximately embryonic stage 25; Hamburger and Hamilton 1951). RNA-seq libraries were prepared and sequenced using 100-bp paired-end sequencing on the Illumina HiSeq 2000 platform at the Research Institute of Molecular Pathology, Vienna (adult tissues), and the Genome Institute at Washington University, St. Louis (embryos). RNA-seq data generated for the Cliv\_1.0 annotation were also downloaded from the NCBI public repository for *de novo* re-assembly. Accession numbers for these public data are SRR521357 (Danish tumbler heart), SRR521358 (Danish tumbler liver), SRR521359 (Oriental frill heart), SRR521360 (Oriental frill liver), SRR521361 (Racing homer heart), and SRR521362 (Racing homer liver).

Each FASTQ file was processed with FastQC (<http://www.bioinformatics.babraham.ac.uk/projects/fastqc/>) to assess quality. When FastQC reported overrepresentation of Illumina adapter sequences, we trimmed these sequences with `fastx_clipper` from the FASTX-Toolkit ([http://hannonlab.cshl.edu/fastx\\_toolkit/](http://hannonlab.cshl.edu/fastx_toolkit/)). We used FASTX-Toolkit for two additional functions: runs of low quality bases at the start of reads were trimmed with `fastx_trimmer` when necessary (quality cutoff of  $-Q$  33), and reads were then trimmed with `fastq_quality_trimmer` ( $-Q$  33). Finally, each pair of sequence files

**Table 4** Annotation statistics for Cliv\_2.1

|                    | Genes  | Transcripts |
|--------------------|--------|-------------|
| Total              | 15,392 | 18,966      |
| match <sup>a</sup> | 14,898 | 18,472      |
| new                | 494    | 494         |

<sup>a</sup>Count that match Cliv\_1.0 annotations with a value of at least 90% (match is calculated as % identity multiplied by % end-to-end coverage).

was assembled with Trinity (Grabherr *et al.* 2011) version r20131110 using the `-jaccard_clip` option.

### Genome annotation

The pre-existing reference Gnomon (Souvorov *et al.* 2010) derived gene models for the Cliv\_1.0 assembly (GCA\_000337935.1) were mapped onto the updated Cliv\_2.1 reference assembly using direct alignment of transcript FASTA entries. This was done using the alignment workflow of the genome annotation pipeline MAKER (Cantarel *et al.* 2008; Holt and Yandell 2011), which first seeds alignments using BLASTN (Altschul *et al.* 1990) and then polishes the alignments around splice sites using Exonerate (Slater and Birney 2005). Results were then filtered to remove alignments that had an overall match of less than 90% of the original model (match is calculated as percent identity multiplied by percent end-to-end coverage).

For final annotation, MAKER was allowed to identify *de novo* gene models that did not overlap the aligned Gnomon models. Protein evidence sets used by MAKER included annotated proteins from *Pterocles gutturalis* (yellow-throated sandgrouse; Zhang *et al.* 2014a) and *Gallus gallus* (chicken; International Chicken Genome Sequencing Consortium 2004) together with all proteins from the UniProt/Swiss-Prot database (Bairoch and Apweiler 2000; UniProt Consortium 2007). The transcriptome evidence sets for MAKER included Trinity mRNA-seq assemblies from multiple *C. livia* breeds and tissues (methods for transcriptome assembly are described above). Gene predictions were produced within MAKER by Augustus (Stanke and Waack 2003; Stanke *et al.* 2008). Augustus was trained using 1000 Cliv\_1.0 Gnomon gene models that were split using the `randomSplit.pl` script into sets for training and evaluation. We followed a semi-automatic training protocol (<https://vcru.wisc.edu/simonlab/bioinformatics/programs/augustus/docs/tutorial2015/training.html>, accessed February 9, 2018). Repetitive elements in the genome were identified using the custom repeat library described above.

**Table 3** Transcriptome assembly summary

| SRA accession | Tissue               | Breed          | # assembled transcripts |
|---------------|----------------------|----------------|-------------------------|
| SRR521357     | Heart                | Danish tumbler | 79,473                  |
| SRR521358     | Liver                | Danish tumbler | 35,691                  |
| SRR521359     | Heart                | Oriental frill | 71,078                  |
| SRR521360     | Liver                | Oriental frill | 74,180                  |
| SRR521361     | Heart                | racing homer   | 80,034                  |
| SRR521362     | Liver                | racing homer   | 80,642                  |
| SRR5878849    | Embryo               | racing homer   | 208,682                 |
| SRR5878850    | Embryo               | parlor roller  | 344,735                 |
| SRR5878851    | Spleen               | racing homer   | 156,415                 |
| SRR5878852    | Olfactory epithelium | racing homer   | 112,632                 |
| SRR5878853    | Subepidermis         | racing homer   | 185,484                 |
| SRR5878854    | Cochlear duct        | racing homer   | 189,438                 |
| SRR5878855    | Brain                | racing homer   | 131,999                 |
| SRR5878856    | Retina               | racing homer   | 186,060                 |

