

# SimPrily: A Python framework to simplify genome simulation with priors

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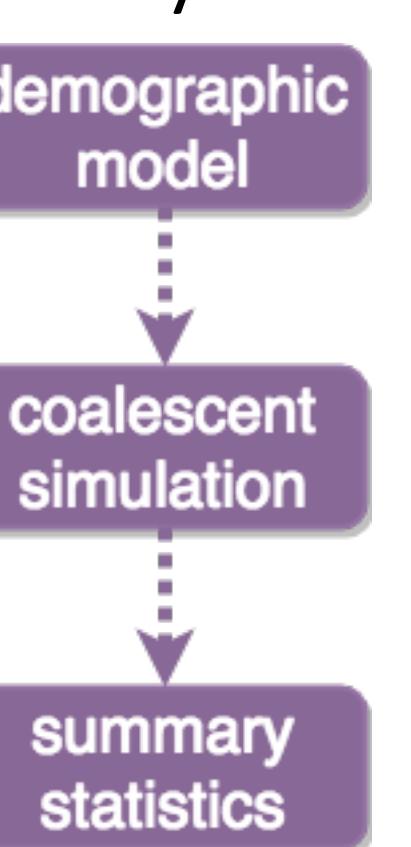
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**Availability:** Source code, HTC workflow, documentation, and examples are available at <https://github.com/agladstein/SimPrily>

## Introduction

### What can you use 1000's – millions of simulations for?

- Approximate Bayesian Computation to infer demographic history
