

# Dynamic Ising Model: Reconstruction of Evolutionary Trees

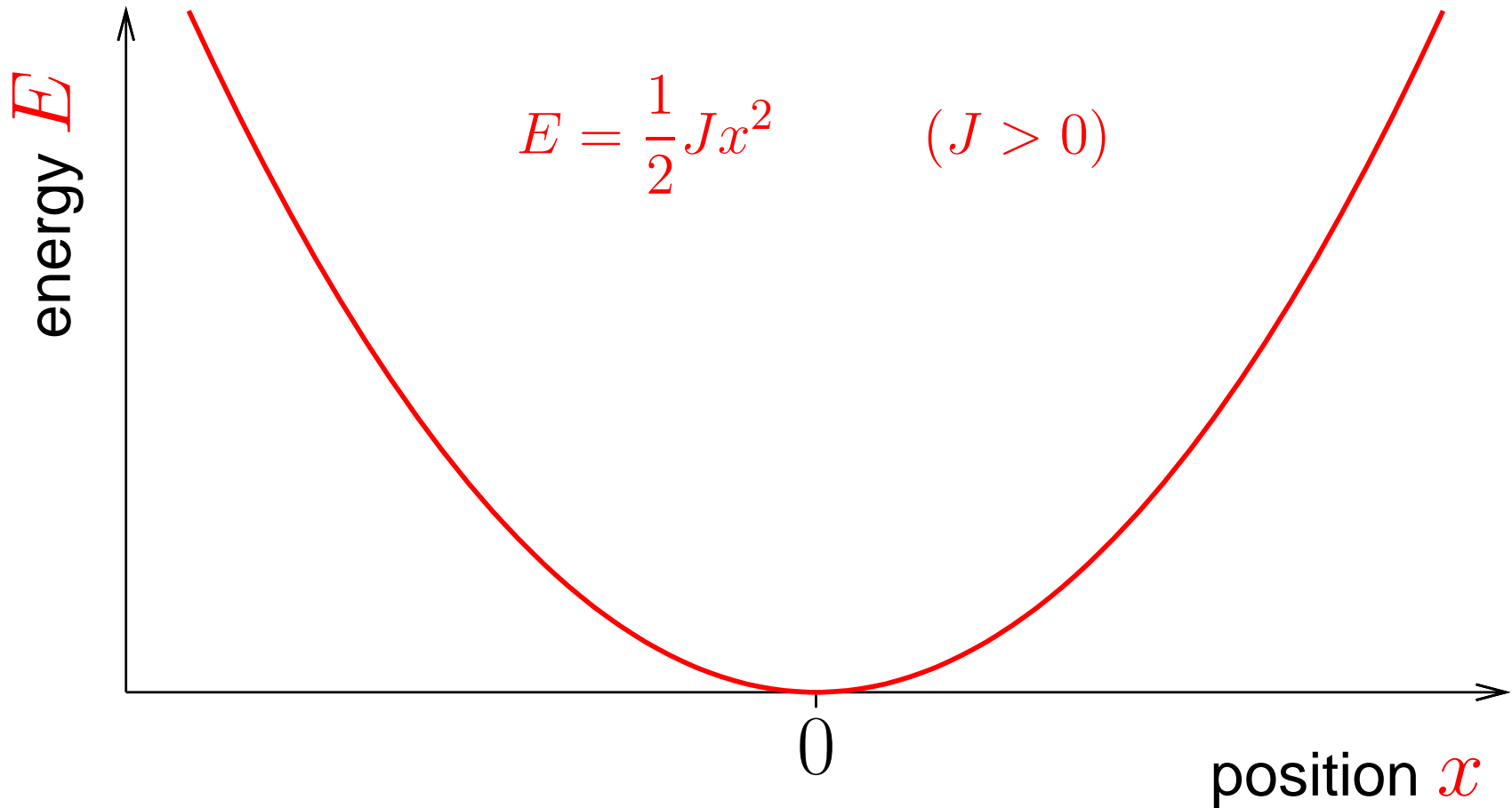
*INCT-SC 18-20/4/2011*

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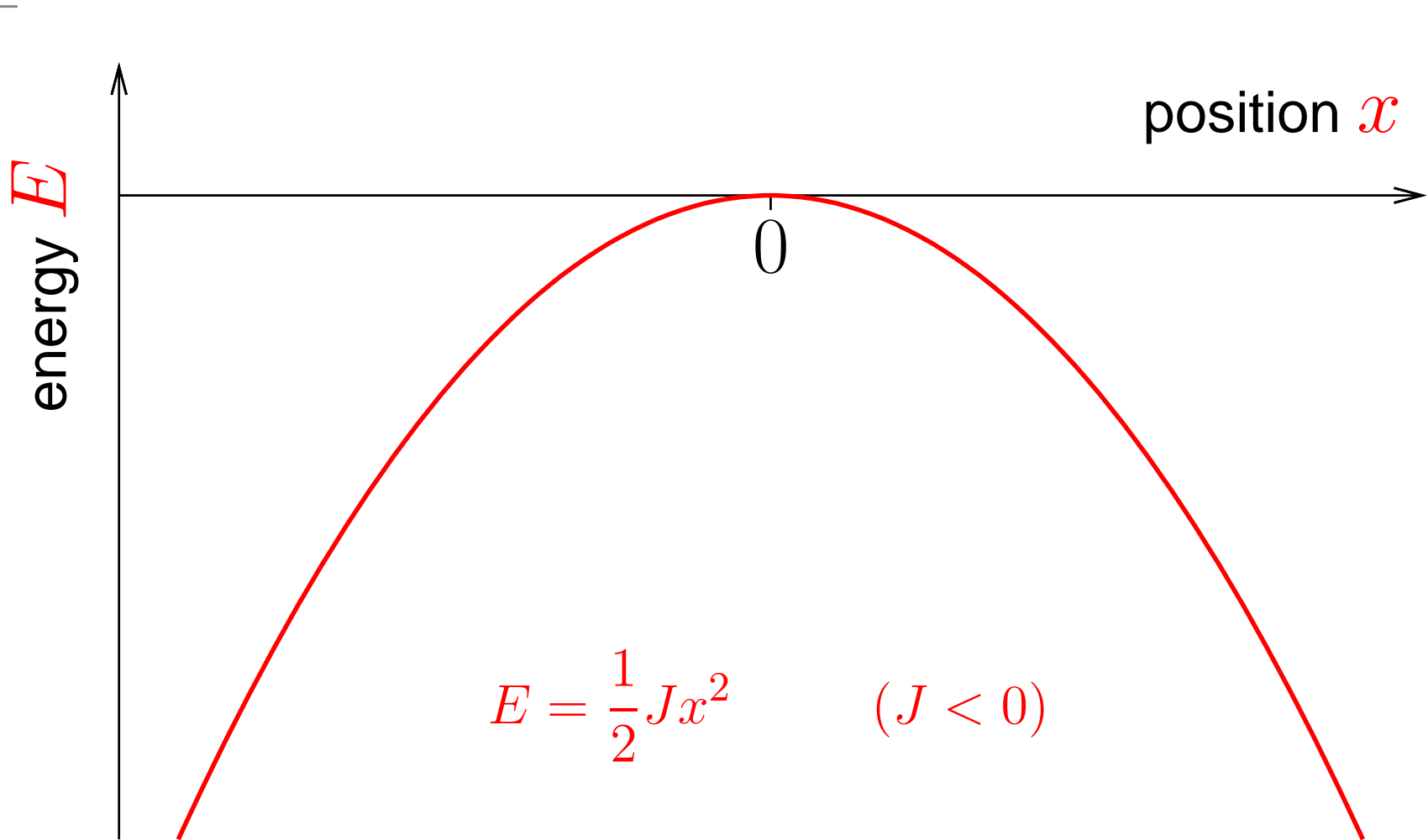
Instituto de Física, Universidade Federal Fluminense

