

# Space of Gene/Species Trees Reconciliations and Probabilistic Models

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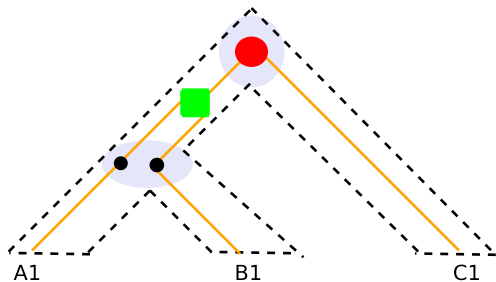
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Integrative Post-Genomics  
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## Gene Family Evolution

The evolution of a genome is determined by

Speciation (●), Duplication (■), and Loss (●).



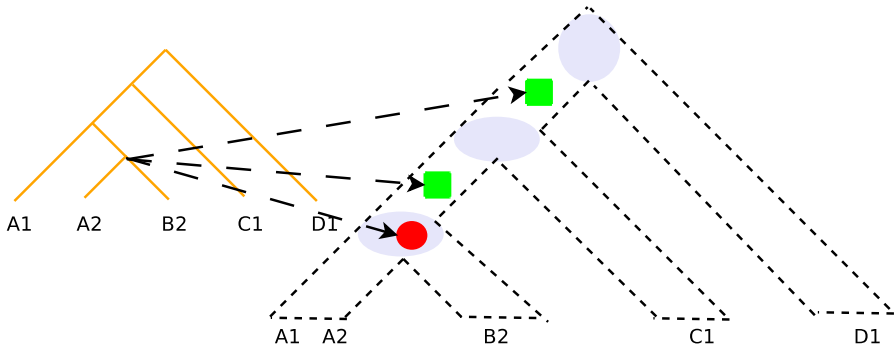
Why it is important to study the evolution of homologous genes?

- Orthologous and paralogous genes
- Gene content of ancestral genomes
- Phylogenomic

## The Problem

### The Main Question

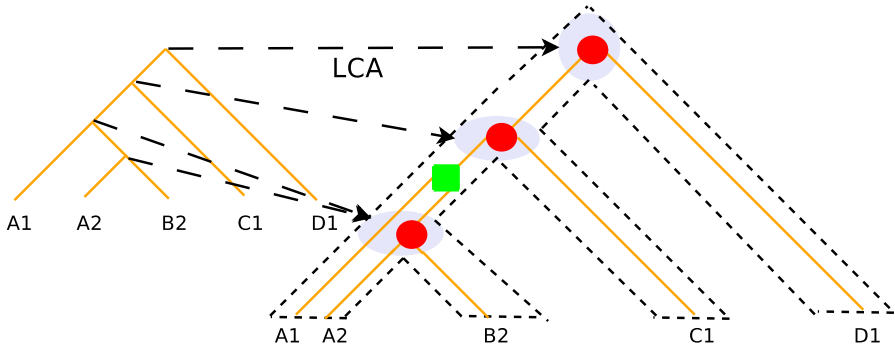
Define the evolution of the **Gene Tree** according to **Species Tree** in term of speciation, duplication, and loss events.



## Definitions

### The Most Parsimonious Reconciliation ( $\alpha_{min}$ )

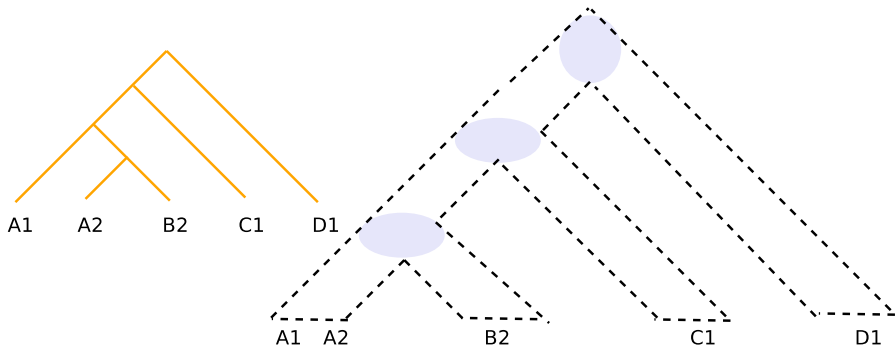
maps a gene  $u$  (of  $G$ ) the lowest possible in  $S$



## A more General Definition

### A Reconciliation between $G$ and $S$

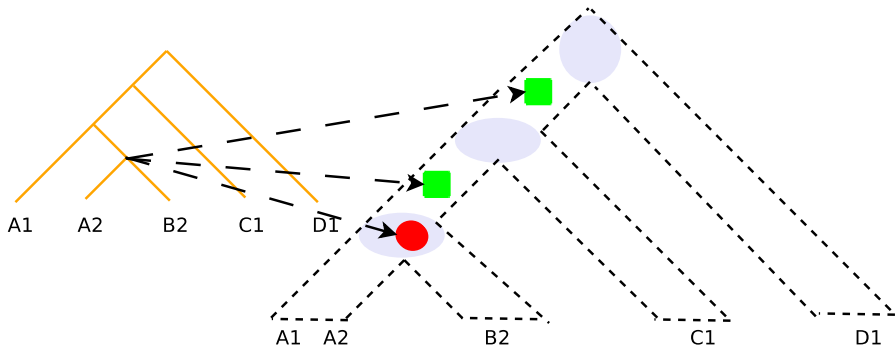
- Each internal node is mapped either on the LCA or on an edge above.
- Descendance Relationships.