- Null demographic model to find regions under selection
- Truth datasets for testing software



### Features

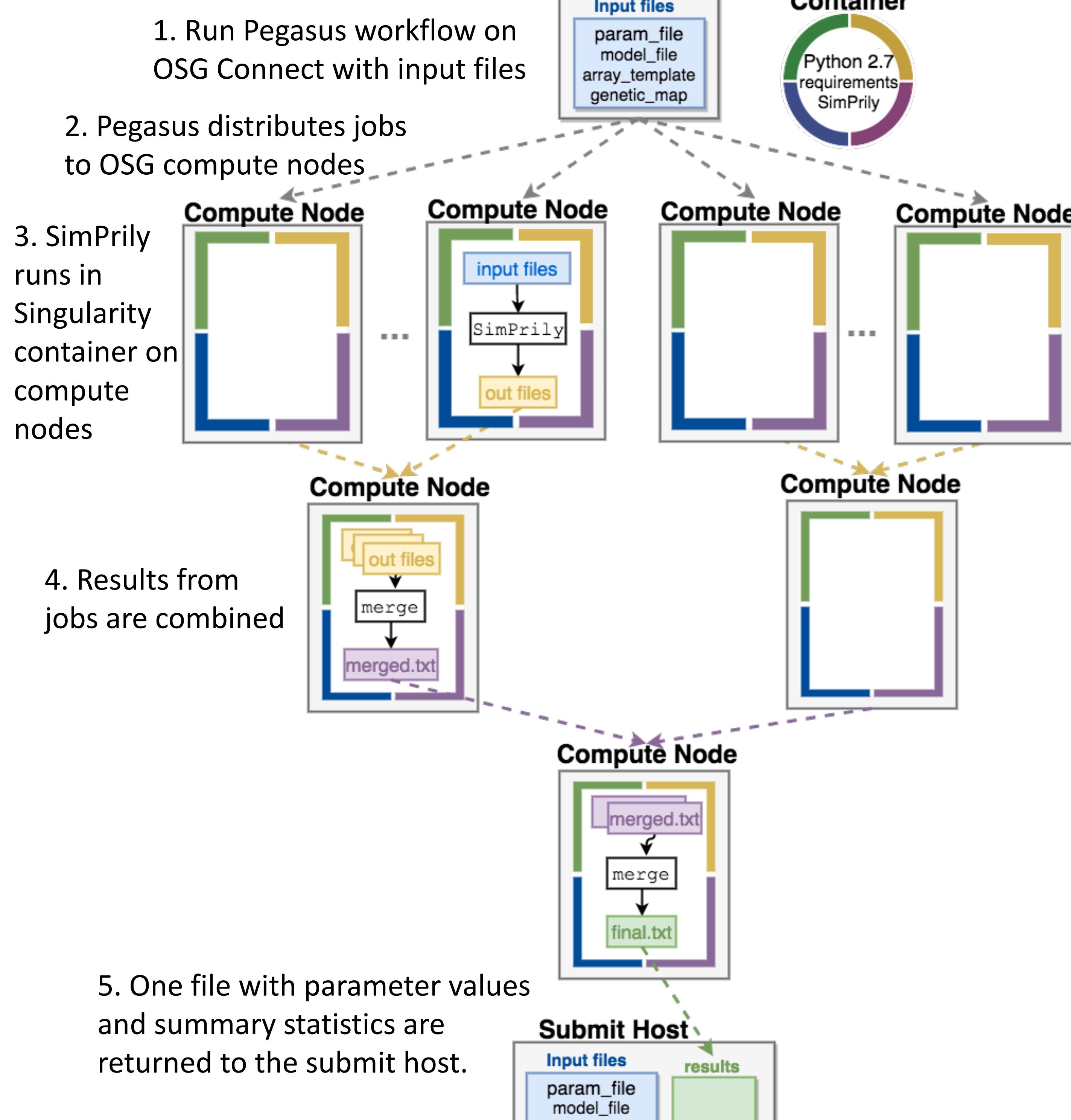
- Specify demographic model with priors
- Create pseudo array from simulations
- Calculate population genetics statistics
- Run 1000's of simulations with GUI in CyVerse Discovery Environment
- Run millions of simulations with Pegasus workflow on the Open Science Grid

