

# An introduction to pangenomics

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## Caveat emptor

Pangenomics is a *rapidly evolving* and *poorly defined* field, this is just a taster

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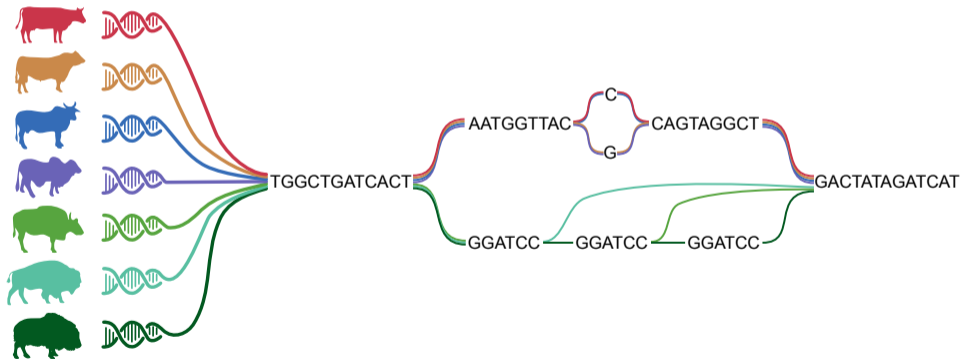
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This also focuses on “**sequence/variation graph**” pangenomics, but there are many other types out there!

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# Overview

## 1. Introduction to pangenomics

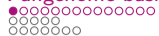
- Terminology
- Graph building
- Pangenome visualisation

## 2. Working with pangenomes

- Pangenome communities
- Pangenome validation
- Downstream pangenomics

## 3. Pangenomics of the future

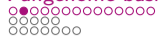
- Personalised pangenomes
- Targeted pangenomes
- Pangenomes = biology?



## What is a genome?

Encode *one* layer of information for an individual organism

Sequence of  $\sim 1,000,000,000$  nucleotides [ACTG] split into chromosomes



## What is a reference genome?

Definition of a reference genome:

*A reference sequence is an accepted representation that is used by researchers as a standard for comparison to DNA sequences generated in their studies.*

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We use the **same** reference genome for these **different** cows?







## Routine genome assembly

Long read sequencing has *almost* solved genome assembly

Solving a puzzle is easier with larger pieces

Jarvis, E.D., Formenti, G., Rhie, A. et al. Semi-automated assembly of high-quality diploid human reference genomes. *Nature* **611**, 519–531 (2022). <https://doi.org/10.1038/s41586-022-05325-5>

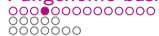
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Much faster **and** much cheaper **and** much easier today



## What is a **pangenome**?

Almost no consensus of what a pangenome *is*



## What is a **pangenome**?

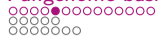
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- a reference genome with a vcf
- a set of genome assemblies
- a list of haplotypes

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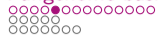
Almost no consensus of what a pangenome *is*

- a reference genome with a vcf
- a set of genome assemblies
- a list of haplotypes
- **a graph structure representing variation across multiple assemblies**



## What is a **pangenome**?

How can we integrate information from many assemblies into one structure?



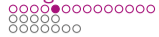
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————— **A** **C** **A** **G** **T** **C** **G** **C** **C** **G** **T** **C** **G** **G** **T** **C** **T** **G** **T** **C** **C** **G** —————

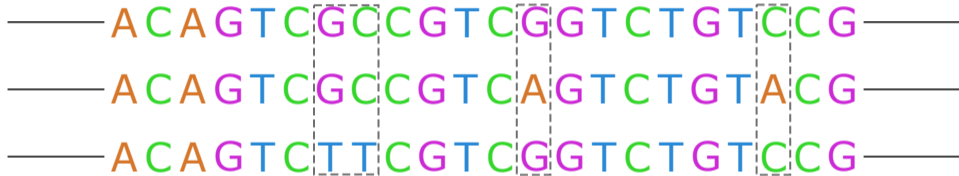
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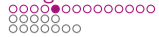