■ **Table 5 Annotation version comparison**

|                   | Cliv_1.0 | Cliv_2.1 |
|-------------------|----------|----------|
| Total Gene Models | 15,724   | 15,392   |
| <i>coding</i>     | 15,022   | 14,683   |
| <i>non-coding</i> | 702      | 709      |
| Total Transcripts | 19,585   | 18,966   |
| <i>coding</i>     | 18,569   | 18,148   |
| <i>non-coding</i> | 1016     | 818      |

### Linkage map construction and anchoring to current assembly

Genotyping-by-sequencing (GBS) data were generated, trimmed, and filtered as previously described (Domyan *et al.* 2016). Reads were mapped to the Cliv\_2.1 assembly using Bowtie2 (Langmead and Salzberg 2012). Genotypes were called using Stacks v1.46 (Catchen *et al.* 2011), with a minimum read-depth cutoff of 10. Thresholds for automatic corrections were set using the parameters `-min_hom_sequations 10`, `-min_het_seqs 0.01`, `-max_het_seqs 0.15`. Sequencing coverage and genotyping rate varied between individuals, and birds with genotyping rates in the bottom 25% were excluded from map assembly.

Genetic map construction was performed using R/qtl v1.41-6 ([www.rqtl.org](http://www.rqtl.org); Broman *et al.* 2003). For autosomal markers, markers showing segregation distortion (Chi-square,  $P < 0.01$ ) were eliminated. Sex-linked scaffolds were assembled and ordered separately, due to differences in segregation pattern for the Z-chromosome. Z-linked scaffolds were identified by assessing sequence similarity and gene content between pigeon scaffolds and the Z-chromosome of the annotated chicken genome (Ensembl Gallus\_gallus-5.0).

Pairwise recombination fractions were calculated in R/qtl for all autosomal and Z-linked markers. Missing data were imputed using “fill.geno” with the method “no\_dbl\_XO”. Duplicate markers were identified and removed. Within individual scaffolds, R/qtl functions “drop-nemarker” and “calc.errorlod” were used to assess genotyping error. Markers were removed if dropping the marker led to an increased LOD score, or if removing a non-terminal marker led to a decrease in length of  $>10$  cM that was not supported by physical distance. Individual genotypes were removed if they showed error LOD scores  $>5$  (Lincoln and Lander 1992). Linkage groups were assembled from 2960 autosomal markers and 232 Z-linked markers using the parameters (`max.rf 0.1`, `min.lod 6`). In the rare instance that single scaffolds

were split into multiple linkage groups, linkage groups were merged if supported by recombination fraction data; these instances typically reflected large physical gaps between markers on a single scaffold. Scaffolds in the same linkage group were manually ordered based on calculated recombination fractions and LOD scores.

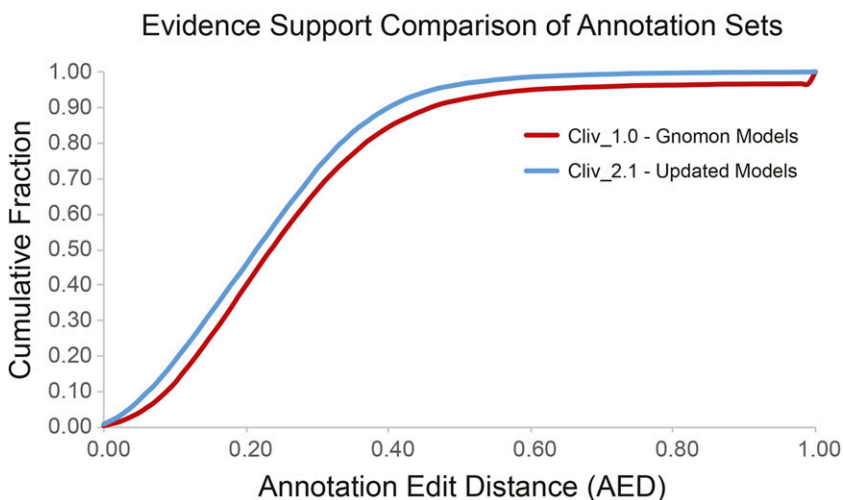
To compare the linkage map to the original genome assembly (Cliv\_1.0), each 90-bp locus containing a genetic marker was parsed from the Stacks output file “catalogXXX\_tags.tsv” and queried to the Cliv\_1.0 assembly using BLASTN (v2.6.0+) with the parameters `-max_target_sequations 1` `-max_hsp 1`. 3,175 of the 3,192 loci (99.47%) from the new assembly had a BLAST hit with an E-value  $< 4e-24$  and were retained.

