### Genome assembly using Nanopore-guided Long and Error-free DNA reads Jean-Marc Aury<sup>1</sup>, Mohammed-Amin Madoui<sup>1</sup>, Stefan Engelen<sup>1</sup>, Adriana Alberti<sup>1</sup>, Caroline Belser<sup>1</sup>, Laurie Bertrand<sup>1</sup>, Corinne http://www.genoscope.cns.fr/nas <sup>1</sup>Commissariat à l'Energie Atomique (CEA), Institut de Génomique (IG), Genoscope, BP5706 Evry, France **Overview of MinION® reads** Methods Instead of using Illumina short reads to correct MinION<sup>®</sup> reads, we propose a method that uses the MinION<sup>®</sup> read as a template to recruit Illumina reads, and by performing a local assembly, build a high-quality synthetic **DNA** library read. DNA fragment siz Step3. generate NaS read Flowcell chemis Illumina short read Number of reads input data Step4. filter NaS read Cumulative size ( contig1 contig2 contig4 contig2 contig N50 size (bp) Step1. get seed reads Average size (bp) Step5. build contig graph % of 2D reads contia4 % of 2D bases Step2. recruit reads Summary statistics of the MinIO Step6. select best path Step3. generate NaS read contig4 contia<sup>5</sup> # reads Step4. filter NaS read Illumina read # reads (>10Kb Step7. validate NaS read coverage Cumulative size output data Average size (k MinION

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## Introduction

The technology of long-read sequencing now offers different alternatives to solve genome assembly problems and haplotype phasing, which can not be resolved adequately by short-read sequencing.

In 2014, Oxford Nanopore released the MinION<sup>®</sup> device, a small and low-cost single-molecule nanopore sequencer, which offers the possibility of sequencing long DNA fragments.

Here, we present a hybrid approach developed to take advantage of data generated using MinION<sup>®</sup> device. Our method is able to generate NaS (Nanopore Synthetic-long) reads up to 60kb with no error and that spanned repetitive regions. We applied NaS on a well-known bacterium (Acinetobacter baylyi ADP1) and a small eukaryotic genome (S. cerevisae strain W303), and compared NaS reads and NaS assemblies with two other existing tools : Nanocorr<sup>1</sup> and ECtools<sup>2</sup>.

## Acinetobacter baylyi ADP1 dataset

We combined ~57X of MinION<sup>®</sup> reads with 50X of Illumina 250bp paired-end reads to produce high quality synthetic reads. To demonstrate the utility of the NaS workflow, we attempted synthetic reads assembly using the Celera asembler. Moreover, we compared NaS and two recent tools: Nanocorr<sup>1</sup> and ECTools<sup>2</sup>.

Summary statistics of the $MinION^{ \mathbb{8}}$ ,	Nanocorr, ECtools and NaS reads.	Reads were aligned using bwa mem

Read set	MinION <sup>®</sup> reads	NanoCorr	ECtools	NaS
# reads	66 492	11 836	4 867	11 476
# reads >10Kb	7 475	2 915	2661	3 077
Cumulative size (coverage)	204 951 379 (57X)	67 636 754 (19X)	55 473 374(15X)	79 900 983 (22X)
Average size	3 082	5 714	11 398	6 962
N50 size	11 670	12 166	12 698	11 331
Max size	123 135	58 414	54 615	59 864
Aligned reads	16 763 (25.2%)	11 802 (99.71%)	4 867 (100%)	11 476 (100%)
Aligned bases	123 416 224 (60.2%)	67 135 095 (99.25%)	55 293 130 (99,67%)	79 838 313 (99.92%)
Mean identity percent	66.3747%	96.5665%	99.9636%	99.9847%
Perfect reads	0 (0%)	2 117 (17.93%)	4 456 (91.55%)	11 015 (95.98%)
Coverage of the reference sequence	3 598 621 (100%)	3 598 621 (100%)	3 598 621 (100%)	3 598 621 (100%)



### Quast<sup>9</sup>.

Metrics (Quast) #contigs Assembly size N50 L50 N90 L90 MinContigSize MaxContigSize ID% Max aln NA50 NA75 Genome fraction (%) # misassemblies # local misassemblies # mismatches per 100 k # indels per 100 kbp

**Comparison of Illumina and NaS reads assemblies.** The figure shows a capture of a 700 kb genomic region from Acinetobacter baylyi ADP1. The first track contains rDNA clusters 5, 6 and 7 (purple rectangles). The orange rectangles represent alignments of contigs from the Illumina-only assembly, whereas blue rectangle represents the alignment of the NaS assembly contig. The three plots represent respectively the coverage of Illumina, Nas 2D and MinION<sup>®</sup> 2D reads. We observed that breakpoints of the Illumina assembly coincide in part with rDNA clusters, in contrast with the NaS assembly which exhibits a perfect alignment.