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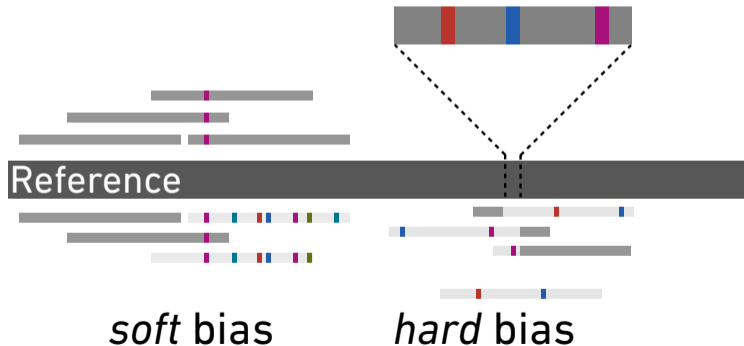
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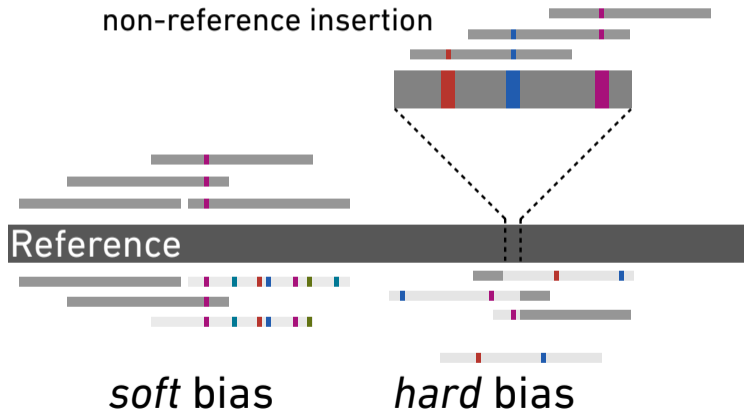
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non-reference insertion



## What is reference bias?

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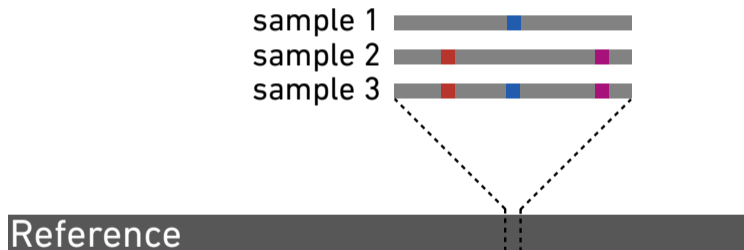


## How do we represent complex variation?

SNPs can **at worst** be quadallelic but a small SV (50 bp) can have  $4^{50} \approx 1.3 \times 10^{30}$  alleles

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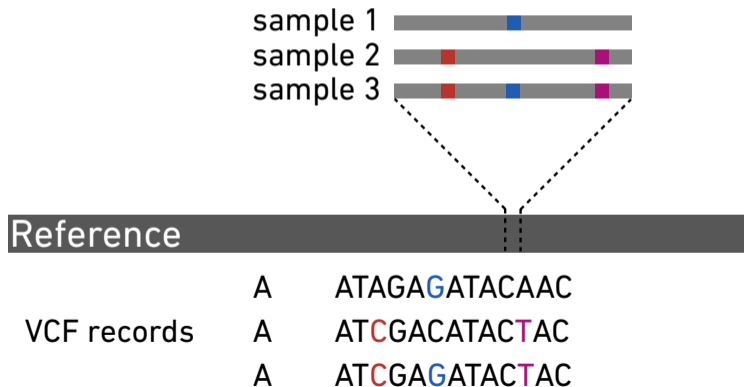
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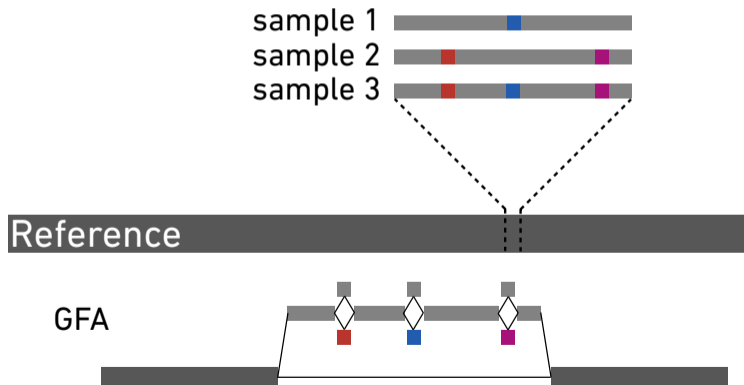
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## Genome file formats

Most sequencing data (or anything representing genomes) are in *fasta/q*

Sequence alignments are generally in *SAM/BAM*

Other “annotation” files like *BED*, *GFF*, etc

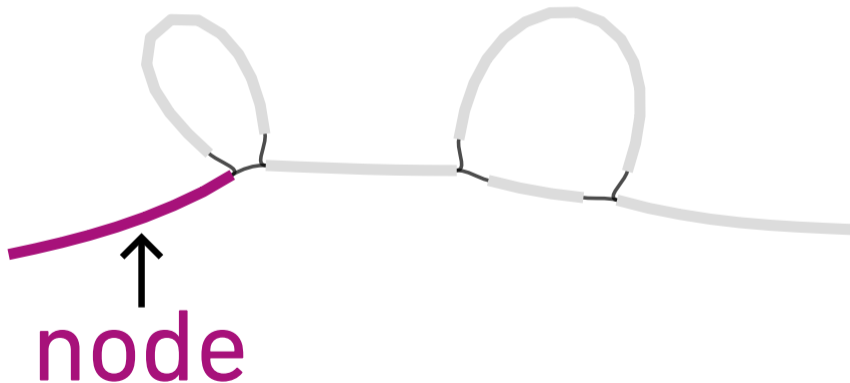


## Pangenome terminology

How do we describe a graph-based sequence/variation pangenome?

