

Population genomics for adaptation

Day 1 - Lecture 2

(adapted from Claire Mérot & Anna Tigano's slides)

Analytical approaches

GWAS

Comparative genomics

Transcriptomics

Population genomics

Experimental evolution

Epigenetics

QTL mapping

Analytical approaches

GWAS

Comparative genomics

Transcriptomics

Population genomics

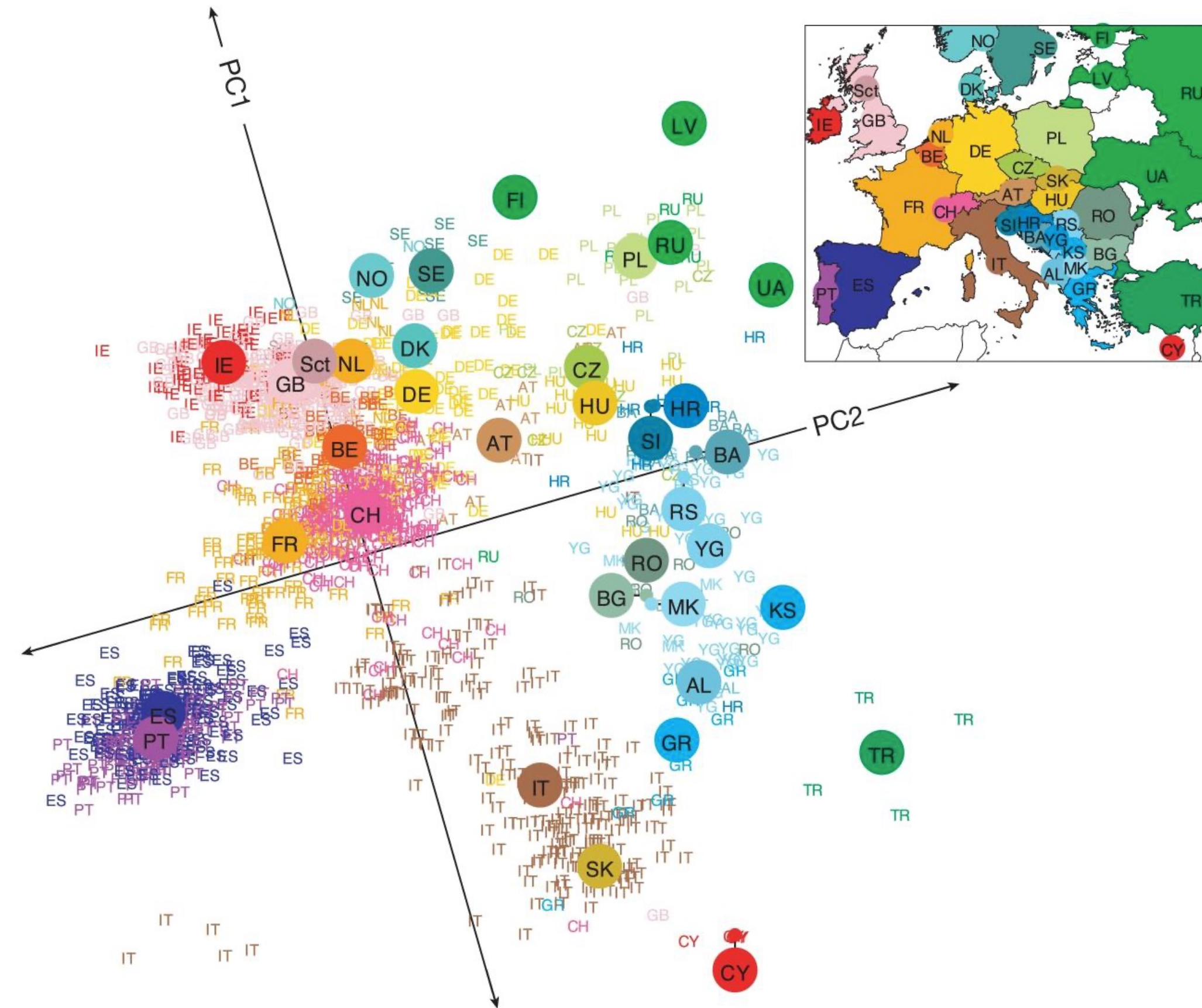
Experimental evolution

Epigenetics

QTL mapping

Population genomics

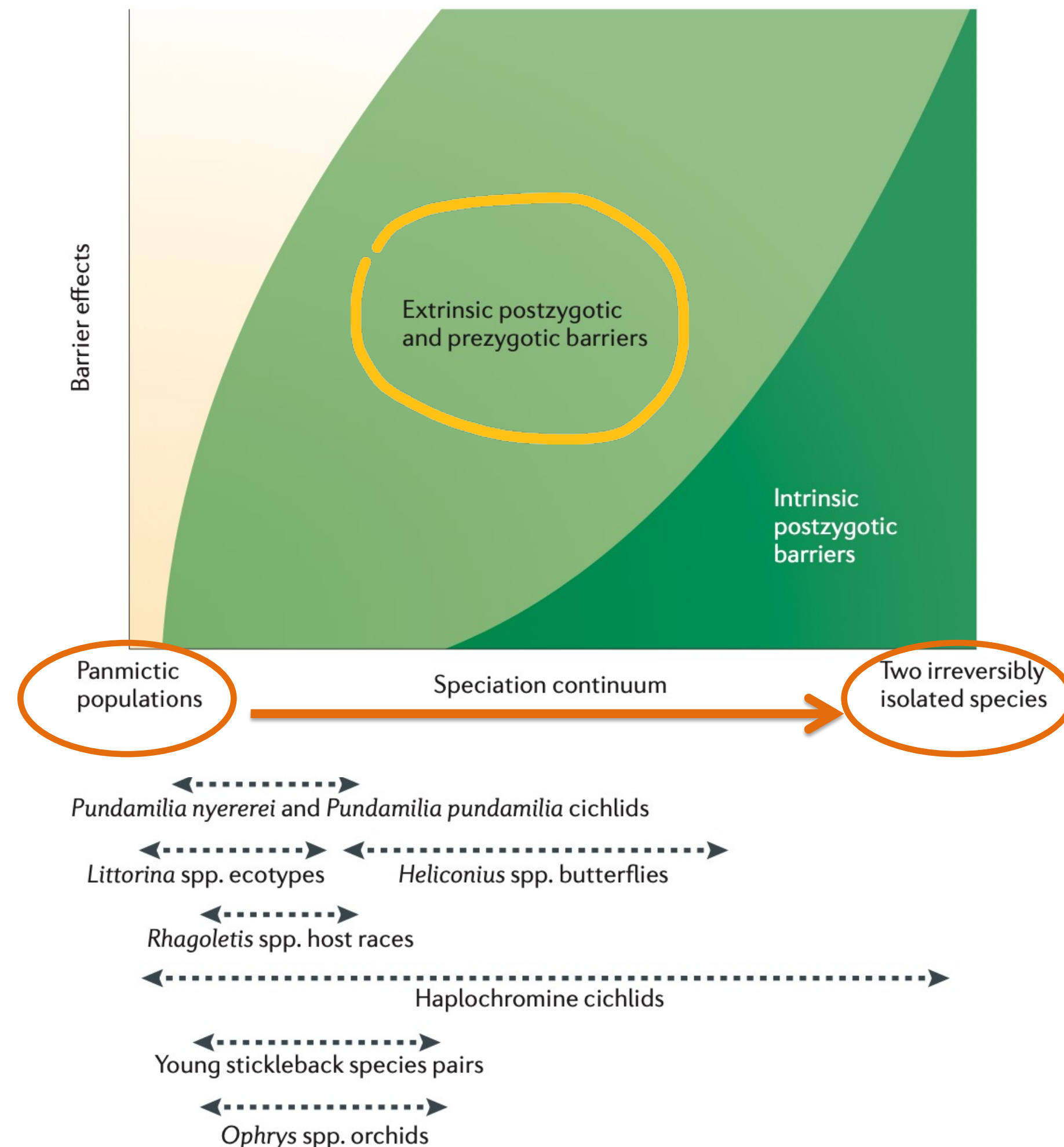
- Studies the **genetic differences within and between populations** and the dynamics of how populations evolve
- Genetic differences are investigated using **genetic markers** that allow to assess how evolutionary forces shape different parts of the genome
- By comparing differences in genetic diversity and differentiation within species we can **study population structure, speciation and adaptation**



