Fast and **strain-aware** HiFi metagenome assembly: MSR sketching and the Alice assembler

Roland Faure^{1,2,3}, Jean-François Flot¹, Dominique Lavenier²

¹Université libre de Bruxelles (ULB) - Belgium

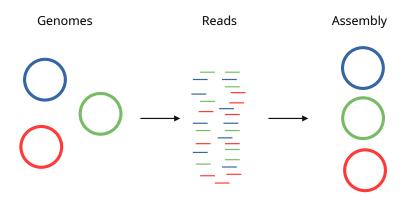
²Université de Rennes, IRISA - France

³Insitut Pasteur, Paris - France

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Metagenome assembly



► Assembling a human gut metagenome (HiFi, 250Gpb)



► Assembling a human gut metagenome (HiFi, 250Gpb)

metaFlye 4 days, 256GB RAM



Assembling a human gut metagenome (HiFi, 250Gpb)

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hifiasm_meta 11 days, 454GB RAM



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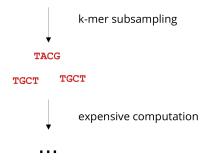


metaMDBG 19h, 10G RAM



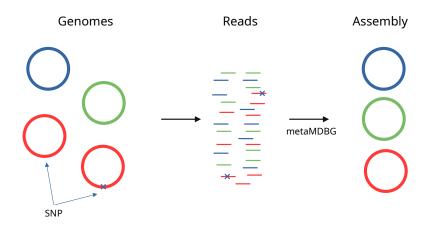
metaMDBG: the trick is sketching input reads

CAGAC**TACG**ATATTTT**TGCT**GACTCATGCGCG**TTTG**G



- minimizers, FracMinHash, seed-chain, strobemers...
- minimap2, Mash, BLAST, metaMDBG...

metaMDBG loses strain diversity



metaMDBG is very fast, but some variants are lost!



k-mer sketching loses SNPs



k-mer sketching loses SNPs



▶ Is k-mer subsampling really the only way to sketch sequences ?

k-mer sketching loses SNPs



- Is k-mer subsampling really the only way to sketch sequences?
- Blassel, Luc & Medvedev, Paul & Chikhi, Rayan. (2022). Mapping-friendly sequence reductions: Going beyond homopolymer compression. iScience.

$$f: \{A, C, G, T\}^{10} \rightarrow \{A, C, G, T, \emptyset\}$$

$$f(10-mer) \rightarrow A \text{ if } hash(10-mer) \in [0,0.05]$$

$$f(10-mer) \rightarrow C \text{ if } hash(10-mer) \in [0.05,0.1]$$

$$f(10-mer) \rightarrow G \text{ if } hash(10-mer) \in [0.1,0.15]$$

$$f(10-mer) \rightarrow T \text{ if } hash(10-mer) \in [0.15,0.2]$$

$$f(10-mer) \rightarrow \emptyset \text{ if } hash(10-mer) > 0.2$$

$$\begin{split} f : & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ f : & \{0-mer\} \rightarrow A \ \ if \ \ hash(10-mer) \in [0,0.05] \\ f : & \{0-mer\} \rightarrow C \ \ if \ \ hash(10-mer) \in [0.05,0.1] \\ f : & \{0-mer\} \rightarrow T \ \ if \ \ hash(10-mer) \in [0.1,0.15] \\ f : & \{0-mer\} \rightarrow \varnothing \ \ if \ \ hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ if \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ if \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ if \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ if \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ if \ hash(10-mer) > 0.2 \end{split}$$

sequence

<u>CAGTATGGAT</u>ACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

sketch

Α



$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ if \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ if \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ if \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ if \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ if \ hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

```
hash(\mathbf{AGTATGGATA})= 0.624 f(\mathbf{AGTATGGATA})= \emptyset
```

sketch

Α



$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ \ if \ \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ \ if \ \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ \ if \ \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ \ \ if \ \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ \ \ if \ \ hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACATCGAGTAGGGGCACTGTACCAGAG

sketch

A G



$$\begin{split} f : & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\emptyset\} \\ f & (10-mer) \rightarrow A \quad if \quad hash(10-mer) \in [0,0.05] \\ f & (10-mer) \rightarrow C \quad if \quad hash(10-mer) \in [0.05,0.1] \\ f & (10-mer) \rightarrow G \quad if \quad hash(10-mer) \in [0.1,0.15] \\ f & (10-mer) \rightarrow T \quad if \quad hash(10-mer) \in [0.15,0.2] \\ f & (10-mer) \rightarrow \emptyset \quad if \quad hash(10-mer) > 0.2 \end{split}$$