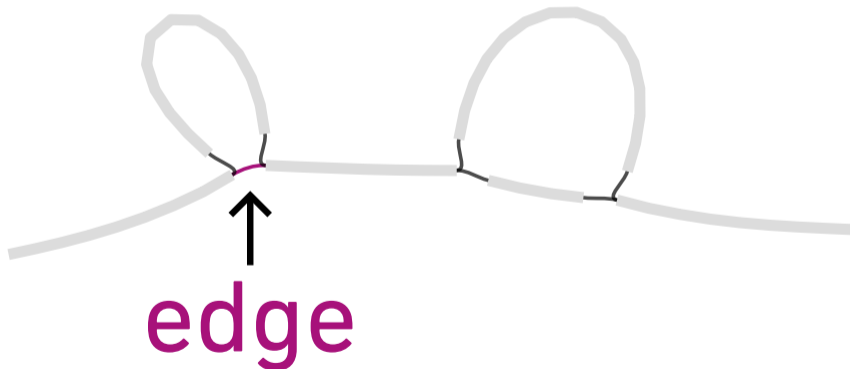
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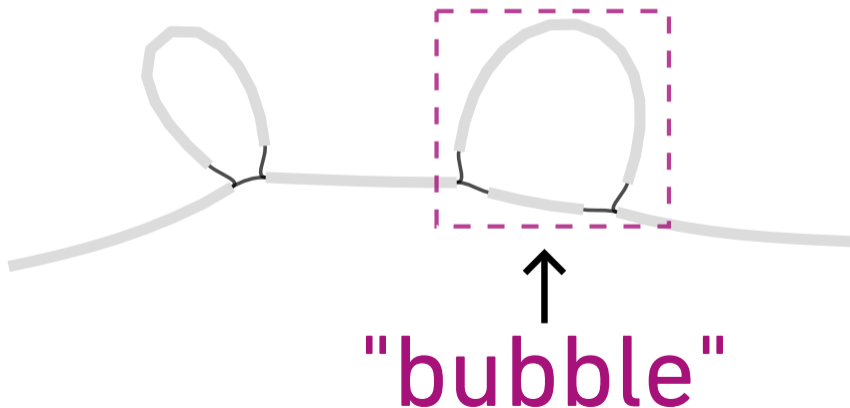
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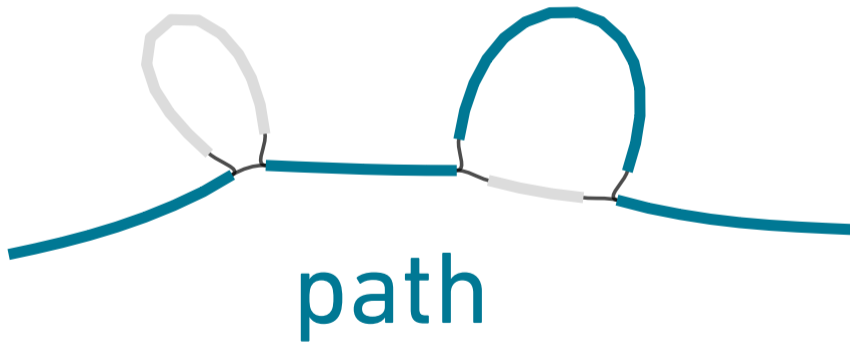
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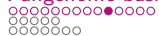


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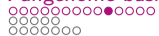






## Pangenome file formats

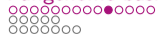
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GFA: **G**raphical **F**ragment **\*A\*\***ssembly



## Pangenome file formats

What are the pangenomic file equivalents?

GFA: **G**raphical **F**ragment **\*A\*\***ssembly

Three main components:

- S-lines: the sequence of the nodes
- L-lines: how the graph is connected with edges
- P-lines: how a “sample” traverses the graph (*optional*)



## Pangenome file formats

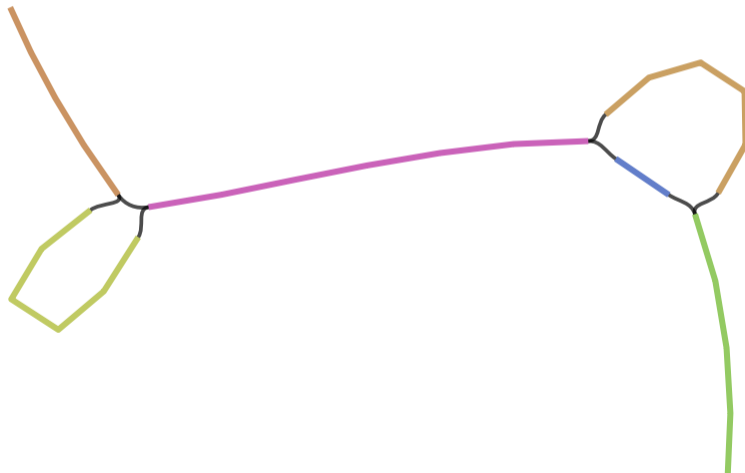
```

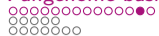
H      VN:Z:1.0
S      1      AATTTACC
S      2      GGTAT
S      3      T
S      4      CCCGATA
S      5      GGACTA
S      6      TTAC
L      1      +      2      +      OM
L      1      +      3      +      OM
L      2      +      4      +      OM
L      3      +      4      +      OM
L      4      +      5      +      OM
L      5      +      6      +      OM
L      4      +      6      +      OM
P      Alice  1+,2+,4+,5+,6+ *
P      Bob   1+,3+,4+,6+ *

