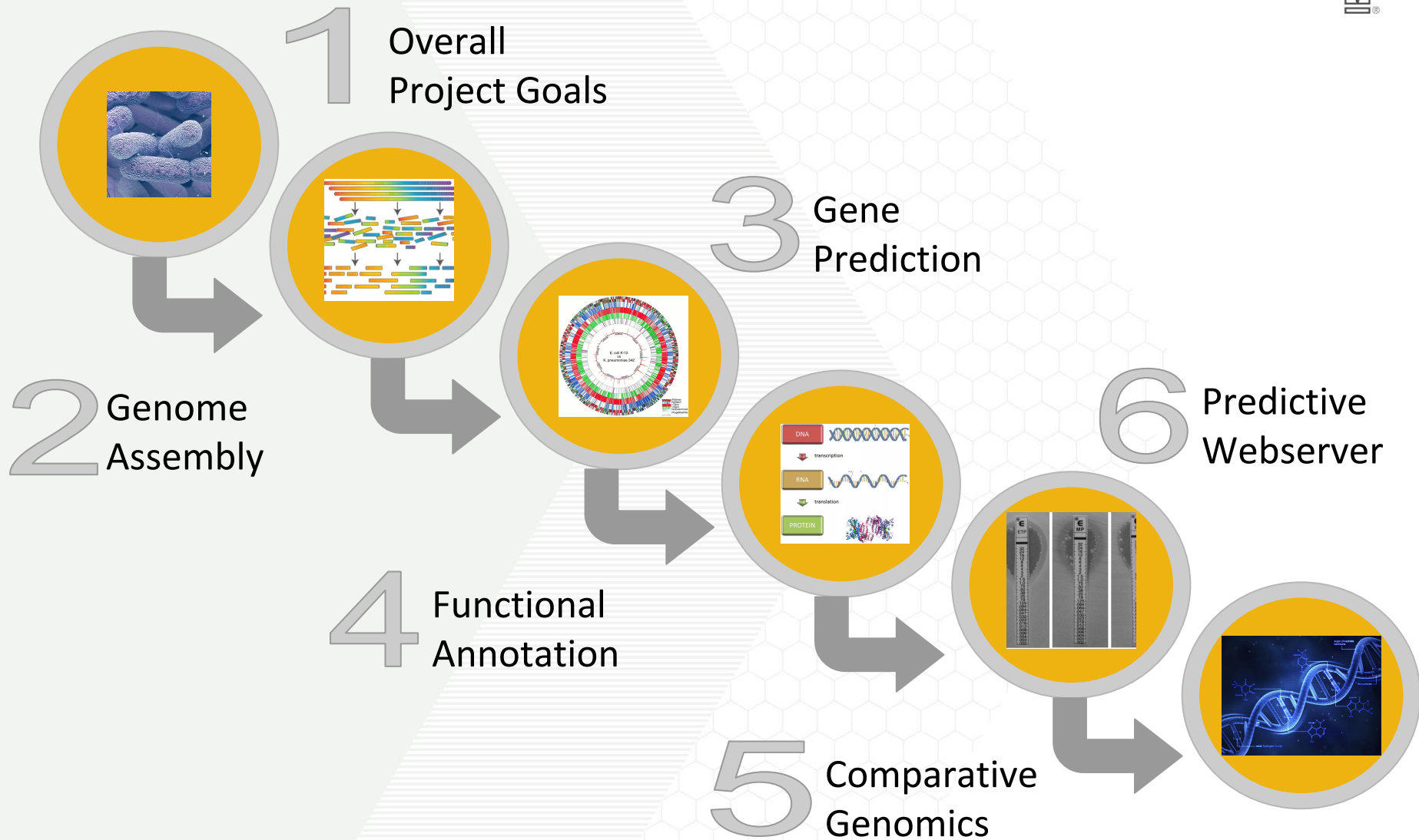


# Team 1 Final Presentation

Assembly, Gene Prediction, Functional  
Annotation, Comparative Genomics,  
Predictive Webserver

**CREATING THE NEXT®**

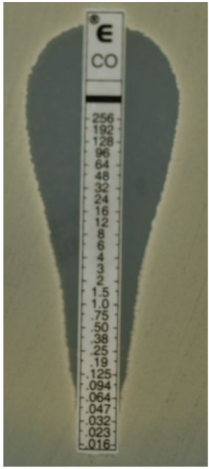
# Outline



# Outline



# Overall Project Goals



Susceptible



Resistant

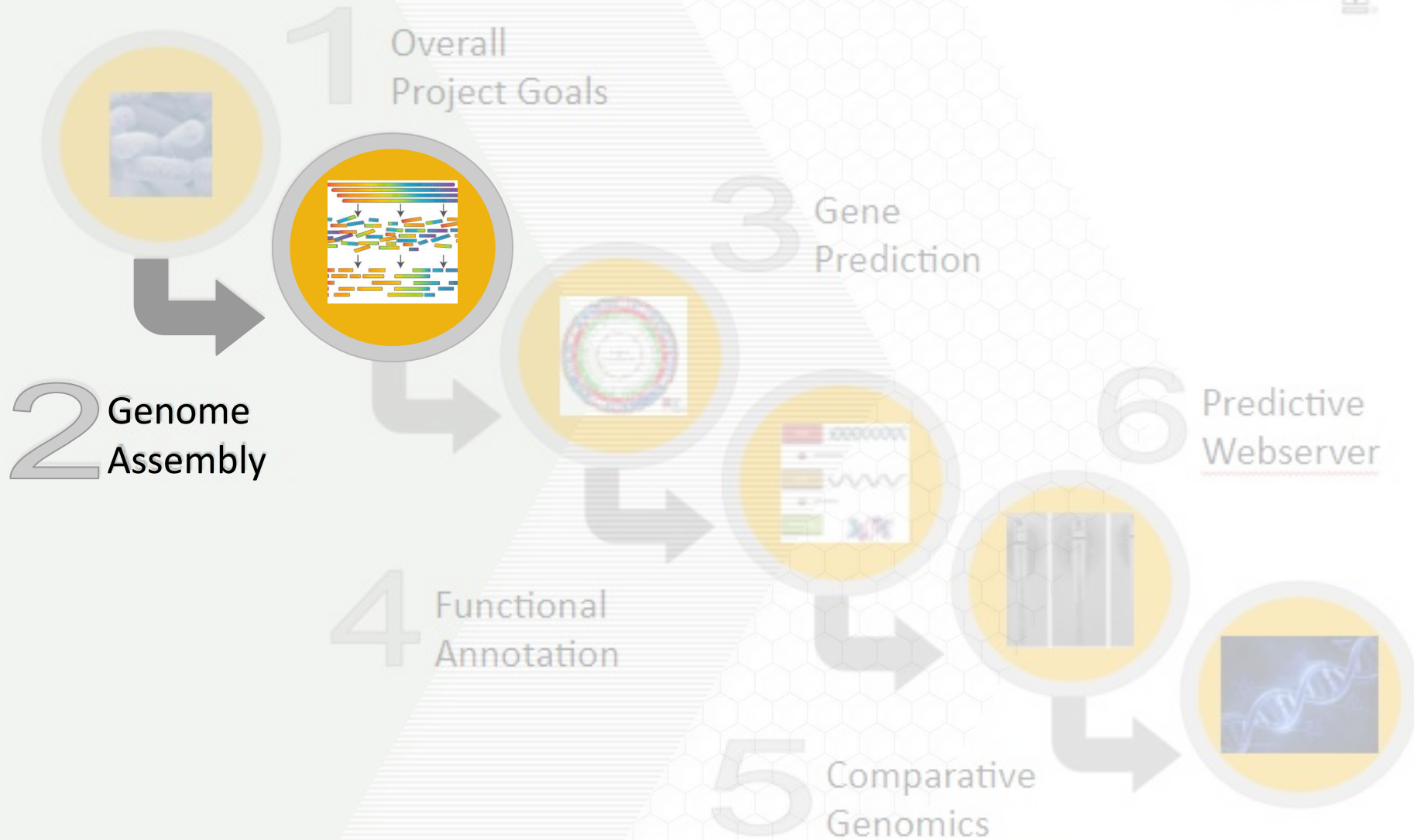


Heteroresistant





# Outline

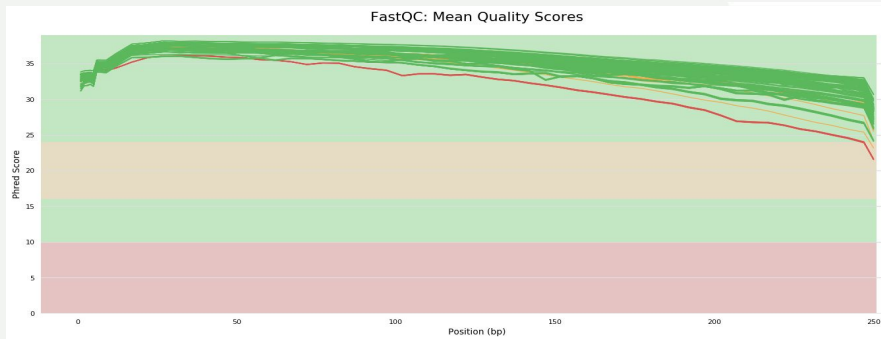


# Genome Assembly

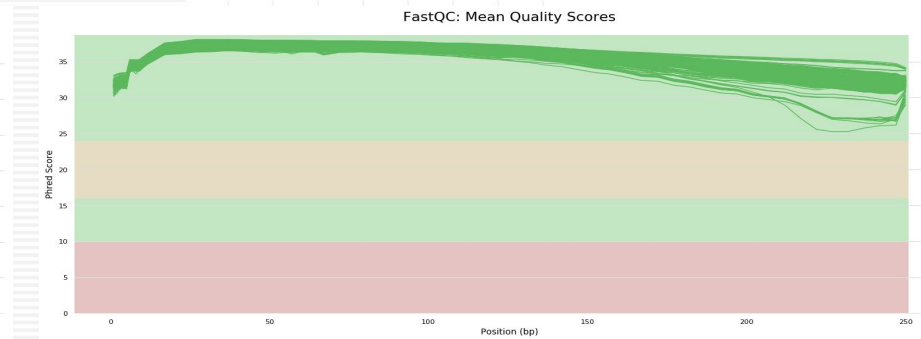
## Assembly Pipeline



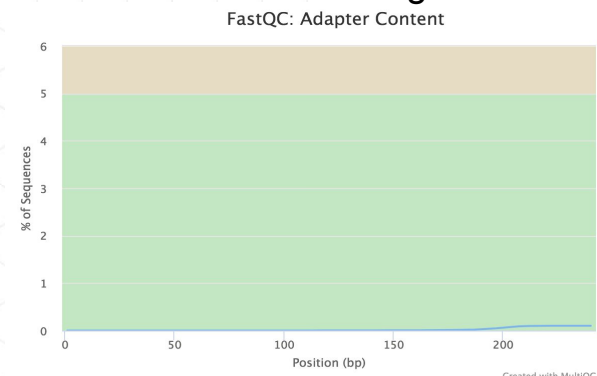
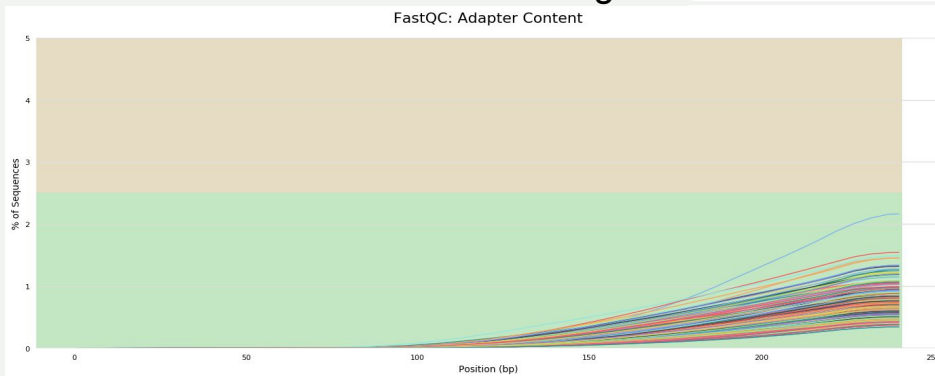
## Trimming