### Assembly comparisons

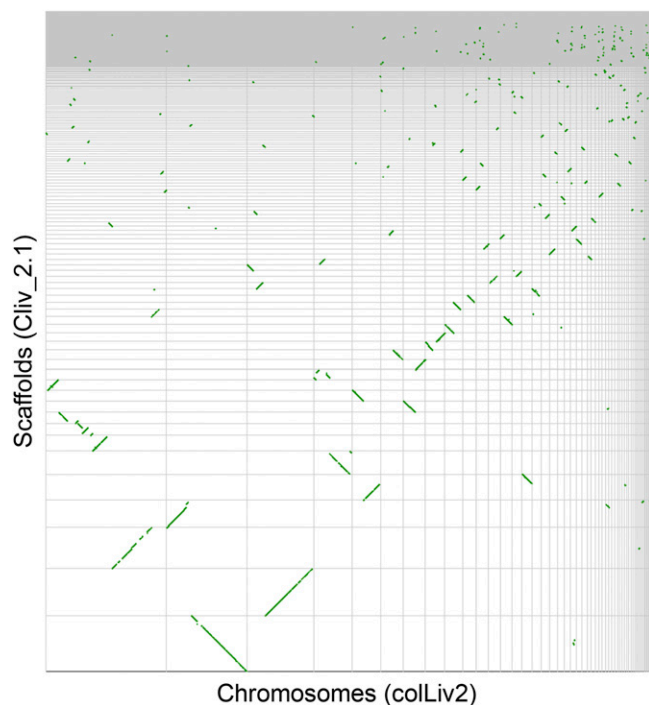
FASTA files from the Cliv\_2.1 and colLiv2 (Damas *et al.* 2017) genome assemblies were hard masked using NCBI WindowMasker (Morgulis *et al.* 2006) and genome-wide alignments were calculated with LAST (Kielbasa *et al.* 2011). From these alignments, a genome-scale dotplot indicating syntenic regions was generated using SynMap (Lyons and Freeling 2008; Lyons *et al.* 2008).

The colLiv2 assembly is currently unannotated. Therefore, to compare gene content between assemblies, we estimated the number of annotated Cliv\_2.1 genes absent from colLiv2 based on gene coordinates. Based on the length of LAST alignments, we calculated the percent of each Cliv\_2.1 scaffold aligning to colLiv2. Scaffolds were divided into four groups based on alignments: Cliv\_2.1 scaffolds that did not align to colLiv2, Cliv\_2.1 scaffolds where LAST alignments to colLiv2 covered less than 50% of the total scaffold length, Cliv\_2.1 scaffolds where LAST alignments to colLiv2 covered between 50% and 75% of the total scaffold length, and Cliv\_2.1 scaffolds where LAST alignments to colLiv2 covered 75% or more of the total scaffold length. For each of these groups, the number of scaffolds containing genes was quantified. Many of these scaffolds are small, and some may be partially or completely missing from the alignment due to masking of repetitive elements. If annotated gene coordinates from Cliv\_2.1 scaffolds fell partially or entirely within a region aligned to colLiv2, these genes were considered “present” in colLiv2. Thus, the number of genes marked as “absent” in colLiv2 might be a conservative estimate.

To compare the linkage map to colLiv2, each 90-bp locus containing a genetic marker was parsed from the Stacks output file



**Figure 3** Evidence support comparison of annotation sets. Annotation edit distance (AED) support for gene models in Cliv\_2.1 (blue line) is improved over Cliv\_1.0 (NCBI Gnomon annotation, red line).



**Figure 4** Dot plot of syntenic regions between the Cliv\_2.1 and colLiv2 assemblies of the *C. livia* genome. Each segment of the X axis represents a single colLiv2 scaffold ordered from largest (left) to smallest (right), while each segment of the Y axis represents a scaffold of the Cliv\_2.1 assembly, ordered from largest (bottom) to smallest (top). Green dots indicate aligned regions of synteny.

“catalogXXX\_tags.tsv” and queried to the colLiv2 assembly using BLASTN (v2.6.0+) with the parameters `-max_target_seqs 1 -max_hsp 1`.

#### Data availability

This Whole Genome Shotgun project has been deposited at DDBJ/ENA/GenBank under the accession AKCR00000000. The version described in this paper is version AKCR02000000. The Cliv\_2.1 assembly, annotation, and associated data are available at [ftp://ftp.ncbi.nlm.nih.gov/genomes/all/GCA/000/337/935/GCA\\_000337935.2\\_Cliv\\_2.1](ftp://ftp.ncbi.nlm.nih.gov/genomes/all/GCA/000/337/935/GCA_000337935.2_Cliv_2.1).