```

# Pangenome file formats

That looks like





## Pangenome file formats

Most downstream tools have their own “efficient” representations of *.gfa* files

- *.og*
- *.vg*
- *.xg*
- *.gbz*



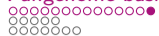
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These graphs contain a lot of information.

GFA is human-readable, but binary formats are more compute efficient



## Pangenome file formats

GAF: **G**raph **A**lignment **F**ormat

A graph “superset” of PAF (**P**airwise **m**Apping **F**ormat).





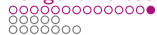
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- which read
- where does it align
- how good was that alignment



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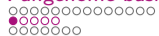
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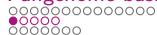
- which read
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Likewise, this is human-readable, and so some tools prefer the binary version *.gam*.



## Graph building

Building a “variation graph” starts with a set of assemblies

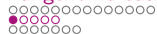


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We often rename chromosome names using [PanSN-spec](#)

`[sample]#[haplotype]#[contig](#[fragment/subrange])`



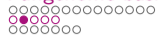
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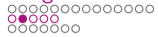
```
[sample]#[haplotype]#[contig](#[fragment/subrange])
```

- avoids conflicts of many e.g. “>chr1” sequences
- encodes some metadata *within* the file
- enables selectively grouping/rename values by “classification”



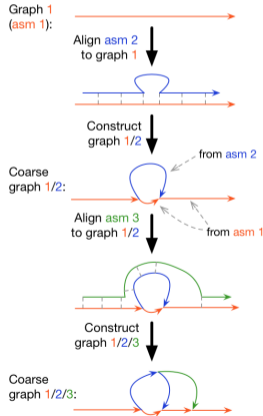
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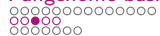
Augments a linear reference “backbone” with *sufficiently* new variation



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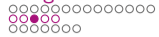




pggb

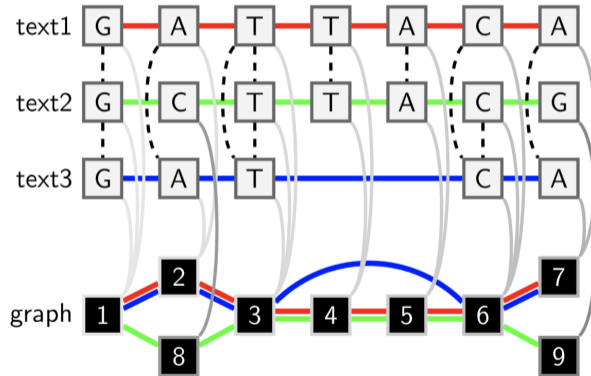
All-versus-all alignment, followed by complicated cleaning of the graph structure

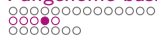




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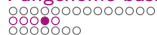
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## Different approaches

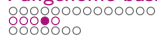
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minigraph	Yes	No	Yes	No	Easy	Laptop
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We can perfectly reconstruct any assembly from a *lossless* graph

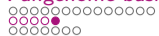


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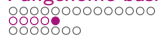
We can perfectly reconstruct any assembly from a *lossless* graph

Pick the approach that best matches **your** research question



## Other pangenome tools

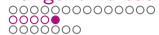
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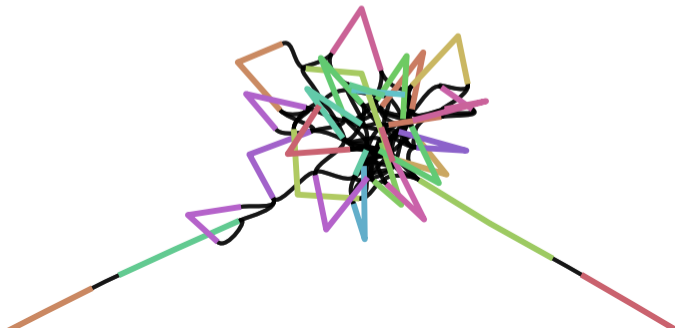
- pangene
- pgr-tk
- many DBG tools (`bifrost` etc.)

