

# Phylogenies (aka Evolutionary Trees)

## CSE 527 Autumn 2009

### 10. Parsimony and Phylogenetic Footprinting

“Nothing in biology makes sense, except in the  
light of evolution”

-- Theodosius Dobzhansky, 1973

## Parsimony

A Complex Question:

Given data (sequences, anatomy, ...) infer the  
phylogeny

A Simpler Question:

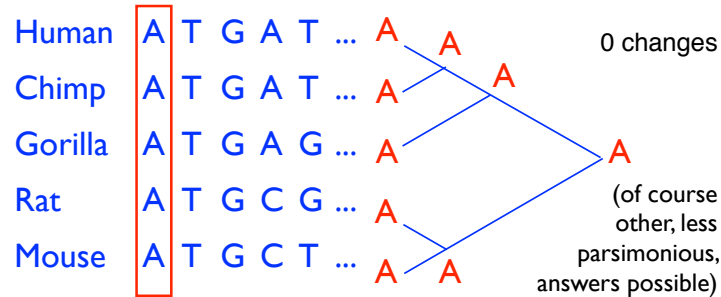
Given data *and* a phylogeny, evaluate “how  
much change” is needed to fit data to tree

General idea ~ Occam’s Razor:  
Given data where change is rare, prefer  
an explanation that requires few events



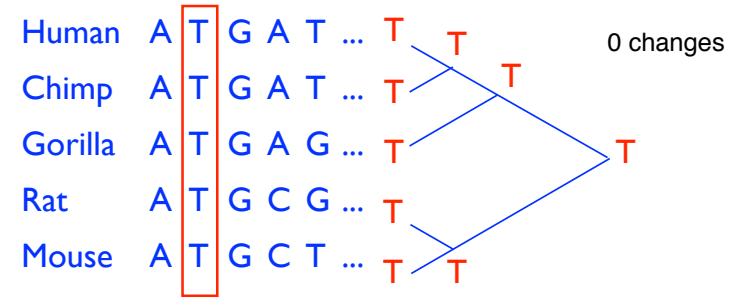
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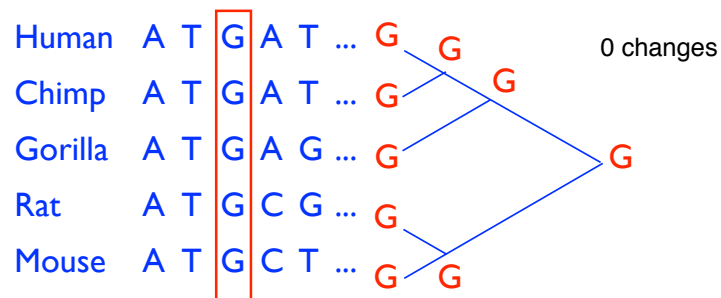
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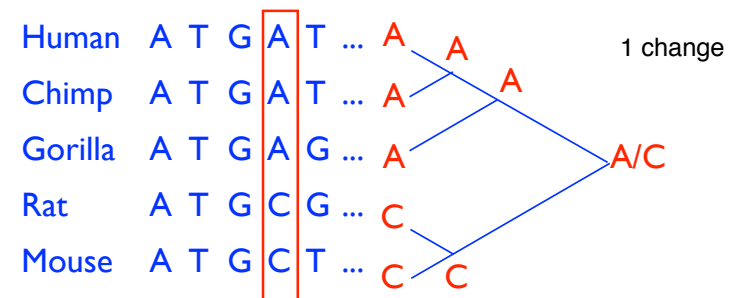
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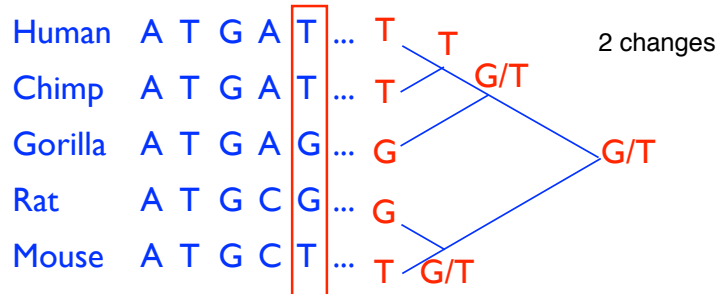
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# Counting Events Parsimoniously

Lesson of example – no unique reconstruction

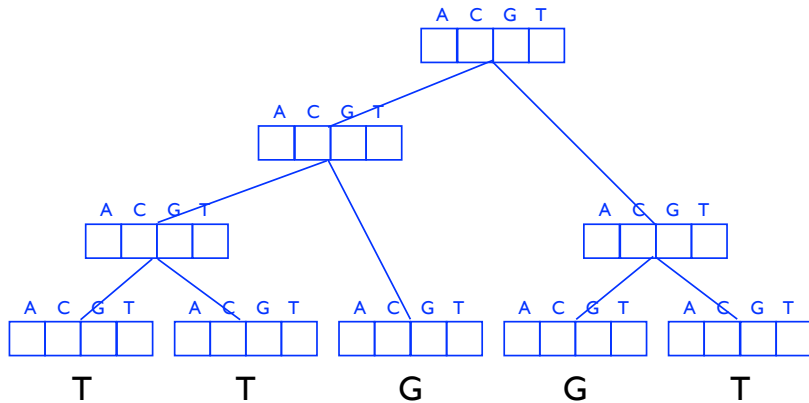
But there is a unique minimum number, of course

How to find it?