# One particle (confinement)



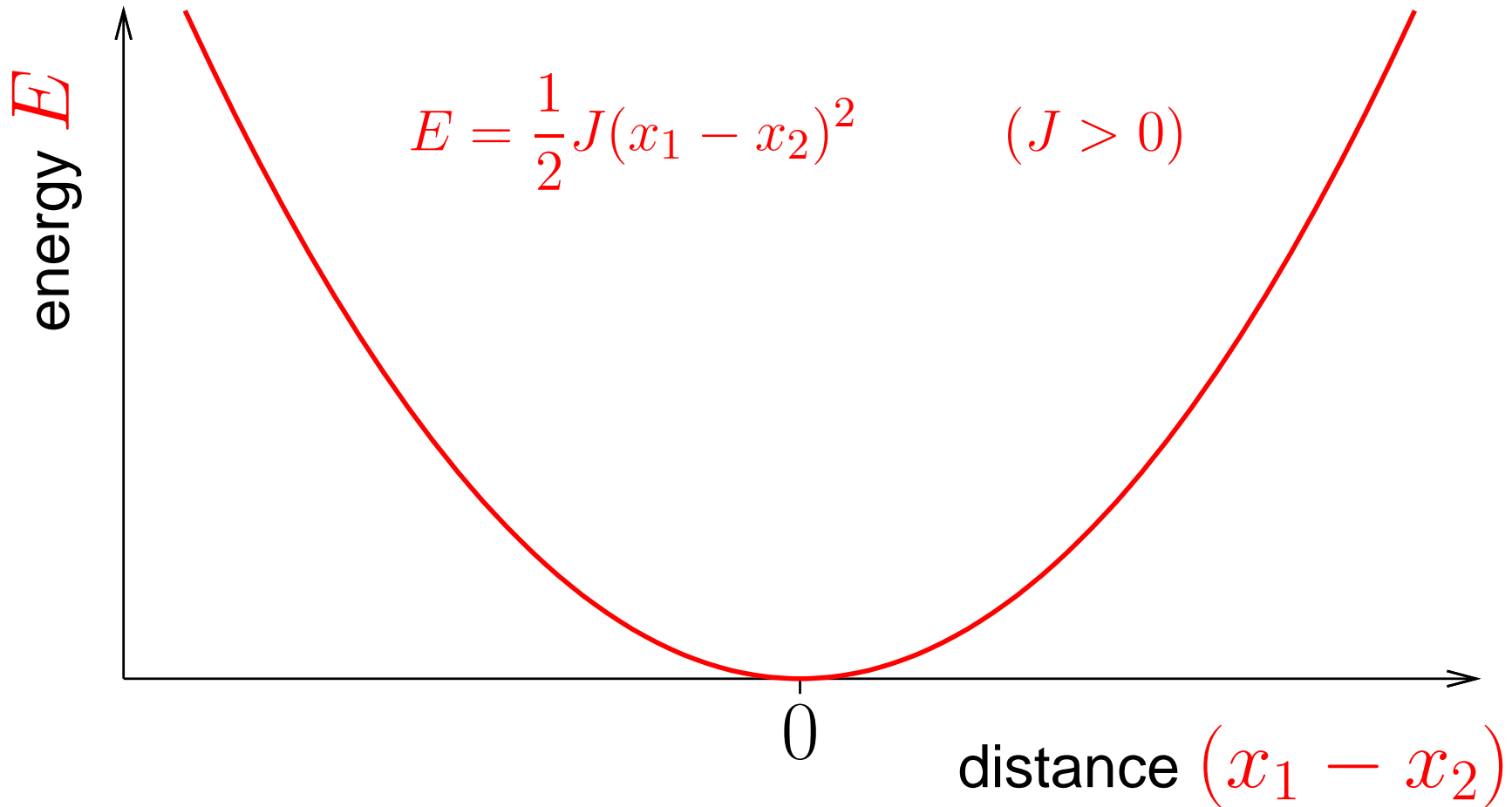
One particle tied to the origin by a spring.