RNA-seq data are deposited in the SRA database with the BioSample accession numbers SAMN07417936-SAMN07417943, and sequence accessions SRR5878849-SRR5878856. Assembly and RNA-seq data are publicly available in NCBI databases under BioProject PRJNA167554. File S1 contains Tables S1–S7. File S2 and File S3 contain recombination fraction data used to construct Figures 5a and 5b, respectively.

## RESULTS AND DISCUSSION

### Genome assembly

The final Cliv\_2.1 reference assembly is 1,108,534,737 base pairs in length and consists of 15,057 scaffolds (Table 1). A total of 1,015 scaffolds contain a gene annotation. Completion analysis of the assembly using BUSCO v2 and the odb9 Vertebrata ortholog dataset (Simão *et al.* 2015) suggests that Cliv\_2.1 is 72.9 (assembly) to 86.2% (annotation) complete. These statistics are nearly identical to the Cliv\_1.0 assembly estimate of 72.3–86.4% (Table 2); therefore, we found no significant changes in completeness between the two assemblies. Because the Chicago libraries and HiRise assembly were designed to improve scaffolding of the original assembly, not to fill gaps, we did not expect substantial improvement to assembly completeness in Cliv\_2.1. Instead, the major improvement to the Cliv\_2.1 assembly is a substantial increase in scaffold length (Figure 1a). The N50 scaffold length for Cliv\_2.1 increased to 14.3 megabases, compared to 3.15 megabases for Cliv\_1.0, a greater than fourfold increase.

The new assembly joins scaffolds that, based on linkage mapping evidence (Domyan *et al.* 2016), we knew were physically adjacent but were still separated in Cliv\_1.0 (see Table S1 in File S1 for full catalog of positions of the original assembly in the new assembly, and Table S2 in File S1 for full catalog of breaks in the original assembly to form the new assembly). For example, we previously determined that Cliv\_1.0 Scaffolds 70 and 95 were joined based on genetic linkage data from a laboratory cross (Domyan *et al.* 2016). These two sequences are now joined into a single scaffold in the Cliv\_2.1 assembly (see Table S6 in File S1 for positions of genetic markers in Cliv\_1.0 and Cliv\_2.1). At least one gene model (RefSeq LOC102093126), which was previously split across two contigs, has now been unified into a single model on a single scaffold.

### Repeat landscape

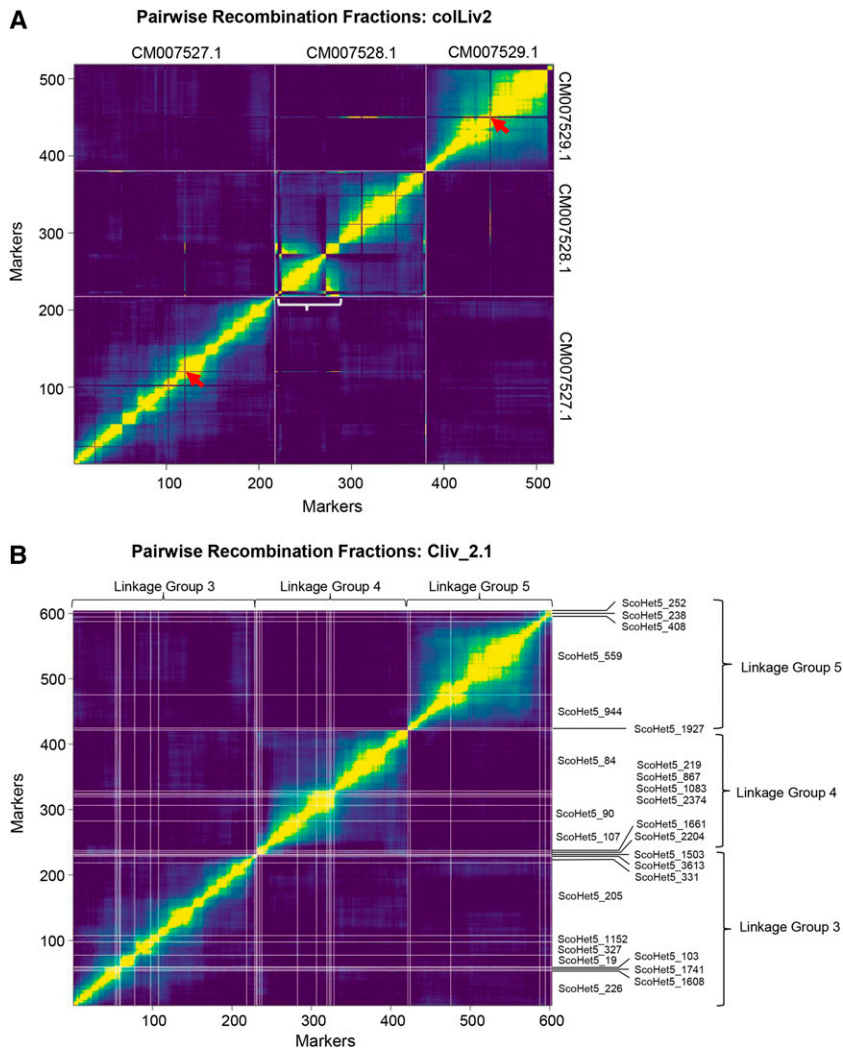
Using our custom library, we identified 8.04% (89.1 Mb; Table S3 in File S1) of the genome assembly as repeats, which is slightly higher than the previously published estimates of 7.25% (Zhang *et al.* 2014b) and 7.83% (Kapusta and Suh 2017). To illustrate the temporal dynamics of TE accumulation (see Methods), we split the amount of DNA of each TE class by bins of 1 million years (My) (Figure 2). This landscape shows that TE accumulation has been consistent throughout time, with some potentially recently active elements. This includes CR1 LINEs (part of the non-LTR fraction), which are presumed to be inactive in most birds (Kapusta and Suh 2017), but comprise over 0.1 Mb of CR1 copies in the youngest bin (0–1 My) in the Cliv\_2.1 assembly (Table S4 in File S1).