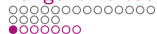


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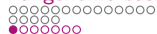


## Pangenome visualisation

IGV (**I**ntegrative **G**enomics **V**iewer, <https://igv.org/doc/desktop/>) is a useful tool for visualising different formats of genomic data:

- read alignments
- bed files
- gene annotations





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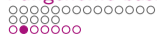
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Is there a pangenomic equivalent?



## Visualising **p**angenomic data

Everything is more complicated in the pangenomic world



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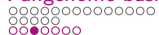
What are we trying to visualise?

- Synteny between many assemblies?
- Genic regions in a pangenome?
- Alignments to a pangenome?



## Interactive visualisation

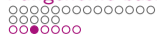
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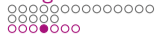
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One of the most common tools is BandageNG (<https://github.com/asl/BandageNG>).

We'll explore this in the practical, but it has several advantages:

- easy to install
- quick to load small-to-moderate sized graphs
- extensive analytic functionality



# Interactive visualisation

Style:  Single  Double

Draw graph

---

**Graph display**

Zoom: 119.9%

Node width: 4.3

Custom colours

---

**Node labels**

Custom  Name  
 Length  Depth  
 CSV data:

Font  Text outline

---

**Graph search**

Create/view graph search

Query: gene

---

> BED

---

**Annotations**

Blast Hits

**Find nodes**

Node(s):

Match:  Exact  Partial

Find node(s)

---

**Find paths**

Name:

Position:

Action:  Select  Recolor

Find path

Paths...

---

**Find walks**

Sequence:

Position:

Action:  Select  Recolor

Find walk

Walks...



## Static visualisation

Large graphs (many nodes and/or edges) are complex to render.





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Let the computer do the **hard** work and render a static representation!

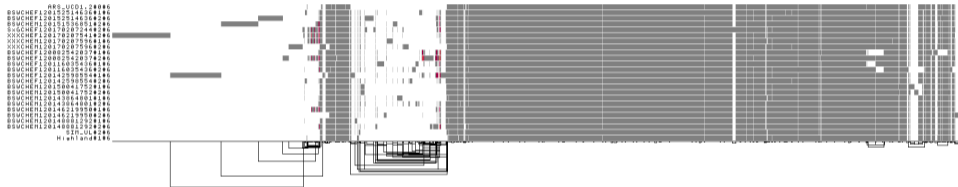


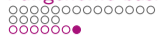
## Static visualisation

Break pangenome down into multiple linear blocks

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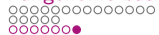
Break pangenome down into multiple linear blocks





## Static visualisation

“Optimally” lay out nodes/edges in 2D with a *Hogwild!* algorithm.



## Static visualisation

“Optimally” lay out nodes/edges in 2D with a *Hogwild!* algorithm.

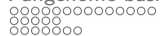


## Static visualisation

“Optimally” lay out nodes/edges in 2D with a *Hogwild!* algorithm.



This step took ~**30%** of the entire HPRC pipeline runtime!



## Pangenome communities

Building pangenomes per chromosome is much easier than genome-wide



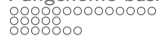
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What if

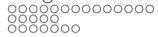
- we care about interchromosomal events
- we don't know how to define "per chromosome"
- we don't have assigned chromosomes





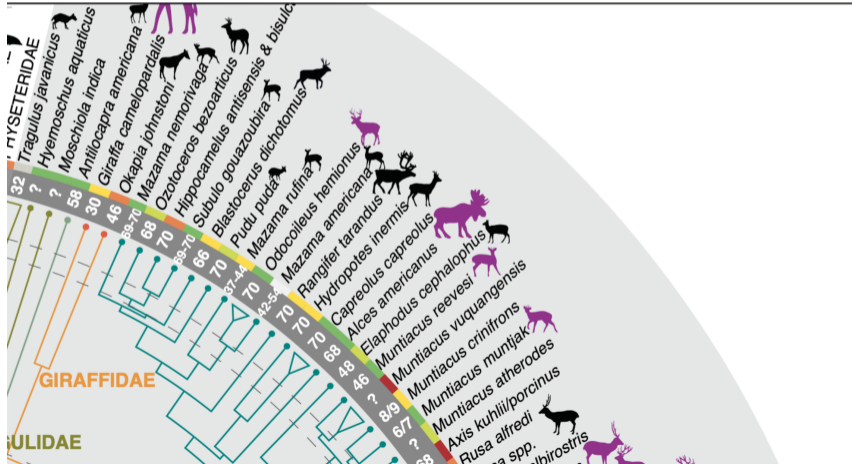
## Nonuniform karyotypes

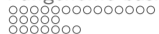
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# Nonuniform karyotypes

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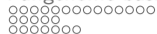




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pggb implemented community detection

- map whole genomes all-versus-all
- build a *weighted* network from all submappings
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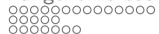