sequence

 ${\tt CAG} {\color{red} {\bf TATGGATACA}} {\tt GATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG}$

hash(TATGGATACA)= 0.88 f(TATGGATACA)=
$$\emptyset$$

sketch

A G



$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ if \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ if \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ if \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ if \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ if \ hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

$$\label{eq:hash(atggatacag)=0.32} \text{f(atggatacag)=} \ \mathcal{D}$$

sketch

AG

AG

$$f: \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\}$$

$$f(10-mer) \rightarrow A \quad \text{if} \quad hash(10-mer) \in [0,0.05]$$

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$$f(10-mer) \rightarrow \varnothing \quad \text{if} \quad hash(10-mer) > 0.2$$

$$\text{CAGTA}_{\mathbf{TGGATACAGA}} \text{TGGAGATATCATCGAGTAGGGGCACTGTACCAGAG}$$

$$\text{hash}(\mathbf{TGGATACAGA}) = 0.19$$

$$f(\mathbf{TGGATACAGA}) = 0.19$$

$$f(\mathbf{TGGATACAGA}) = T$$

sequence

sketch

$$f: \{A, C, G, T\}^{10} \rightarrow \{A, C, G, T, \emptyset\}$$

$$f(10-mer) \rightarrow A \quad \text{if} \quad hash(10-mer) \in [0,0.05]$$

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$$f(10-mer) \rightarrow \emptyset \quad \text{if} \quad hash(10-mer) > 0.2$$
CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTAG

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

```
hash(GGATACAGAT)= 0.214
    f(GGATACAGAT) = \emptyset
```

sketch

AG

$$f: \{A, C, G, T\}^{10} \rightarrow \{A, C, G, T, \emptyset\}$$

$$f(10-mer) \rightarrow A \text{ if } hash(10-mer) \in [0,0.05]$$

$$f(10-mer) \rightarrow C \text{ if } hash(10-mer) \in [0.05,0.1]$$

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sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

hash(**GATACAGATG**)=
$$0.678$$

f(**GATACAGATG**)= \emptyset

sketch

$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ \ if \ \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ \ if \ \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ \ if \ \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ \ \ if \ \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ \ \ if \ \ hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

hash(**ATACAGATGG**)=
$$0.669$$

f(**ATACAGATGG**)= \emptyset

sketch



$$\begin{split} f : & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ f : & \{10-mer\} \rightarrow A \text{ if } hash(10-mer) \in [0,0.05] \\ f : & \{10-mer\} \rightarrow C \text{ if } hash(10-mer) \in [0.05,0.1] \\ f : & \{10-mer\} \rightarrow G \text{ if } hash(10-mer) \in [0.1,0.15] \\ f : & \{10-mer\} \rightarrow T \text{ if } hash(10-mer) \in [0.15,0.2] \\ f : & \{10-mer\} \rightarrow \varnothing \text{ if } hash(10-mer) > 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCAC<u>TGTACCAGAG</u>

sketch

A G T

T C

2

Γ

∮▶ ∢ 差 ▶ ∢ 差 ▶ ○ 差 ○ 夕へで

AG



sketch

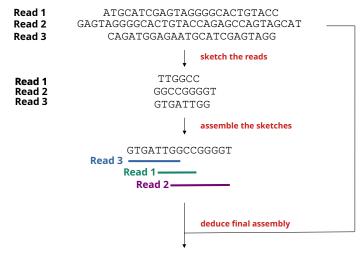
MSR reductions are mapping-friendly

lacktriangle original sequences align \iff reduced sequences align

MSR reductions are mapping-friendly

- ▶ original sequences align ←⇒ reduced sequences align
- This property is very useful