Before Trimming



After Trimming



Created with MultiQC

# De Novo Assembly

## SKESA -

- The binary for Skesa was provided by CDC
- It is an assembler that works based on DeBruijn graphs
- Creates breaks at repeat regions in genomes
- It works for haploid genome
- Multi-threaded application - so good for scaling

## Scaffolding -

- Scaffolding was performed using SSPACE
- Extends and scaffolds pre-assembled contigs

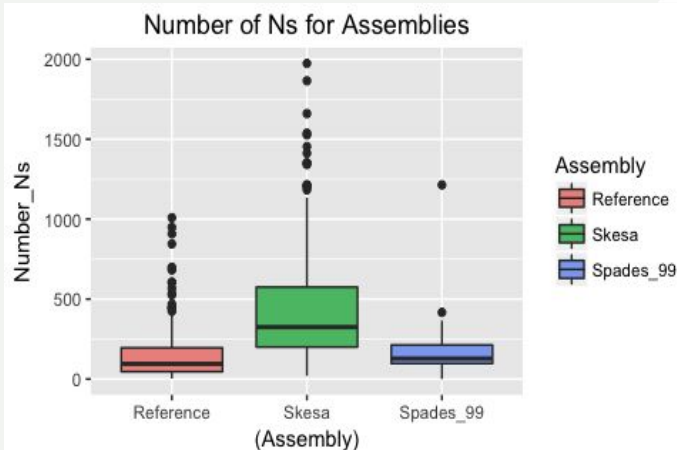
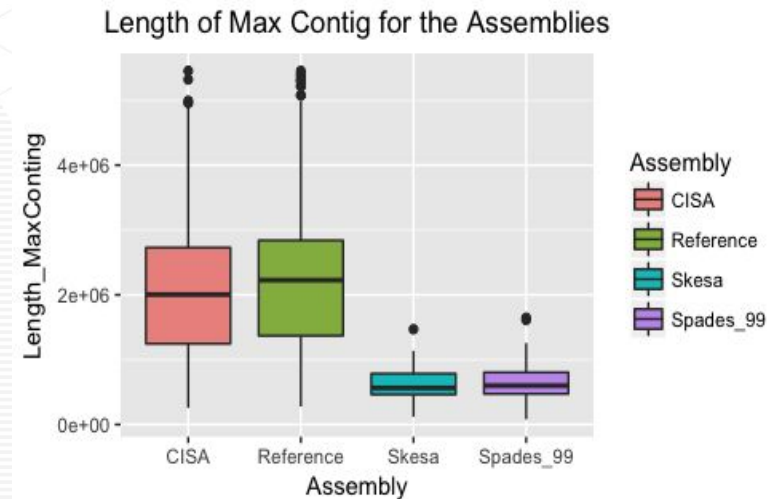
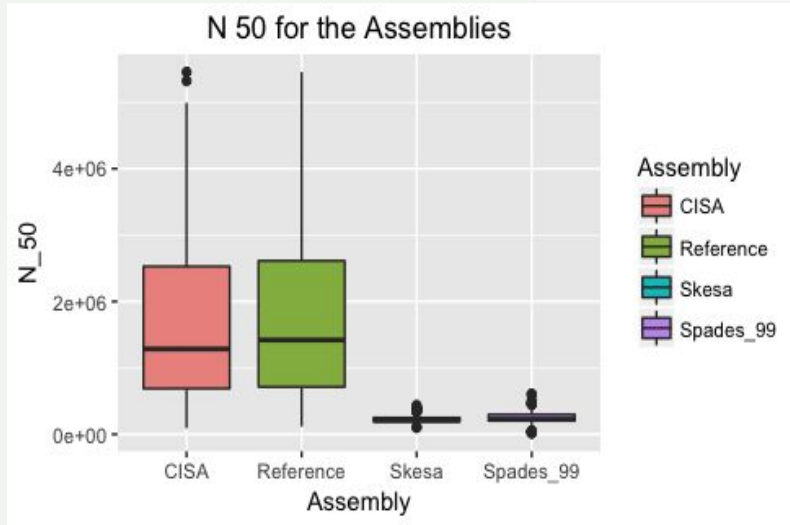


SSPACE basic  
FOR 100% BASECLEAR

The output contains final scaffolds in fasta format, scaffolds with initial numbered contigs, a log file and a summary file

# De Novo Assembly

## Quality of assemblies

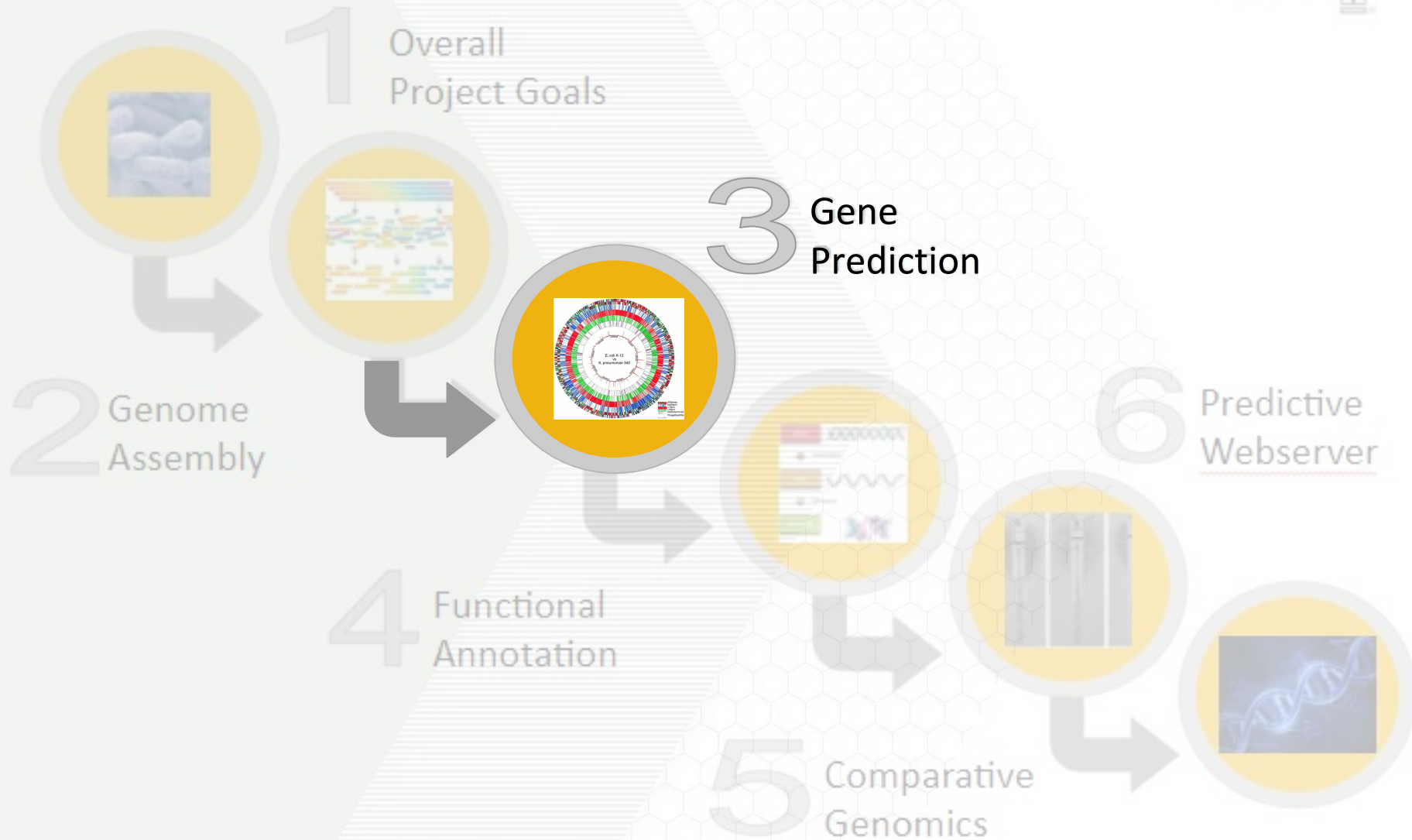


## Comparison between Spades and Skesa

| Parameters      | Average Spades | Average Skesa | P value     |
|-----------------|----------------|---------------|-------------|
| N50             | 250137         | 229259        | 0.19592     |
| # Contigs       | 212            | 123           | 1.55E-10*** |
| Largest Contigs | 645324         | 609123        | 0.063028    |
| Total Length    | 5588948        | 5601627       | 0.44905     |
| N's per 100kbp  | 2.781          | 11.456        | 0.000104*** |

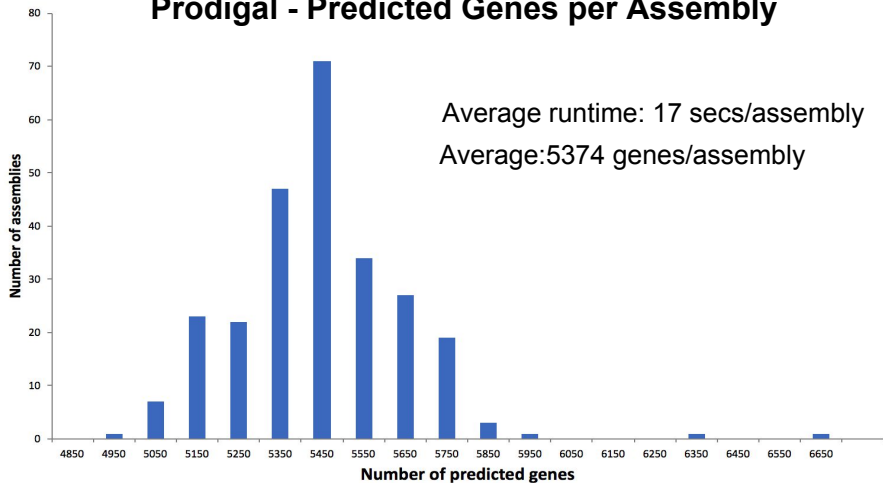


# Outline

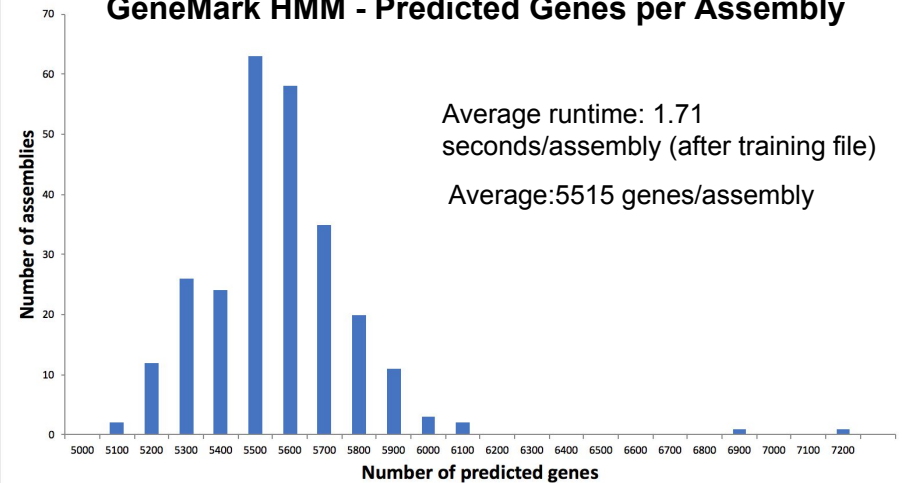


# Gene Prediction Methods

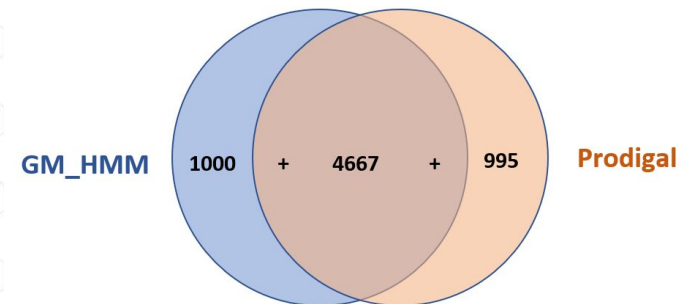
### Prodigal - Predicted Genes per Assembly