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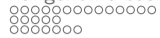
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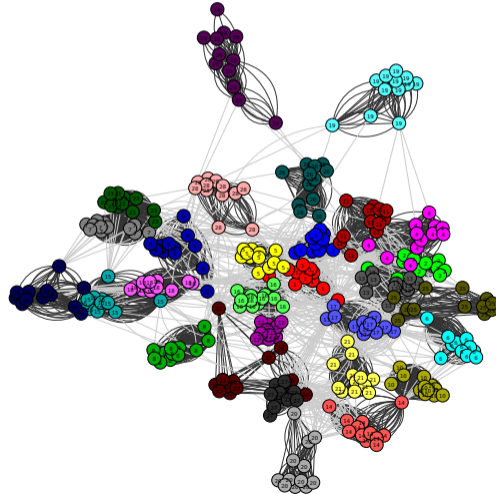
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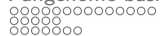
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Distinguishing signal from noise is hard for small/infrequent mappings



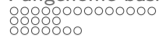
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## Pangenome validation

How do we know if the pangenome we built is any good?

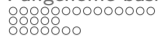


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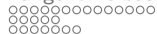




## Pangenome analyses

There are several tools useful for checking pangenome construction and content

- gfatools
- odgi
- panacus
- gretl



## Pangenome graph statistics

After building a graph, the simplest statistics to check are:

- total sequence length
- maximum and average node size
- node depth distribution



## Pangenome graph statistics

Graphs can be described by the number of nodes and edges they contain.

Different graphs (e.g., `pggb` versus `minigraph`) may have similar length, but very different node/edge counts.

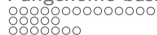


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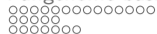
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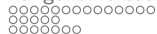
Should be *reasonable* values (how many bases do you expect before a SNP?)