### Transcriptome assemblies

A total of 1,936,543 transcripts were assembled from the 14 RNA-seq data sets. Numbers of assembled transcripts from each tissue are listed in Table 3. BUSCO analysis indicated 85.6% completeness of

**Table 6** Summary of Cliv\_2.1 alignment to colLiv2 chromosome-level scaffolds. Overall, colLiv2 appears to exclude 1,184, or approximately 7.7%, of the 15,392 annotated genes from the Cliv\_2.1 assembly; this is consistent with the overall decrease in genome size

| Cliv_2.1 scaffold representation | # of scaffolds | Scaffold length range | Scaffolds with genes | # of genes | Genes in LAST alignment to colLiv2 | Genes missing from LAST alignment to colLiv2 |
|----------------------------------|----------------|-----------------------|----------------------|------------|------------------------------------|--|
| Missing                          | 14,189         | 200–393,647           | 147                  | 164        | NA                                 | 164  |
| ≤50% aligned                     | 251            | 318–2,545,801         | 183                  | 506        | 369                                | 137  |
| 50–75% aligned                   | 183            | 581–5,717,624         | 251                  | 638        | 550                                | 88   |
| ≥75% aligned                     | 434            | 259–94,473,889        | 434                  | 14,084     | 13,289                             | 795  |



**Figure 5** Correspondence between genotyping data and marker order in colLiv2 and Cliv\_2.1 assemblies. (a) Representative plot of pairwise recombination fractions for GBS markers, ordered based on best alignment to colLiv2 assembly, for chromosomes CM007527.1, CM007528.1, and CM007529.1. X and Y axes show individual markers, ordered as they map to the colLiv2 chromosomes CM007527.1, CM007528.1, and CM007529.1. White lines mark the boundaries between chromosomes. Yellow indicates low pairwise recombination fraction (linked markers), while purple indicates high pairwise recombination fraction (unlinked markers). Red arrows highlight two markers, one mapped to chromosome CM007527.1 and one mapped to chromosome CM007529.1, for which recombination fractions suggest that these markers should instead be located on chromosome CM007528.1. A white bracket indicates a region on chromosome CM007528.1 where portions of the chromosome appear to be assembled in the wrong order. (b) Plot of pairwise recombination fractions for the Cliv\_2.1 scaffolds that make up linkage groups 3, 4, and 5. In (a), colLiv2 CM007527.1 largely corresponds to linkage group 3, CM007528.1 to linkage group 4, and CM007529.1 to linkage group 5. White lines mark the boundaries between individual scaffolds, with scaffold IDs indicated on the right side.

the union of transcriptome assemblies compared to the Vertebrata ortholog set.

### Annotation

The updated annotation set contains 15,392 gene models encoding 18,966 transcripts (Table 4). This represents a minor update of the reference annotation set as 94.7% of previous models were mapped forward nearly unmodified (90% exact match for 14,898 out of 15,724 previous gene models) and 494 new gene models were added to the Cliv\_2.1 annotation set (Table 5).

The updated annotation set shows a modest improvement in concordance with aligned evidence datasets from mRNA-seq and cross species protein homology evidence relative to the Cliv\_1.0 set as measured by Annotation Edit Distance (AED; Eilbeck *et al.* 2009; Holt and Yandell 2011). As a result, transcript models in the Cliv\_2.1 annotation tend to have lower AED values than the Cliv\_1.0 set (Figure 3; the cumulative distribution function (CDF) curve is shifted to the left). Lower AED values indicate greater model concordance with aligned transcriptome and protein homology data. Furthermore, the Cliv\_2.1 dataset displays greater transcript counts in every AED bin despite having slightly fewer transcripts overall compared to the Cliv\_1.0 dataset (Table S5 in File S1). The higher bin counts indicate that lower AED values are not solely a result of removing unsupported

models from the annotation set, but rather suggest that evidence concordance has improved overall.