### GeneMark HMM - Predicted Genes per Assembly



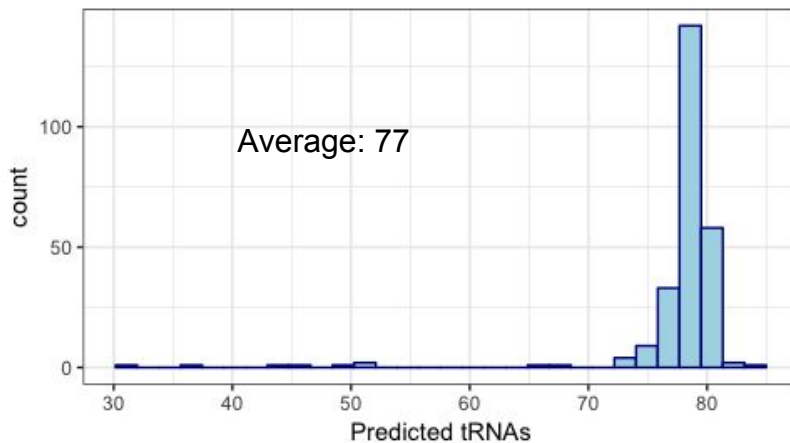
| Method       | True Positives | False Positives | False negatives | Sensitivity | PPV   |
|--------------|----------------|-----------------|-----------------|-------------|-------|
| Prodigal     | 5015.8         | 437.7           | 480.6           | 91.2        | 92.0  |
| GeneMark HMM | 5061.5         | 507.1           | 456.4           | 91.7        | 91.1  |
| Intersect    | 4383.4         | 323.6           | 1096.4          | 80.0        | 93.1  |
| Union        | 5693.9         | 618.5           | 423.1           | 93.1        | 90.25 |



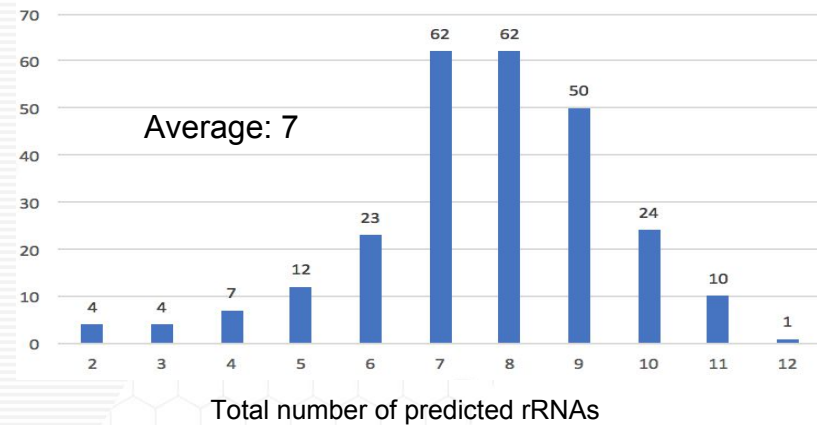
# Gene Prediction Methods

|             | Aragon           | RNAmmer        | Infernal         |
|-------------|------------------|----------------|------------------|
| Method      | Homology Base    | ab initio      | ab initio        |
| Run Time    | <10 sec/assembly | ~3min/assembly | <10 min/assembly |
| Type of RNA | tRNA             | rRna           | istR             |

Number of predicted tRNA by Aragon



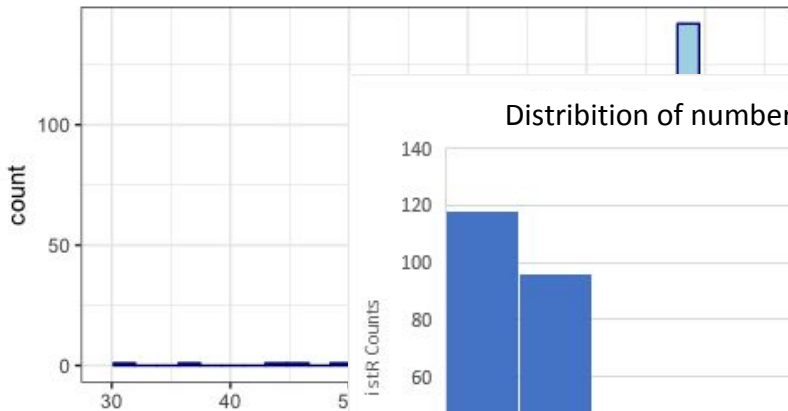
Number of predicted rRNA by RNAmmer



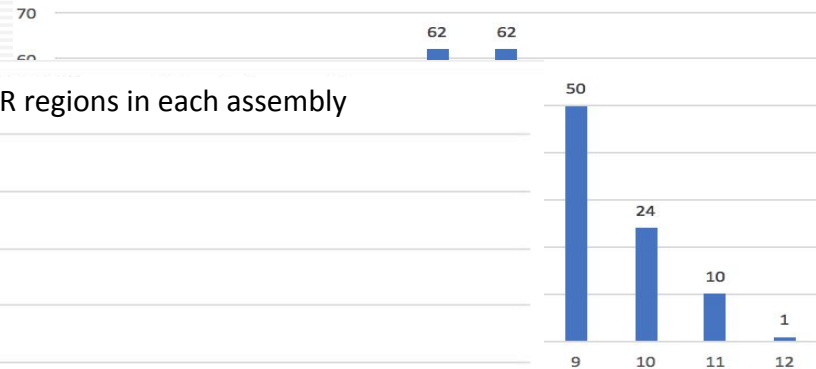
# Gene Prediction Methods

|             |                  |                |                  |
|-------------|------------------|----------------|------------------|
|             | Aragon           | RNAmmer        | Infernal         |
| Method      | Homology Base    | ab-initio      | ab-initio        |
| Run Time    | <10 sec/assembly | ~3min/assembly | <10 min/assembly |
| Type of RNA | tRNA             | rRna           | istR             |

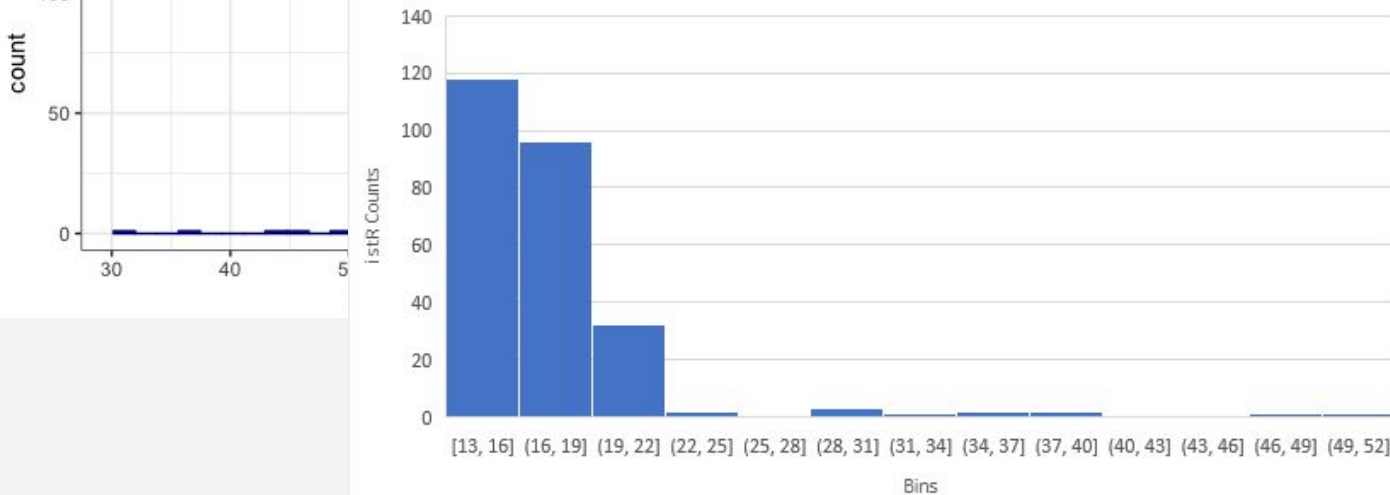
Number of predicted tRNA by Aragon



Number of predicted rRNA by RNAmmer



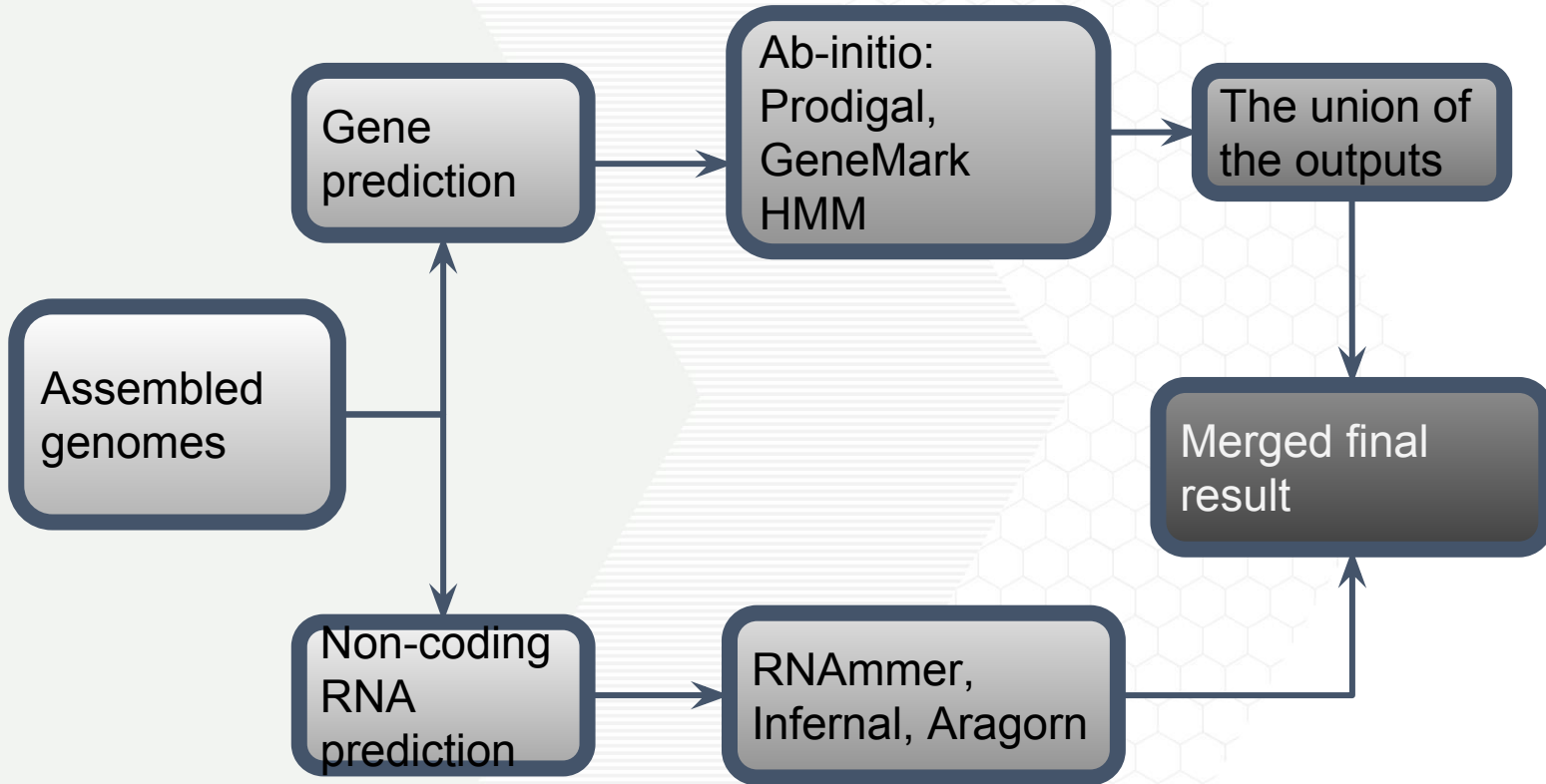
Distribution of number of istR regions in each assembly