Novembre, J., Johnson, T., Bryc, K. *et al.* Genes mirror geography within Europe. *Nature* **456**, 98–101 (2008). <https://doi.org/10.1038/nature07331>

Population genomics for adaptation

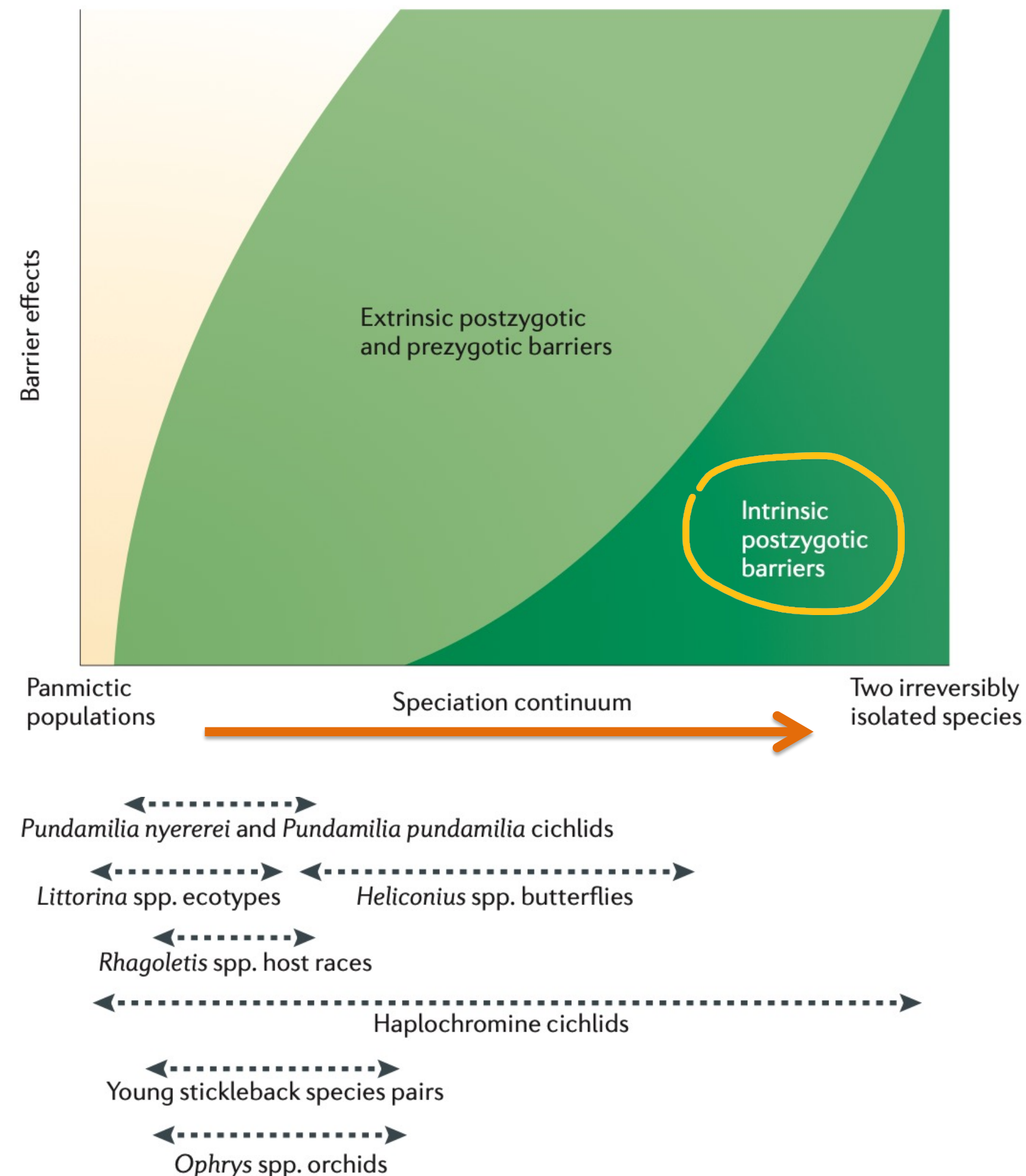
a Speciation driven by divergent selection



- Population genomics study populations **early in the speciation continuum**

Population genomics for adaptation

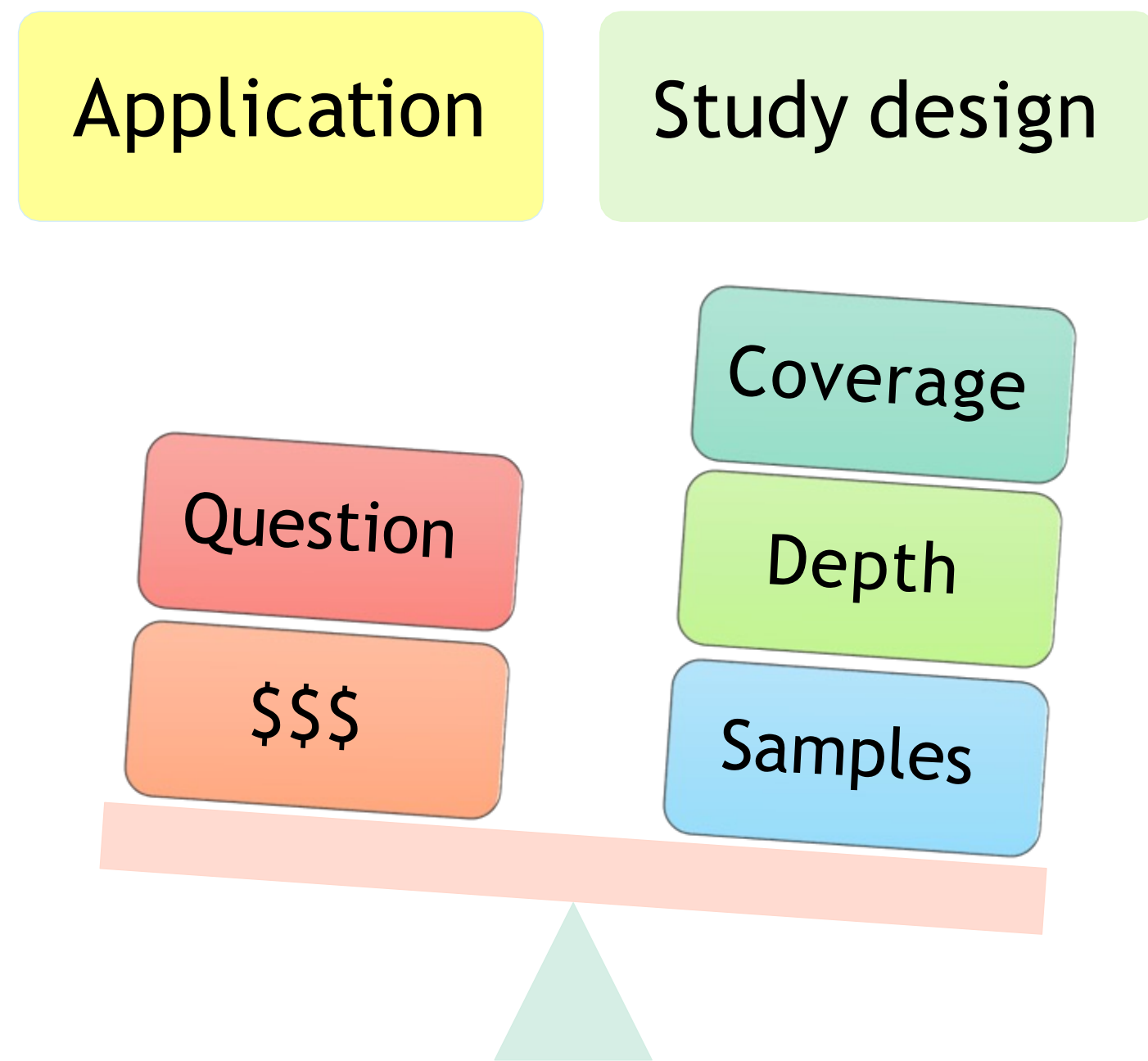
a Speciation driven by divergent selection



- Population genomics study populations **early in the speciation continuum**
- Later on in the continuum, differentiation builds up and it becomes more challenging to distinguish whether genetic differentiation is due to ecological divergence and adaptation, or to other factors

