# **Estimation of reproductive** number and prevalence using genomic and time series data

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#### Motivation

- Inferring the dynamics of pathogen transmission during an outbreak is an important problem in infectious disease epidemiology.
- Combining datatypes is challenging: methods to analyse time series of cases and sequence data have developed in isolation of each other.
- Existing approaches for estimating the reproduction number and prevalence of infection may struggle with large datasets (Andréoletti et al (2022)).

#### Methods

- We used an approximation to make the birthdeath model from Manceau et al (2021) feasible for large datasets. Our algorithm has linear complexity.
- We extended the method to enable the use of a time series of confirmed (but not sequenced) cases. Time-series Integration Method Through Approximation of Moments
- The resulting method has been implemented as a BEAST2 package called TimTam available at aezarebski.github.io/timtam/ with several tutorials.

#### Discussion

- TimTam is a computationally tractable way to estimate key quantities while using more of the available data.
- The BEAST2 package makes it possible for people to use TimTam in their existing workflows.
- The approximation scheme could be extended to incorporate additional data types.

### References

- Zarebski, A. E. et al 2022 A computationally tractable birthdeath model that combines phylogenetic and epidemiological data. PLOS Comput. Biol.
- Manceau, M. et al., 2021. The probability distribution of the ancestral population size conditioned on the reconstructed phylogenetic tree with occurrence data. J. Theor. Biol.
- Andréoletti, J. et al 2022 The Occurrence Birth-Death Process for combined-evidence analysis in macroevolution and epidemiology. Syst. Biol.

Estimate  $R_0$  and the number of infectious from sequences and a time series of cases with a birth-death model.

Now available as the TimTam BEAST2 package!





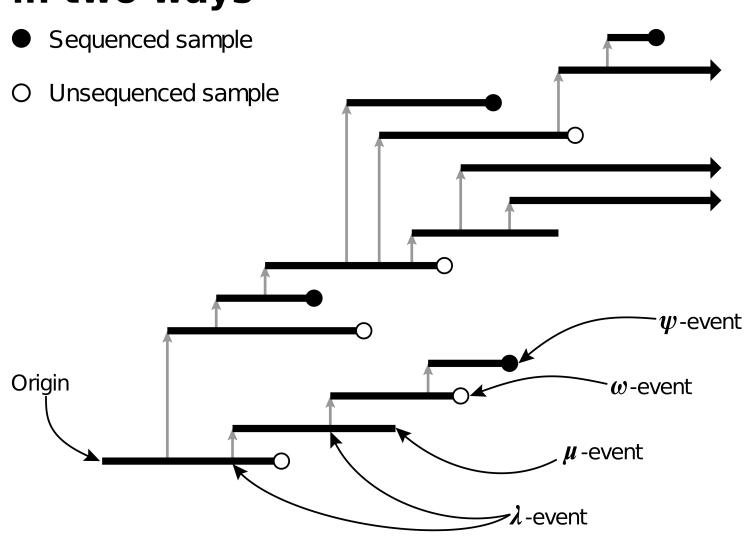
## Paper



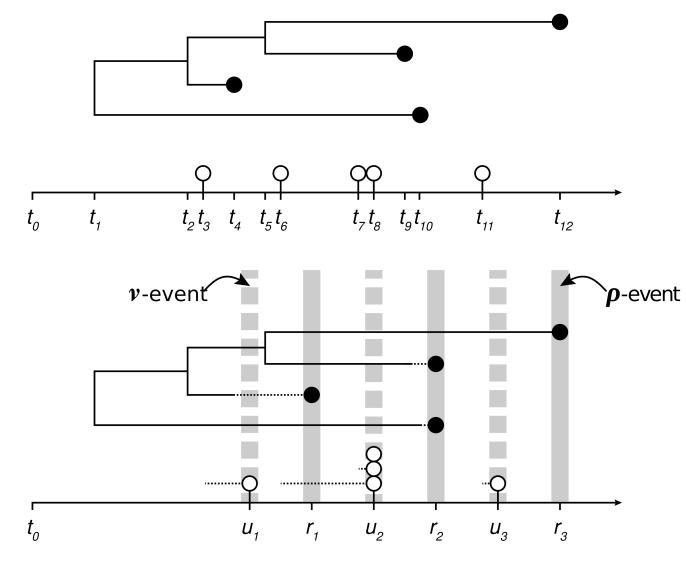




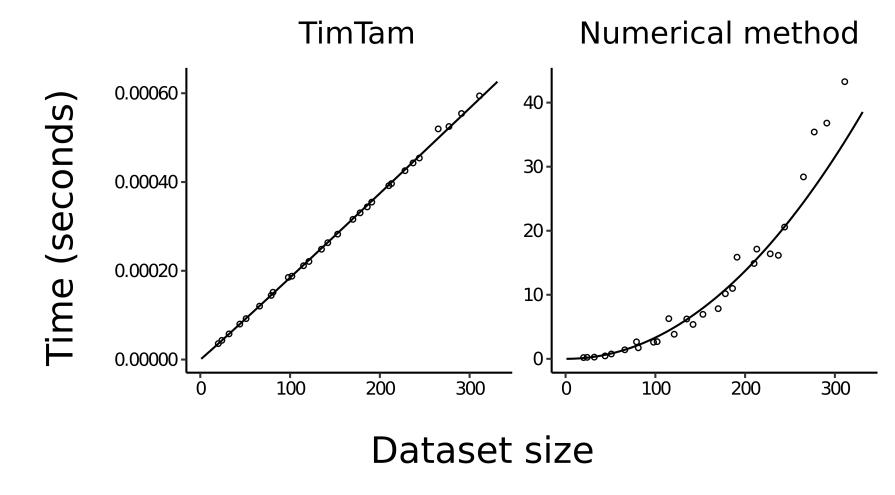
# A birth-death process is observed in two ways



## **Observations in continuous time may** be aggregated into a time series



#### **Evaluation of the log-likelihood is linear** in the size of the dataset



# The $R_0$ estimates converge to the truth as the datasets get bigger

