CoLoRMap: Correcting Long Reads by Mapping short reads

## Supplementary Material

Ehsan Haghshenas <sup>1,2</sup>, Faraz Hach <sup>1,3</sup>, S. Cenk Sahinalp <sup>1,3,4</sup> and Cedric Chauve <sup>5</sup>

<sup>1</sup>School of Computing Sciences, Simon Fraser University, Burnaby (BC), Canada, V5A 1S6
 <sup>2</sup>MADD-Gen Graduate Program, Simon Fraser University, Burnaby (BC), Canada, V5A 1S6
 <sup>3</sup>Vancouver Prostate Centre, Vancouver, BC, Canada, V6H 3Z6
 <sup>4</sup>School of Informatics and Computing, Indiana University, Bloomington, IN, USA, 47405
 <sup>5</sup>Department of Mathematics, Simon Fraser University, Burnaby (BC), Canada, V5A 1S6

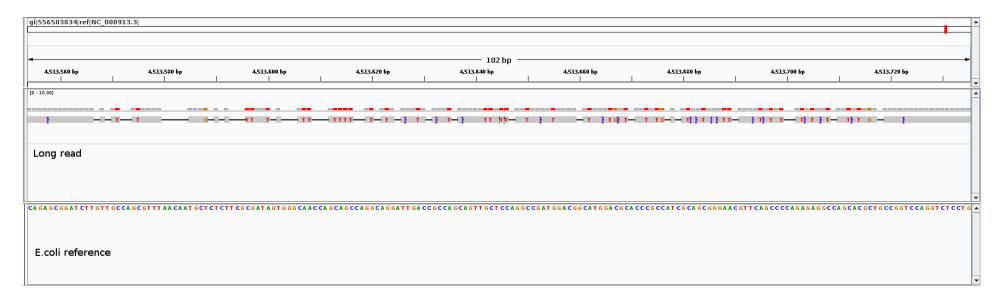


Figure S1: An example of a gap (region uncovered by short reads) on long read, exported from IGV software. There are so many sequencing errors that mapping short read in this region is very challenging. In the region shown here, the maximum exact match between long read and the reference genome is 4 bp long, in a region of size  $\approx 150$  bp.

Table S1: Data

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Bacteria	Yeast	Fruit fly				
E. coli	S. cerevisiae	D. melanogaster				
K-12 substr. MG1655	S288C	iso-1				
$NC_{-}000913$	$NC_{-}0011\{33-48\}$	NT_0337{77-79}				
	NC_001224	$NC_0043\{53-54\}$				
		NC_0245{11-12}				
		NT_037436				
$4.6 \; \mathrm{Mbp}$	12.2  Mbp	140  Mbp				
$\mathrm{DevNet}^1$	$\mathrm{DevNet}^2$	Bergman Lab <sup>3</sup>				
33,360	231,604	901,564				
2,938	6,055	1,505				
14,494	30,164	13,885				
98 Mbp	$1,402~\mathrm{Mbp}$	1,358  Mbp				
21x	114x	9.7x				
$ERR022075^{4}$	SRR567755	$ERX645969^{4}$				
2,316,614	4,503,422	70,000,000				
100 & 102	101	101				
50x	37x	50x				
$504\pm27$	$190 \pm 80$	$240\pm54$				
	E. coli K-12 substr. MG1655 NC_000913  4.6 Mbp  DevNet <sup>1</sup> 33,360 2,938 14,494 98 Mbp 21x  ERR022075 <sup>4</sup> 2,316,614 100 & 102 50x	E. coli K-12 substr. MG1655 NC_000913  S. cerevisiae S288C NC_0011{33-48} NC_001224  4.6 Mbp  12.2 Mbp  DevNet¹ DevNet² 33,360 231,604 2,938 6,055 14,494 30,164 98 Mbp 21x 114x  ERR022075⁴ 2,316,614 4,503,422 100 & 102 50x 37x				

 $<sup>^{1}\</sup> Obtained\ from\ {\tt https://github.com/PacificBiosciences/DevNet/wiki/E\ coli\ K12\ MG1655\ Hybrid\ Assembly.}$  Reads shorter than 100bp were filtered out.