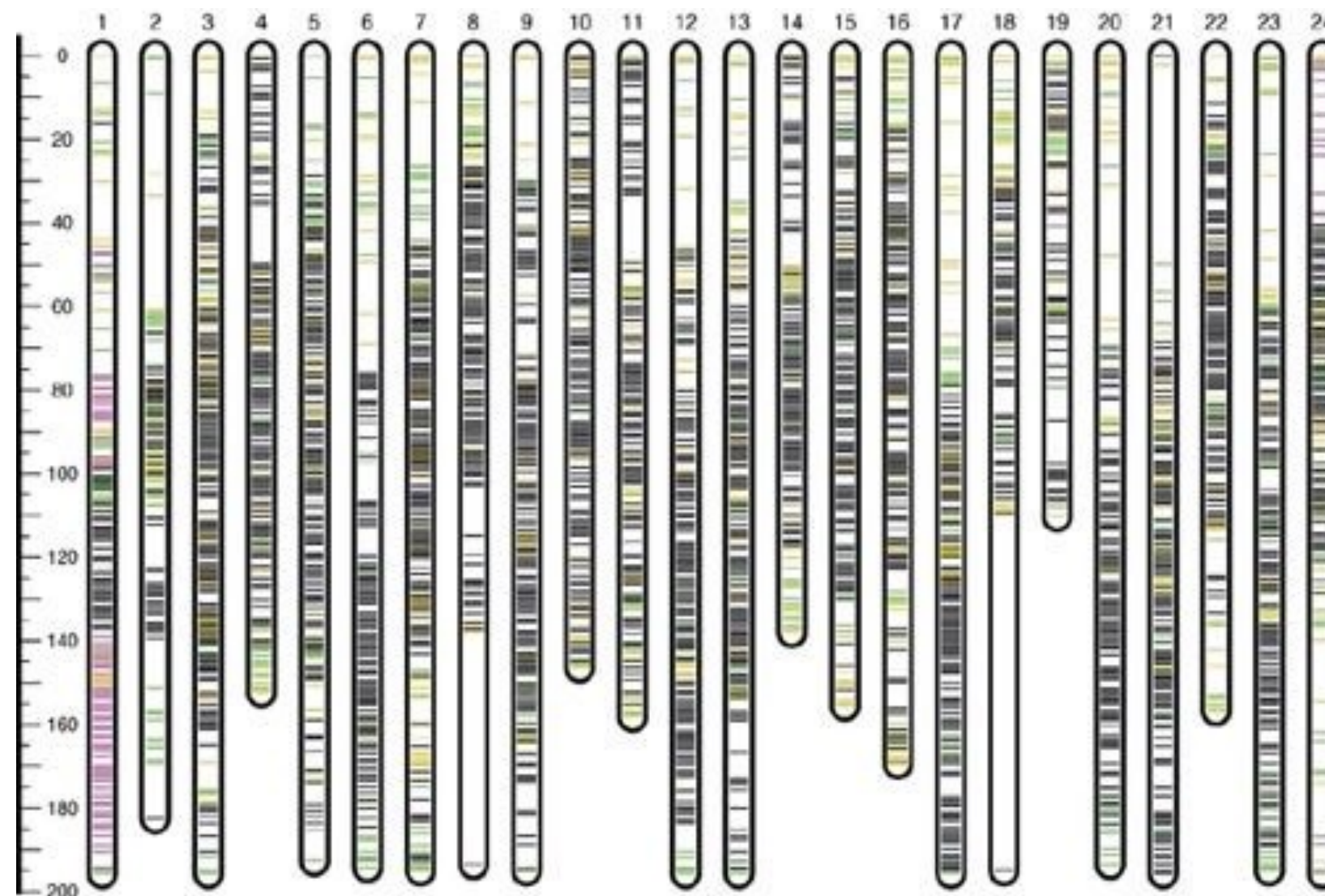
Seehausen et al. 2014, Nat. Gen. Rev.

Sequencing methods for population genomics



For the course, we will analyze genomic data obtained with **RAD-seq**, as it provides:

- a manageable amount of data for quick analyses (short compute runs)
- genotype of thousands of loci for many individuals at a reasonable cost
- power to address diversity of research questions (need fine-tuning)
- **data analysis skills** easily **transferable** to other genomic data types (**WGS**, targeted sequencing)



Example of potential
genomic coverage of
RADseq (fined-tuned)

Akopyan et al. 2022. Molecular Ecology

Pros of RADseq

- It **doesn't require extensive genomic resources**: no need of a high-quality reference genome (though it helps)
- It is **customizable**: through choice of restriction enzyme and sequencing volumes you can fine-tune coverage of the genome and depth of sequencing
- It samples random loci across the genome, both **putative neutral and adaptive loci**

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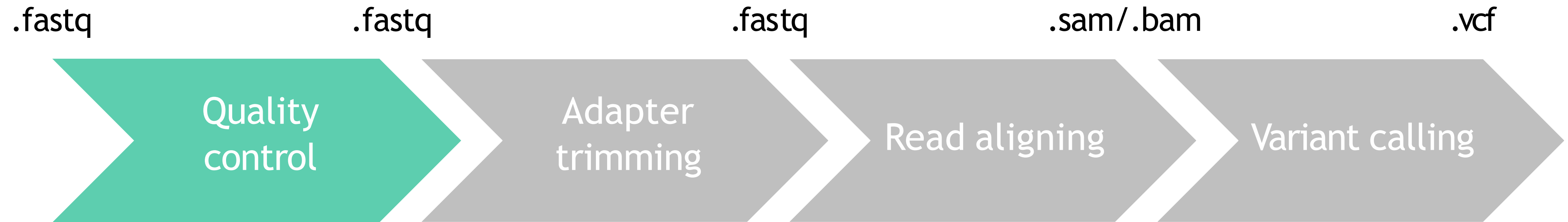
Cons of RAD-seq

- Because coverage of the genome is not full, there is a **risk of missing locus of interest**
- It's **hard to investigate the genomic architecture** of adaptive traits
- We have **limited** information for the **characterization of structural variants** that could be involved in adaptation (i.e. genomic basis or recombination suppressant)