### Linkage map

The linkage map consists of 3,192 markers assembled into 48 autosomal linkage groups and a single Z-chromosome linkage group (Table S6 in File S1). The map contains markers from 236 scaffolds. Together, these scaffolds encompass 1,048,536,443 bp (94.6%) of the Cliv\_2.1 assembly, and include 13,026 of 15,392 (84.6%) annotated genes. Cliv\_2.1 scaffolds are strongly supported by linkage data. For 235 out of 236 scaffolds included in the linkage map, all GBS markers mapped to that scaffold form a single contiguous block within one linkage group (only scaffold ScoHet5\_252 was split between two linkage groups). Additionally, within-scaffold marker order was largely supported by calculated pairwise recombination fractions.

### Comparison with colLiv2 genome assembly

Recently, Damas *et al.* (2017) used computational methods and universal avian bacterial artificial chromosome (BAC) probes to achieve chromosome-level scaffolding of the pigeon genome using the Cliv\_1.0 assembly as input material. This assembly, named colLiv2 (GenBank assembly accession GCA\_001887795.1; 1,018,016,946 bp in length), is approximately 8% smaller than the Cliv\_2.1 assembly.

Based on genome-wide pairwise alignments using LAST (Figure 4) (Kielbasa *et al.* 2011), a substantial number of regions of Cliv\_2.1 that do not align to colLiv2 genome contain both unique sequence and annotated genes. Based on gene coordinates, 1184 annotated Cliv\_2.1 genes were absent from colLiv2 (Table 6).

Of the 3,192 GBS makers mapped to Cliv\_2.1, 2,940 markers (92.1%) mapped to colLiv2 with an E-value  $<4e-24$ . Of the remaining markers, 7 mapped to colLiv2 with an E-value  $>4e-24$ , and 245 markers (7.67%) failed to map to colLiv2 entirely. We assessed the agreement between marker and linkage data by calculating pairwise recombination fractions for the 2940 markers, then plotted these recombination fractions in the order in which markers appear on the colLiv2 chromosome-level scaffolds. Overall, the marker order largely agrees with calculated recombination fractions; however, we identified a number of locations where pairwise recombination fractions suggest that portions of the colLiv2 chromosomes are not ordered properly, as exemplified in Figure 5. We also identified 42 markers for which the location with the best sequence match in colLiv2 appears to be incorrect based on recombination fraction estimates; these markers are summarized in Table S7 in File S1.

## Conclusions

The improved scaffold lengths and updated gene model annotations of Cliv\_2.1 will further empower ongoing studies to identify genes responsible for phenotypic traits of interest. In addition, longer scaffolds will improve detection of regions under selection, including large deletions and other structural variants responsible for interesting traits in *C. livia*. Finally, our new transcriptomic data provide tissue-specific expression profiles for several adult tissue types and an important embryonic stage for the morphogenesis of limbs, craniofacial structures, skin, and other tissues.