Assembling using MSR sketches



CAGATGGAGAATGCATCGAGTAGGGGCACTGTACCAGAGCCAGTAGCAT

MSR sketches

$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ if \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ if \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ if \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ if \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ if \ hash(10-mer) > 0.2 \end{split}$$

sequence1 CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

sketch1 A

sequence2 CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG

sketch2 A

$$\begin{split} f : & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f (10-mer) \rightarrow A \quad if \quad hash (10-mer) \in [0,0.05] \\ & f (10-mer) \rightarrow C \quad if \quad hash (10-mer) \in [0.05,0.1] \\ & f (10-mer) \rightarrow G \quad if \quad hash (10-mer) \in [0.1,0.15] \\ & f (10-mer) \rightarrow T \quad if \quad hash (10-mer) \in [0.15,0.2] \\ & f (10-mer) \rightarrow \varnothing \quad if \quad hash (10-mer) > 0.2 \end{split}$$

sequence1 CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

sketch1

Α

sequence2 CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG

sketch2 A

$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ & f(10-mer) \rightarrow A \ \ if \ \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ \ if \ \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ \ if \ \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ \ \ if \ \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \varnothing \ \ \ if \ \ hash(10-mer) > 0.2 \end{split}$$

sequence1

CA<u>GTATGGATAC</u>AGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

sketch1

A G

sequence2

 ${\tt CA} \underline{\tt GTATGGATAC} {\tt AGATGGAGATAT} \underline{\tt G} {\tt ATCGAGTAGGGGCACTGTACCAGAG}$

sketch2

A G



$$\begin{split} f: & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\emptyset\} \\ & f(10-mer) \rightarrow A \ \ if \ \ hash(10-mer) \in [0,0.05] \\ & f(10-mer) \rightarrow C \ \ if \ \ hash(10-mer) \in [0.05,0.1] \\ & f(10-mer) \rightarrow G \ \ if \ \ hash(10-mer) \in [0.1,0.15] \\ & f(10-mer) \rightarrow T \ \ if \ \ hash(10-mer) \in [0.15,0.2] \\ & f(10-mer) \rightarrow \emptyset \ \ \ if \ \ hash(10-mer) > 0.2 \end{split}$$

sequence1 CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

sketch1 A G T

CAGTATGGATACAG<mark>ATGGAGATATG</mark>ATCGAGTAGGGGCACTGTACCAGAG

sketch2 A G T

$$\begin{split} f : & \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\} \\ f (10-mer) \rightarrow A & if & hash(10-mer) \in [0,0.05] \\ f (10-mer) \rightarrow C & if & hash(10-mer) \in [0.05,0.1] \\ f (10-mer) \rightarrow G & if & hash(10-mer) \in [0.1,0.15] \\ f (10-mer) \rightarrow T & if & hash(10-mer) \in [0.15,0.2] \\ f (10-mer) \rightarrow \varnothing & if & hash(10-mer) > 0.2 \end{split}$$

sequence1

sketch1

A G T T

sequence2

 ${\tt CAGTATGGATACAGA} \underline{{\tt TGGAGATATG}} {\tt ATCGAGTAGGGGCACTGTACCAGAG}$

sketch2

sequence1

sequence2

sketch1

sketch2

CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG

G

 $f: \{A, C, G, T\}^{10} \to \{A, C, G, T, \emptyset\}$

sequence1

sequence2

sketch1

sketch2

$$f: \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\}$$

$$f(10-mer) \rightarrow A \text{ if } hash(10-mer) \in [0,0.05]$$

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$$f(10-mer) \rightarrow T \text{ if } hash(10-mer) \in [0.15,0.2]$$

$$f(10-mer) \rightarrow \varnothing \text{ if } hash(10-mer) > 0.2$$

$$CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG$$

$$A G T T C$$

$$CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG$$

G

sequence1

sequence2

sketch1

sketch2

$$f: \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\varnothing\}$$

$$f(10-mer) \rightarrow A \quad if \quad hash(10-mer) \in [0,0.05]$$

$$f(10-mer) \rightarrow C \quad if \quad hash(10-mer) \in [0.05,0.1]$$

$$f(10-mer) \rightarrow G \quad if \quad hash(10-mer) \in [0.1,0.15]$$

$$f(10-mer) \rightarrow T \quad if \quad hash(10-mer) \in [0.15,0.2]$$

$$f(10-mer) \rightarrow \varnothing \quad if \quad hash(10-mer) > 0.2$$
CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

A G T T C

CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG

G

MSRs keep SNPs

```
f: \{A, C, G, T\}^{10} \to \{A, C, G, T, \emptyset\}
                     f(10-mer) \rightarrow A if hash(10-mer) \in [0,0.05]
                     f(10-mer) \to C \text{ if } hash(10-mer) \in [0.05, 0.1]
                     f(10-mer) \rightarrow G \text{ if } hash(10-mer) \in [0.1, 0.15]
                     f(10-mer) \to T \text{ if } hash(10-mer) \in [0.15, 0.2]
                     f(10-mer) \rightarrow \emptyset if hash(10-mer) > 0.2
                   CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG
sequence1
                         A G T
sketch1
                   CAGTATGGATACAGATGGAGATATGATCGAGTAGGGGCACTGTACCAGAG
sequence2
                         A G
sketch2
```

