# L\_RNA\_scaffolder: scaffolding genomes with transcripts

Wei Xue, Jiong-Tang Li, Ya-Ping Zhu, Guang-Yuan Hou, Xiang-Fei Kong, You-Yi Kuang and Xiao-Wen Sun

### **Supplementary Methods**

#### Recipes for human genome scaffolding

Here we describe how we run each scaffolder on human genomes in this study. Note that we run each scaffolder with the default parameters. Although better results may be obtained with different parameters, the default parameters should provide a good starting point. At our website, http://www.fishbrowser.org/software/L\_RNA\_scaffolder, we have placed the raw mate-pair libraries, the initial contigs and all the assemblies. These recipes allow others to replicate our results.

The file of human contigs is named as 'contigs.fa'. For each scaffolder, we take the 2 kb mate-pair library as a practical instance. The fastq files of 2 kb mate-pair library are 2K\_1.fastq and 2K\_2.fastq.

(1) To run **SOAPdenovo**, we make a configure file, named as *soapdenovo.lib.* 

**max\_rd\_len=100 [LIB] avg\_ins=2000 reverse\_seq=1 asm\_flags=2 rank=1 pair\_num\_cutoff=2 q1=2K\_1.fastq**

**q2=2K\_2.fastq**

Then we run the following commands:

**prepare -c contigs.fa -K 24 -g EC**

**SOAPdenovo31mer map -s soapdenovo.lib -g EC**

**SOAPdenovo31mer scaff -g EC**

(2) For SOPRA, we format two fastq files into a fasta file (named as srr.fasta) which the program requires. The

following commands are used:

**perl s\_prep\_contigAseq\_v1.4.6.pl -contig contigs.fa -mate srr.fasta -a outdir bowtie-build contigs\_sopra.fasta SOPRA bowtie -v 0 -m 1 -f --sam SOPRA srr\_sopra.fasta > mysam\_mate\_illu1 perl s\_parse\_sam\_v1.4.6.pl -sam mysam\_mate\_illu1 -a outdir perl s\_read\_parsed\_sam\_v1.4.6.pl -parsed mysam\_mate\_illu1\_parsed -d 2000 -a outdir perl s\_scaf\_v1.4.6.pl -w 5 -o orientdistinfo\_c5 -a outdir**

(3) For SSPACE, we generate a library file, named as libraries.txt.

**Lib1 2K\_1.fastq 2K\_2.fastq 2000 0.125 RF**

We run the command:

**perl SSPACE\_Basic\_v2.0.pl -l libraries.txt -s contigs.fa -k 5 -x 0 -z 0 -a 0.7 -n 15 -T 1 -p 0 -b 2K**

(4) To run Opera, two fastq files are converted into two fasta files, labeled as lib\_1\_1.fa and lib\_1\_2.fa,

respectively. Then the following command is run:

**perl preprocess\_reads.pl contig.fa lib\_1\_1.fa lib\_1\_2.fa lib\_1.map bowtie opera contigs.fa lib\_1.map results**

(5) For MIP scaffolder, reads in the Illumina mate pairs are renamed and the appropriate ends are reversed into

SOLiD format following the requirement of this package. The new fastq files are R3.fq and F3.fq. We specify the

following parameters in the configure file (2K.config).

**genome\_length=3000000000 minimum\_support=2 mappings= filter.merged.sam orientation=SOLID insert\_length=2000**

Additionally in the coverage file the coverage of each contig is set as 1. The commands are:

**bowtie-build contigs.fa CONTIG bowtie -v 0 -m 1 --sam CONTIG R3.fq >R3.sam bowtie -v 0 -m 1 --sam CONTIG F3.fq >F3.sam perl merge-mapping-lines.pl F3.sam R3.sam merged.sam env LC\_COLLATE=C sort -t\$'\t' -k 3,3 merged.sam > merged.sam.sorted1 env LC\_COLLATE=C sort -t\$'\t' -k 14,14 merged.sam > merged.sam.sorted2 rm merged.sam filter-mappings.sh merged.sam.sorted1 merged.sam.sorted2 filter.merged.sam perl mip-scaffolder.pl 2K.config contigs.fa coverage.file ./**