Bioinformatic pipeline



Bioinformatic pipeline

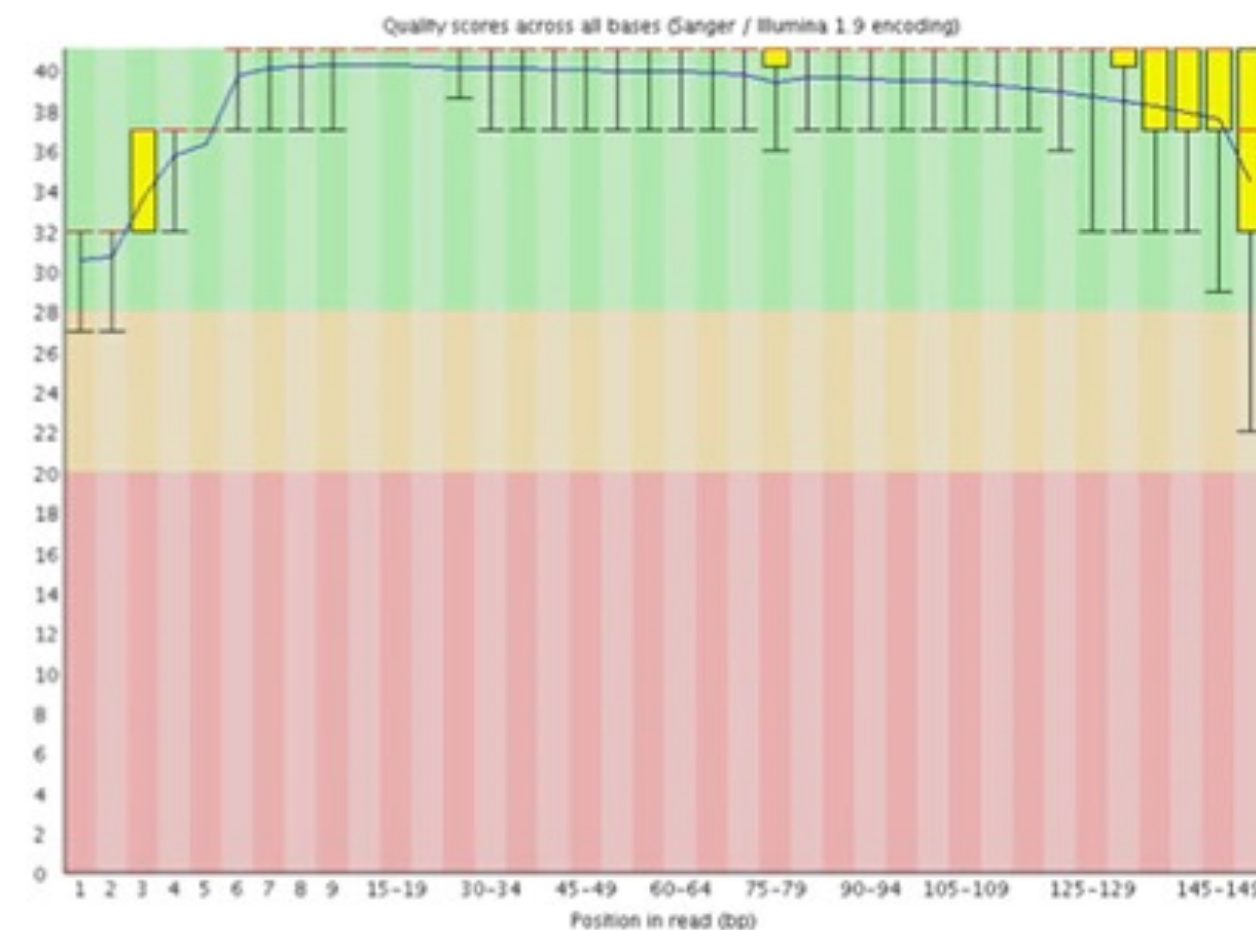


FastQC

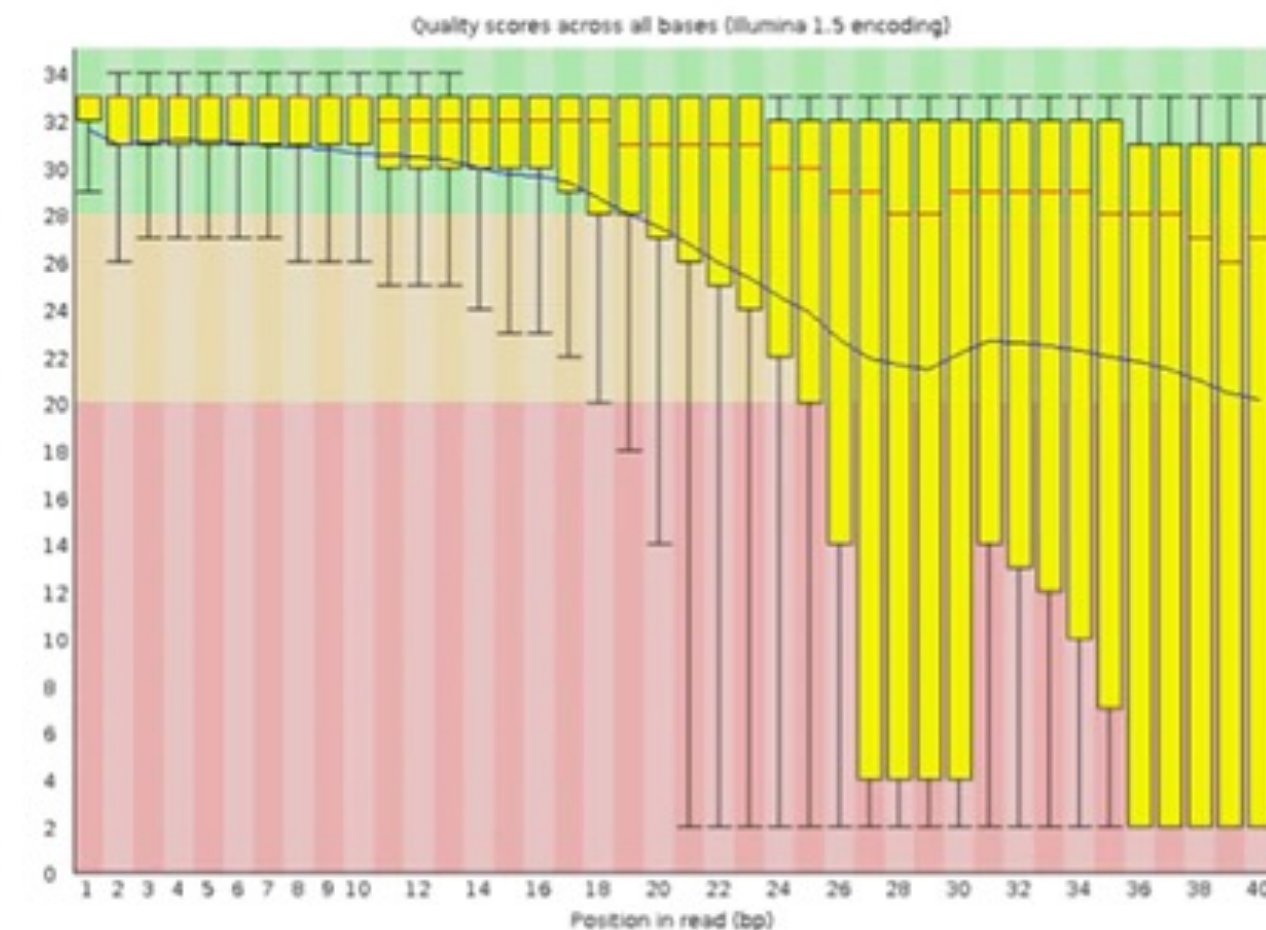


FastQC: Per base sequence quality