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## LITERATURE CITED

- Altschul, S. F., W. Gish, W. Miller, E. W. Meyers, and D. J. Lipman, 1990 Basic Local Alignment Search Tool. *J. Mol. Biol.* 215(3): 403–410. [https://doi.org/10.1016/S0022-2836\(05\)80360-2](https://doi.org/10.1016/S0022-2836(05)80360-2)
- Bairoch, A., and R. Apweiler, 2000 The SWISS-PROT protein sequence database and its supplement TrEMBL in 2000. *Nucleic Acids Res.* 28(1): 45–48. <https://doi.org/10.1093/nar/28.1.45>
- Bao, W., K. K. Kojima, and O. Kohany, 2015 Repbase Update, a database of repetitive elements in eukaryotic genomes. *Mob. DNA* 6(1): 11. <https://doi.org/10.1186/s13100-015-0041-9>
- Broman, K., H. Wu, S. Sen, and G. Churchill, 2003 R/qtl: QTL mapping in experimental crosses. *Bioinformatics* 19(7): 889–890. <https://doi.org/10.1093/bioinformatics/btg112>
- Cantarel, B. L., I. Korf, S. M. C. Robb, G. Parra, E. Ross *et al.*, 2008 MAKER: An easy-to-use annotation pipeline designed for emerging model organism genomes. *Genome Res.* 18(1): 188–196. <https://doi.org/10.1101/gr.6743907>
- Catchen, J. M., A. Amores, P. Hohenlohe, W. Cresko, and J. H. Postlethwait, 2011 Stacks: building and genotyping loci de novo from short-read sequences. *G3 (Bethesda)* 1(3): 171–182. <https://doi.org/10.1534/g3.111.000240>
- Damas, J., R. O'Connor, M. Farre, V. P. E. Lenis, H. J. Martell *et al.*, 2017 Upgrading short-read animal genome assemblies to chromosome level using comparative genomics and a universal probe set. *Genome Res.* 27(5): 875–884. <https://doi.org/10.1101/gr.213660.116>
- Domyan, E. T., M. W. Guernsey, Z. Kronenberg, S. Krishnan, R. E. Boissy *et al.*, 2014 Epistatic and combinatorial effects of pigmentary gene mutations in the domestic pigeon. *Curr. Biol.* 24(4): 459–464. <https://doi.org/10.1016/j.cub.2014.01.020>
- Domyan, E. T., Z. Kronenberg, C. R. Infante, A. I. Vickrey, S. A. Stringham *et al.*, 2016 Molecular shifts in limb identity underlie development of feathered feet in two domestic avian species. *eLife* 5: e12115. <https://doi.org/10.7554/eLife.12115>
- Domyan, E. T., and M. D. Shapiro, 2017 Pigeonetics takes flight: Evolution, development, and genetics of intraspecific variation. *Dev. Biol.* 427(2): 241–250. <https://doi.org/10.1016/j.ydbio.2016.11.008>
- Eilbeck, K., B. Moore, C. Holt, and M. Yandell, 2009 Quantitative measures for the management and comparison of annotated genomes. *BMC Bioinformatics* 10(1): 67. <https://doi.org/10.1186/1471-2105-10-67>
- Feschotte, C., U. Keswani, N. Ranganathan, M. L. Guibotsy, and D. Levine, 2009 Exploring repetitive DNA landscapes using REPCLASS, a tool that automates the classification of transposable elements in eukaryotic genomes. *Genome Biol. Evol.* 1(0): 205–220. <https://doi.org/10.1093/gbe/evp023>
- Grabherr, M. G., B. J. Haas, M. Yassour, J. Z. Levin, D. A. Thompson *et al.*, 2011 Full-length transcriptome assembly from RNA-Seq data without a reference genome. *Nat. Biotechnol.* 29(7): 644–652. <https://doi.org/10.1038/nbt.1883>
- Hamburger, V., and H. L. Hamilton, 1951 A series of normal stages in the development of the chick embryo. *J. Morphol.* 88(1): 49–92. <https://doi.org/10.1002/jmor.1050880104>
- Holt, C., and M. Yandell, 2011 MAKER2: an annotation pipeline and genome-database management tool for second-generation genome projects. *BMC Bioinformatics* 12(1): 491. <https://doi.org/10.1186/1471-2105-12-491>
- International Chicken Genome Sequencing Consortium, 2004 Sequence and comparative analysis of the chicken genome provide unique perspectives on vertebrate evolution. *Nature* 432(7018): 695–716. <https://doi.org/10.1038/nature03154>
- Kapusta, A., and A. Suh, 2017 Evolution of bird genomes—a transposon’s-eye view. *Ann. N. Y. Acad. Sci.* 1389(1): 164–185. <https://doi.org/10.1111/nyas.13295>
- Kapusta, A., A. Suh, and C. Feschotte, 2017 Dynamics of genome size evolution in birds and mammals. *Proc. Natl. Acad. Sci. USA* 114(8): E1460–E1469. <https://doi.org/10.1073/pnas.1616702114>
- Kielbasa, S. M., R. Wan, K. Sato, P. Horton, and M. C. Frith, 2011 Adaptive seeds tame genomic sequence comparison. *Genome Res.* 21(3): 487–493. <https://doi.org/10.1101/gr.113985.110>
- Kronenberg, Z. N., E. J. Osborne, K. R. Cone, B. J. Kennedy, E. T. Domyan *et al.*, 2015 Wham: Identifying Structural Variants of Biological Consequence. *PLOS Comput. Biol.* 11(12): e1004572. <https://doi.org/10.1371/journal.pcbi.1004572>
- Langmead, B., and S. L. Salzberg, 2012 Fast gapped-read alignment with Bowtie 2. *Nat. Methods* 9(4): 357–359. <https://doi.org/10.1038/nmeth.1923>
- Levi, W. M., 1986 The Pigeon (Second Revised Edition). Levi Publishing Co., Inc., Sumter, SC.
- Lincoln, S. E., and E. S. Lander, 1992 Systematic detection of errors in genetic linkage data. *Genomics* 14(3): 604–610. [https://doi.org/10.1016/S0888-7543\(05\)80158-2](https://doi.org/10.1016/S0888-7543(05)80158-2)