#### Accuracy Assessment following the GAGE pipeline

To compute scaffold correctness in zebrafish and human genome assembly, firstly the contigs in one predicted scaffold are sorted on the reference genome following GAGE pipeline [\[1\]](#page-15-0). Briefly, the scaffolds are split into smaller contigs  $(S_1, S_2, ..., S_N)$  whenever a gap is encountered. These contigs are numbered sequentially in increasing order, generating (N-1) predicted connections  $(S_i, S_{i+1})$  consisting of two sequentially contigs. These contigs are mapped to the reference genome using nucmer [\[2\]](#page-15-1). Show-tiling is run to generate the order of contigs on the reference genome, forming multiple reference connections  $|S_i, S_{i+k}|$  ( $k \neq 0$ ). Secondly, we compute the correctness by comparing the predicted connections and reference connections. For one contig  $i$ , if k in the reference connection is equal to 1 and the orientation of  $S_{i+1}$  in the two connections are the same, then the predicted connection is consistent with the reference connection. Otherwise, it is defined as a misjoin error, where two contigs are joined together in the assembly in a manner that is inconsistent with the reference genome. These misjoins are tallied into inversions, relocations, and translocations. An inversion is a switch between strands (and orientation), where k is equal to 1 but the orientations of  $S_{i+1}$  in the two connections are opposite. In one relocation, k is not equal to 1 and both  $S_i$  and  $S_{i+1}$  are from the same chromosome. The predicted assembly connects two contigs  $S_i$  and  $S_{i+1}$  from different chromosomes, defined as a translocation event. Our scaffolding method focuses on scaffolding exonic contigs and therefore intronic contigs between two exonic contigs is possibly lost, leading to a relocation event. For example, suppose that contigs  $(S_{i-1}, S_i, S_{i+1})$  are located in the reference genome, where  $S_{i-1}$  and  $S_{i+1}$  are exonic contigs and  $S_i$  is intronic contig. L\_RNA\_scaffolder might reconstruct an  $(S_{i-1}, S_{i+1})$  connection while contig S<sub>i</sub> is missing. If S<sub>i-1</sub> and S<sub>i+1</sub> are less than MIL apart in the reference genome but joined together in the predicted assembly, this relocation is also considered correct. Otherwise, it is considered as an errant relocation. The strategy is also applied into the accuracy assessment for the five existing scaffolders. Finally, we count the corrected accuracy rate of each scaffolding result. The corrected accuracy rate = 1 - (inversions + errant relocations + translocations) / total connections.

#### Determining correct connections

The accuracy assessment is on the basis of the reference genome is correct. To determine whether the errant relocations and translocations in zebrafish genome scaffolding are correct, we calculate the supporting evidence numbers for L\_RNA\_scaffolder connections and Zv\_9 connections using three approaches, syntenic block order, human homologs coverage and zebrafish 'guide' transcript completeness. First, zebrafish syntenic blocks in five genomes, Medaka (oryLat2), Stickleback (gasAcu1), Tetraodon (tetNig2), Fugu (fr3) and human (hg19), are converted using the liftOver program [\[3\]](#page-15-2) and the genome-wide pair-wise alignments between zebrafish and these species is downloaded from the UCSC Genome Browser. If the corresponding syntenic blocks to two

linked contigs in L\_RNA\_scaffolder are adjacent in one of the above genomes, this is considered to be supporting evidence for this linkage. The same procedure is followed for the connections in Zv 9. Second, homologs should be covered as much as possible by the genome and homolog coverage is a common indicator of the quality of a genome assembly [\[4\]](#page-15-3). The alignment of human proteins to zebrafish contigs, mapped by chained tBLASTn, is downloaded from the UCSC Genome Browser. Better homolog coverage is another piece of supporting evidence for a connection. Third, if a connection has better coverage of a 'guide' transcript, then this transcript is the third supporting evidence for this connection. Finally, if L\_RNA\_scaffolder connections and Zv<sub>9</sub> connections have the same amount of evidence, it is hard to determine which connections are correct; otherwise, the connection with the most evidence is regarded to be the correct one.