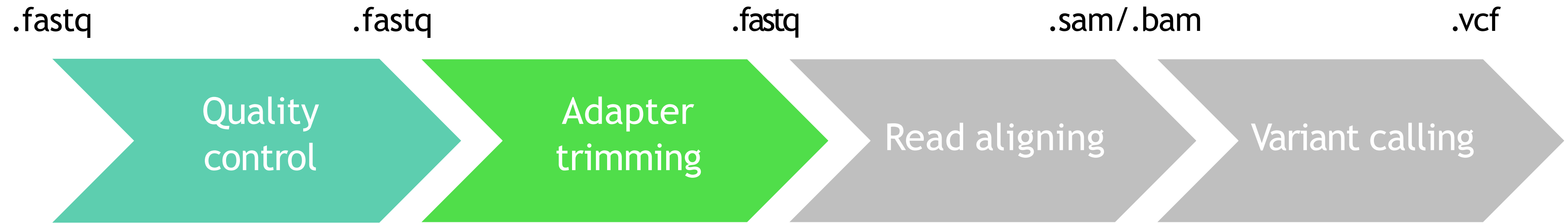
Good data



Bad data

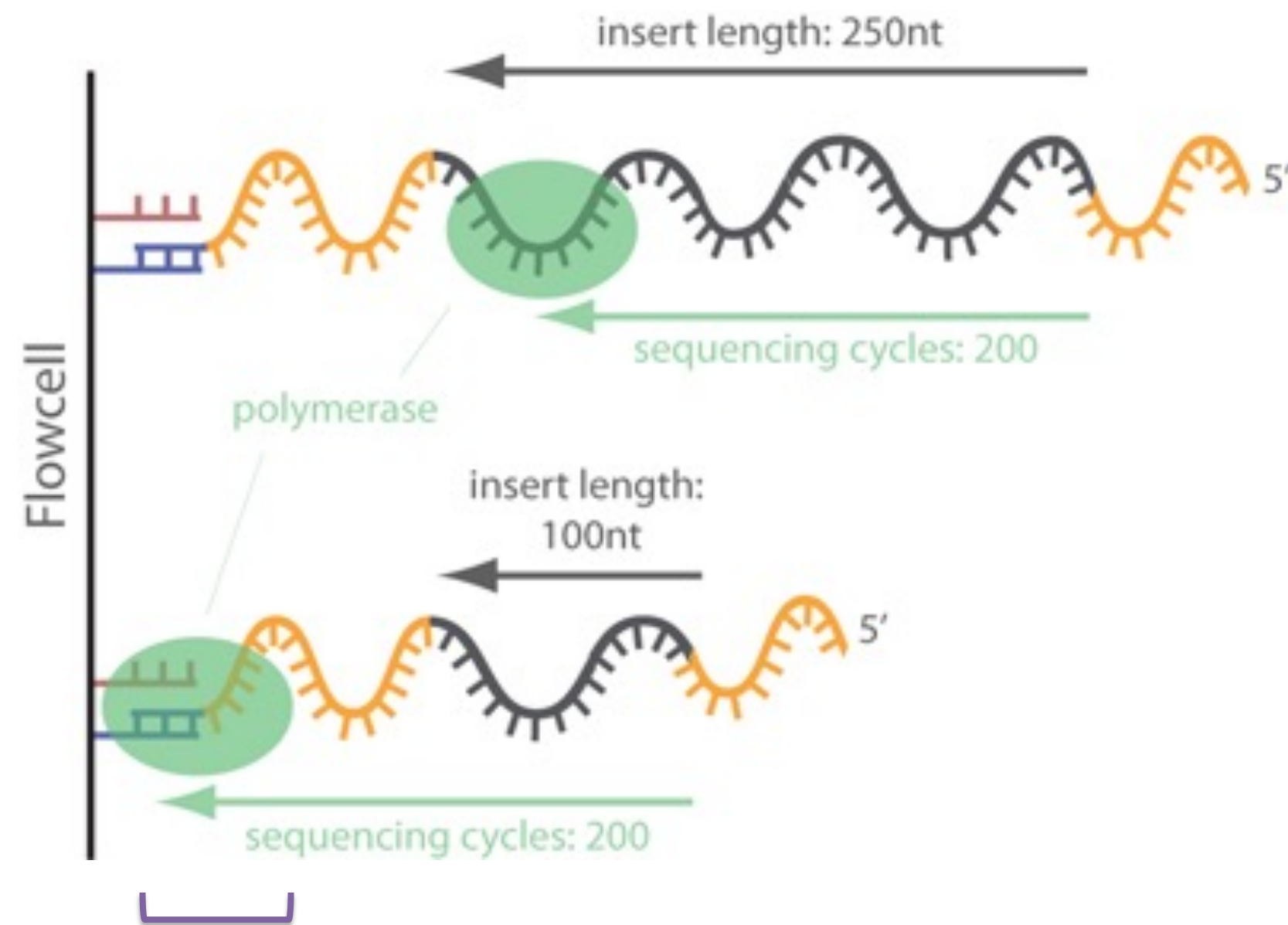


Bioinformatic pipeline

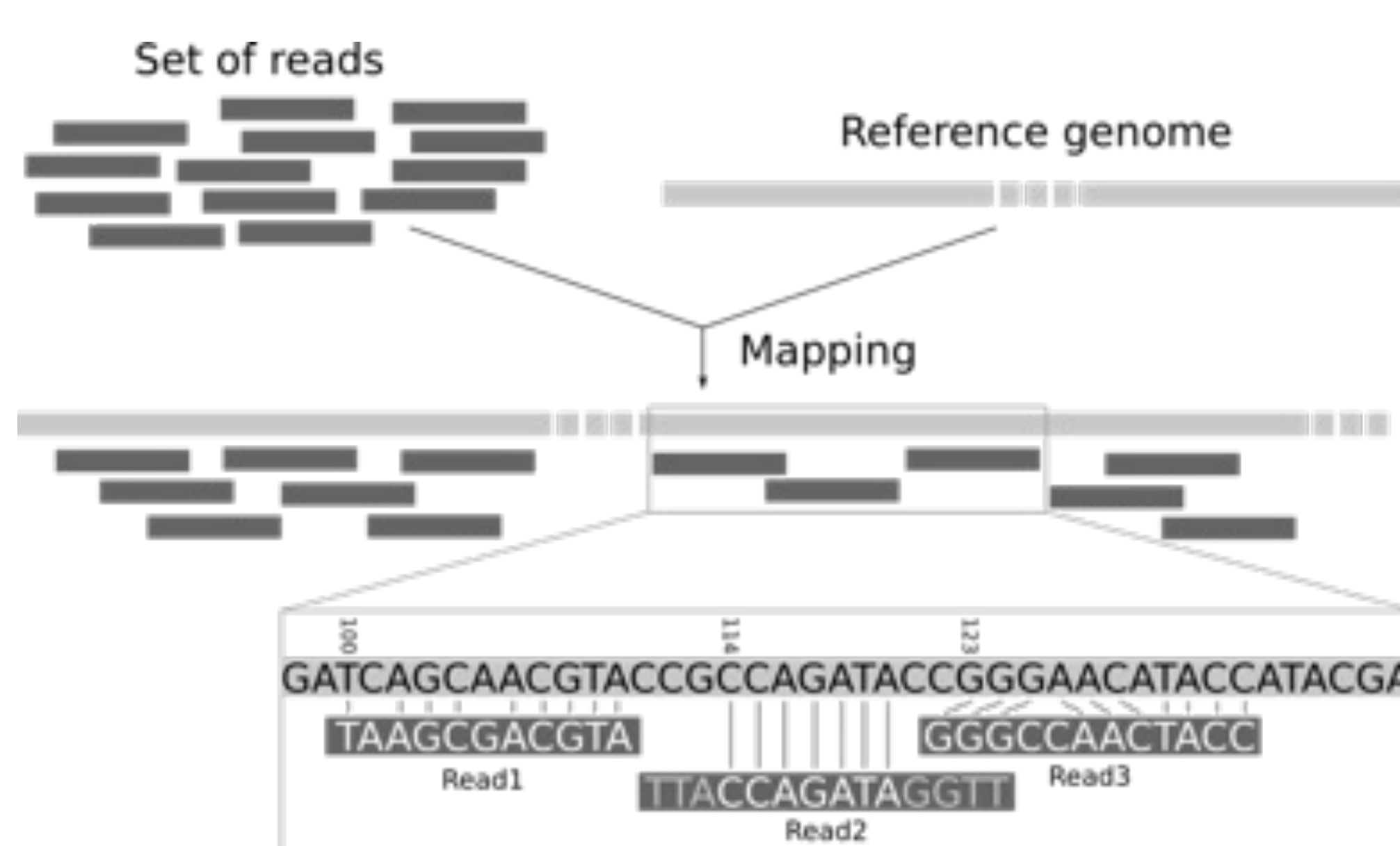
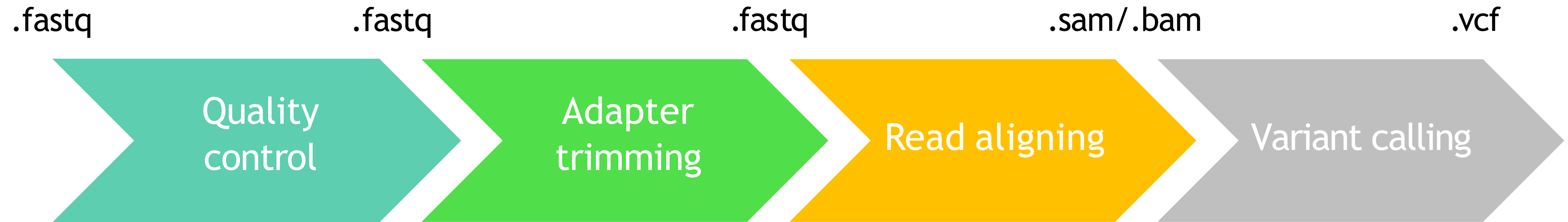