1. Sara Goodwin, James Gurtowski, Scott Ethe-Sayers, Panchajanya Deshpande, Michael Schatz, W Richard McCombie: Oxford Nanopore Sequencing and de novo Assembly of a Eukaryotic Genome. *bioRxiv* doi: http://dx.doi.org/10.1101/013490 2. https://github.com/jgurtowski/ectools 3. Kent WJ: BLAT--the BLAST-like alignment tool. Genome Res 2002, 12(4):656-664.

4. Maillet N, Lemaitre C, Chikhi R, Lavenier D, Peterlongo P: Compareads: comparing huge metagenomic experiments. BMC bioinformatics 2012, 13 Suppl 19:S10.



assembly (using newbler<sup>5</sup>) of the recruited-reads and the seed-reads. Outputted contigs (light blue and re rectangles) are then filtered using seed-read alignments. In this example, a single contig representing the fina NaS read is produced.



detecting gap of coverage

Summary statistics of genome assemblies produced using Celera assembler<sup>8</sup>. Metrics were computed using

	Illumina	NaS	Nanocorr	ECtools
	20	3	6	4
	3 592 537	3 635 796	3 620 823	3 616 882
	326 117	3 609 416	3 604 474	2 468 787
	5	1	1	1
	140 386	3 609 416	3 604 474	954 595
	11	1	1	2
	3 547	9 380	1 458	54 816
	520 993	3 609 416	3 604 474	2 468 787
	99.99	99.99	99.98	99.97
	520 993	1 442 823	1 825 329	1 701 411
	290 660	1 212 310	2 598 906	954 061
	194 326	953 958	681 989	496 599
	99.735	100	100	99.971
	4	2	2	3
	3	2	8	6
эр	6.49	0.78	4.95	9.37
	0.33	0.44	3.11	6.75

# Yeast dataset

We used the dataset provided with the nanocorr<sup>1</sup> tool, based on the W303 strain of S. cerevisae, in combination with Illumina paired-end reads and compared our results with the one obtained with Nanocorr<sup>1</sup>.



5. http://www.454.com/products/analysis-software/

Untangling complex regions. In the case of repetitive regions (represented by dark blue rectangles), the NaS contigs per MinION<sup>®</sup> template (Step3 and tion of the repetitive region (contig2). **Step5.** Construction of the contig with the seed-reads coverage of the given contig. Contig2, which represents the repetitive region, is linked to four different contigs. **Step6.** The contigs present in the path with the highest weight (contig1 – contig2) - contig3) are selected, using the Floyd-Warshall algorithm, and assembled to generate the final NaS read. Step7. The consistency of the synthetic NaS read is checked by aligning the initial Illumina reads set and

W303 PacBio asembly, using bwa mem with '-x pac	locorr and NaS reads. Reads were aligned on the W
NanoCorr (all MinION <sup>®</sup> reads)	MinION <sup>®</sup> reads
30X of PE @ 300bp	NA
105 281	267 768
12 254	34 300
488 Mb (39X)	1 465Mb (117X)
4 636	5 473
8 294	7 937
72 936	146 992
104 094 (98.87%)	68 215 (25.47%)
475 Mb (97.27%)	411 Mb (28.02%)
97.5005%	55.4937%
3 334 (3.2%)	0 (0%)
12 336 482 (99.72%)	ce 12 353 715 (99.86%)
b	NanoCorr (all MinION® reads)   30X of PE @ 300bp   105 281   12 254   488 Mb (39X)   4 636   8 294   72 936   104 094 (98.87%)   97.5005%   3 334 (3.2%)   12 336 482 (99.72%)

Metrics were computed using Quast.

Metrics (Quast)	Illumina	Nanocorr
# contigs	6 953	204
Assembly size	14 910 895	14 000 895
GC (%)	38.71	38.64
Reference GC (%)	38.21	38.21
N50	53 444	334 484
L50	80	15
N90	544	20 612
L90	3 137	98
# misassemblies	72	161
# misassembled contigs	52	107
# local misassemblies	22	44
Genome fraction (%)	97.0	92.2
Duplication ratio	1.18	1.23
# mismatches per 100 kbp	91.11	72.65
# indels per 100 kbp	9.20	34.17
average id%	99.79	99.69

6. Kielbasa SM, Wan R, Sato K, Horton P, Frith MC: Adaptive seeds tame genomic sequence comparison. Genome Res 2011, 21(3):487-493.