- Lyons, E., and M. Freeling, 2008 How to usefully compare homologous plant genes and chromosomes as DNA sequences. *Plant J.* 53(4): 661–673. <https://doi.org/10.1111/j.1365-313X.2007.03326.x>
- Lyons, E., B. Pedersen, J. Kane, M. Alam, R. Ming *et al.*, 2008 Finding and comparing syntenic regions among Arabidopsis and the outgroups papaya, poplar, and grape: CoGe with rosids. *Plant Physiol.* 148(4): 1772–1781. <https://doi.org/10.1104/pp.108.124867>
- Miller, S. A., D. D. Dykes, and H. F. Polesky, 1988 A simple salting out procedure for extracting DNA from human nucleated cells. *Nucleic Acids Res.* 16(3): 1215. <https://doi.org/10.1093/nar/16.3.1215>
- Morgulis, A., E. M. Gertz, A. A. Schaffer, and R. Agarwala, 2006 WindowMasker: window-based masker for sequenced genomes. *Bioinformatics* 22(2): 134–141. <https://doi.org/10.1093/bioinformatics/bti774>
- Price, A. L., N. C. Jones, and P. A. Pevzner, 2005 De novo identification of repeat families in large genomes. *Bioinformatics* 21(Suppl 1): i351–i358. <https://doi.org/10.1093/bioinformatics/bti1018>
- Pruitt, K. D., T. Tatusova, and D. R. Maglott, 2007 NCBI reference sequences (RefSeq): a curated non-redundant sequence database of genomes, transcripts and proteins. *Nucleic Acids Res.* 35(Database): D61–D65. <https://doi.org/10.1093/nar/gkl842>
- Putnam, N. H., B. L. O'Connell, J. C. Stites, B. J. Rice, M. Blanchette *et al.*, 2016 Chromosome-scale shotgun assembly using an in vitro method for long-range linkage. *Genome Res.* 26(3): 342–350. <https://doi.org/10.1101/gr.193474.115>
- Shapiro, M. D., Z. Kronenberg, C. Li, E. T. Domyan, H. Pan *et al.*, 2013 Genomic diversity and evolution of the head crest in the rock pigeon. *Science* 339(6123): 1063–1067. <https://doi.org/10.1126/science.1230422>
- Simão, F. A., R. M. Waterhouse, P. Ioannidis, E. V. Kriventseva, and E. M. Zdobnov, 2015 BUSCO: assessing genome assembly and annotation completeness with single-copy orthologs. *Bioinformatics* 31(19): 3210–3212. <https://doi.org/10.1093/bioinformatics/btv351>
- Slater, G., and E. Birney, 2005 Automated generation of heuristics for biological sequence comparison. *BMC Bioinformatics* 6(1): 31. <https://doi.org/10.1186/1471-2105-6-31>
- Smit, A. F., and R. Hubley, 2008 RepeatModeler Open-1.0 <http://www.repeatmasker.org/>.
- Smit, A. F., R. Hubley, and P. Green, 1996 RepeatMasker Open-3.0 <http://www.repeatmasker.org/>.
- Smit, A. F., R. Hubley, and P. Green, 2015 RepeatMasker Open-4.0.2013–2015 <http://www.repeatmasker.org/>.
- Souvorov, A., Y. Kapustin, B. Kiryutin, V. Chetvernin, T. Tatusova *et al.*, 2010 Gnomon – NCBI eukaryotic gene prediction tool, NCBI, Bethesda, MD.
- Stanke, M., M. Diekhans, R. Baertsch, and D. Haussler, 2008 Using native and syntenically mapped cDNA alignments to improve de novo gene finding. *Bioinformatics* 24(5): 637–644. <https://doi.org/10.1093/bioinformatics/btn013>
- Stanke, M., and S. Waack, 2003 Gene prediction with a hidden Markov model and a new intron submodel. *Bioinformatics* 19(Suppl 2): ii215–ii225. <https://doi.org/10.1093/bioinformatics/btg1080>
- Suh, A., C. C. Witt, J. Menger, K. R. Sadanandan, L. Podsiadlowski *et al.*, 2016 Ancient horizontal transfers of retrotransposons between birds and ancestors of human pathogenic nematodes. *Nat. Commun.* 7: 11396. <https://doi.org/10.1038/ncomms11396>
- UniProt Consortium, 2007 The universal protein resource (UniProt). *Nucleic Acids Res.* 35: D193–D197.
- Warren, W. C., D. F. Clayton, H. Ellegren, A. P. Arnold, L. W. Hillier *et al.*, 2010 The genome of a songbird. *Nature* 464(7289): 757–762. <https://doi.org/10.1038/nature08819>
- Zhang, G., B. Li, C. Li, M. T. Gilbert, E. D. Jarvis *et al.*, 2014a Comparative genomic data of the Avian Phylogenomics Project. *Gigascience* 3(1): 26. <https://doi.org/10.1186/2047-217X-3-26>
- Zhang, G., C. Li, Q. Li, B. Li, D. M. Larkin *et al.*, 2014b Comparative genomics reveals insights into avian genome evolution and adaptation. *Science* 346(6215): 1311–1320. <https://doi.org/10.1126/science.1251385>

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