## Methods

### How to submit jobs to the Open Science Grid:

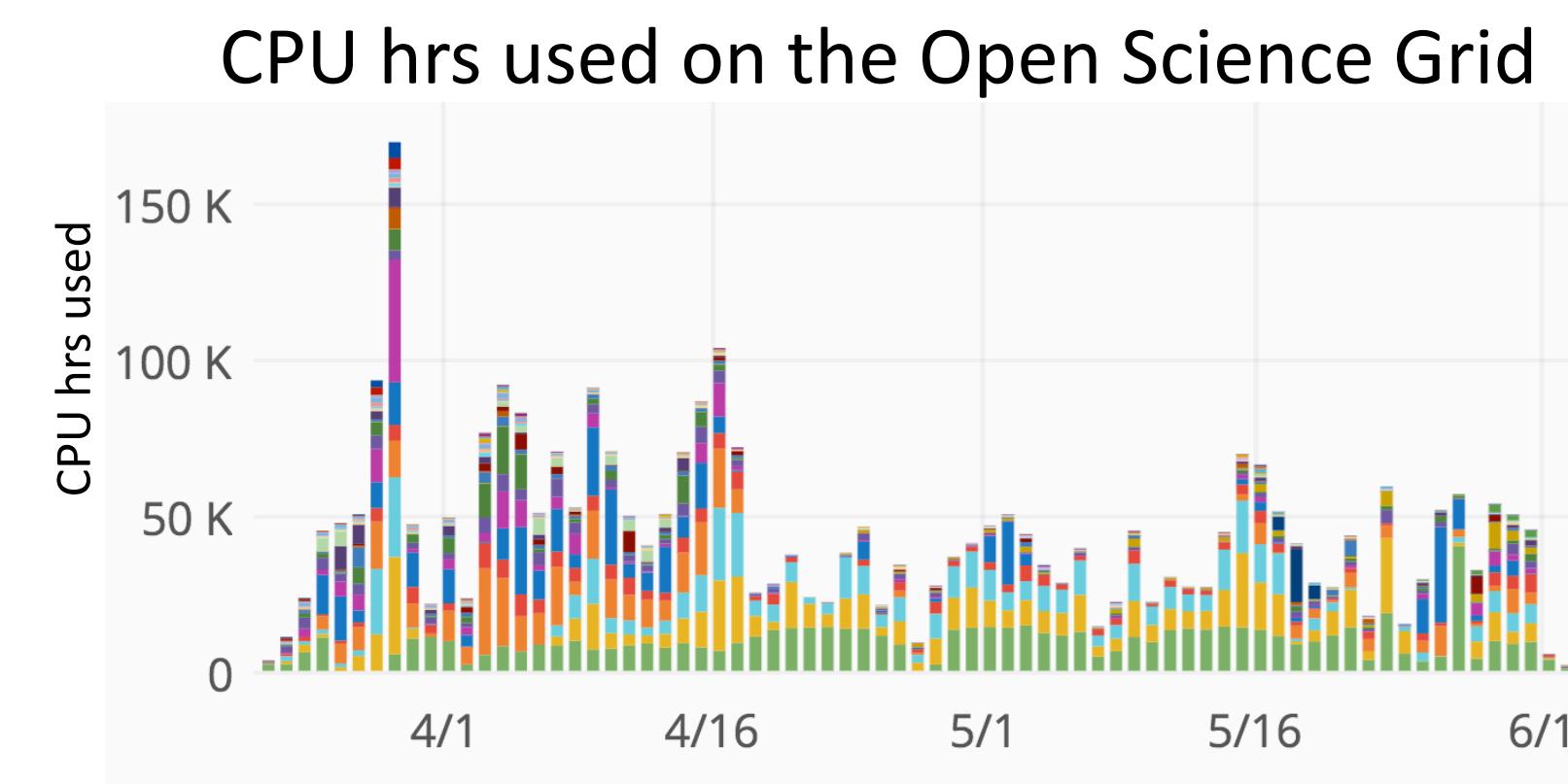
```
./submit param_file.txt model_file.csv array_template genetic_map number_jobs
```