# One particle (runaway)



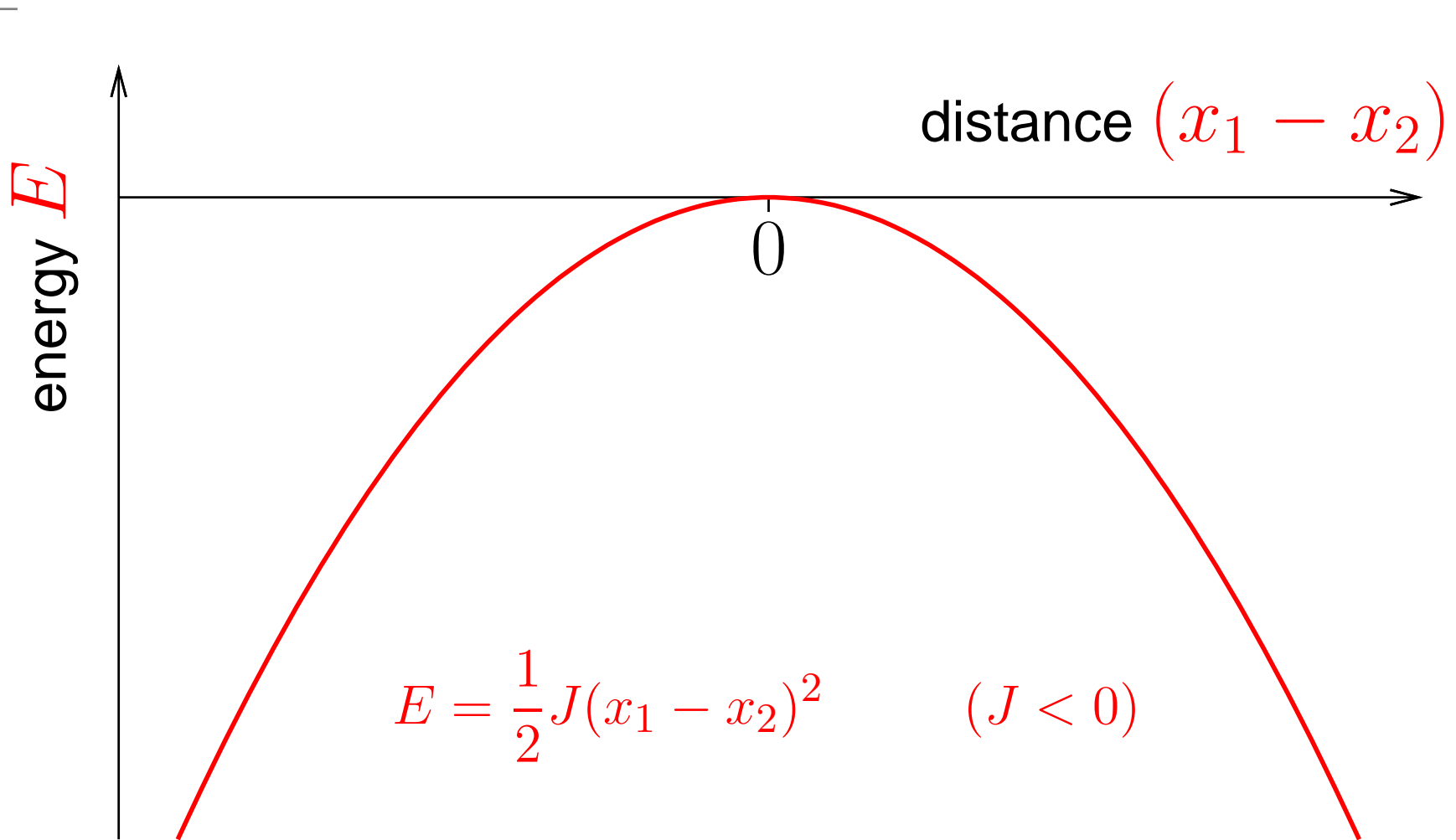
One particle repelled away from the origin by a anti-spring.

# Two attracting particles



Two particles tied to each other by a spring.

# Two repelling particles



Two particles repelling each other by a anti-spring.

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update : 
$$\begin{cases} x_i(t + \Delta t) = x_i(t) + v_i(t)\Delta t + \frac{1}{2} \frac{F(x_i) + F(\bar{x}_i)}{2} \Delta t^2 \\ v_i(t + \Delta t) = v_i(t) + \frac{F(x_i) + F(\bar{x}_i)}{2} \Delta t \end{cases} \quad \text{Verlet}$$

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$$E = - \sum_{i,j} J_{ij} S_i S_j$$

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Due to universality, many different systems can be described by this model: ferromagnetism or liquid gas transition for  $J_{ij} > 0$ ; antiferromagnetism for  $J_{ij} < 0$  in bipartite lattices; spin glasses for both positive and negative, random  $J_{ij}$ ; and Boolean systems in general.

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Onsager’s exact solution (1944) for the thermodynamic behaviour of the uniform ferromagnet in two dimensions is a paradigmatic scientific achievement.

# Back to the current model

$$\frac{1}{2}J_{ij}(x_i - y_j)^2 = \frac{1}{2}J_{ij}x_i^2 + \frac{1}{2}J_{ij}x_j^2 - J_{ij}x_ix_j$$



# Back to the current model

“external” potential

$$\frac{1}{2}J_{ij}(x_i - y_j)^2 = \overbrace{\frac{1}{2}J_{ij}x_i^2 + \frac{1}{2}J_{ij}x_j^2} - \underbrace{J_{ij}x_ix_j}_{\text{interaction}}$$

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That is why I called it **Dynamic Ising Model**.

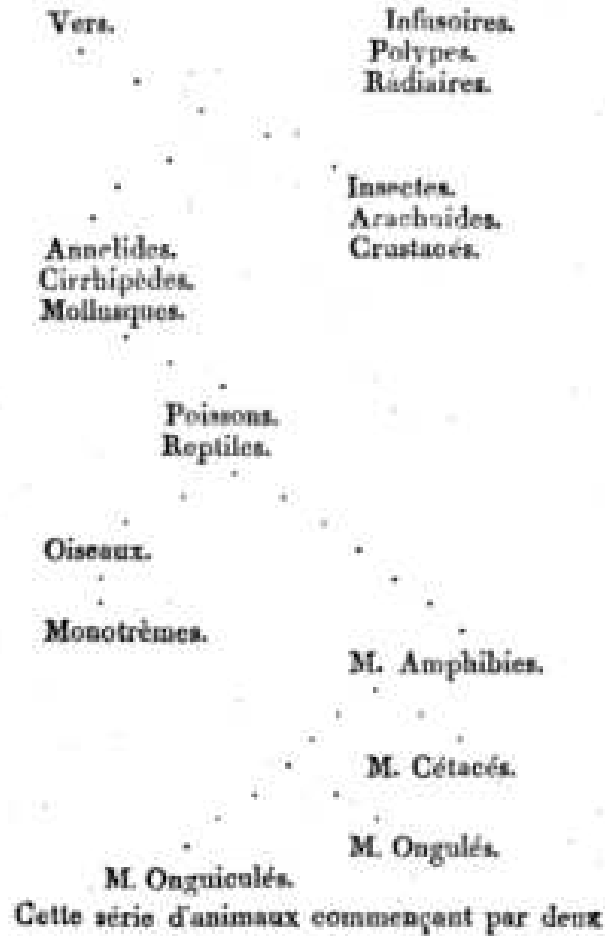
# The first evolutionary tree

ADDITIONS.