#### Scaffolding human genome with Illumina RNA-seq data

We scaffold human genome contigs with illumina RNA-seq data in two ways. Two datasets of 100 bp RNA-seq data from polyA(+) RNA libraries are downloaded from NCBI SRA database (SRR324684 and SRR324685). In the first way, the fastq sequences are converted to fasta format and aligned to human contigs using BLAT. The alignments are input into L\_RNA\_scaffolder for scaffolding. The N50 length increases to 163.5 kb. In the second way, RNA-seq data is firstly assembled using Trinity [\[5\]](#page-15-4). The *de novo* assembled transcripts are aligned using BLAT and the output guides genome scaffolding. The N50 length reaches 159.5 kb. These scaffoldings demonstrate that L\_RNA\_scaffolder is suitable for illumina RNA-seq data.

#### Scaffolding human genome with Pacbio RNA-seq data

PacBio, a third generation sequencing (TGS) technology, generates longer reads than the second-generation sequencing platforms. The PacBio platform can yield reads of average length over 2,500 bp and some reads are over 10 kb [\[6\]](#page-15-5). However, these reads have high error rate (up to 15%). To demonstrate that our method is applicable to PacBio RNA-seq data, 174,246 PacBio long RNA-seq reads from human brain cerebellum [\[6\]](#page-15-5) are used to scaffold human genome with our method. Considering that currently the reads have high error rate, the alignment identity is set as 80%. After scaffolding, the N50 reaches 146.8 kb. Although the read amount is much small, the N50 value is larger than the ones of the scaffoldings using 2 kb mate-pair library by SOAPdenovo, Opera, MIP scaffolder or SSPACE. This practice indicates that our method has the practical impact on genome scaffolding using the novel single-molecule sequencing technologies.

## **Supplementary Figures**

**Supplementary Figure 1.** Intron distribution in human, mouse, cow, chicken and medaka.



Five well-assembled genomes of different sizes from 0.7 Gb to 3.2 Gb are selected to estimate the distribution of large introns (longer than 5kb). The positions of introns in genomes are downloaded from Ensembl and the intron size is calculated as the difference value between start coordinate and end coordinate. Most introns are smaller than 5 kb. Although the proportion of long intron is low, they occupy over half of all gene loci (**Supplementary Table 1**).



**Supplementary Figure 2.** Comparisons of the performance of L\_RNA\_scaffolder with different parameters. **(a)**







(a) The performance of L\_RNA\_scaffolder with minimal length coverage and minimal percent identity both set as 0.9. The N50 length is the length x such that 50% of the genome size is contained in sequences of length x or greater. The N50 number is the number of sequences with lengths greater than the N50 length.

(b) The performance of L\_RNA\_scaffolder with maximal intron length set as 100 kb and minimal percent identity set as 0.9.

(c) The performance of L\_RNA\_scaffolder with the maximal intron length set as 100 kb and the minimal length coverage set as 0.9.

**Supplementary Figure 3.** The contig number in zebrafish scaffolding paths.



Every path starts from one predecessor and ends at one terminator. One path consists of at least two fragments.

**(c)**



**Supplementary Figure 4.** The length distribution of lost contigs in the correctable relocations.

**Supplementary Figure 5.** The coverage of core eukaryotic genes in three versions of zebrafish genome



The 248 core eukaryotic genes aligned to three genomes of zebrafish using Blat with the default identity cutoff and different sequence coverage as shown on the x-axis.





**(b)**





The A, B, C and D are the initial genome contigs. The reads a, b, c and d are alternative splicing transcripts aligned to these contigs.

(a) All spliced variants (a and b) are aligned to the same contigs (A, B and C). The built scaffolds could completely recover these transcripts.