Early solutions 1965-75

# Sankoff & Rousseau, '75

$P_u(s)$  = best parsimony score of subtree rooted at  
 node  $u$ , assuming  $u$  is labeled by character  $s$



# Sankoff-Rousseau Recurrence

$P_u(s)$  = best parsimony score of subtree rooted at  
 node  $u$ , assuming  $u$  is labeled by character  $s$

For Leaf  $u$ :

$$P_u(s) = \begin{cases} 0 & \text{if } u \text{ is a leaf labeled } s \\ \infty & \text{if } u \text{ is a leaf not labeled } s \end{cases}$$

For Internal node  $u$ :

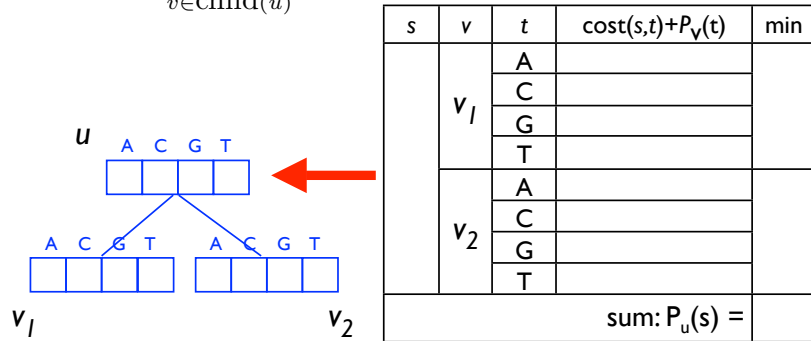
$$P_u(s) = \sum_{v \in \text{child}(u)} \min_{t \in \{A, C, G, T\}} \text{cost}(s, t) + P_v(t)$$

Time:  $O(\text{alphabet}^2 \times \text{tree size})$

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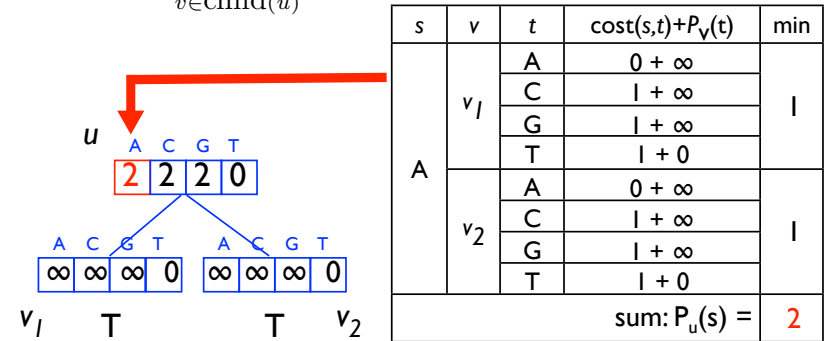
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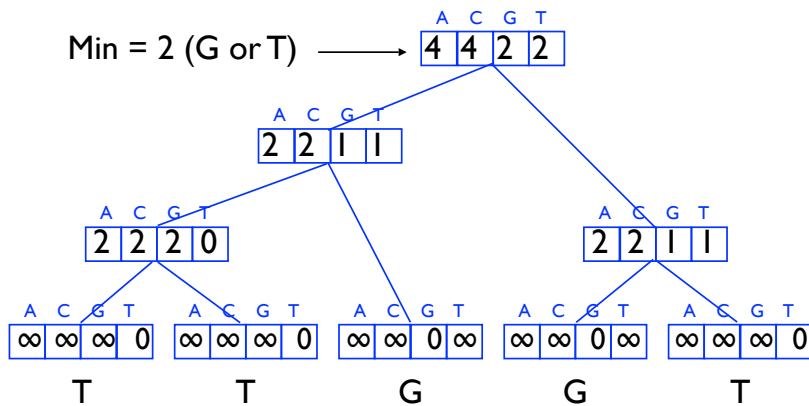
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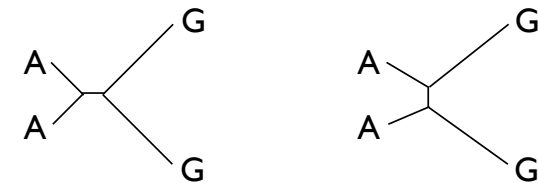


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# Which tree is better?



Which has smaller parsimony score?

Which is more likely, assuming edge length proportional to evolutionary rate?

# Parsimony – Generalities

Parsimony is not the best way to evaluate a phylogeny (maximum likelihood generally preferred - as previous slide suggests)

But it is a natural approach, works well in many cases, and is fast.

Finding the best tree: a much harder problem

Much is known about these problems; *Inferring Phylogenies* by Joe Felsenstein is a great resource.

# Phylogenetic Footprinting

See link to Tompa's slides on course web page  
<http://www.cs.washington.edu/homes/tompa/papers/ortho.ppt>