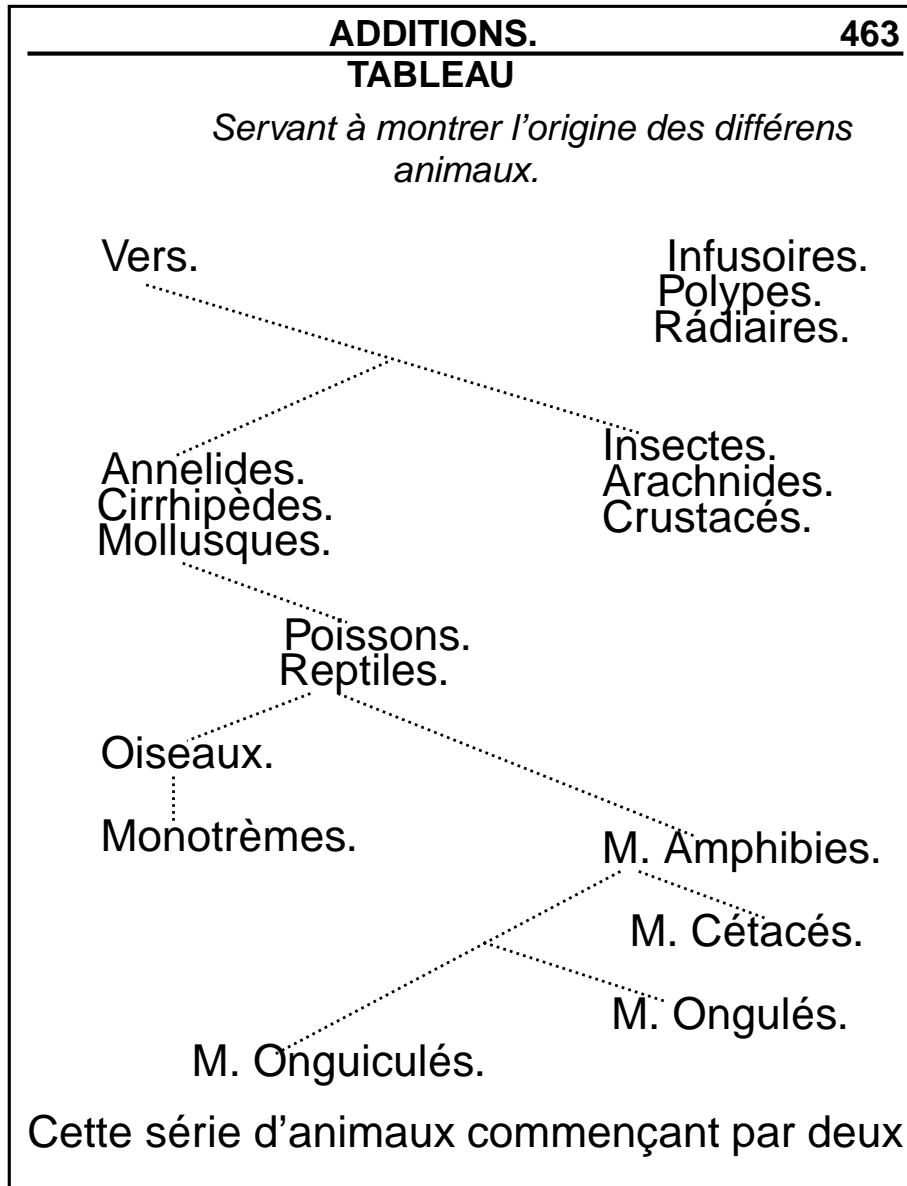
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## T A B L E A U

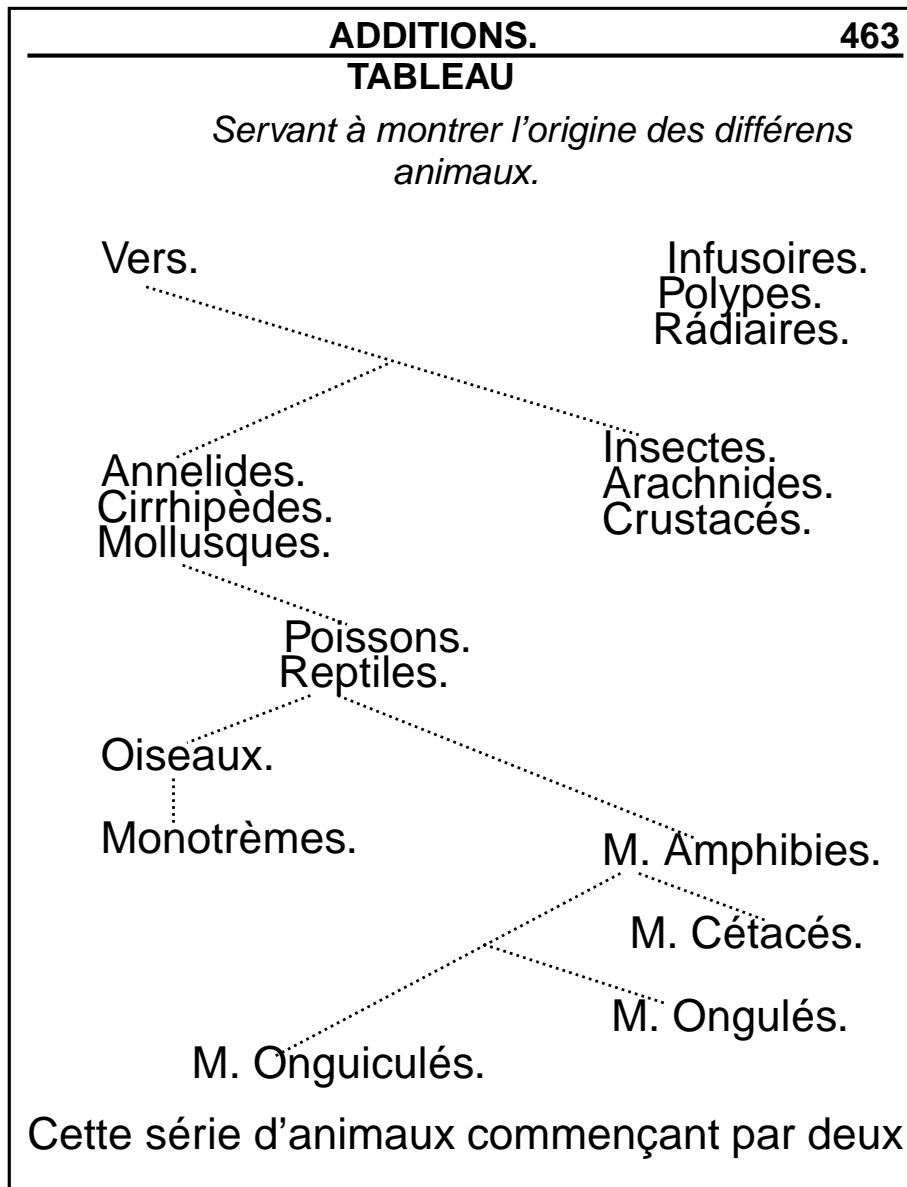
*Servant à montrer l'origine des différens animaux.*