FastQC

Trimmomatic
Cutadapt
Fastp

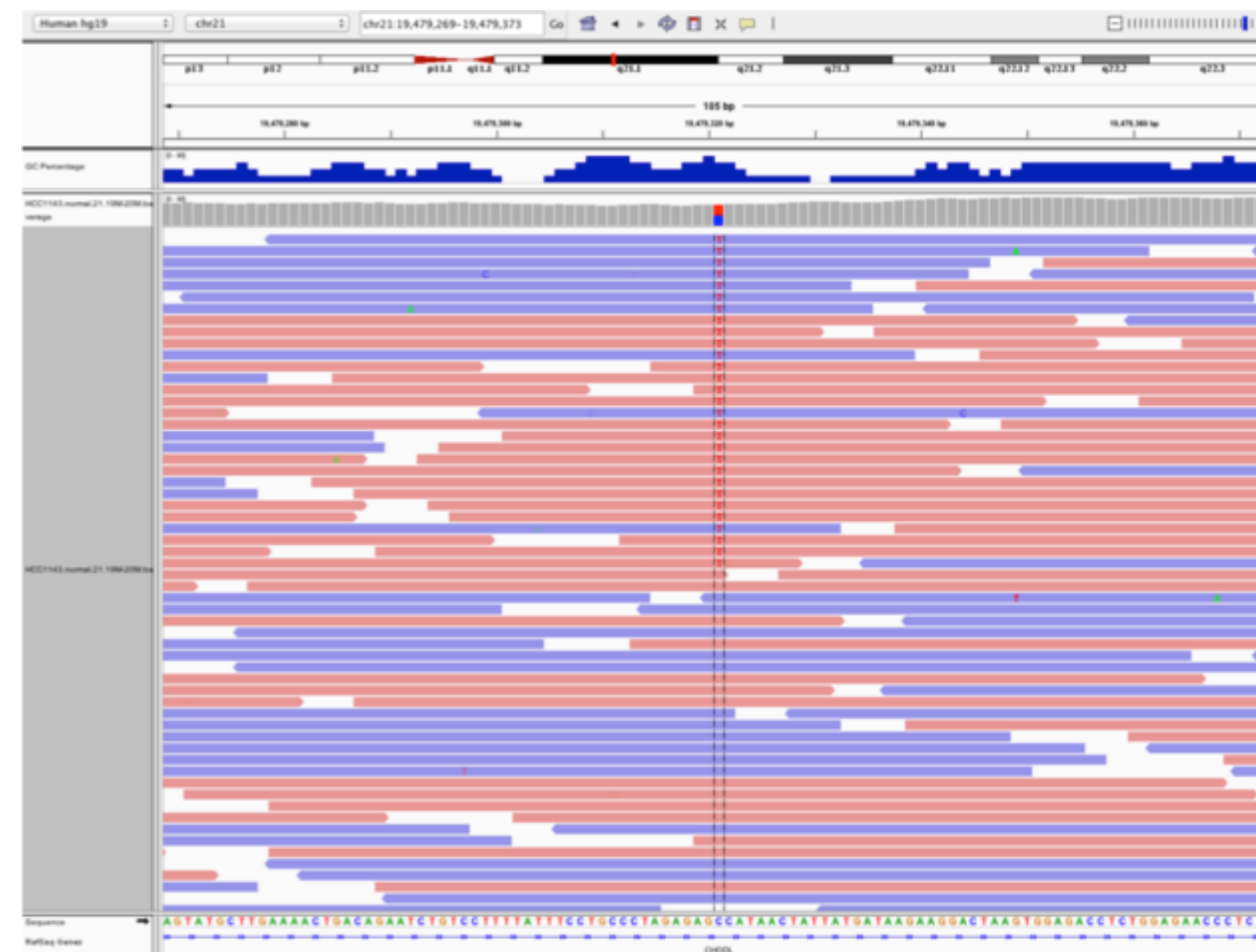
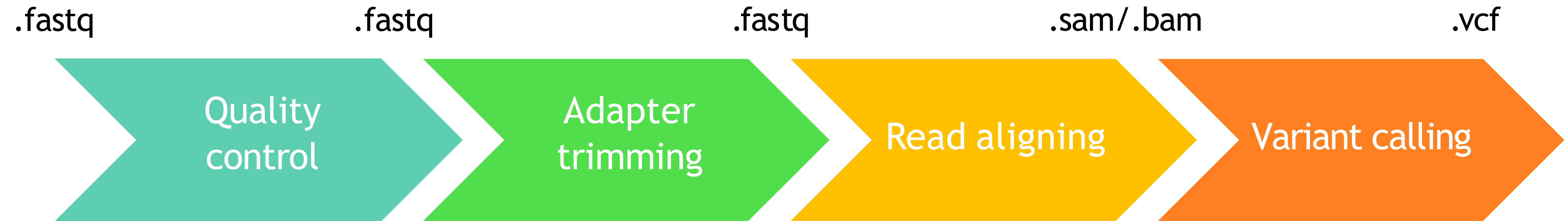


Bioinformatic pipeline



Bowtie2
BWA

Bioinformatic pipeline



IGV screenshot of a SNP

Stacks
ANGSD
GATK
SAMtools
bcftools
...

The VCF file

Header – commands + contigs/chromosomes

```
##fileformat=VCFv4.2
##FILTER=<ID=PASS,Description="All filters passed">
##bcftoolsVersion=1.11+htslib-1.11
##bcftoolsCommand=mpileup -Ou -f reference/onerka_chr.fa -b sample_lists/bams_allmgi.txt -q 5 -Q 30 -r NC_042535.1:1-10000000 -I -a AD,DP,SP,ADF,ADR -d 200
##reference=file://reference/onerka_chr.fa
##contig=<ID=NC_042535.1,length=41065921>
##contig=<ID=NC_042536.1,length=61175412>
##contig=<ID=NC_042537.1,length=59001101>
```

Header – info

```
##ALT=<ID=*,Description="Represents allele(s) other than observed.">
##INFO=<ID=INDEL,Number=0,Type=Flag,Description="Indicates that the variant is an INDEL.">
##INFO=<ID=IDV,Number=1,Type=Integer,Description="Maximum number of raw reads supporting an indel">
##INFO=<ID=IMF,Number=1,Type=Float,Description="Maximum fraction of raw reads supporting an indel">
##INFO=<ID=DP,Number=1,Type=Integer,Description="Raw read depth">
```

Header – columns names

#CHROM	POS	ID	REF	ALT	QUAL	FILTER	INFO	FORMAT	goodbam/ALOL_DP_0187.bam	goodbam/ALOL_DP_2757.bam	goodbam/ALOL_DP_2780.bam
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Variant information

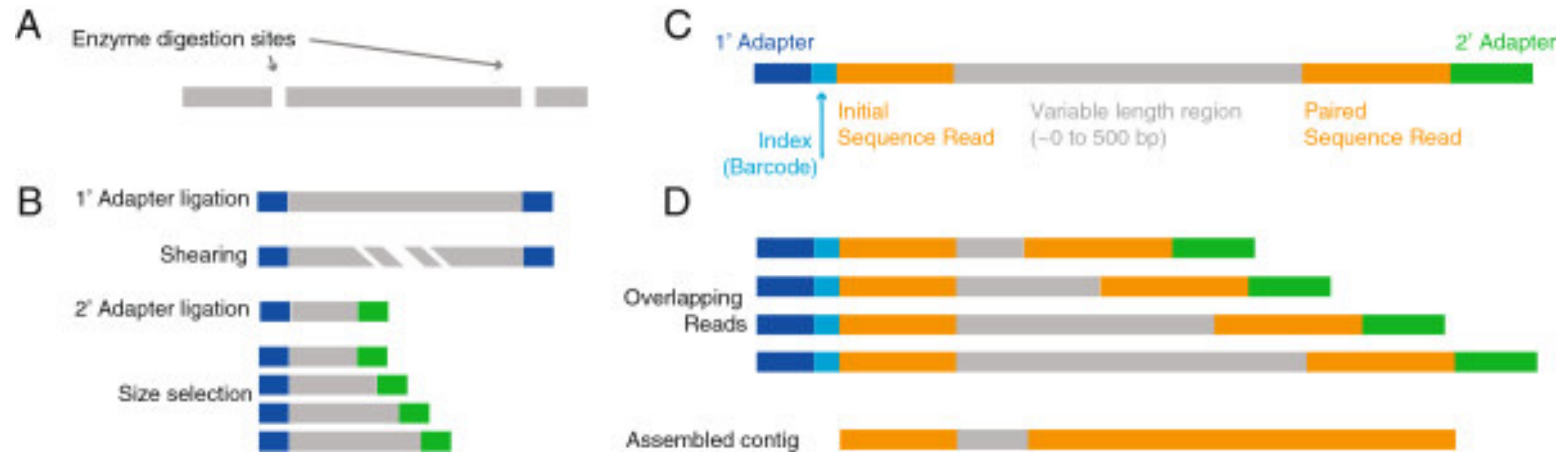
NC_042535.1	801	.	G	A	988	PASS	AN=976;AC=39	GT:PL:DP:SP:ADF:ADR:AD	0/0:0,27,239:9:0:2,0:7,0:9,0	0/0:0,45,255:15:0:7,0:8,0:15,0	0/0:0,36,255:12:0:5,0:7,0:12,0
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Library preparation and sequencing

Knowing the technical aspects of library preparation and sequencing is important to properly handle and analyze the data and identify potential biases/problems

- **Type of library preparation:** method, enzymes used, insert size, input DNA quantity and quality, etc...
- **Sequencing:** technology, platform, read length, single vs. paired-end, depth, etc...