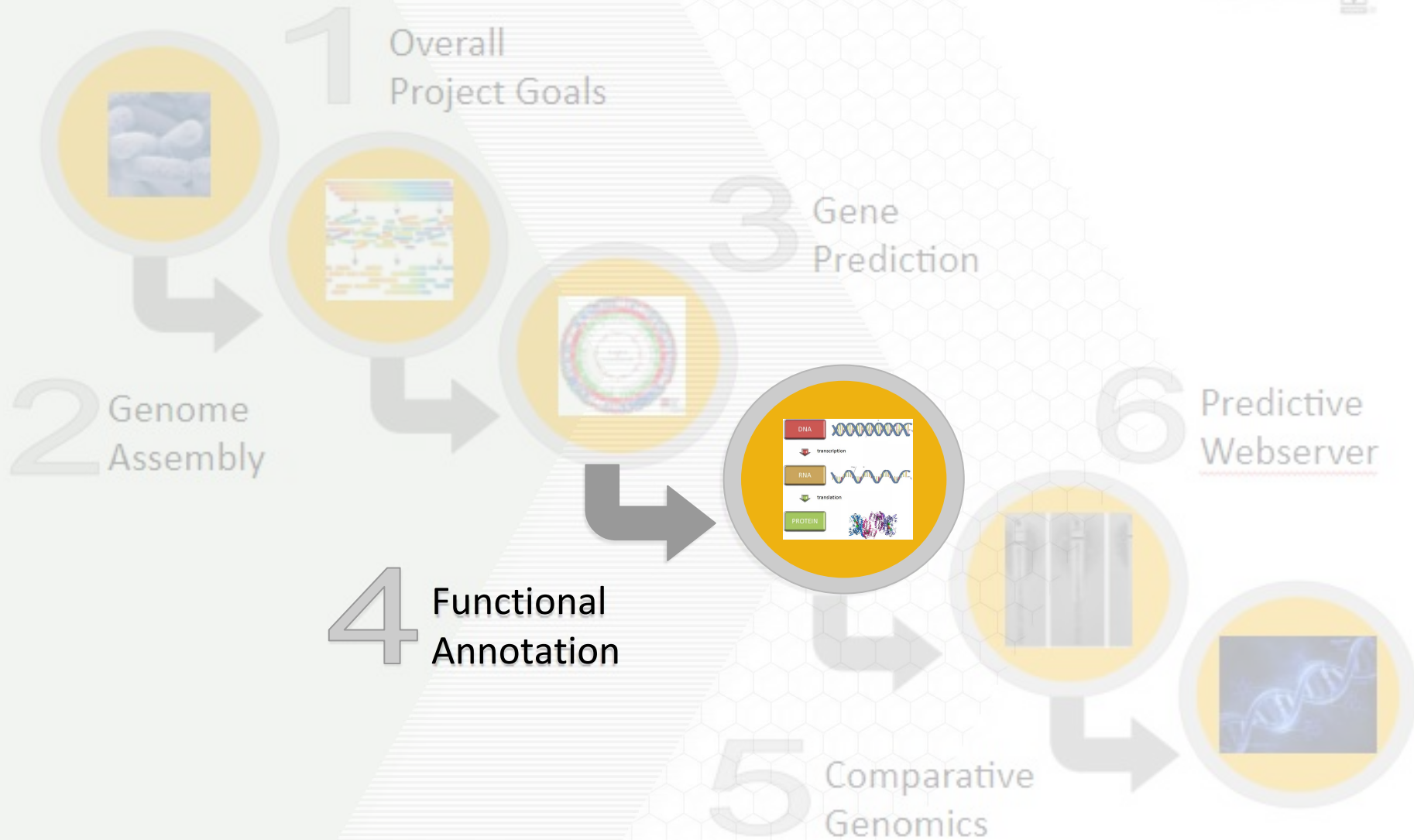
NAs



# Gene Prediction Final Pipeline

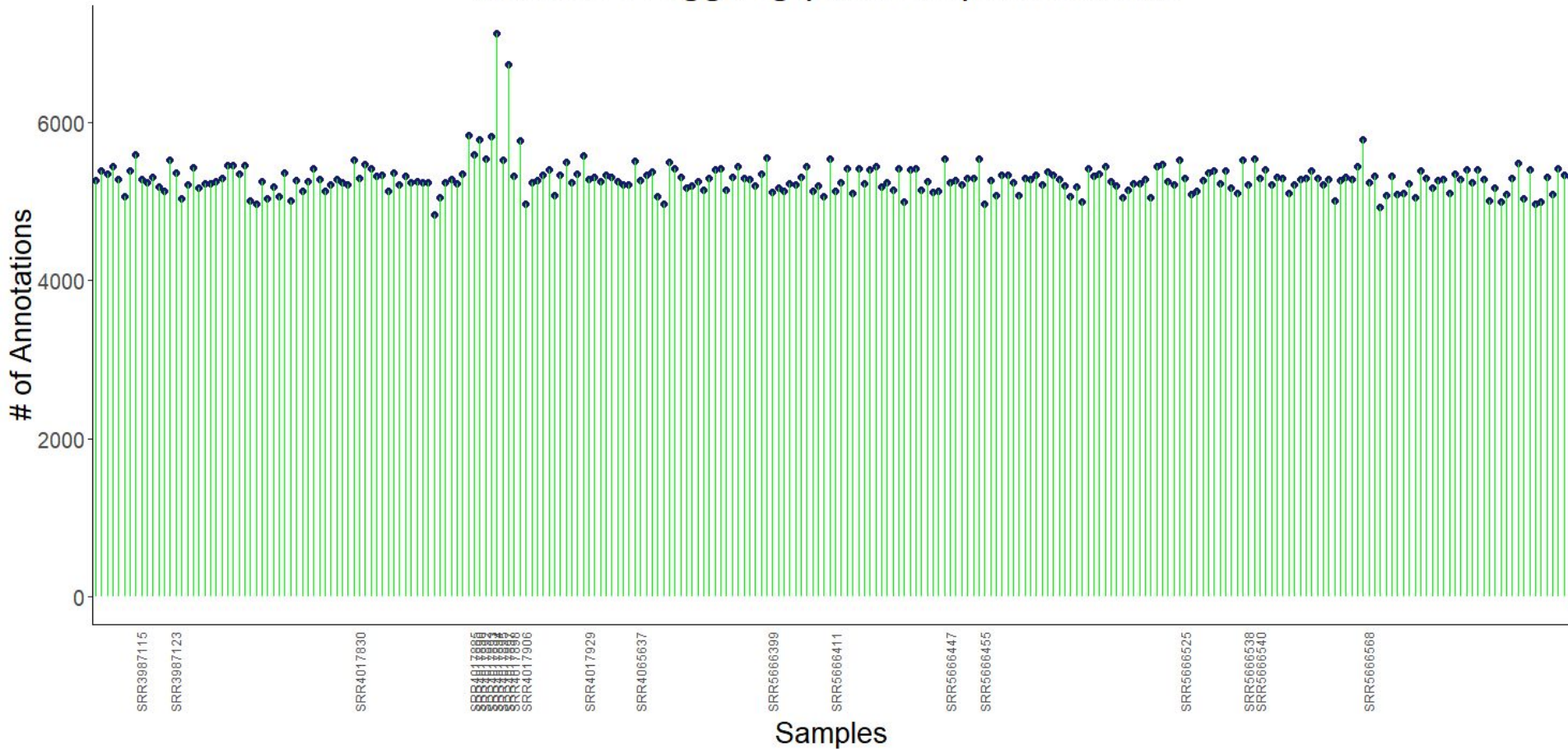


# Outline



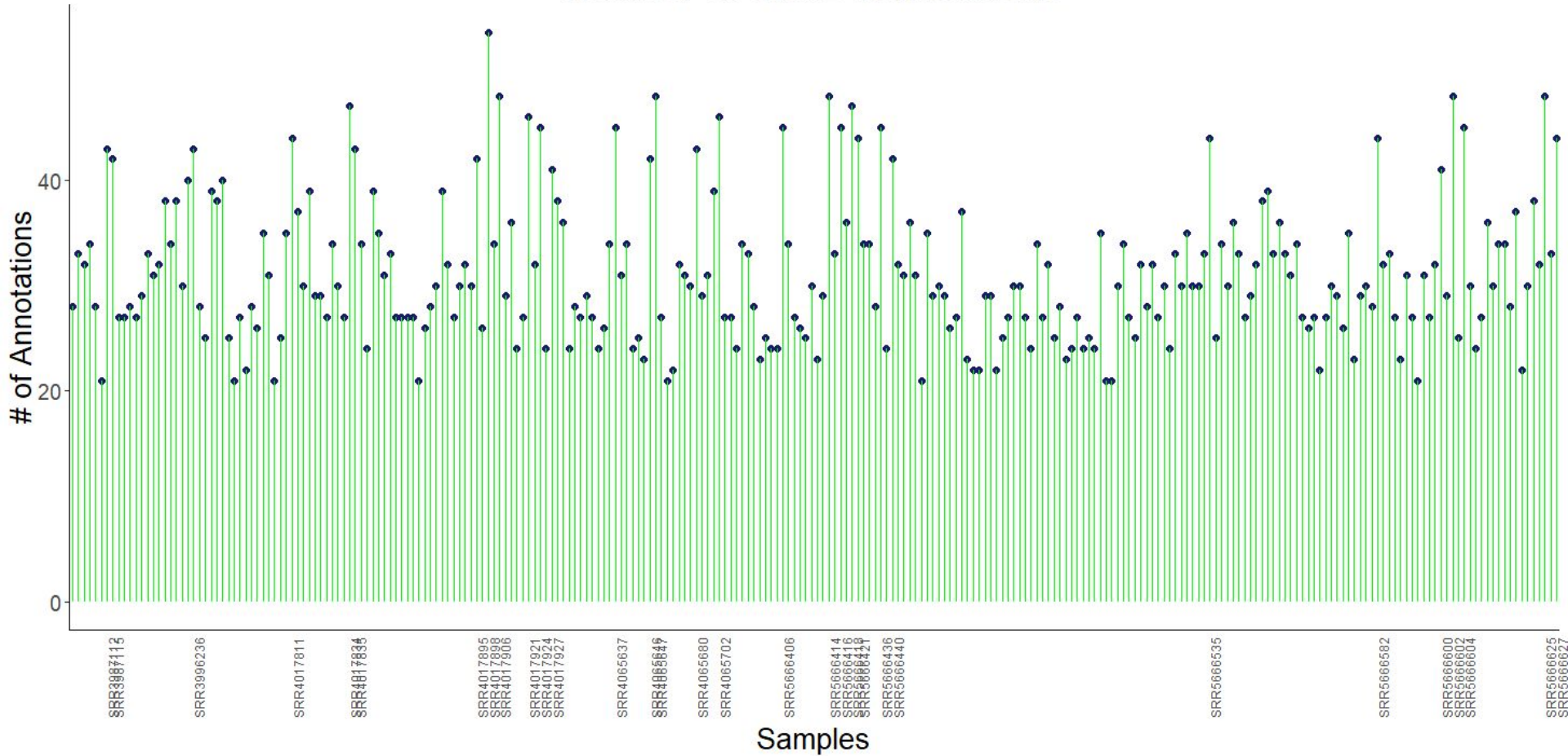
# Functional Annotation Methods

## Number of eggNog (Diamond) Annotations



# Functional Annotation Methods

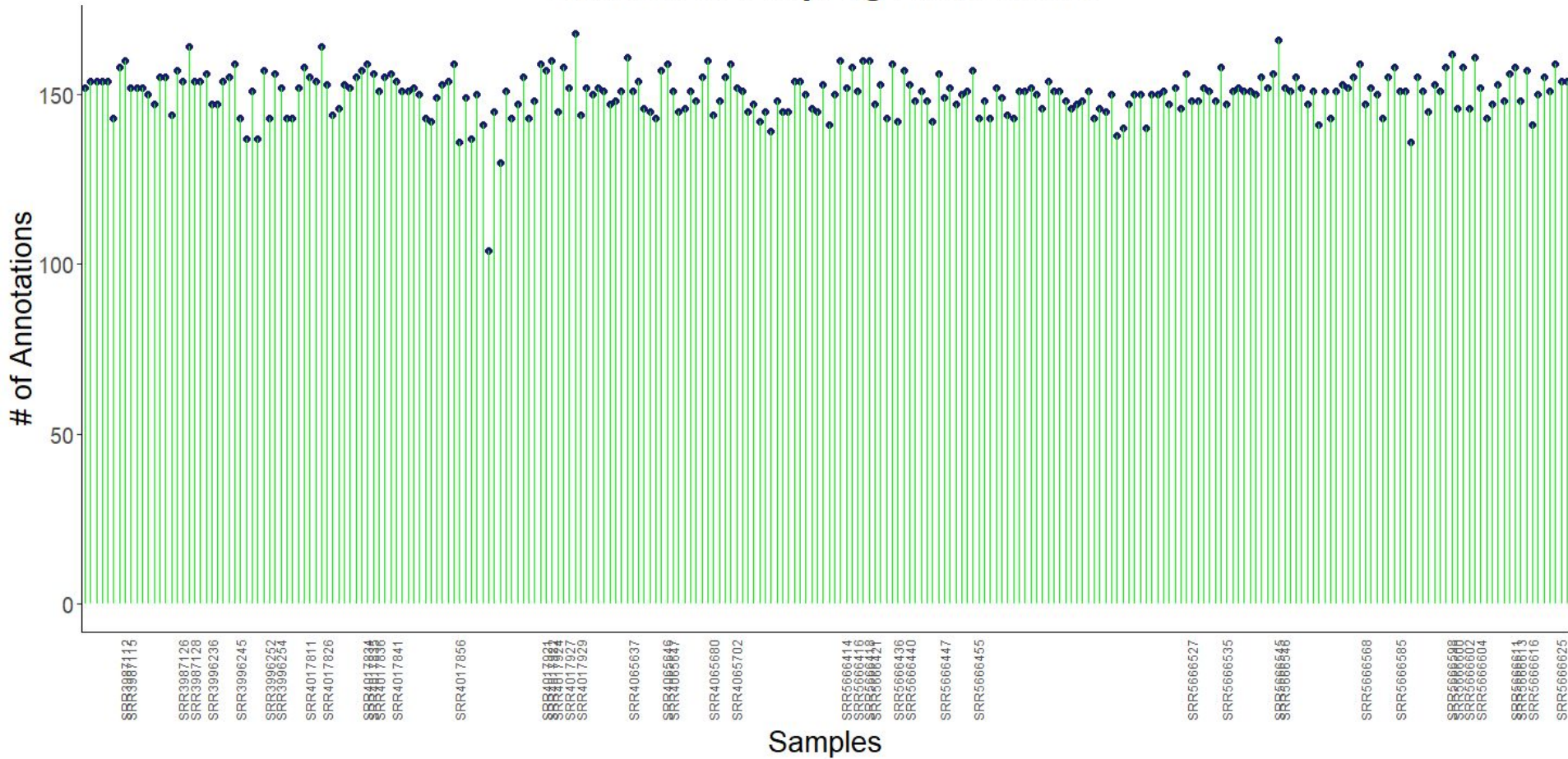
## Number of CARD Annotations





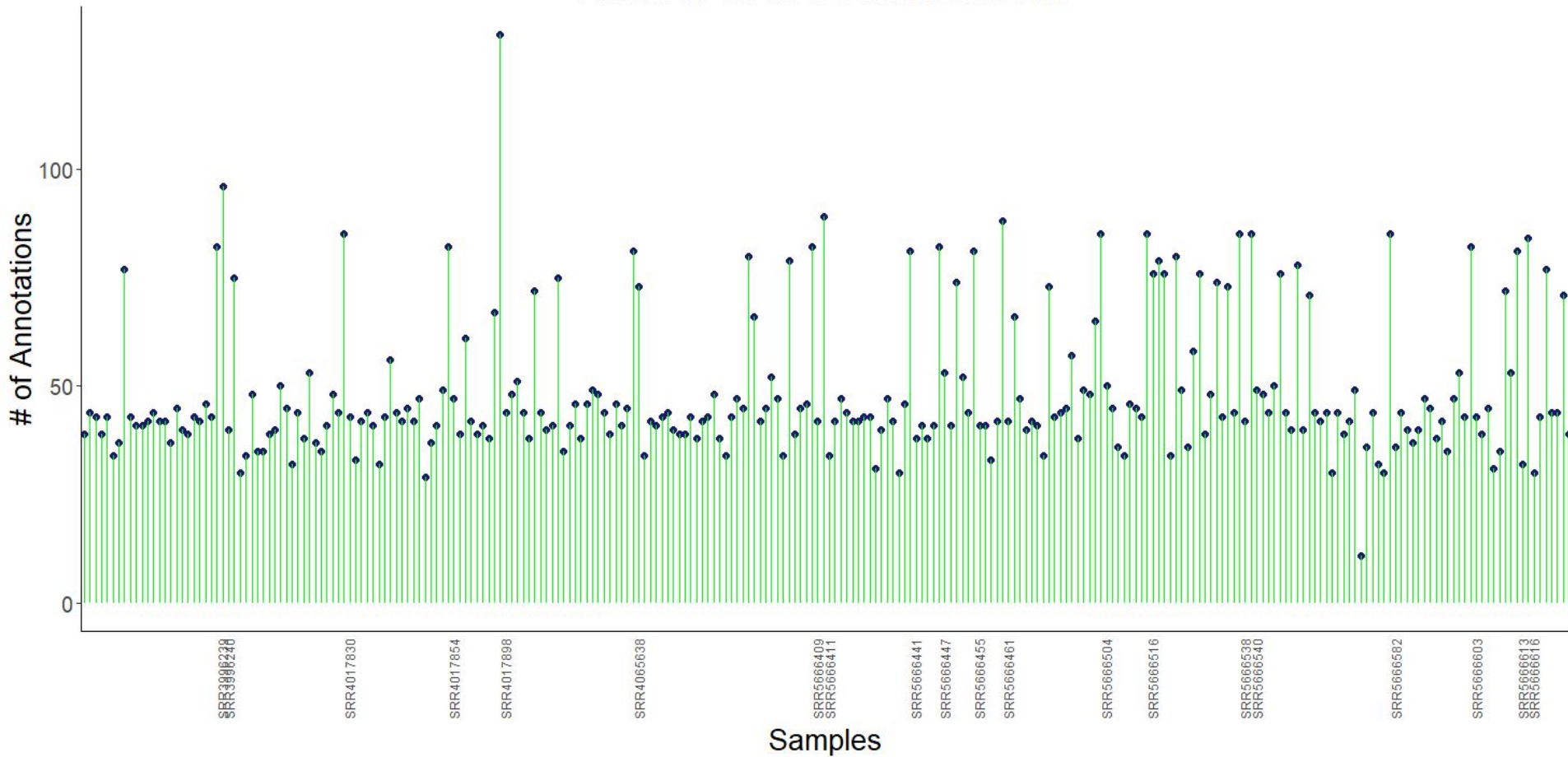
# Functional Annotation Methods

## Number of DeepArg Annotations



# Functional Annotation Methods

## Number of VFDB Annotations

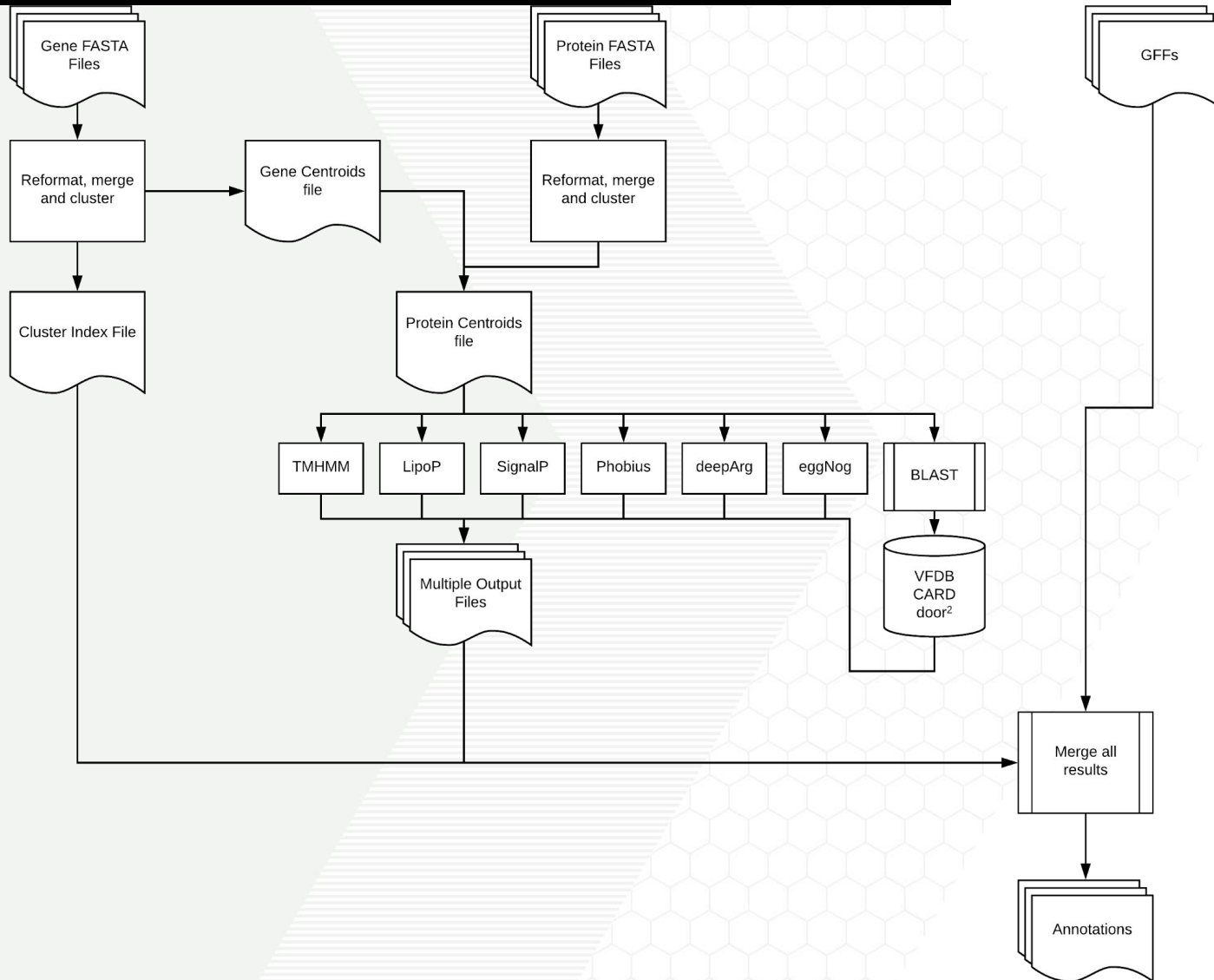


# Functional Annotation Methods

## Overall statistics

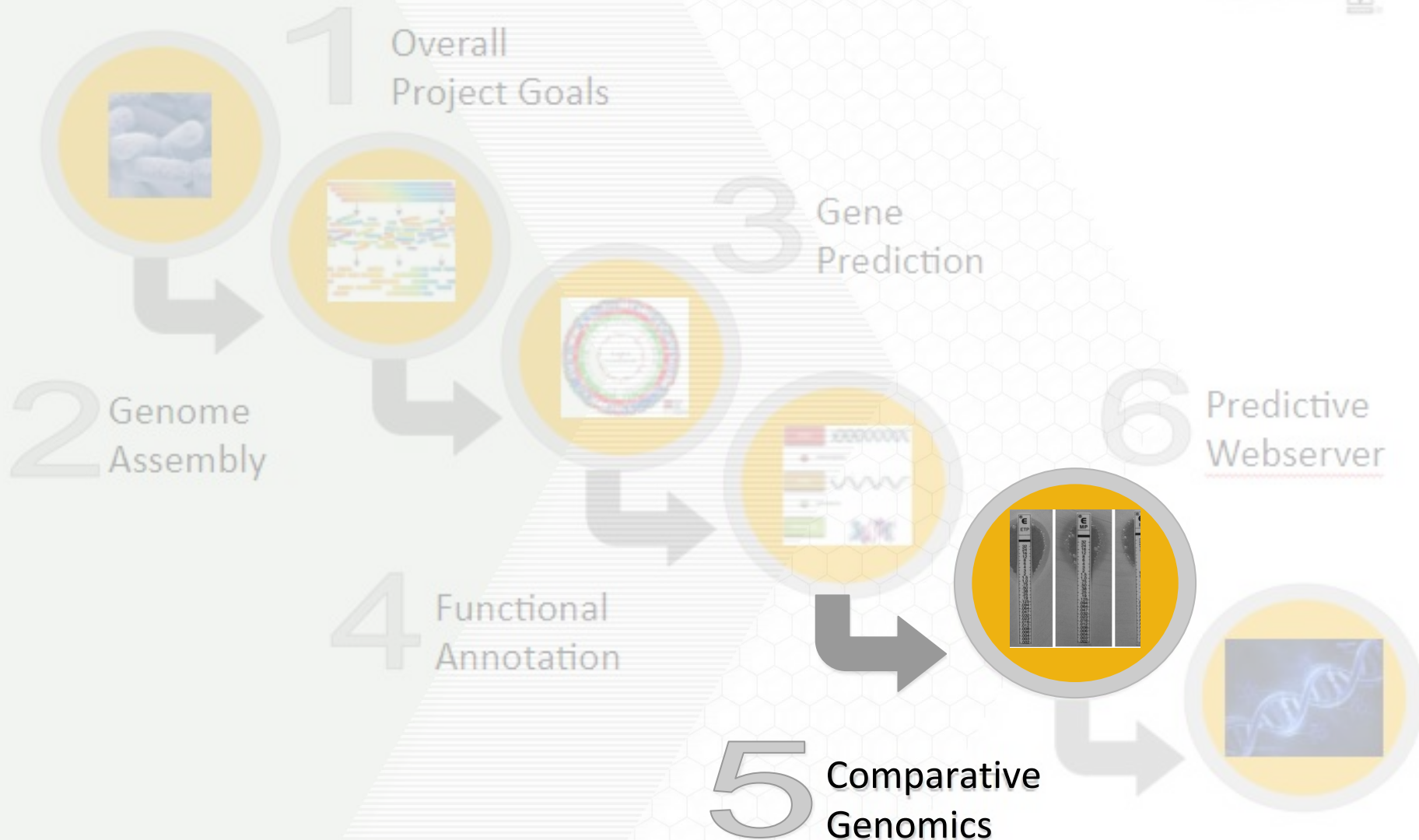
| Tools / Database | Total # of annotations | Average # of annotations |
|------------------|------------------------|--------------------------|
| CARD             | 8,051                  | 31                       |
| DeepARG          | 38,799                 | 150                      |
| Door2            | 1,330,879              | 5158                     |
| Eggnog (diamond) | 1,364,546              | 5289                     |
| GeneMark.hmm     | 110,235                | 427                      |
| LipoP            | 1,502,024              | 5822                     |
| Phobius          | 1,501,560              | 5820                     |
| Prodigal         | 1,391,789              | 5395                     |
| SignalP          | 1,501,569              | 5820                     |
| TMHMM            | 1,501,577              | 5820                     |
| VFDB             | 12,517                 | 49                       |