(b) The dominantly expressed alternative splicing variant (a, b and c) includes all exons of this gene. They guide scaffolding and all variants could be also completely reconstructed.

(c) The dominantly expressed alternative splicing variant (b and c) includes partial exons of this gene. Some exonic contigs are not assembled during scaffolding.

**Supplementary Figure 7.** *Trans-*splicing and gene fusion may influence L\_RNA\_scaffolder accuracy

**(a)**





(a) The expression of one host gene in chromosome 1 (*a* and *b*) are higher than the chimeric RNA (*c*). Our method correctly rebuilds the genome under the guidance of host gene.

(b) The chimeric RNA has higher expression (*a* and *b*) than the host gene (*c*), leading to a translocation joining two contigs from chromosome 1 and chromosome 2.

### **Supplementary Tables**



**Supplementary Table 1.**The proportion of long introns in transcribed genomic regions.

<sup>a</sup>. The information analyzed here is all downloaded from Ensembl. The genes are firstly grouped into genomic loci based on their positions. If one genomic locus is mapped by

only a single gene, then the length of this locus is the gene length. If one locus contains multiple overlapping genes in two strands, the length of this locus is the different value between the start coordinate of the first gene and the end coordinate of the last gene.

#### **Supplementary Table 2.** Twenty inversions in zebrafish genome scaffolding

The neighboring exons in 'guide' transcripts or homologs in the genome should have the same orientation. Therefore, 'guide' transcript and human homologs in zebrafish genome are used to determine the adjacent contigs orientation. For zebrafish 'guide' transcripts, "-" indicates that the exon is aligned to the minus strand of the contig and "+" suggests that the exon is mapped to the plus strand of the contig. The mapping of human homologs to zebrafish contigs using chained tBLASTn, is downloaded from UCSC genome browser. "+-" shows that the exon is mapped to the minus strand of zebrafish contigs and "++" suggests that the exon is located in the plus strand. These 20 connections cases have the same order in L\_RNA\_scaffolder and Zv\_9. But the orientation of one fragment is conflicting. Here, we show the contig order and orientation of these 20 cases in Zv\_9. The transcript exon orientation and homolog orientation in Zv\_9 contigs are listed below.





a. the format of "chr1:35053895-35093367:+" shows that contig "CABZ01031288.1" is located in the plus strand of chromosome 1 from the 35053895<sup>th</sup> nucleotide to the 35093367th nucleotide.

**b.** the format of "233-380" means that this exon starts from the 233<sup>rd</sup> nucleotide to the 380<sup>th</sup> nucleotide of the guide "C078294".

<sup>c</sup>. The "-" indicates that the exon of "233-380" is aligned to the minus strand of contig "CABZ01031288.1". Since contig "CABZ01031288.1" is located at the plus strand of chromosome 1, this exon is aligned to the minus strand of chromosome 1. However, the exon of "377-687" is mapped to the plus strand of chromosome 1. The conflicting orientation of two adjacent exons suggests that one of two connected contigs should be reversed.

**Supplementary Table 3.** One hundred and two uncertain 'errant' relocations

**Supplementary Table 4.** Ninety eight 'errant' relocations where L\_RNA\_scaffolder connections had more supporting evidence

**Supplementary Table 5.** Twenty one 'errant' relocations where Zv 9 reference connections had more supporting evidence

**Supplementary Table 6.** Thirty three uncertain translocations

**Supplementary Table 7.** Forty three translocations where L\_RNA\_scaffolder connections had more supporting evidence

**Supplementary Table 8.** Sixteen translocations where Zv\_9 reference connections had more supporting evidence

### **References**

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- <span id="page-15-5"></span><span id="page-15-4"></span><span id="page-15-3"></span><span id="page-15-2"></span><span id="page-15-1"></span><span id="page-15-0"></span>6. Au KF, Underwood JG, Lee L, Wong WH: **Improving PacBio long read accuracy by short read alignment**. *PLoS One* 2012, **7**(10):e46679.