 $<sup>^2~{\</sup>tt https://github.com/PacificBiosciences/DevNet/wiki/Saccharomyces-cerevisiae-W303-Assembly-Contigs}$ 

<sup>3</sup> bergmanlab.ls.manchester.ac.uk/data/genomes/2057\_PacBio.tgz

 $<sup>^4</sup>$  Only a subset of the data was used; the read file was truncated to  $50\mathrm{x}$  coverage.

Table S2: The effect of chunking on correction quality for CoLoRMap. CoLoRMap-W represents running of our software on the whole long read set.

				Aligned				
data set	Method	$\#\mathrm{Reads}^a$	$\# \text{Reads}^b$	$\# \mathrm{Bases}^c$	Size <sup>d</sup> (%)	Matched <sup>e</sup> (%)	Identity $f$ (%)	Gen. $cov.^g$
E.coli	CoLoRMap-W	33360	31247	83214224	89.49	86.59	99.02	100.00
(Full)	CoLoRMap	33360	31271	83344272	89.92	87.53	99.27	100.00
	CoLoRMap-W+OEA	33360	31165	82556432	89.07	86.63	99.20	100.00
	CoLoRMap+OEA	33360	31215	82915378	89.66	87.58	99.38	100.00
E.coli	CoLoRMap-W	30501	30302	76706135	95.98	93.44	99.23	100.00
(Trim)	CoLoRMap	30396	30190	76671240	96.26	94.24	99.46	100.00
	CoLoRMap-W+OEA	30501	30285	76338574	95.88	93.87	99.43	100.00
	CoLoRMap+OEA	30396	30183	76434210	96.21	94.56	99.58	100.00
E.coli	CoLoRMap-W	57458	57281	71449338	98.90	98.76	99.88	99.91
(Split)	CoLoRMap	48987	48840	73728458	99.11	98.99	99.90	99.91
	CoLoRMap-W+OEA	44037	43847	73062465	98.77	98.59	99.86	99.91
	CoLoRMap+OEA	40256	40101	74571341	98.99	98.84	99.89	99.91
Yeast	CoLoRMap-W	231594	223919	1211630012	88.07	83.12	96.69	99.85
(Full)	CoLoRMap	231594	223641	1207729568	88.60	85.62	98.30	99.83
	CoLoRMap-W+OEA	231594	223693	1207654403	88.02	83.61	97.10	99.85
	CoLoRMap+OEA	231594	223497	1205652269	88.55	85.72	98.40	99.83
Yeast	CoLoRMap-W	214765	211702	1004246265	93.35	88.61	96.94	99.85
(Trim)	CoLoRMap	211324	208188	1017551673	92.84	90.46	98.79	99.82
	CoLoRMap-W+OEA	214765	211710	1001174433	93.38	89.33	97.44	99.81
	CoLoRMap+OEA	211324	208310	1017391347	92.95	90.76	98.92	99.82
Yeast	CoLoRMap-W	1043237	1038397	631786029	96.65	96.14	99.44	99.68
(Split)	CoLoRMap	435140	432750	943502213	97.56	97.29	99.69	99.79
	CoLoRMap-W+OEA	676091	672731	707315725	97.36	96.60	99.28	99.77
-	CoLoRMap+OEA	349998	347516	952997735	97.26	96.95	99.66	99.79

 $^a$ the number of DNA sequences available after running the correction tool (may contain uncorrected sequences); in case of original data set, shows the total number of long reads.  $^b$ the number of aligned sequences.  $^c$ the number of bases aligned to the reference genome.  $^d$ the percentage of aligned bases; that is column c / summed length of sequences in column a.  $^e$ the percentage of matched bases; that is total number of matched bases / summed length of sequences in column a.  $^f$  average identity; that is total number of matched bases / summed length of aligned regions in the reference genome.  $^g$  percentage of the reference genome covered by the aligned sequences.