## Pangenome graph statistics

From `gfatools stat` on a large, base-level bovine pangenome of chromosome 1 (159 Mb)

```
Number of segments: 10140559
Number of links: 14371940
Number of arcs: 28743880
Total segment length: 200985993
Average segment length: 19.820
Max degree: 106924
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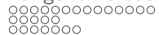


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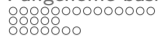
The total pangenome size should *approximately* be equal to the reference plus all variation.



## Pangenome openness

How does the growth of a pangenome change with more samples?

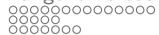




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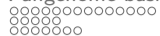


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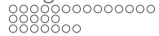
If  $\alpha > 1$ , the pangenome is **closed**, otherwise if  $\alpha \leq 1$ , the pangenome is **open**.



## Pangenome openness

With enough samples, we can estimate  $\alpha$

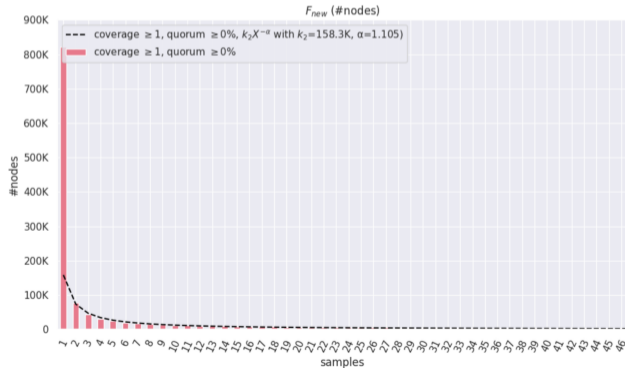
Care is needed about how much variation is *expected* to be shared . . .

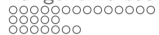


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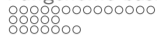
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## Pangenome layers

Pangenome openness effectively addresses the total unique sequence.  
What about different levels of intersection?



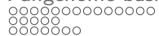
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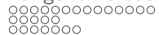
We can characterise pangenome *nodes* as:

- **core**: present in all/most samples
- **shell**: present in at least two samples
- **cloud**: present in only one sample
- **flexible/dispensable**: varies, but something like shell/cloud



## Pangenome layers

With enough samples, we expect minimal sequence to be “core”

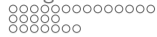


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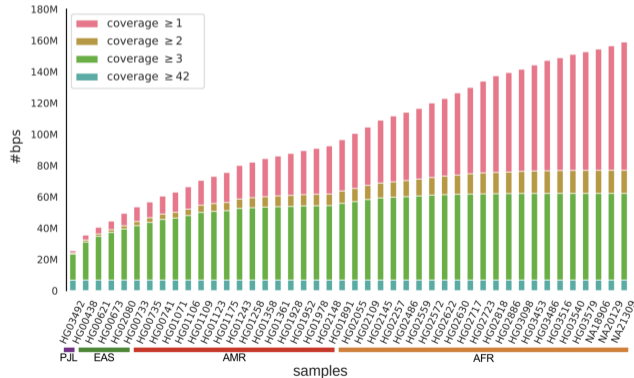


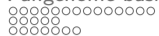


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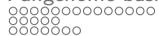
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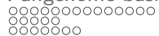
## Downstream pangenomics

Once we have a “good” pangenome, what can we actually do with it?



## Calling pangenome variants

We can also call variants *within* the pangenome with `vg deconstruct`



## Calling pangenome variants

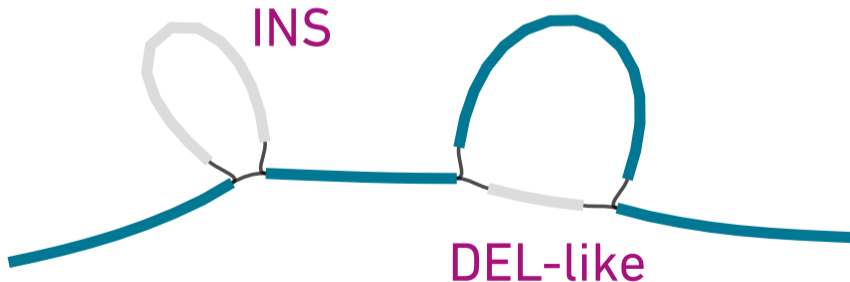
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## Aligning to pangenomes

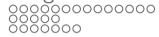
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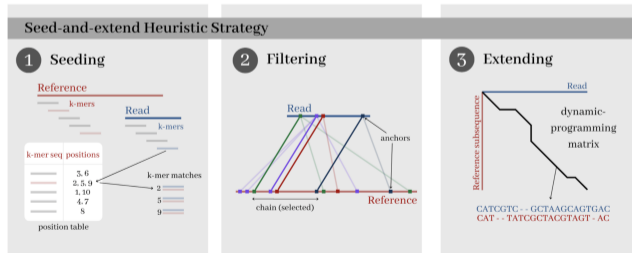
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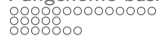
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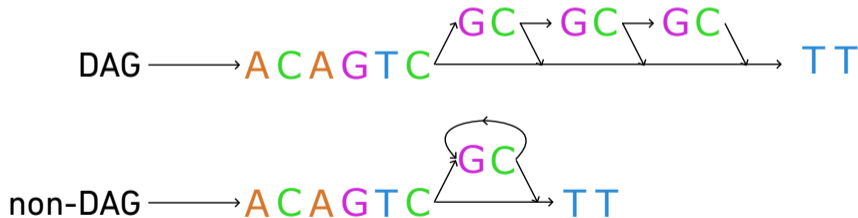
non-DAGs allow revisiting a node (maybe infinitely times)

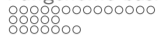
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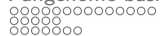
Currently limited number of “production” tools

- GraphAligner
- `vg giraffe-lr` soon!



## Personalised pangenomes

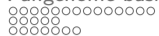
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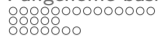
## Personalised pangenomes

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Can we “filter” out graph complexity that isn’t useful for a *given* sample?





## Irrelevant pangenomic variation

Given any genomic sequencing, we can easily calculate a set of  $k$ -mers for that sample



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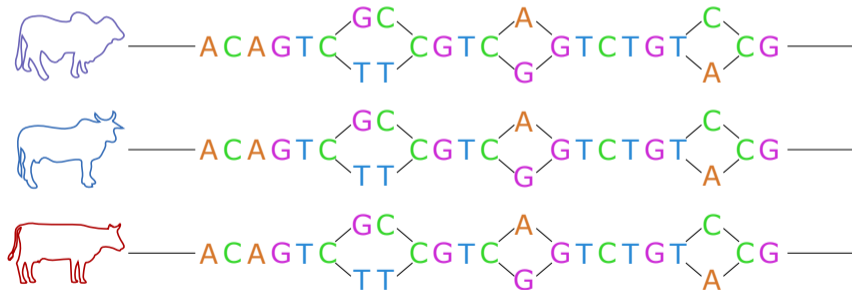
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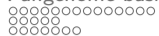


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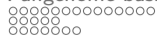
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## Upstream blackbox

Pangenomes can be challenging and don't always match downstream input formats



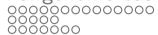
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A user could provide a complete reference pangenome and (short) reads

Inside a black box, we can then run

- `vg haplotype` (personalise the pangenome)
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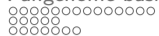
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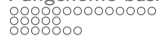
Improved variant calls without *direct* exposure to the pangenome



