# A Flexible Bayesian Framework to Study Viral Trait Evolution

Paul Bastide<sup>1</sup>, G. Baele<sup>1</sup>, M. A. Suchard<sup>2,3,4</sup> and P. Lemey<sup>1</sup>

<sup>1</sup> Evolutionary and Computational Virology, Rega Institute, KU Leuven, Belgium

<sup>3</sup> Department of Biomathematics, David Geffen School of Medicine at UCLA, USA

JSM 2019



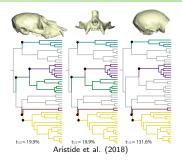


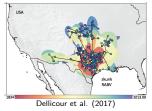


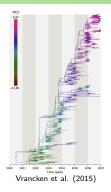
 $<sup>^2</sup>$  Department of Biostatistics, Jonathan and Karin Fielding School of Public Health, University of California, Los Angeles, USA

<sup>&</sup>lt;sup>4</sup> Department of Human Genetics, David Geffen School of Medicine at UCLA, USA

# Phylogenetic Comparative Methods



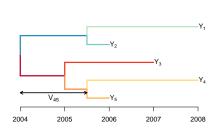


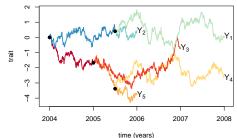


- Various time scales: Myr decade.
- Various traits: morpho, geo, viral.

Question: Trait dynamics for an evolving organism?

## BM on a Tree





Variance: 
$$\mathbb{C}$$
ov  $[Y_4; Y_5] = \sigma^2 \times V_{45}$ 

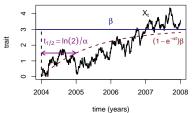
shared evolution time

Multivariate: 
$$\mathbb{C}$$
ov  $[Y_{4k}; Y_{5l}] = R_{kl} \times V_{45}$ 

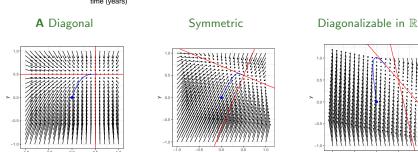
Distribution: 
$$\mathbf{Y} \sim \mathcal{MN}(\mathbf{1}_n \boldsymbol{\mu}^T, \mathbf{V}, \mathbf{R})$$

matrix normal

## Multivariate OU Modeling



$$\mathrm{d}\, \mathbf{X}_t = \mathbf{A}[oldsymbol{eta} - \mathbf{X}_t]\,\mathrm{d}\, t + \mathbf{\Sigma}\,\mathrm{d}\, \mathbf{B}_t$$



Distribution on a Tree: Still Gaussian. No nice Kronecker product.

#### Research Problems

### A Flexible Bayesian Framework to Study Viral Trait Evolution

#### Sampling in constrained space

• Variance R, selection strength A.

#### Likelihood Computation

One post-order traversal of the tree.

#### Gradient Computation: HMC

• One pre-order traversal of the tree.

Session 310

Tuesday 9:25 am

CC - Hall C