Table S3: Quality of corrected long reads for E.coli dataset obtained with different methods. Assessment is based on alignments of long reads to the reference genome obtained with BWA-MEM.

				Aligned				
data set	Method	$\#\mathrm{Reads}^a$	$\# \text{Reads}^b$	$\# \mathrm{Bases}^c$	$Size^d$ (%)	Matched <sup>e</sup> (%)	Identity $f(\%)$	Gen. $cov.^g$
E.coli	Original	33360	30830	86694498	88.45	76.66	94.07	100.00
E.coli	LSC	25426	25403	77867023	93.06	86.46	97.20	100.00
(Full)	proovread	24722	24046	73292276	91.83	90.89	99.69	100.00
	LoRDEC	33360	31371	82332501	90.16	88.74	99.44	100.00
	CoLoRMap	33360	31693	84690697	91.37	89.34	99.20	100.00
	CoLoRMap+OEA	33360	31693	84514038	91.39	89.67	99.33	100.00
E.coli	LSC	25426	25402	72255582	95.02	89.47	97.68	100.00
(Trim)	LoRDEC	31733	31320	80137781	94.32	93.49	99.69	100.00
	CoLoRMap	30396	30392	76686059	96.28	94.77	99.45	100.00
	CoLoRMap+OEA	30396	30392	76498317	96.29	95.17	99.59	100.00
E.coli	PacBioToCA	100100	100006	69100959	99.80	99.77	99.95	99.81
(Split)	proovread	30479	30477	71518136	99.50	99.40	$\boldsymbol{99.97}$	99.67
	LoRDEC	49018	41679	80036317	99.33	99.28	99.96	99.83
	CoLoRMap	48987	48965	74256645	$\boldsymbol{99.82}$	99.70	99.91	99.91
	CoLoRMap+OEA	40256	40235	75174811	99.79	99.65	99.90	99.91

 $<sup>^</sup>a$ the number of DNA sequences available after running the correction tool (may contain uncorrected sequences); in case of original data set, shows the total number of long reads.  $^b$ the number of aligned sequences.  $^c$ the number of bases aligned to the reference genome.  $^d$ the percentage of aligned bases; that is column c / summed length of sequences in column a.  $^e$ the percentage of matched bases; that is total number of matched bases / summed length of sequences in column a.  $^f$ average identity; that is total number of matched bases / summed length of aligned regions in the reference genome.  $^g$ percentage of the reference genome covered by the aligned sequences.

Table S4: Quality of corrected long reads for Yeast dataset obtained with different methods. Assessment is done using alignments obtained from BWA-MEM.

				Aligned				
data set	Method	# Reads	#Reads	#Bases	Size (%)	Matched $(\%)$	Identity (%)	Gen. cov.
Yeast	Original	231594	136943	742471424	52.94	47.05	92.79	99.69
Yeast	proovread	229702	223719	1216554868	88.78	83.79	95.86	99.75
(Full)	LoRDEC	231594	226827	1223763923	89.96	87.50	98.21	99.71
, ,	CoLoRMap	231594	228484	1240416300	91.00	88.42	98.14	99.71
	CoLoRMap+OEA	231594	228484	1239535613	91.03	88.66	$\boldsymbol{98.27}$	99.70
Yeast	LoRDEC	228893	226632	1206108701	91.46	89.25	98.40	99.71
(Trim)	CoLoRMap	211324	211206	1029575460	93.94	92.17	98.77	99.71
	CoLoRMap+OEA	211324	211206	1028609695	93.98	$\boldsymbol{92.47}$	$\boldsymbol{98.93}$	99.70
Yeast	proovread	225878	225670	245184675	99.82	99.66	99.82	60.64
(Split)	LoRDEC	1460179	925878	1133579321	97.90	97.41	99.52	99.72
, - ,	CoLoRMap	435140	434418	961260796	99.40	99.14	99.74	99.71
	CoLoRMap+OEA	349998	349421	973637656	99.37	99.07	99.72	99.70

Note: Please see Table S3 for description about each column.