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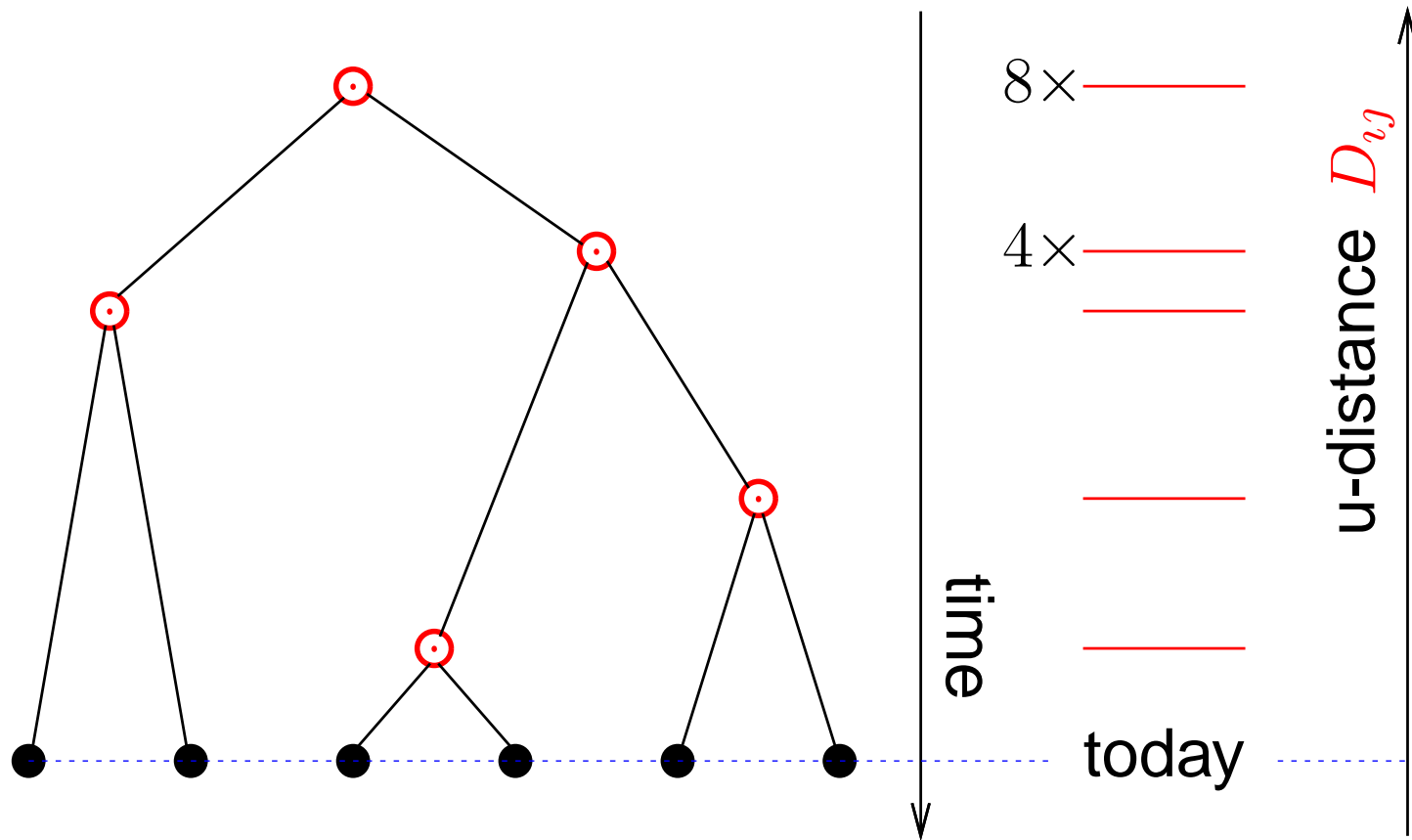


La Philosophie  
Zoologique

Lamarck  
(1809)