RADseq pipeline



Or double digestion

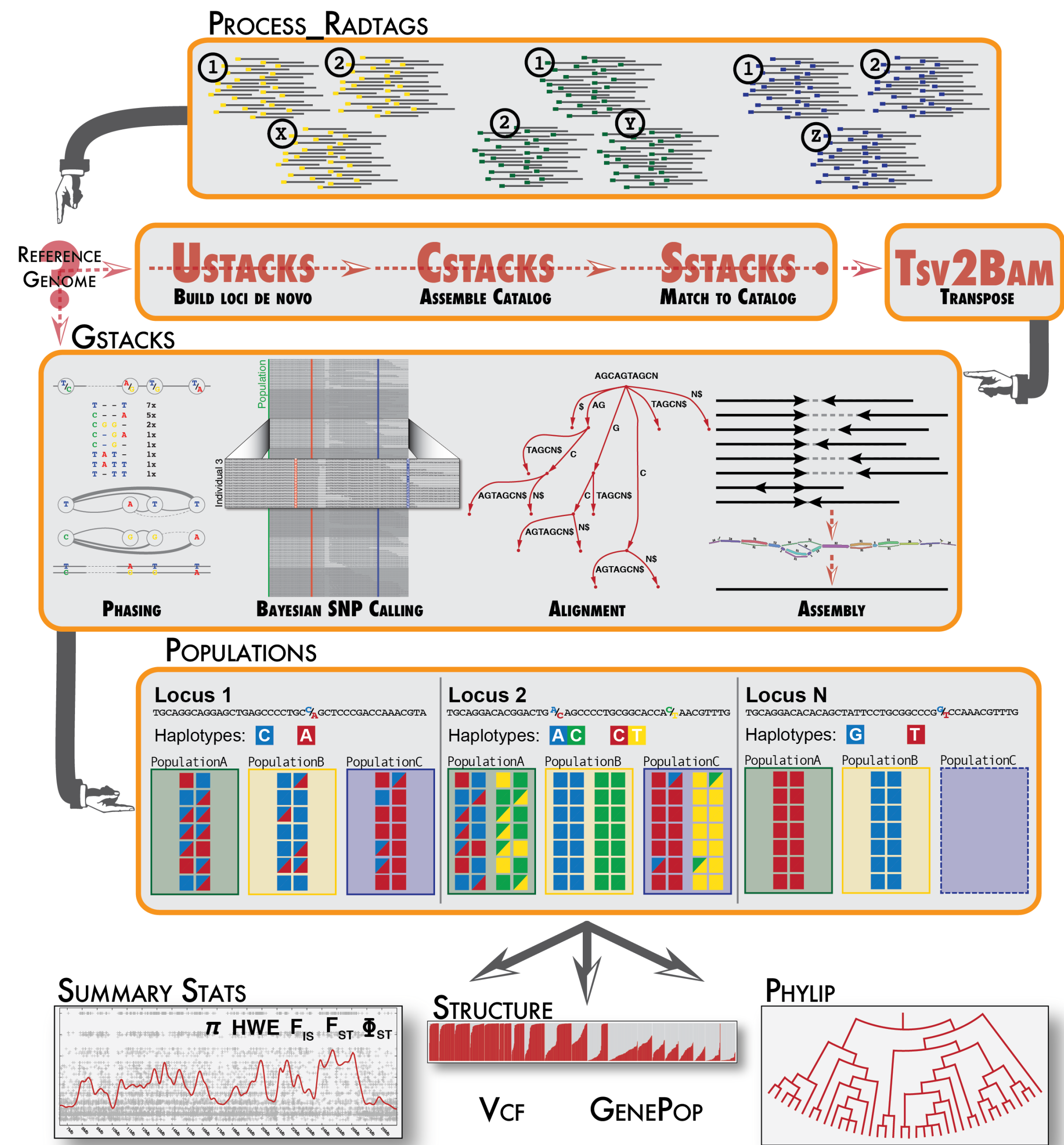
RADseq pipelines

- Stacks (Catchen et al. 2013, Molecular Ecology)
- dDocent (Puritz et al. 2014, PeerJ)
- PyRAD (Eaton 2014, Bioinformatics)
- AftRAD (Sovic et al. 2015, Molecular Ecology Resources)
- ANGSD (Korneliussen et al. 2014)
- GATK (McKenna et al. 2010, Genome Research)

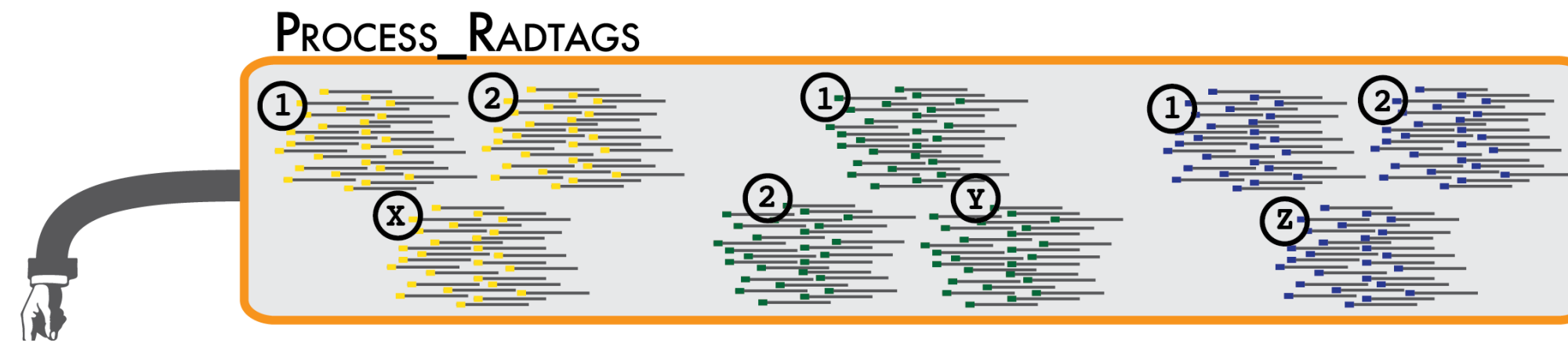
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Stacks