Table S5: Quality of Canu assemblies for E.coli data set corrected by different methods. The assessment is done using QUAST. All statistics are based on contigs of size  $\geq 500$  bp, unless otherwise noted.

Assembly	Original	LoRDEC	proovread	CoLoRMap	CoLoRMap+OEA
# contigs ( $\geq 0$ bp)	182	24	26	19	19
# contigs (≥ 1000 bp)	182	24	26	19	19
# contigs (≥ 5000 bp)	178	24	26	19	19
# contigs (≥ 10000 bp)	141	24	26	19	19
# contigs (≥ 50000 bp)	4	21	22	19	19
Total length $(\geq 0 \text{ bp})$	3508197	4623137	4629719	4624793	4627249
Total length (≥ 1000 bp)	3508197	4623137	4629719	4624793	4627249
Total length ( $\geq 5000 \text{ bp}$ )	3492249	4623137	4629719	4624793	4627249
Total length ( $\geq 10000 \text{ bp}$ )	3209268	4623137	4629719	4624793	4627249
Total length ( $\geq 25000 \text{ bp}$ )	1710292	4623137	4616507	4624793	4627249
Total length (≥ 50000 bp)	228498	4495150	4492555	4624793	4627249
Largest contig	69266	920903	605792	1089140	1089205
Reference length	4641652	4641652	4641652	4641652	4641652
GC (%)	51.05	50.81	50.81	50.81	50.81
Reference GC (%)	50.79	50.79	50.79	50.79	50.79
N50	24663	226456	231774	239066	239066
NG50	17847	226456	231774	239066	239066
L50	48	6	7	5	5
LG50	76	6	7	5	5
# unaligned contigs	0+0  part	0+0 part	0+0 part	0+0 part	0+0 part
Unaligned length	0	0	0	0	0
Genome fraction (%)	75.455	99.120	99.092	99.244	99.231
Duplication ratio	1.002	1.005	1.007	1.004	1.005
Largest alignment	69266	538466	398061	698643	698643
NA50	24663	202095	198530	239066	239066
NGA50	17847	202095	198530	239066	239066
LA50	48	8	9	6	6
LGA50	76	8	9	6	6
# misassemblies	0	6	7	5	6
# relocations	0	6	7	5	6
# translocations	0	0	0	0	0
# inversions	0	0	0	0	0
# misassembled contigs	0	4	3	3	4
Misassembled contigs length	0	1328532	1076559	1277904	1446651
# local misassemblies	1	2	3	1	1
# N's per 100 kbp	0.00	0.00	0.00	0.00	0.00
# mismatches per 100 kbp	8.17	15.63	18.00	6.64	7.36
# indels per 100 kbp	191.04	3.43	2.02	1.80	1.74
Indels length	7249	222	126	99	98

Table S6: Quality of Canu assemblies for Yeast data set corrected by different methods. The assessment is done using QUAST. All statistics are based on contigs of size  $\geq 500$  bp, unless otherwise noted.