### High throughput workflow



## Results

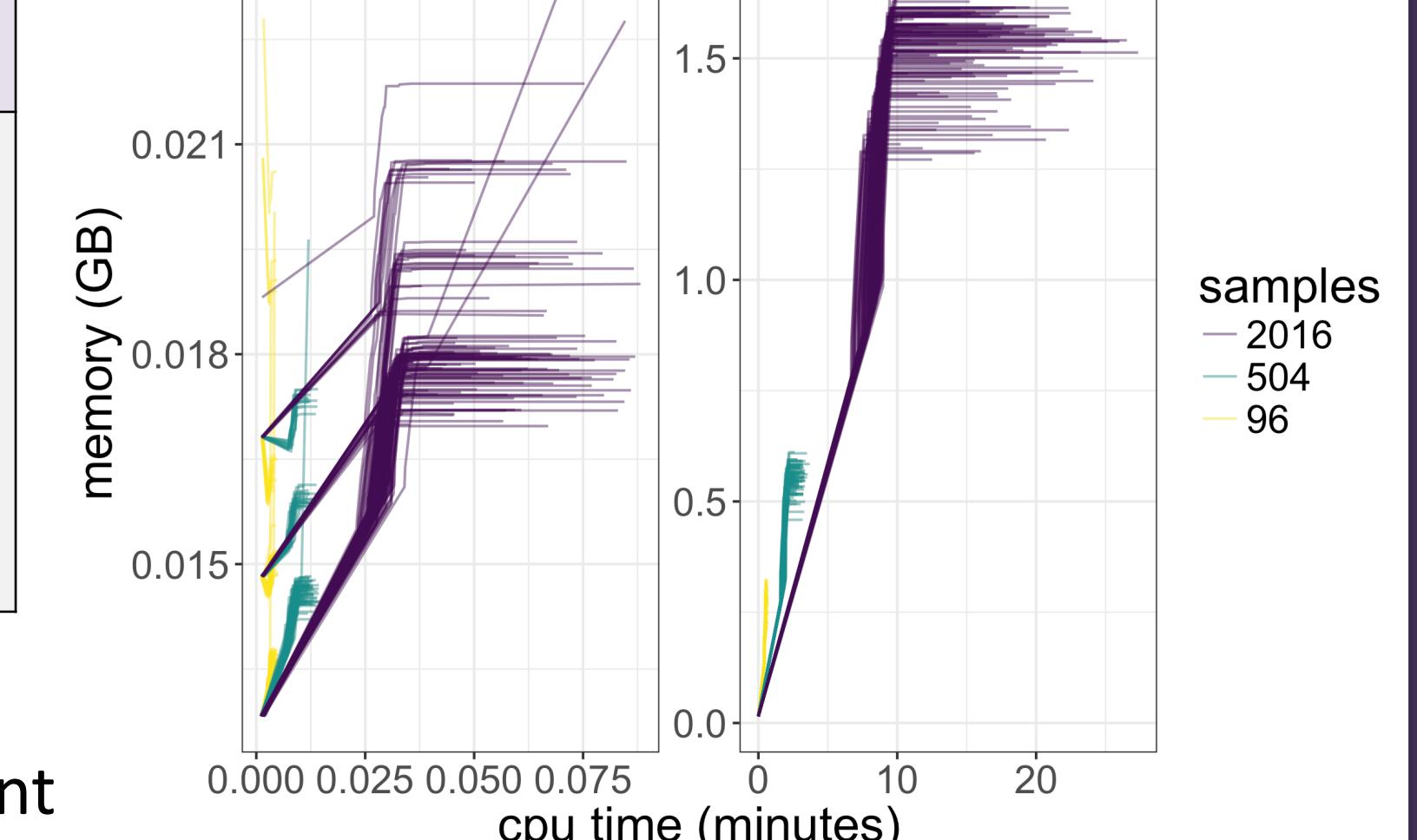
### Performance



Locus Sample Size	Model 1		Model 2	
	Mem (GB)	Time (min)	Mem (GB)	Time (min)
1 Mb	0.01	0.005	0.05	0.2
504	0.01	0.01	0.1	0.7
2016	0.02	0.06	0.3	6.9
300 Mb	0.3	0.8	3.1	12.6
504	0.5	2.9	5.2	46.9
2016	1.5	17.4	13.0	337.8

