

AXE

The Rapid and Accurate Demultiplexer

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- ▶ Bioinformatician @ Borevitz Lab
 - ▶ TraitCapture Project Developer
 - ▶ Genomics (Low level Sequence Analysis)
 - ▶ Phenomics (Image analysis)
 - ▶ Sample tracking, data standards, HPC
- ▶ Starting PhD in Bioinformatics next year



In big data, binary goes up to 2. #eyenary

- ▶ Sequencing == firehose of data
- ▶ Need to put > 1 sample / lane
- ▶ Give BRF only one tube
- ▶ \therefore we need multiplexing
- ▶ \therefore de-multiplexing



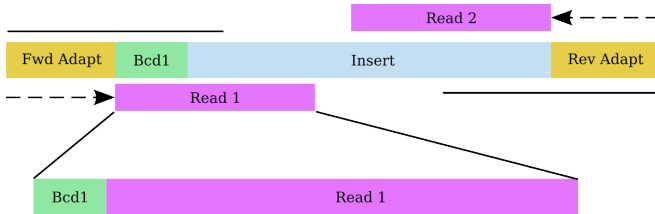
The High Throughput Problem

- ▶ Sequencing == firehose of data
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DNA/Molecular Barcoding

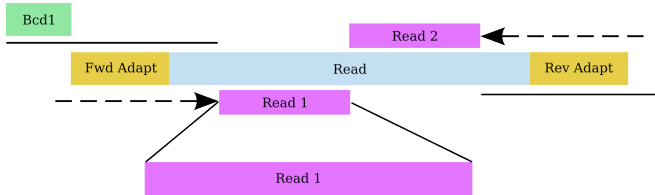
- ▶ DNA fragment contains per-sample unique seq.
- ▶ Sequenced, and “attached” to a read
- ▶ Must be balanced & staggered
- ▶ Hamming distance >2





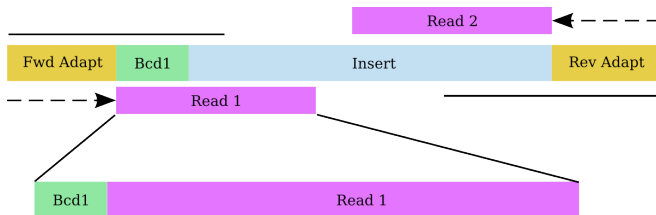
So you need a demultiplexer?

- ▶ Some studies use kit protocols
- ▶ Most kits use index reads
- ▶ Illumina pipeline automatically demuxes these



So you need a demultiplexer?

- ▶ Some studies use kit protocols
- ▶ Most kits use index reads
- ▶ Illumina pipeline automatically demuxes these
- ▶ Many advanced/homebrew protocols use “in-read”
- ▶ Must be demultiplexed by user



- 



Hamming distance

- ▶ Distance between two strings of equal length

ACTGTG

x x = 2

ACAGCG

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- ▶ Is a poor measure of seq. divergence:

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xxxxxx = 6

CTGTGA



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$$x_{\dots\dots\dots} = 1$$

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- ▶ `sum([0 if s1[i] == s2[i] else 1 for i in range(1)])`

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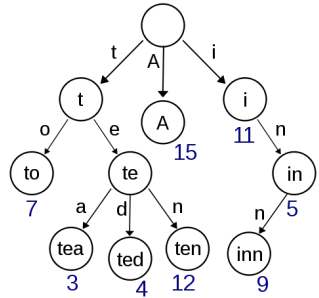
$$x \dots = 1$$

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- ▶ `sum([0 if s1[i] == s2[i] else 1 for i in range(1)])`
- ▶ Good Enough™

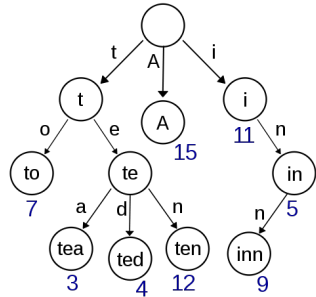
A Forest of Tries?

- ▶ Trie is k-ary tree for k letter alphabet



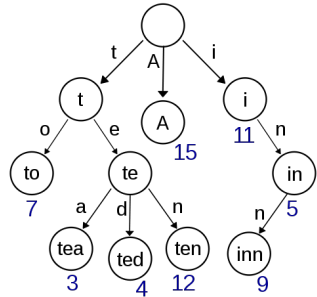
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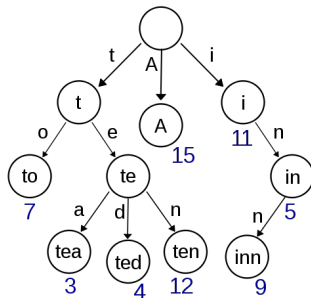
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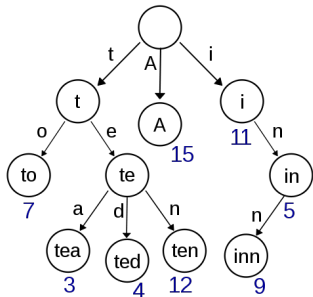
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- ▶ Memory efficient (prefixes collapsed)
- ▶ Prefix lookups very fast



Hamming Mismatch Trie

- ▶ Pre-calculate all strings with Hamming dist d from search
- ▶ Make trie, do lookups
- ▶ Essentially a FSM

AAAA
CAAA
GAAA
TAAA
ACAA
AGAA
ATAA
AACA
AAGA
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```

/-A-A-A-A
| | | \-C
| | | -G
| | | -T
| | \-C-A
| | -G-A
-| | -T-A
| \-C-A-A
| -G-A-A
| -T-A-A
|-C-A-A-A
|-G-A-A-A
\ -T-A-A-A
    
```

The Algorithm

- ▶ Take read
- ▶ Walk trie w/ start of read
- ▶ Mark full-length matches
- ▶ Take longest match

AAAA
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I THINK...

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- ▶ These statements are thought through, but please, tell me if I'm wrong

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- ▶ Ok, time for an IPython Notebook



Thanks

- ▶ Justin Borevitz
- ▶ Sylvain Forêt
- ▶ Aaron Chuah
- ▶ Cam Jack
- ▶ Jared Streich & Collin Ahrens (β -testers)