Assembly	original	lordec	proovread	CoLoRMap	CoLoRMap+OEA
# contigs ( $\geq 0$ bp)	26	28	32	24	29
# contigs (≥ 1000 bp)	26	28	32	24	29
# contigs ( $\geq 5000 \text{ bp}$ )	26	28	31	22	28
# contigs (≥ 10000 bp)	26	27	30	21	28
# contigs ( $\geq 50000 \text{ bp}$ )	22	19	24	19	20
Total length $(\geq 0 \text{ bp})$	12341981	12497078	12485995	12315869	12450479
Total length (≥ 1000 bp)	12341981	12497078	12485995	12315869	12450479
Total length ( $\geq 5000 \text{ bp}$ )	12341981	12497078	12484209	12308283	12445656
Total length (≥ 10000 bp)	12341981	12490996	12474494	12302229	12445656
Total length ( $\geq 25000 \text{ bp}$ )	12341981	12444116	12456794	12302229	12385648
Total length ( $\geq 50000 \text{ bp}$ )	12218401	12257688	12279045	12239085	12217774
Largest contig	1543990	1552711	1537979	1555857	1538508
Reference length	12157105	12157105	12157105	12157105	12157105
GC (%)	38.18	38.21	38.22	38.17	38.20
Reference GC (%)	38.15	38.15	38.15	38.15	38.15
N50	777602	818962	777713	815158	932935
NG50	777602	818962	777713	815158	932935
L50	6	6	6	6	6
LG50	6	6	6	6	6
# unaligned contigs	1+1 part	1+0 part	1+0 part	1+0 part	1+0 part
Unaligned length	27953	27982	42350	34077	29118
Genome fraction (%)	98.638	98.791	98.687	98.716	98.881
Duplication ratio	1.027	1.038	1.037	1.023	1.033
		1.038 1073237	1.037 1090741	1.023 1073302	1.033 1085688
Duplication ratio Largest alignment NA50	1.027				l
Duplication ratio Largest alignment NA50 NGA50	1.027 1084893	1073237 377095 377095	1090741 350112 350112	1073302	1085688
Duplication ratio Largest alignment NA50 NGA50 LA50	1.027 1084893 354598 354598 11	1073237 377095 377095 11	1090741 350112 350112 11	1073302 <b>377108</b> <b>377108</b> 11	1085688 377106 377106 11
Duplication ratio Largest alignment NA50 NGA50 LA50 LGA50	1.027 1084893 354598 354598	1073237 377095 377095	1090741 350112 350112	1073302 <b>377108</b> <b>377108</b>	1085688 377106 377106
Duplication ratio Largest alignment NA50 NGA50 LA50	1.027 1084893 354598 354598 11	1073237 377095 377095 11 11 124	1090741 350112 350112 11 11 108	1073302 <b>377108</b> <b>377108</b> 11	1085688 377106 377106 11
Duplication ratio Largest alignment NA50 NGA50 LA50 LA50 LGA50	1.027 1084893 354598 354598 11	1073237 377095 377095 11	350112 350112 350112 11	1073302 377108 377108 11	1085688 377106 377106 11 11
Duplication ratio Largest alignment NA50 NGA50 LA50 LGA50 # misassemblies	1.027 1084893 354598 354598 11 11	1073237 377095 377095 11 11 124	1090741 350112 350112 11 11 108	1073302 377108 377108 11 11 102	1085688 377106 377106 11 11 112
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations	1.027 1084893 354598 354598 11 11 107 26	1073237 377095 377095 11 11 124 42	1090741 350112 350112 11 11 108 29	1073302 377108 377108 11 11 102 30	1085688 377106 377106 11 11 112 31
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations	1.027 1084893 354598 354598 11 11 107 26 79	1073237 377095 377095 11 11 124 42 82	1090741 350112 350112 11 11 108 29 79	1073302 377108 377108 11 11 102 30 72	1085688 377106 377106 11 11 112 31 80
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations  # inversions  # misassembled contigs  Misassembled contigs length	1.027 1084893 354598 354598 11 107 26 79 2 21 10513374	1073237 377095 377095 11 11 124 42 82 0	1090741 350112 350112 11 11 108 29 79 0	1073302 377108 377108 11 11 102 30 72 0	1085688 377106 377106 11 11 112 31 80
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations  # inversions  # misassembled contigs	1.027 1084893 354598 354598 11 11 107 26 79 2	1073237 377095 377095 11 11 124 42 82 0	1090741 350112 350112 11 11 108 29 79 0 24	1073302 377108 377108 11 11 102 30 72 0 19	1085688 377106 377106 11 11 112 31 80 1 24
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations  # inversions  # misassembled contigs  Misassembled contigs length  # local misassemblies  # N's per 100 kbp	1.027 1084893 354598 354598 11 11 107 26 79 2 21 10513374 31	1073237 377095 377095 11 11 124 42 82 0 25 12191557 11	1090741 350112 350112 11 11 108 29 79 0 24 10639582 14	1073302 377108 377108 11 11 102 30 72 0 19 11996690 11	1085688 377106 377106 11 11 112 31 80 1 24 10856637
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations  # inversions  # misassembled contigs  Misassembled contigs length  # local misassemblies  # N's per 100 kbp  # mismatches per 100 kbp	1.027 1084893 354598 354598 11 11 107 26 79 2 21 10513374	1073237 377095 377095 11 11 124 42 82 0 25 12191557 11	1090741 350112 350112 11 11 108 29 79 0 24 10639582 14 0.00 96.59	1073302 377108 377108 11 11 102 30 72 0 119 11996690 11	1085688 377106 377106 11 11 112 31 80 1 24 10856637 12
Duplication ratio  Largest alignment  NA50  NGA50  LA50  LGA50  # misassemblies  # relocations  # translocations  # inversions  # misassembled contigs  Misassembled contigs length  # local misassemblies  # N's per 100 kbp	1.027 1084893 354598 354598 11 11 107 26 79 2 21 10513374 31	1073237 377095 377095 11 11 124 42 82 0 25 12191557 11	1090741 350112 350112 11 11 108 29 79 0 24 10639582 14	1073302 377108 377108 11 11 102 30 72 0 19 11996690 11	1085688 377106 377106 11 11 112 31 80 1 24 10856637 12