MSRs keep and amplify SNPs

$$f: \{A,C,G,T\}^{10} \rightarrow \{A,C,G,T,\emptyset\}$$

$$f(10-mer) \rightarrow A \quad \text{if} \quad hash(10-mer) \in [0,0.05]$$

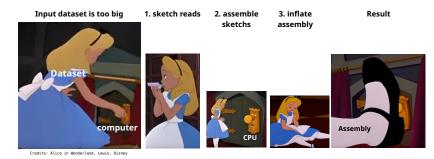
$$f(10-mer) \rightarrow C \quad \text{if} \quad hash(10-mer) \in [0.05,0.1]$$

$$f(10-mer) \rightarrow G \quad \text{if} \quad hash(10-mer) \in [0.1,0.15]$$

$$f(10-mer) \rightarrow T \quad \text{if} \quad hash(10-mer) \in [0.15,0.2]$$

$$f(10-mer) \rightarrow \emptyset \quad \text{if} \quad hash(10-mer) > 0.2$$
SNP before

The Alice assembler: assembling with MSR



- ► Any assembler for step 2., by default BCALM2+tip-clipping
- ▶ github.com/rolandfaure/alice-asm



▶ Zymobiomics Gut Microbiome Standard with 5 strains of *E.coli*

Genome fraction (%)

	≡ metamdbg	alice
Escherichia_coli_B1109	78.408	92.039
Escherichia_coli_B3008	36.411	99.968
Escherichia_coli_B766	95.647	95.641
Escherichia_coli_JM109	38.211	96.334
Escherichia_coli_b2207	37.335	95.495

Measured using metaQUAST

Strains are not collapsed

Assembling a human gut metagenome (HiFi sequencing)

Flye 4d, 256G RAM



hifiasm_meta 11d, 454G RAM



metaMDBG 19h, 10G RAM



Assembling a human gut metagenome (HiFi sequencing)

Flye 4d, 256G RAM



hifiasm meta 11d, 454G RAM



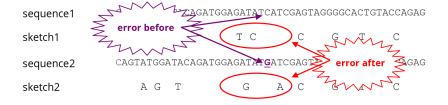
metaMDBG19h, 10G RAM



Alice



The dark side of MSR: errors



- ► Errors are amplified: Alice only works on highly accurate reads
- lacktriangle New error rate pprox Original error rate / compression rate /



Metagenomic datasets in the future



Metagenomic datasets in the future

Alice HiFi assembler (github.com/ rolandfaure/alice-asm) is fast and strain-aware



Metagenomic datasets in the future

- Alice HiFi assembler (github.com/ rolandfaure/alice-asm) is fast and strain-aware
- MSR sketches keep & amplify differences between sequences



Metagenomic datasets in the future

- Alice HiFi assembler (github.com/ rolandfaure/alice-asm) is fast and strain-aware
- MSR sketches keep & amplify differences between sequences
- MSR sketches are sequences and can be manipulated as such

Perspectives

► Other uses for MSR sketching

Perspectives

Other uses for MSR sketching

$$\begin{split} & f: \big\{A,C,G,T\big\}^{10} \!\to\! \big\{A,C,G,T,\varnothing\big\} \\ & f(10-mer) \!\to\! A \quad if \quad hash(10-mer) \!\in\! [0,0.05] \\ & f(10-mer) \!\to\! C \quad if \quad hash(10-mer) \!\in\! [0.05,0.1] \\ & f(10-mer) \!\to\! G \quad if \quad hash(10-mer) \!\in\! [0.1,0.15] \\ & f(10-mer) \!\to\! T \quad if \quad hash(10-mer) \!\in\! [0.15,0.2] \\ & f(10-mer) \!\to\! \varnothing \quad if \quad hash(10-mer) \!>\! 0.2 \end{split}$$

sequence

CAGTATGGATACAGATGGAGATATCATCGAGTAGGGGCACTGTACCAGAG

```
hash(TGTACCAGAG)= 0.06
   f(TGTACCAGAG)= C
```

sketch

A G

ТС

 \triangleright Changing f, I, c