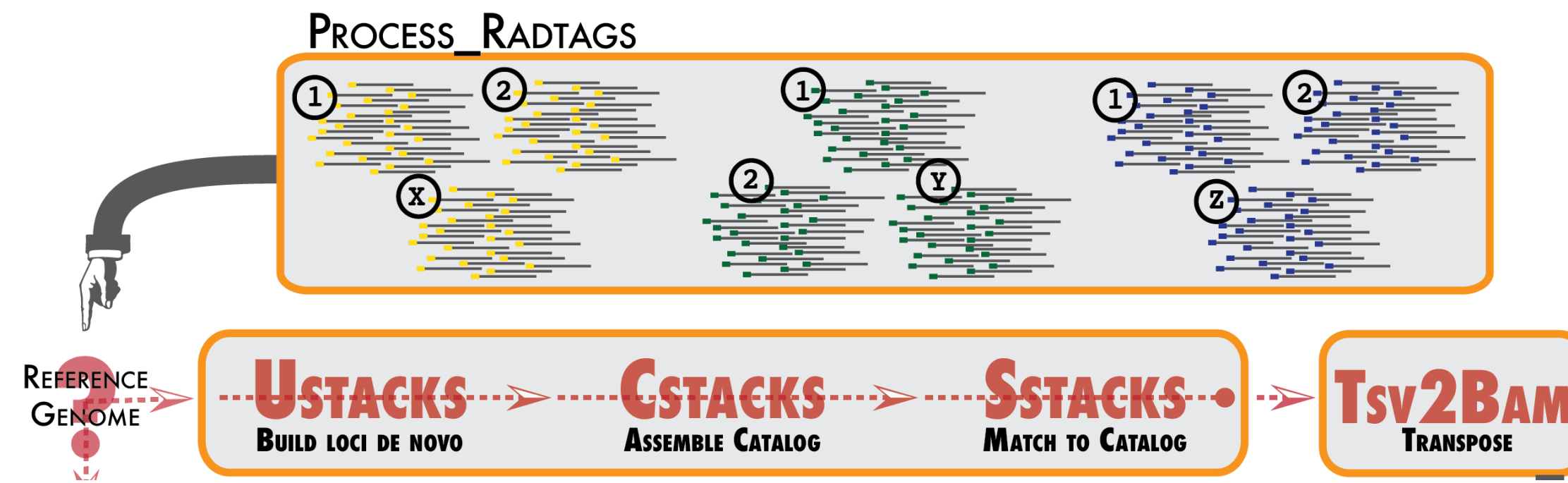
Stacks



To preprocess raw data

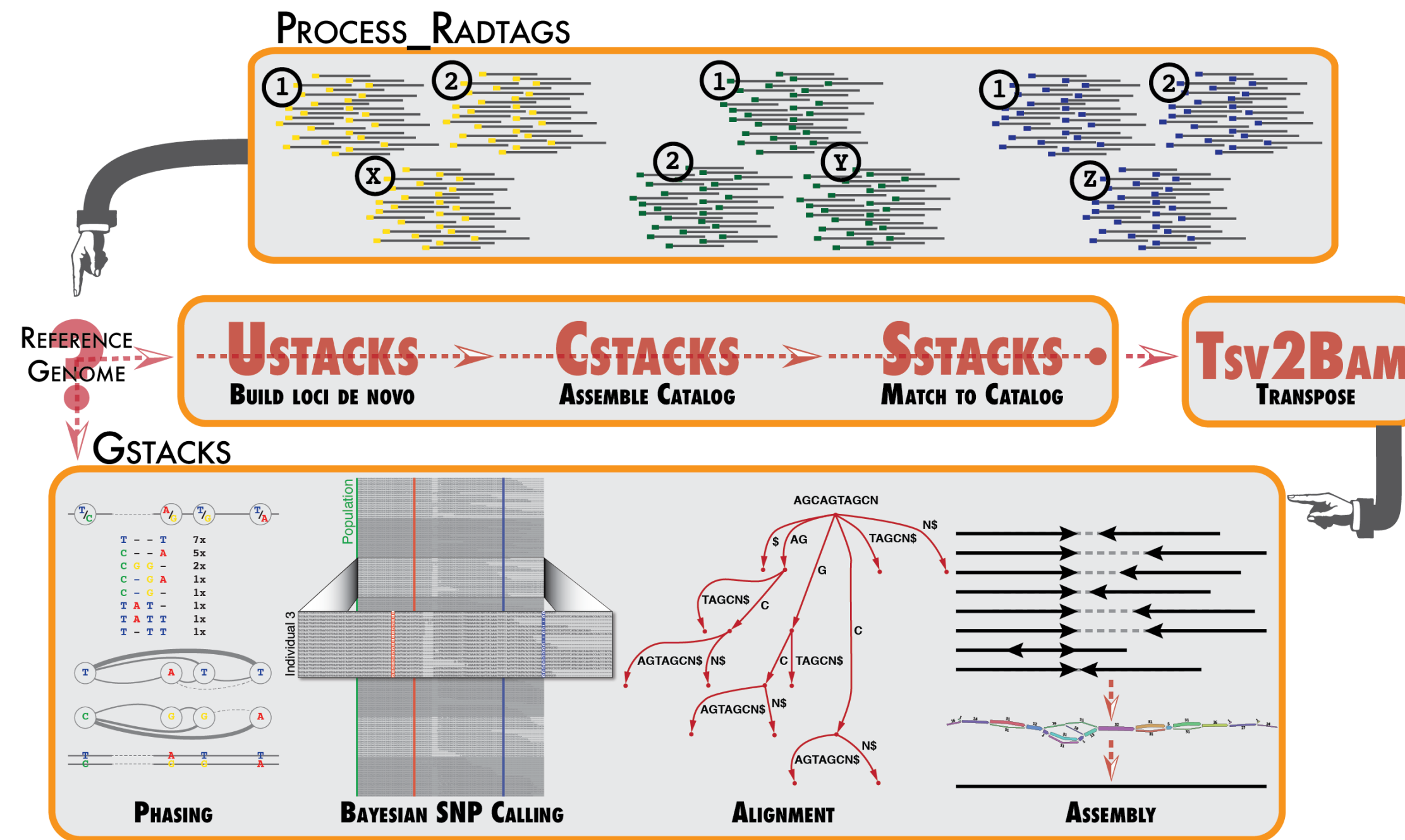
- Demultiplexing
- Adapter removal
- Quality filtering

Stacks



Loci assembly without reference genome

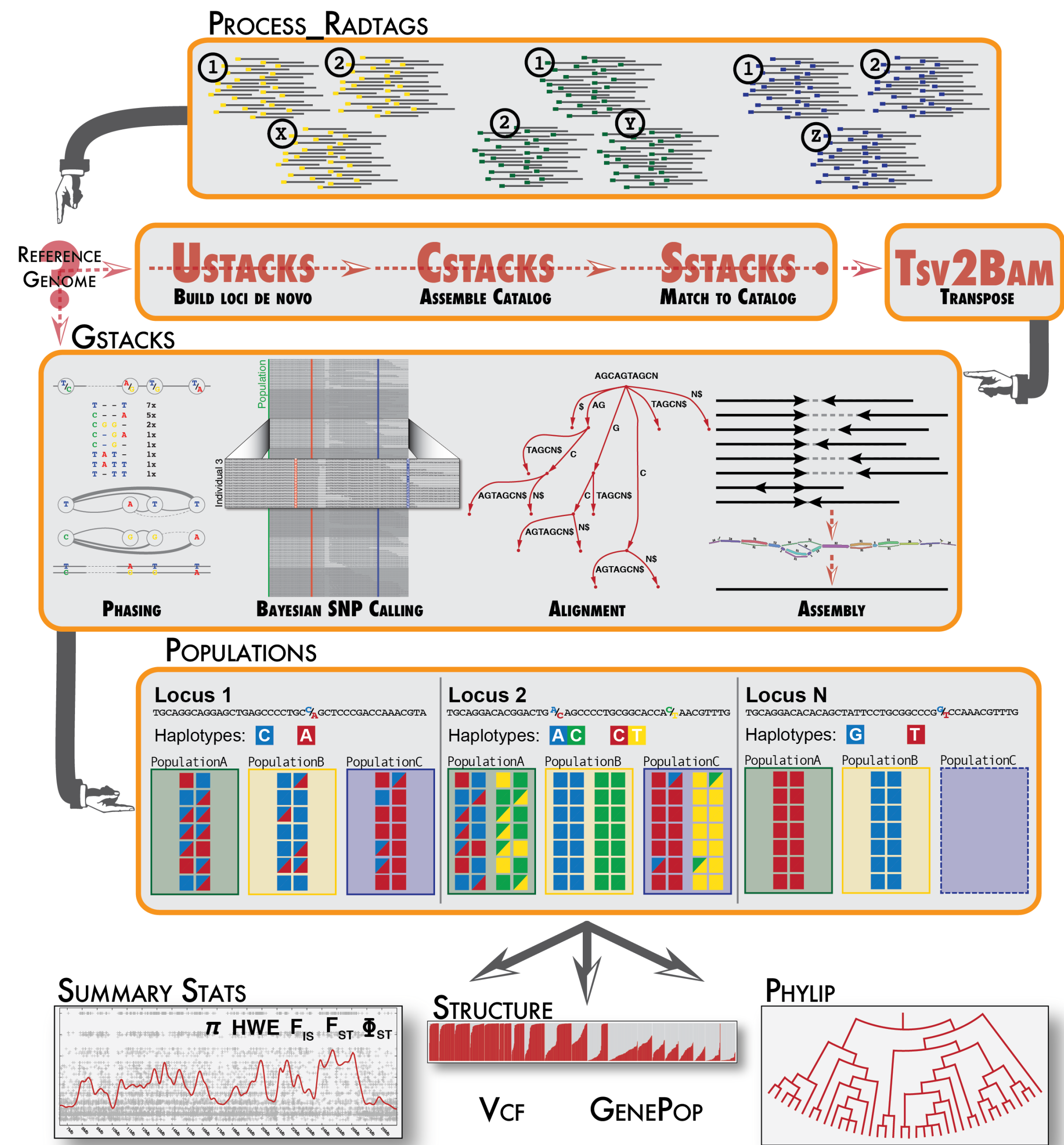
Stacks



If you have a reference genome, align RADseq data with external software

GSTACKS does different things according to data input but at the end it calls variants from assembled loci

Stacks



Variant calling from whole genome data

Most commonly used software for variant calling

Low coverage whole genome data ($\leq 5X$)

- Genotype likelihoods
- ANGSD (genotype uncertainty)

Moderate to high coverage data ($> 5X$)

- Genotype quality
- bcftools mpileup
- GATK

Variant calling from whole genome data

Most commonly used software for variant calling

Low coverage whole genome data ($\leq 5X$)

- Genotype likelihoods
- ANGSD (genotype uncertainty)

Moderate to high coverage data ($> 5X$)

- Genotype quality
- `bcftools mpileup` -> we will use in the tutorial
- GATK