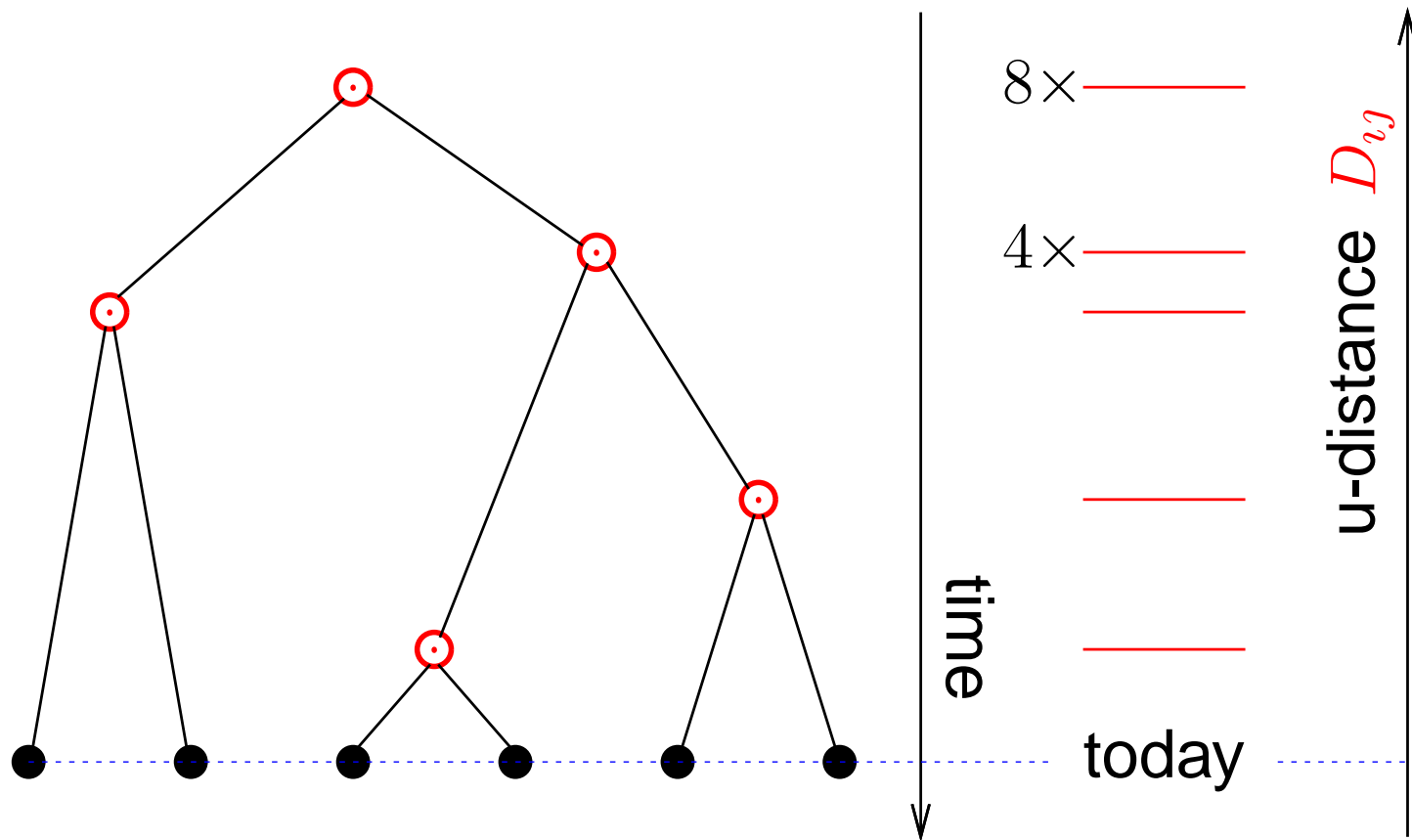
Darwin's  
birth year

# Another evolutionary tree





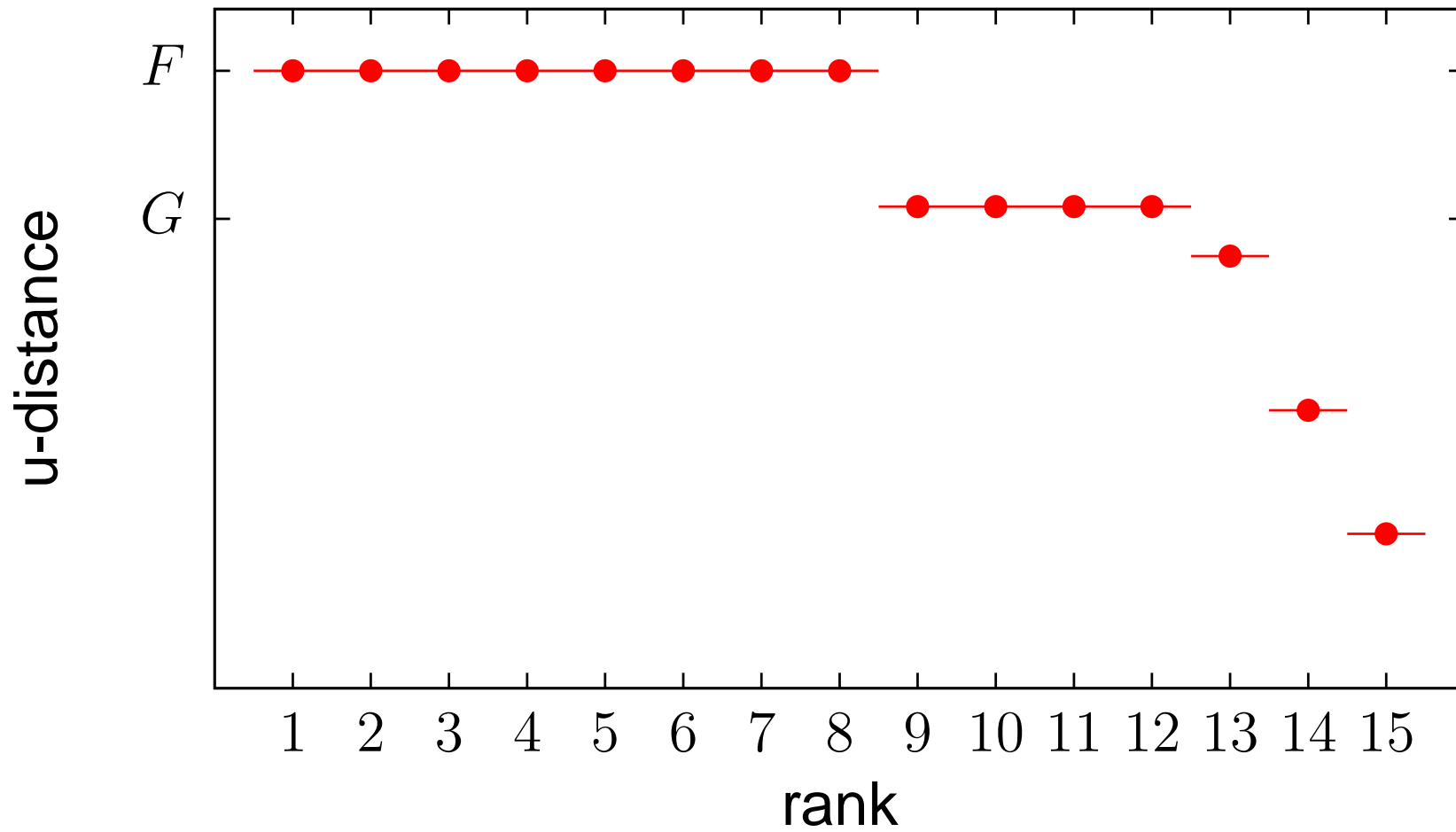
# Another evolutionary tree



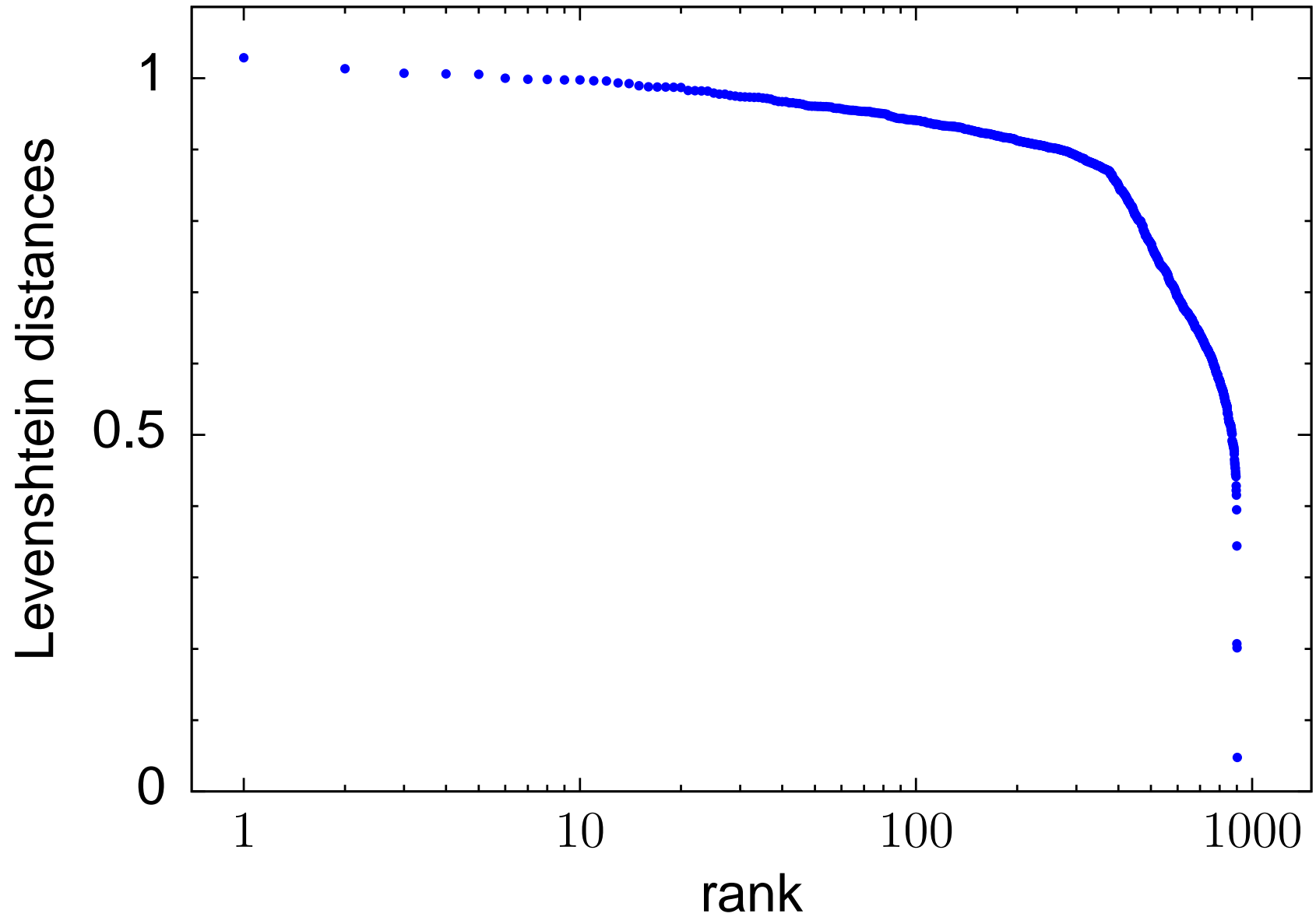
$$J_{ij} = D - D_{ij}$$

Parameter  $D$  is adjusted in between the two higher levels.