# Functional Annotation Final Pipeline



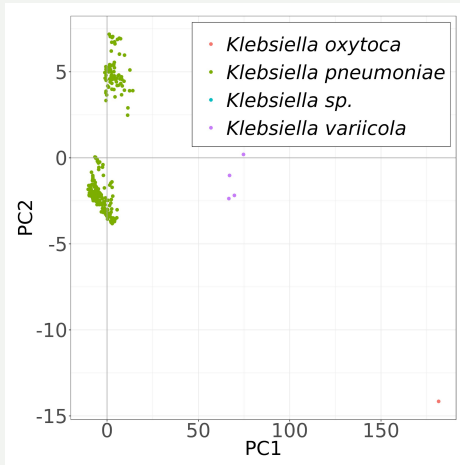


# Outline

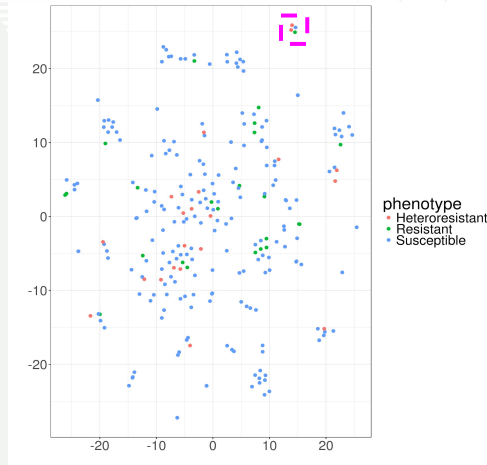


# Comparative Genomics Final Pipeline

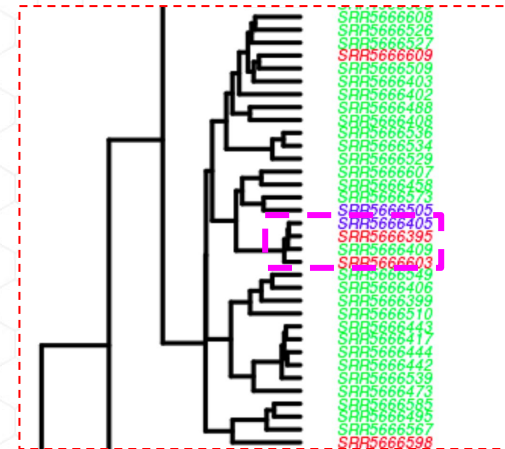
PCA analysis



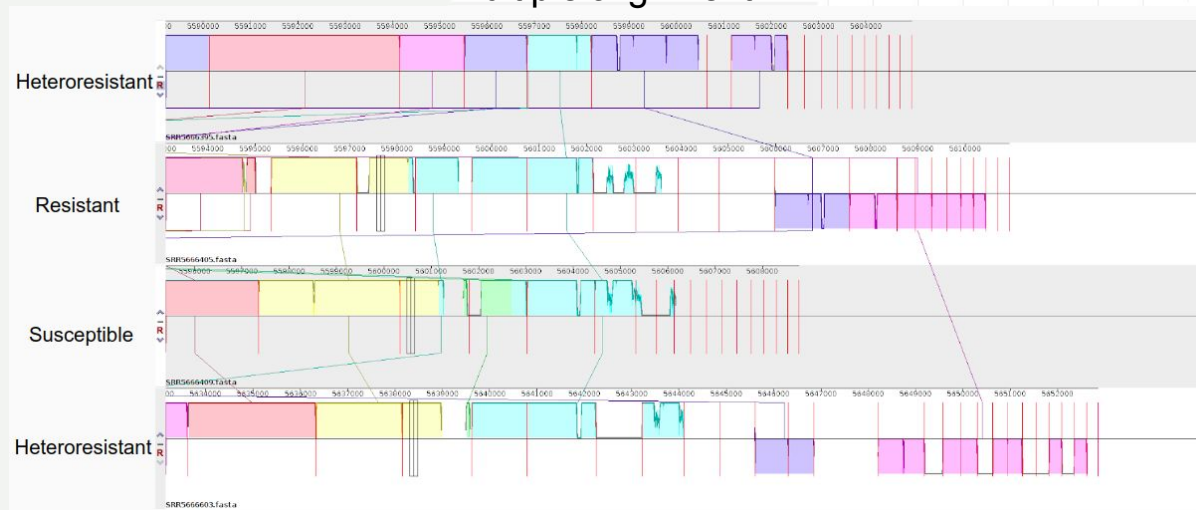
tSNE



Hierarchical clustering

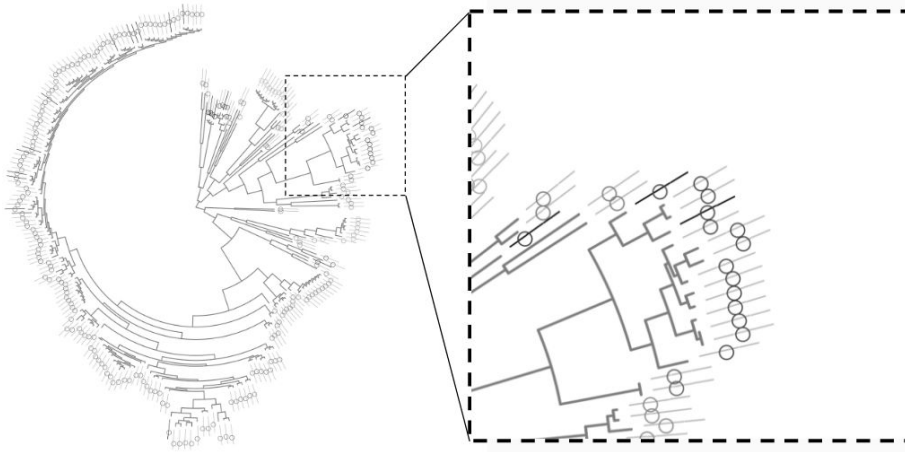


Multiple alignment

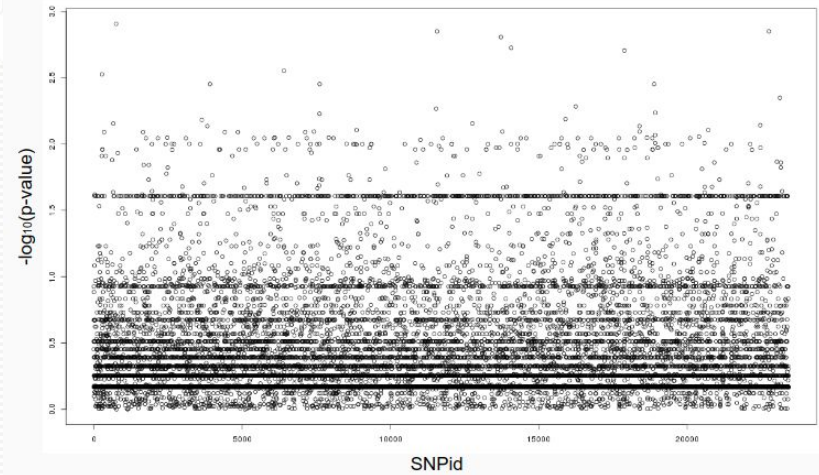


# Comparative Genomics Methods

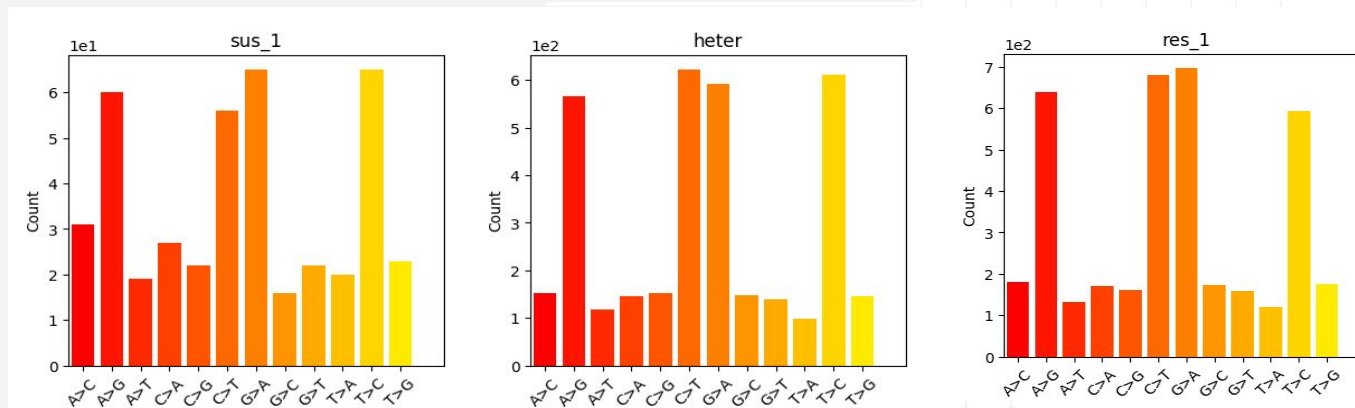
buGWAS



bacterialGWAS

