## Sequentially Markovian Coalescence André E. R. Soares

**Populations Genomics in Practice 2023** 

### The idea

# To reconstruct the demographic history of a species from genome sequences.

## The most common methods to do so



#### Inference of human population history from individual whole-genome sequences

Heng Li<sup>1,2</sup> & Richard Durbin<sup>1</sup>



Published: 22 June 2014

#### **Inferring human population size and** separation history from multiple genome sequences

Stephan Schiffels 🗠 & Richard Durbin 🗠

Nature Genetics 46, 919–925 (2014) Cite this article

#### **PSMC**

doi:10.1038/nature10231

### MSMC

## The most common methods to do so

**PSMC** Unphased genome One diploid individual

MSMC Phased genomes Many individuals

### **Coalescence** methods So it has some \*\*

Some assumptions and particularities:

- Neutral evolution
- Panmitic population: equal coalescence probabilities for all pairs of lineages

- Coalescence rate is related to population size. (as seen earlier)

If we have a genealogy that shows when the coalescent events happened, we then can infer the population size of a population.



### Sequentially Markovian Coalescent Think different

**Traditional coalescence methods** 

- They work backwards
- They build full genealogies from modern/extant samples.

#### **Sequentially Markovian Coalescence**

- They go along the genome
- It builds a "local" genealogy for each locus on the genome.

## How does it work?

#### HMM = Hidden Markov Model

#### PSMC uses a HMM







#### Some states that change with time

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#### But they're hidden (you can't observe them)

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## But they're hidden (you can't observe them)

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\_ \_ \_ \_

But you can observe something connected to them



It's really powerful for dynamic systems and is used a lot in computational biology (annotation, etc)





**Observed state** 

Naming each part of it...





Genetic sequence

#### How SMC methods work





- It creates 100 bp windows
- 1 for hets, 0 for homs

## How does SMC work?

#### In a whole genome we have...





## The SMC is capable of calculating the probability of recombination breakpoints.



Nucleotides stat

tes Recombination I	breakpoints
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#### Since a "tree" between two sequences is known, the only variable that change is T<sub>MRCA</sub>.























**PSMC**: Local genealogy is the time to the  $T_{MRCA}$ , because only one tree **MSMC:** Uses only some of the local trees, the ones that describe the

T<sub>MRCA</sub> of two alleles at a locus

## What does it look like?



mutation rate to scale the graph.



## **PSMC** plot



## **PSMC** plot



### **PSMC plot - example 01** What do you see?





## **PSMC: the weak points**

- It's really dependable on proper generation times and mutation rates;
- Sudden drops in population will show as a steady decline over time instead of a sudden bottleneck;
- Population structure will strongly affect the results (as it affects coalescence times);
- Not great with zoo animals;
- Doesn't have a framework for testing hypotheses, must use bootstrap replicates instead.

## **PSMC: the weak points**

Factors that affect the coalescent rates will affect the PSMC too, like natural selection and nonrandom mating.

## **PSMC** vs **MSMC**

- with coalescence events in the recent past;

- It tends to out-perform PSMC even in single genomes;

- Multiple individuals help increase the chance for alleles

- Deep coalescences are relatively rare in all cases.

## **PSMC and beyond**

- eight samples in most cases.
- SMC++ (Terhorst et al. 2017): higher accuracy
- ASMC (Palamara et al. 2018): 2-3x faster
- XSMC (Ki & Terhorst, 2020)
- Gamma-SMC (Schweiger & Durbin, published in Advance August 10, 2023): Up to 20x faster, can detect loci under positive selection.

## MSMC2: Expands on MSMC, that's limited to

## **Reading suggestions**

REVIEW ARTICLE

A practical introduction to methods for estimating den data

Niklas Mather | Samuel M. Traves | S

**RESOURCE ARTICLE** 

Limits and convergence pro Markovian coalescent

Thibaut Paul Patrick Sellinger 💿 📔 Diala

#### **MSMC and MSMC2: The Multi Coalescent**

**Stephan Schiffels and Ke Wang** 



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