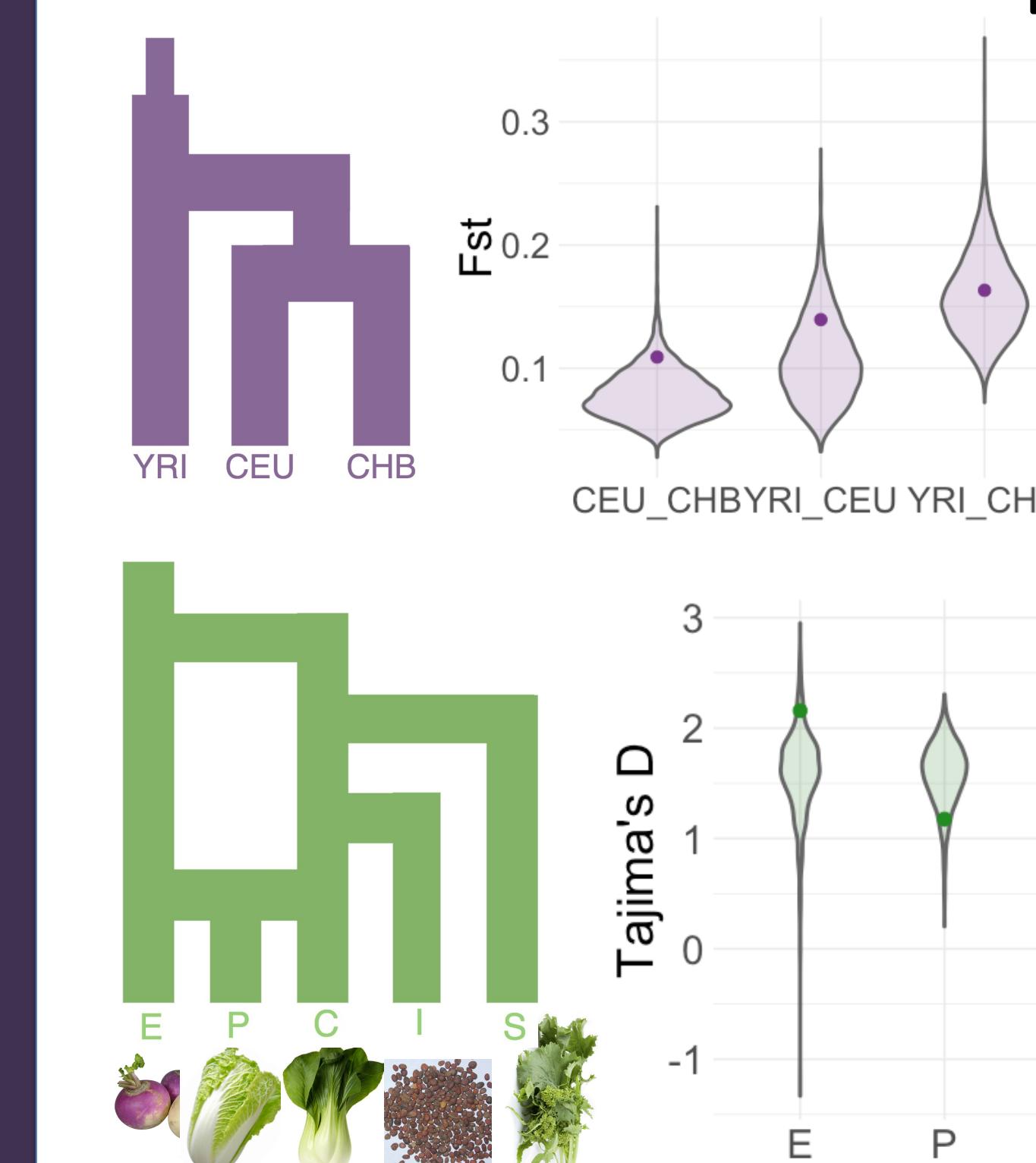
Performance of simple and more complicated model run with different sample and locus sizes.

$\mu = 2.5 \times 10^{-8}$ ,  $T = (0:5000)$ ,  $N = (1e3:1e6)$



Performance profile of Model 1 as SimPrily runs 100 simulations each.

### Examples



Distribution of Fst values from 5000 simulations of chr1 of a model of Yoruba (YRI), Europeans (CEU), and Han Chinese (CHB). The dots indicate the Fst values from 1000 Genomes data.

Distribution of Tajima's D values from 1000 simulations of chrA01 of a *B. rapa* model. The dots indicate the Tajima's D values from real data.

## Conclusions

### Major Benefits

- No experience with HTC required - Ready to use HTC workflow
- Minimal storage required – simulations are not printed

### Future Work

- Options of a variety of simulators
- Serial or parallel multilocus simulations

### References

- <sup>1</sup>Chen, G. et al. 2009. *Genome research*, 136-142.
- <sup>2</sup>Deelman, E. et al. 2015. *Future Generation Computer Systems*, 46, 17-35.
- <sup>3</sup>Merchant, N. et al. 2016. *Plos Biology*, 14(1), 1-9.
- <sup>4</sup>Pordes, R. et al. 2007. *Journal of Physics: Conference Series*, 78, 012057.
- <sup>5</sup>Qi, X. et al. 2017. *Molecular Ecology*, 26:3373-3388.
- <sup>6</sup>Quinto-Cortés et al. 2017. Submitted
- <sup>7</sup>The 1000 Genomes Project Consortium 2015. *Nature*, 526, 68-74.

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