## Targeted pangenomes

A *reference* pangenome should cover the entire genome

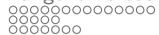




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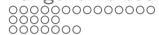
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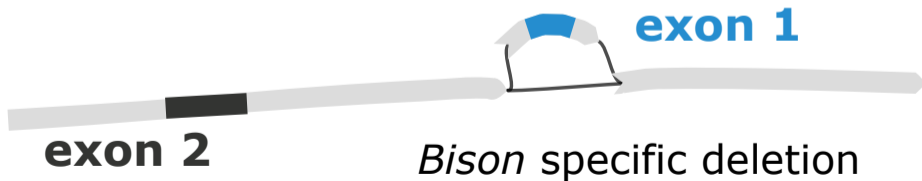
*Bison* specific deletion

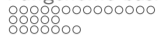


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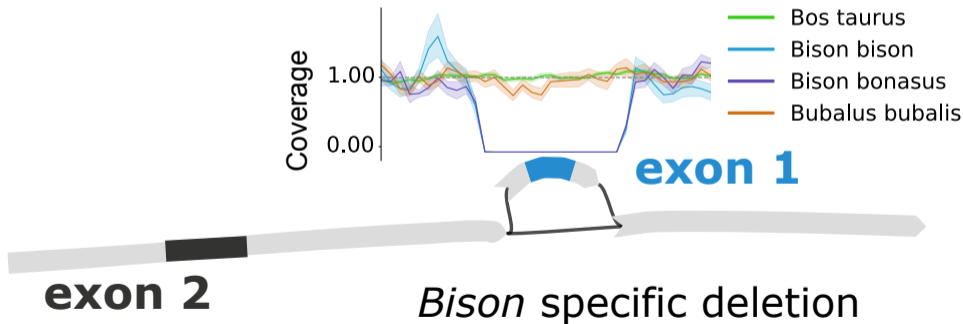


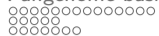


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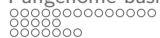
For a given reference-annotated region, we can:



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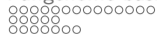
For a given reference-annotated region, we can:

- lift over equivalent reference coordinates into other assemblies
- extract relevant section of those assemblies
- build a pangenome from these sequences



## A better approach

`imp` outlines a different approach

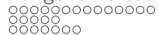


## A better approach

`imp` outlines a different approach

- conduct the hard all-to-all mapping once
- extract *transitive* regions based on a set of coordinates
- build a pangenome from those sequences





## A new whole-genome approach?

Building many small pangenomes is easier than one big pangenome

Can we go from per *chromosome* to per *window*?

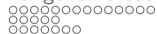


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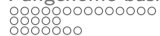
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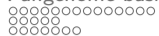
Some unresolved concerns:

- boundary conditions are poorly defined
- events spanning the “split length” might be lost
- detecting subgraph isomorphisms is hard



## Acrocentric recombination

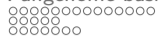
Caveat: biologists probably knew before the computer people



## Acrocentric recombination

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Initial human pangenome construction lead to huge tangles in *some* chromosomes

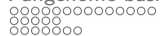


## Acrocentric recombination

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Pangenomes (at minimum) offer a new perspective on existing questions

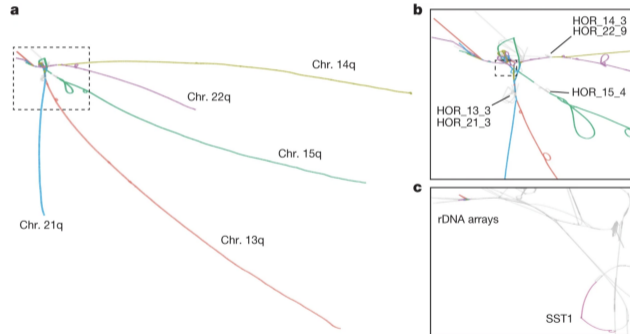


## Acrocentric recombination

Pseudo-homologous regions near centomeres drive Robertsonian translocations

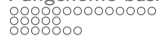
# Acrocentric recombination

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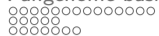
{Guarracino et al. 2023}





## Braided snarls

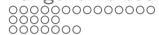
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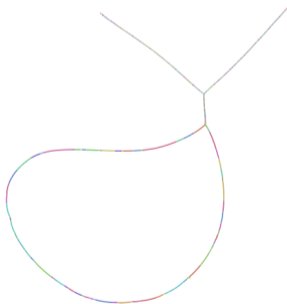
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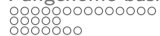


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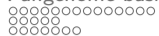
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## Superpangenomes

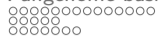
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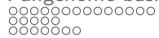


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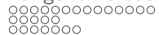
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**Hyper/Mega/Ultrapangenomes?**



## Superpangenomes

What happens if we include many related species into a pangenome?

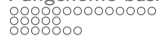


## Superpangenomes

What happens if we include many related species into a pangenome?

- ultraconserved elements are still roughly single nodes
- species-specific variation are distinct paths through bubbles
- phylogeny-related information present in nested bubbles





## Summary – starting with pangenomes

Pangenomes can integrate many genomes into one structure to mitigate reference bias



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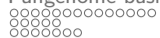


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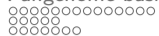
Building pangenomes is still hard, but quickly getting easier

Pangenome openness or graph statistics help us know if our graphs are “good”



## Summary – working with pangenomes

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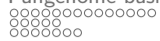
Population-scale read alignment and “direct” pangenomic analyses are *becoming* possible



## Hands on pangenomics

During the activity we'll look at

- building a small `minigraph` pangenome
- visualising that pangenome in `BandageNG`
- using `gfatools` to find regions of interest



# Questions?