Table S7: Quality of Canu assemblies for D.melanogaster data set corrected by different methods. The assessment is done using QUAST. All statistics are based on contigs of size  $\geq 500$  bp, unless otherwise noted.

Assembly	original	lordec	CoLoRMap
$\# \text{ contigs } (\geq 0 \text{ bp})$	217	224	260
# contigs ( $\geq 1000 \text{ bp}$ )	217	224	260
$\# \text{ contigs } (\geq 5000 \text{ bp})$	159	144	161
# contigs (> 10000 bp)	47	33	42
# contigs ( $\geq 50000 \text{ bp}$ )	0	0	2
Total length $(\geq 0 \text{ bp})$	1768221	1730606	2106055
Total length (≥ 1000 bp)	1768221	1730606	2106055
Total length ( $\geq 5000 \text{ bp}$ )	1543023	1410633	1726065
Total length (≥ 10000 bp)	735933	653134	910341
Total length ( $\geq 25000 \text{ bp}$ )	58943	286003	488439
Total length ( $\geq 50000 \text{ bp}$ )	0	0	142690
Largest contig	30023	42661	75766
Reference length	137567484	137567484	137567484
GC (%)	38.17	37.92	38.22
Reference GC (%)	42.08	42.08	42.08
N50	8620	7664	8485
L50	64	58	58
# unaligned contigs	69 + 8  part	67 + 14 part	61 + 17  part
Unaligned length	770395	861325	986102
Genome fraction (%)	0.649	0.573	0.764
Duplication ratio	1.117	1.104	1.066
Largest alignment	16190	13571	17993
NA50	1442	-	955
NGA50	-	-	-
LA50	177	-	238
# misassemblies	175	122	138
# relocations	117	73	83
# translocations	58	49	54
# inversions	0	0	1
# misassembled contigs	67	54	73
Misassembled contigs length	562340	358099	478259
# local misassemblies	55	32	21
# N's per 100 kbp	0.00	0.00	0.00
# mismatches per 100 kbp	679.35	704.35	583.04
# indels per 100 kbp	401.99	273.08	191.33
Indels length	9235	6132	7931