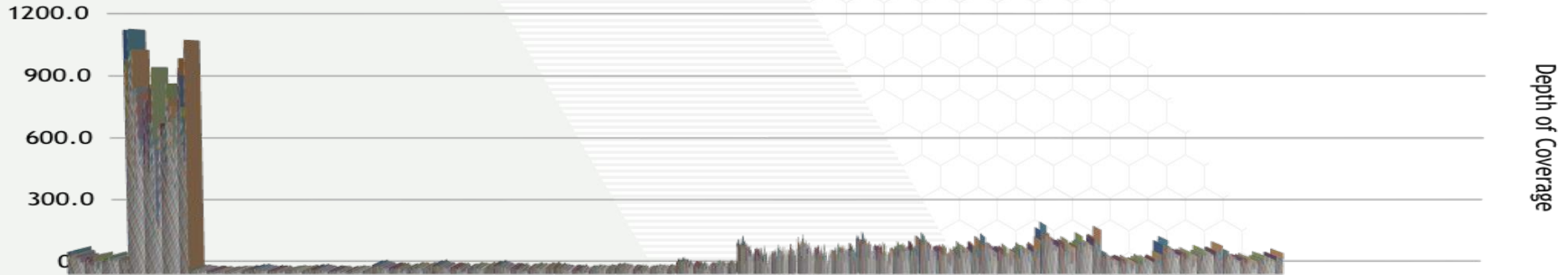


Substitution rates

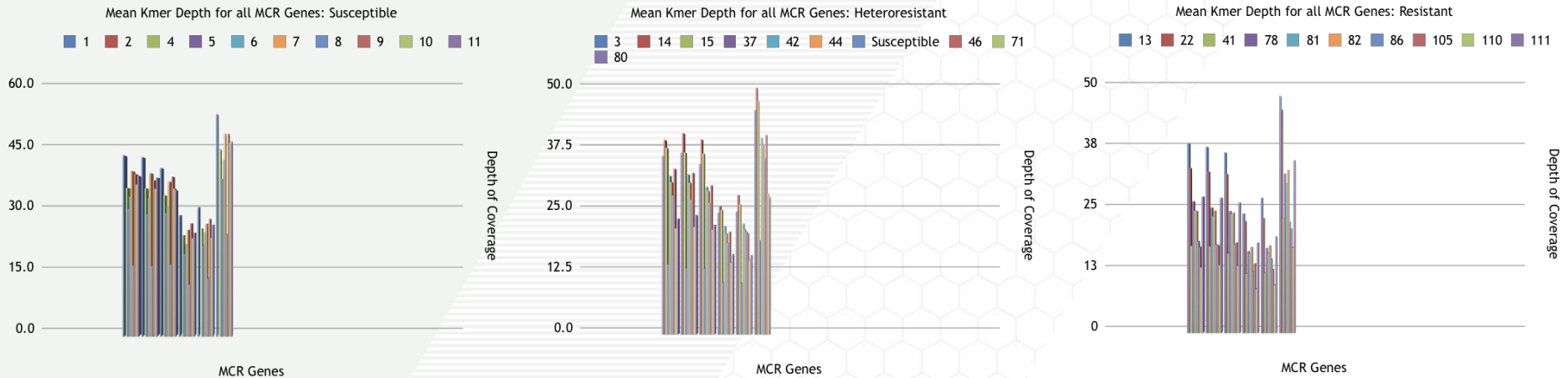


# Comparative Genomics Methods

Mean Kmer Depth for all Colistin Resistance CARD genes

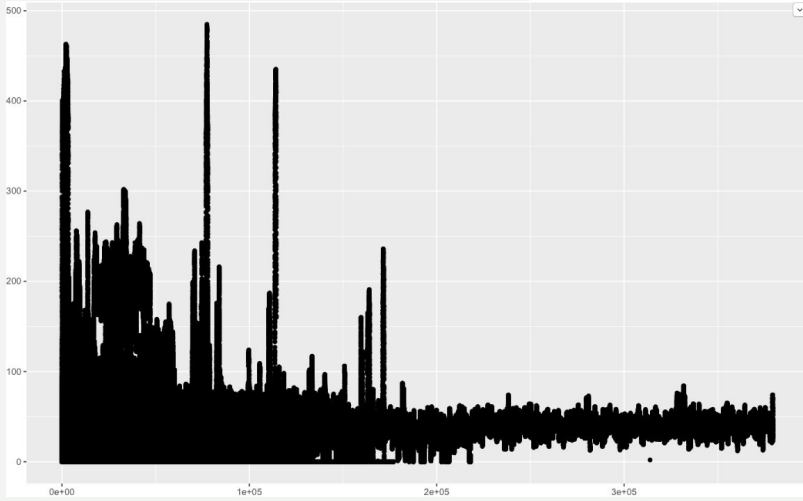


Colistin Resistance Conferring CARD Genes

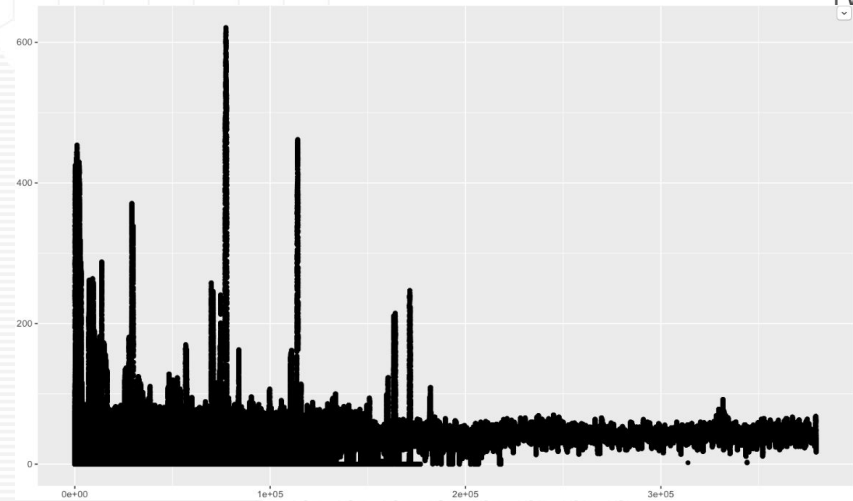




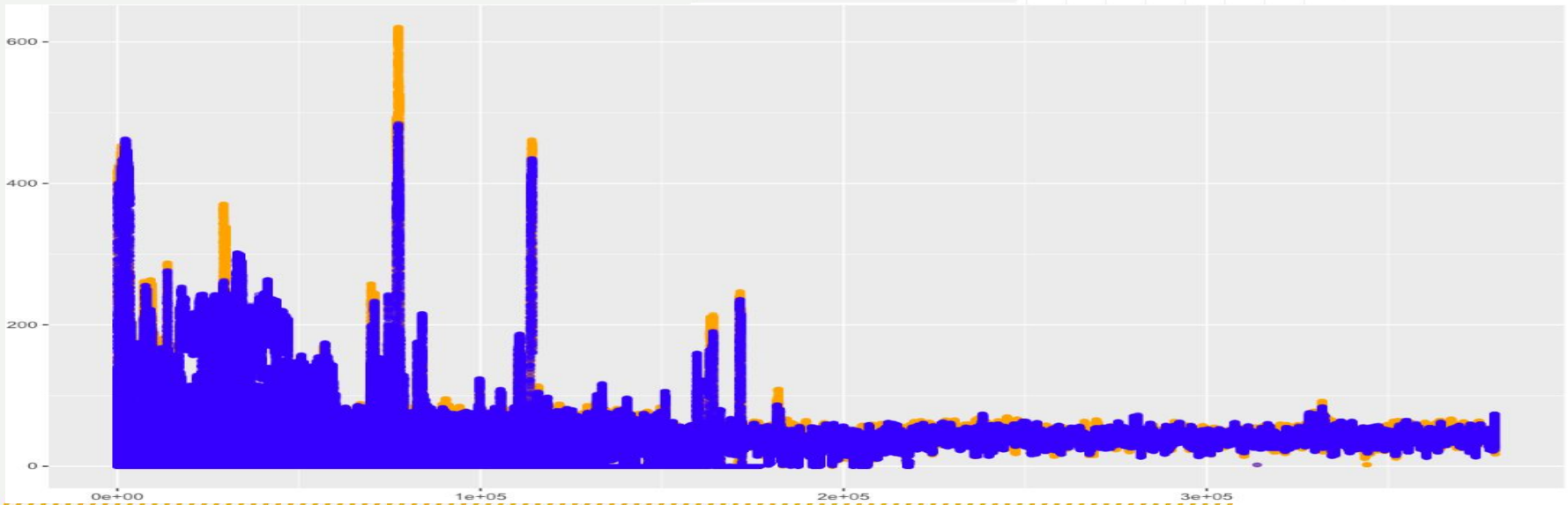
# Comparative Genomics Methods



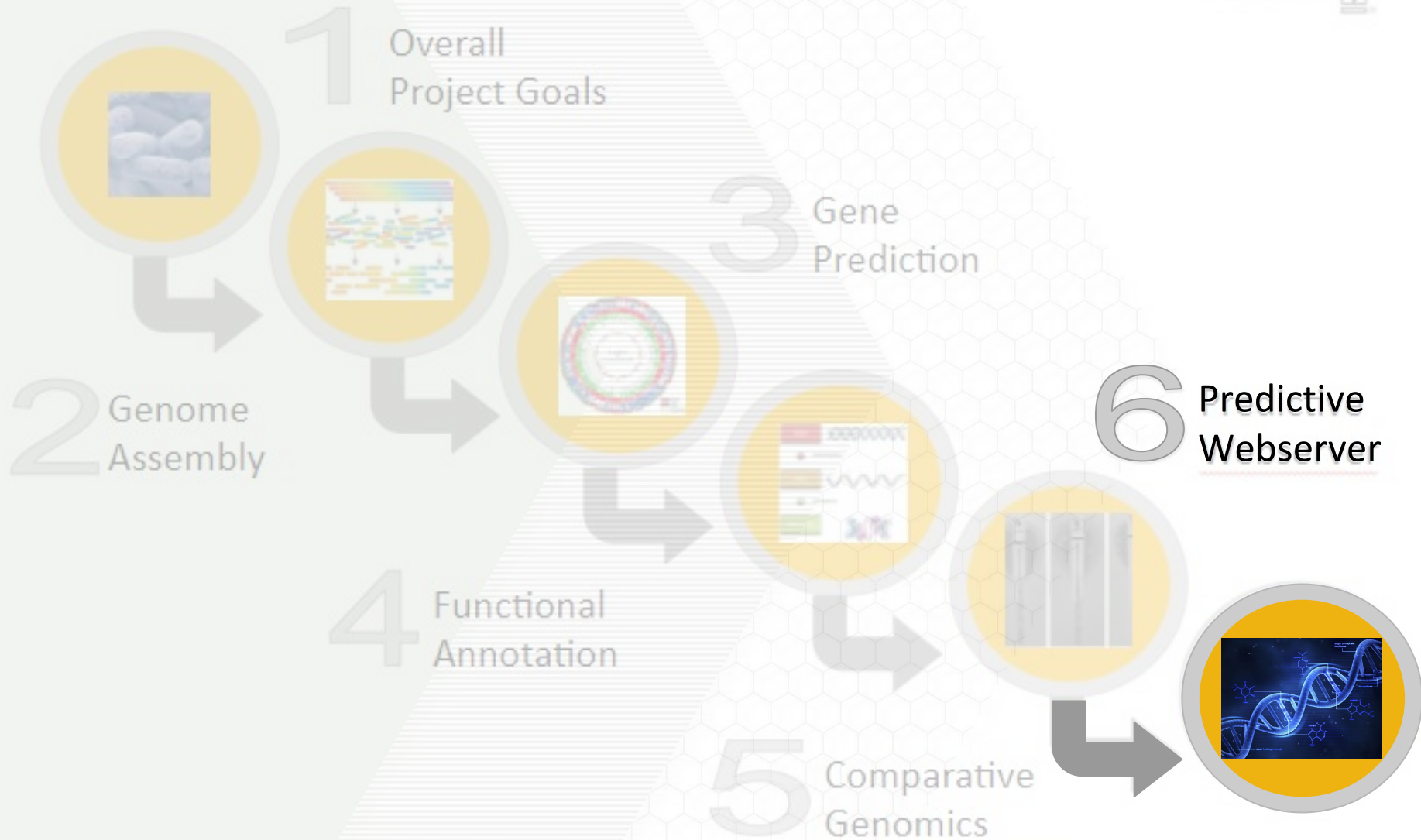
Susceptible



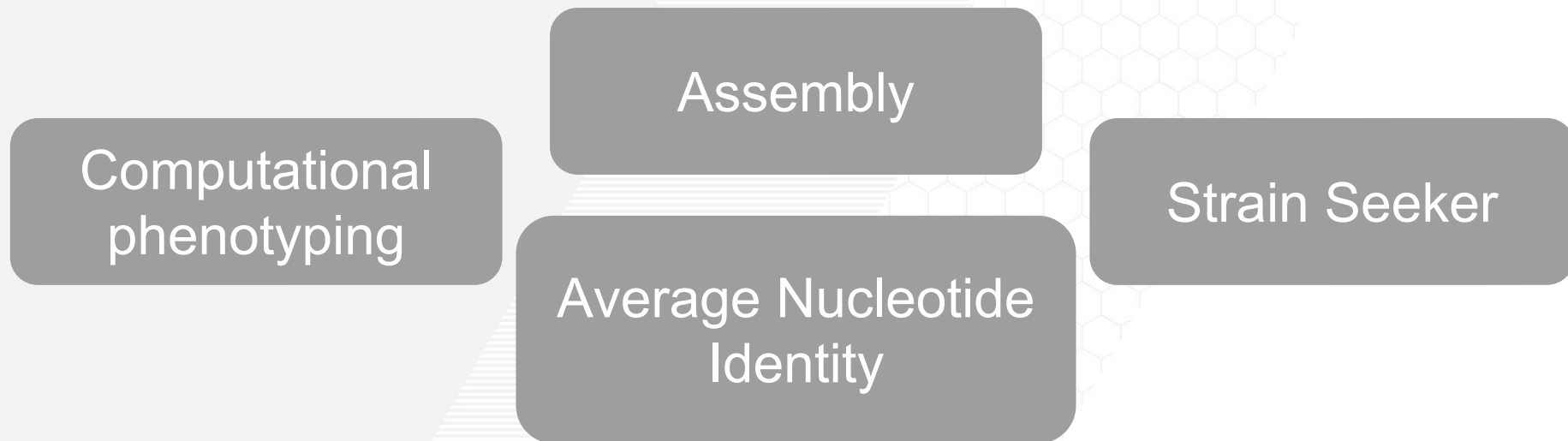
Heteroresistant



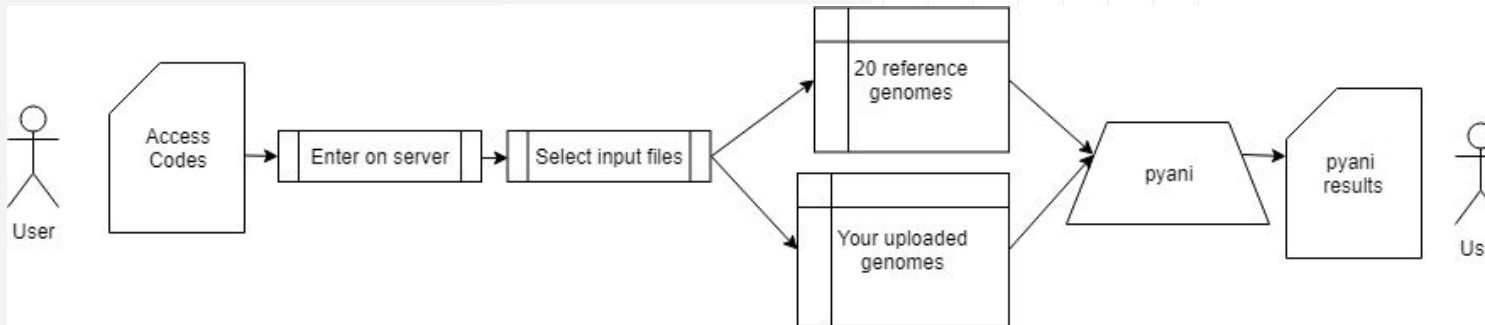