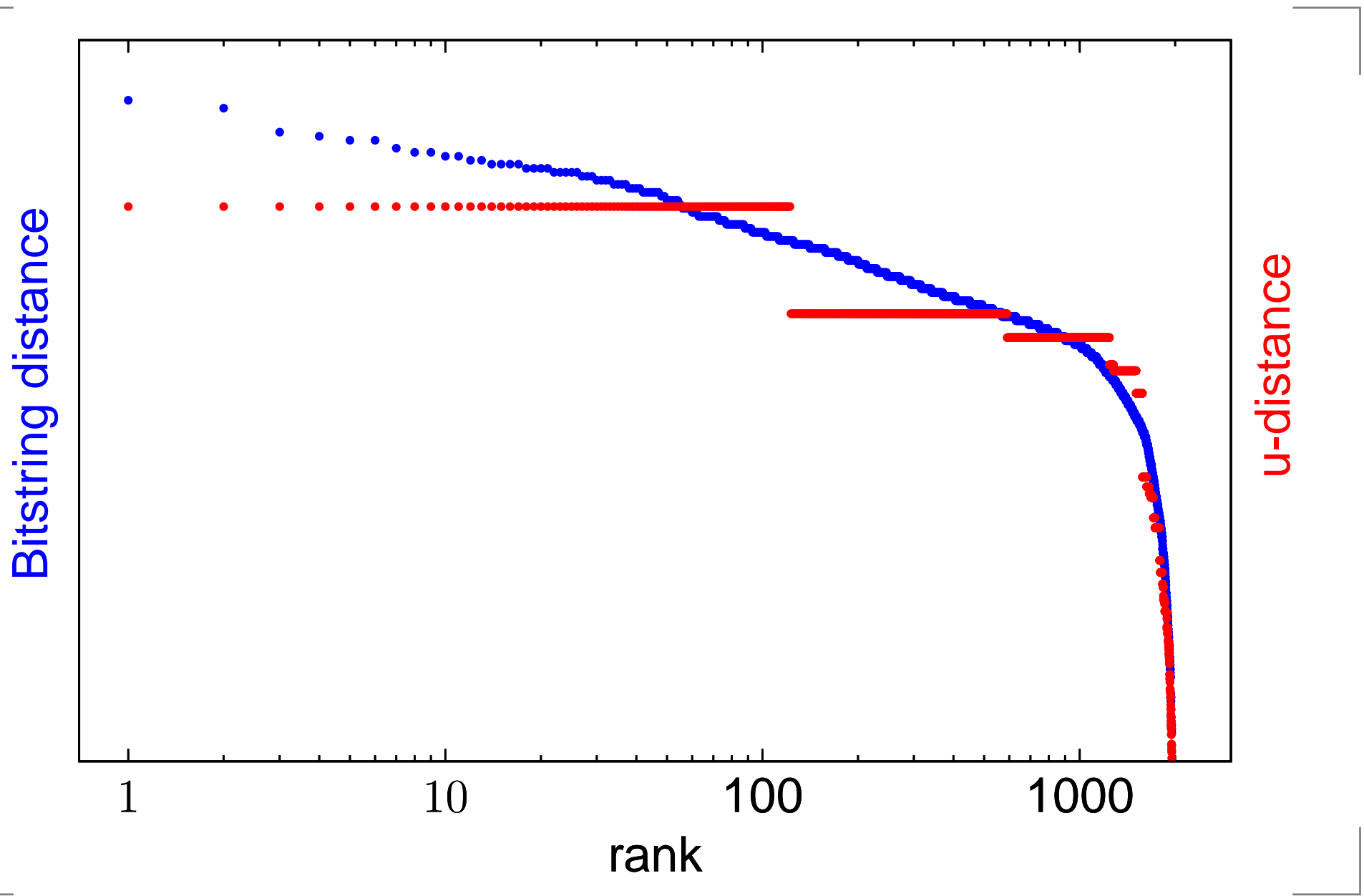
# Rank plot, same tree



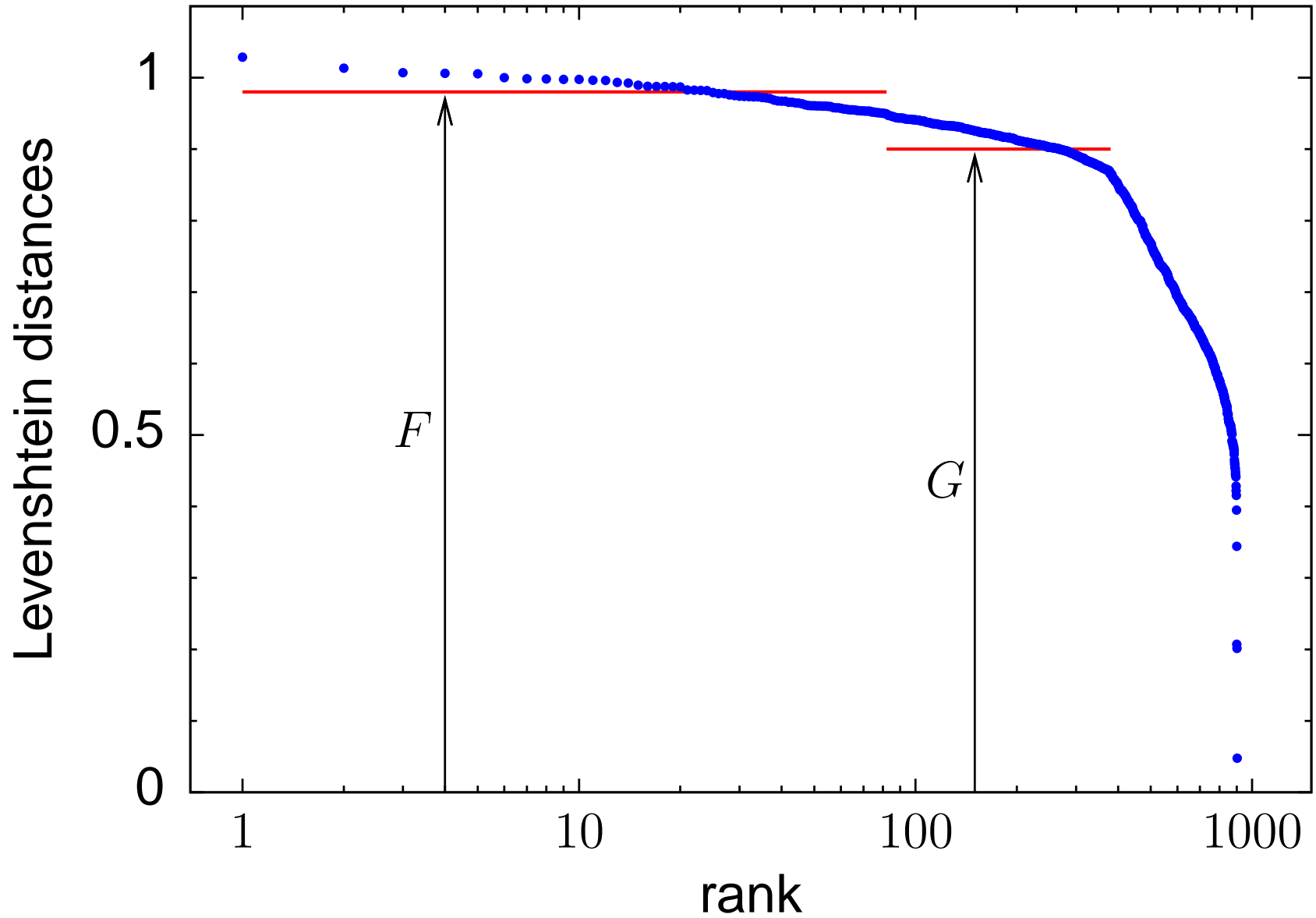
# Tupian family, 43 languages



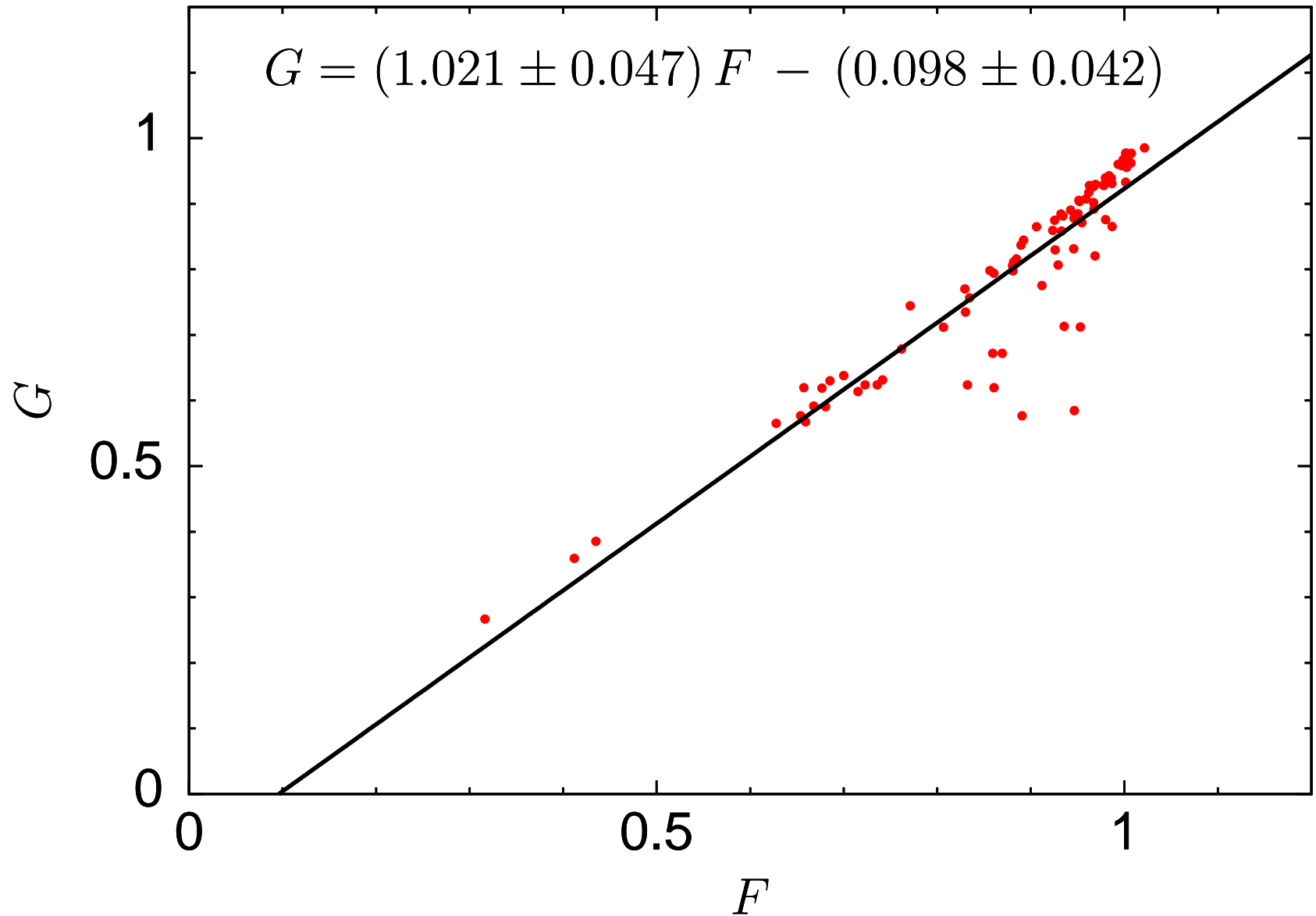
# Simulated tree, 63 languages



# Measures for each real family



# 89 real families



# Our group at UFF

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Jürgen Stilck  
Marcio Argollo de Menezes  
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Daniel Girardi (UFF-VR)  
Nestor Oiwa (UFF-Friburgo)  
Aquino Espíndola (UFF-VR)  
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Adriano Sousa (UFRN)  
Armando Ticona (La Paz)  
Karen Burgoa (UFLa)  
Veit Schwaemmle (Stuttgart)  
Cinthya Chianca (Austrália)  
Klauko Mota  
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