7. Li H, Durbin R: Fast and accurate long-read alignment with Burrows-Wheeler transform. Bioinformatics 2010, 26(5):589-595.

8. Myers EW, Sutton GG, Delcher AL, Dew IM, Fasulo DP, Flanigan MJ, Kravitz SA, Mobarry CM, Reinert KH, Remington KA et al: A whole-genome assembly of Drosophila. Science 2000, 287(5461):2196-2204. 9. Gurevich A, Saveliev V, Vyahhi N, Tesler G.: QUAST: quality assessment tool for genome assemblies\_ Bioinformatics. 2013 Apr 15;29(8):1072-5. doi: 10.1093/bioinformatics/btt086. Epub 2013 Feb 19.



linION runs	on Acinetobacter	baylyi ADP1			
	Run1	Run2	Run3	Run4	Run5
	1	2	3	4	4
9	8 kb	20 kb	20 kb	20 kb	20 kb
,	R7	R7	R7.3	R7.3	R7.3
	9,241	3,990	6,052	11,957	35,252
/lb)	21.4	19.3	40.8	34.5	88.9
	5,388	11,288	10,217	12,729	13,967
	2,314	4,830	6,746	2,886	2,523
	6.5%	13.6%	43.3%	11.6%	9.7%
	14.6%	27.1%	57.1%	42.7%	44.6%

	1D reads	2D reads
# reads	57,911	8,581
# reads (>10Kb)	3,609	3,866
Cumulative size (Mbp)	118.9	86.1
Average size (bp)	2,052	10,033
N50 size (bp)	11,058	12,141
Max size (bp)	123,135	58,704
Aligned reads	9,623 (16.6%)	7,140 (83.2%)
Mean identity percent	56.6%	74.5%
Max alignment size	54,158	58,656
Error-free reads	0	0



## Conclusion

The approach we present here is an efficient method to sequence genome by combining advantages of Illumina and the new Oxford Nanopore These sequencing technologies. technologies are commercialized through two desktop instruments, the MinION<sup>®</sup> device and the MiSeq sequencer respectively, that have the advantage to be small and relatively low cost

Our method offers the opportunity to sequence microbial or small eukaryotic genomes in a very short time, even in small facilities.

This hybrid approach presents an interesting alternative compared with standard strategies, such as SMRT of Pacific BioSciences and Illumina TruSeq Synthetic long reads. For approach is example, our straightforward in terms of library preparation, as well as laboratory and information technology infrastructure requirements.

Moreover, we demonstrated that although the Oxford Nanopore technology is a relatively new sequencing technology, currently with a high error rate, it is already useful in generation of high-quality the genome assemblies.

reads

aligned

using LAST<sup>6</sup>

### Summary statistics of genome assemblies produced using Celera assembler.

125 11 845 583 38.14 38.21 148 384 21 21 45 795 45 75 83 51 51 51 51 51 51 51 51 51 51 51 51 51	NaS
11 845 583 38.14 38.21 148 384 21 45 795 75 83 51 51 51 51 13 91.5 1.04 36.65 1.04 36.65	125
38.14 38.21 148 384 21 45 795 75 83 51 33 51 13 91.5 1.04 36.65 7.23 99.93	11 845 583
38.21 148 384 21 45 795 75 83 51 33 51 13 91.5 1.04 36.65 7.23 99.93	38.14
148 384 21 45 795 75 83 51 13 91.5 1.04 36.65 7.23 99.93	38.21
21 45 795 75 83 51 13 91.5 1.04 36.65 7.23 99.93	148 384
45 795 75 83 51 13 91.5 1.04 36.65 7.23 99.93	21
75 83 51 13 91.5 1.04 36.65 7.23 99.93	45 795
83 51 13 91.5 1.04 36.65 7.23 99.93	75
51 13 91.5 1.04 36.65 7.23 99.93	83
13 91.5 1.04 36.65 7.23 99.93	51
91.5 1.04 36.65 7.23 99.93	13
1.04 36.65 7.23 99.93	91.5
36.65 7.23 99.93	1.04
7.23 99.93	36.65
99.93	7.23
	99.93