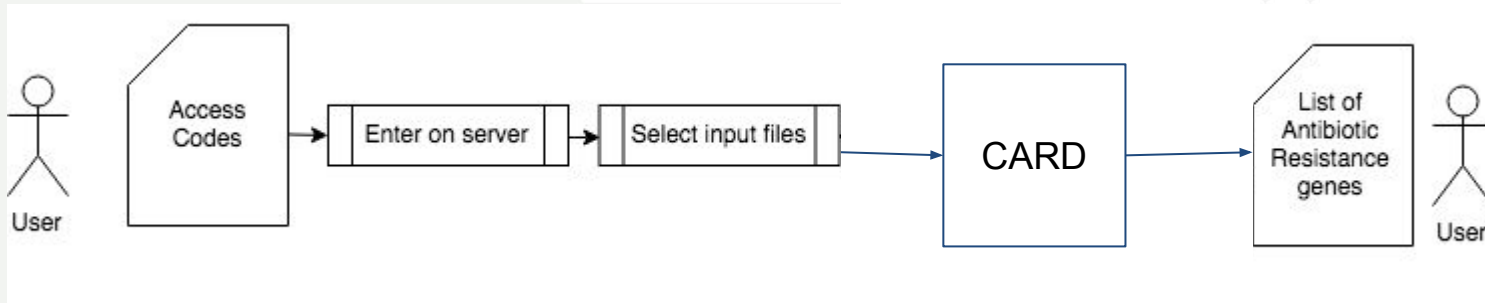
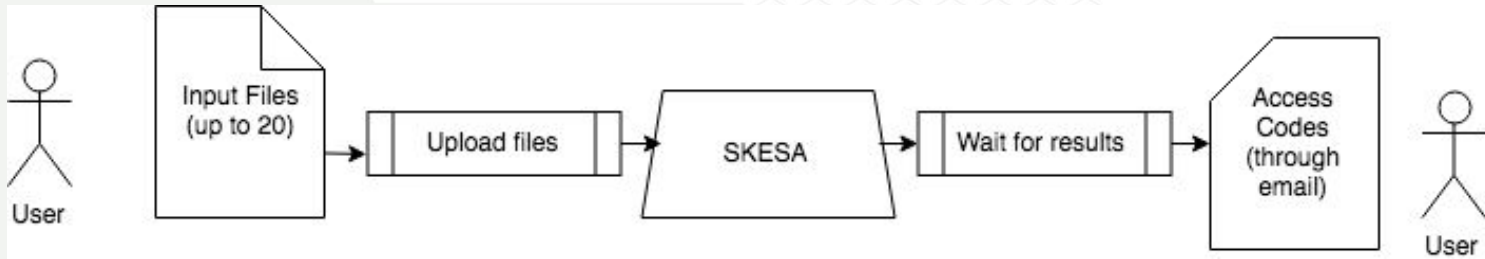
# Outline



Goal - to build a tool that can provide high quality assemblies and relevant information about genomes



# Predictive Webserver Methods



# Predictive Webserver Demo



# Sources



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- Bushnell, Brian. BBMap: a fast, accurate, splice-aware aligner. No. LBNL-7065E. Ernest Orlando Lawrence Berkeley National Laboratory, Berkeley, CA (US), 2014.

Thank you



Questions?