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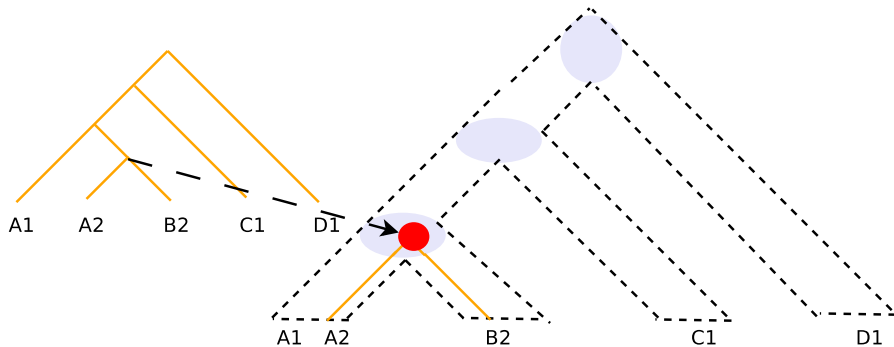
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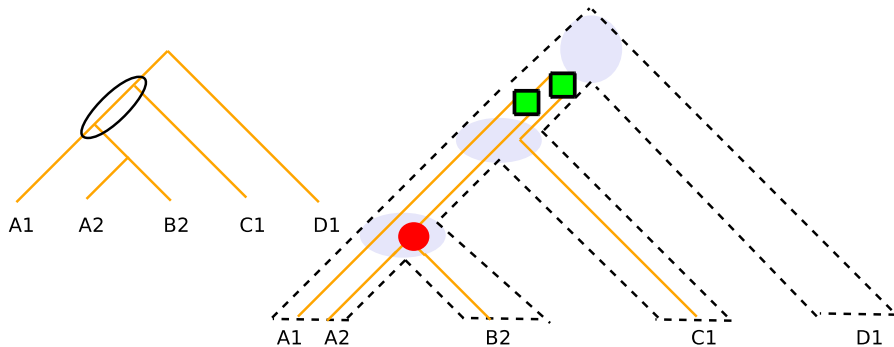
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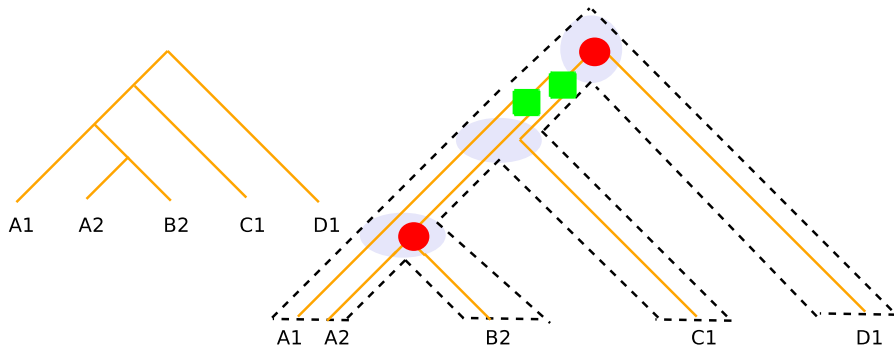




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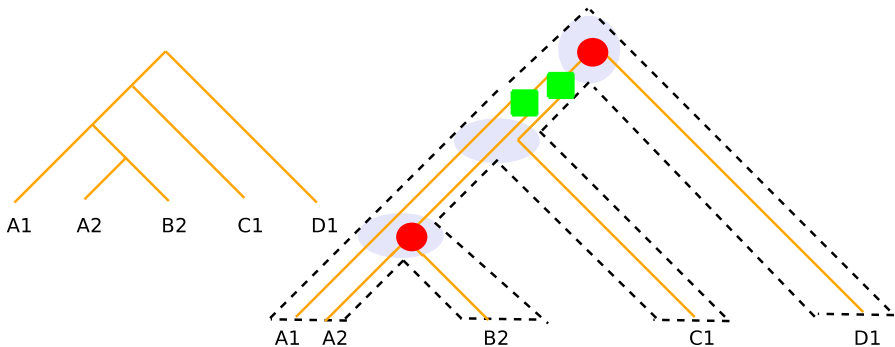
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## A more General Definition

### Properties

- Does not ONLY induce the LCA reconciliation.
- The number of reconciliations is finite, but can be exponential.



## Reconciliation Space Exploration

This simple definition allows

- Count the number of reconciliations.
- Generate randomly and uniformly a reconciliation.
- Define operators used to explore the whole space.
- Exhaustively explore the space.

# Counting and Randomization algorithms

## Counting the Number of Reconciliations

- Dynamic programming algorithm in  $O(|G||S|)$  time and space.

## Randomly Generate a reconciliation

- Algorithm in  $O(|G||S|)$  time and space.
- Uniform distribution over all reconciliations.

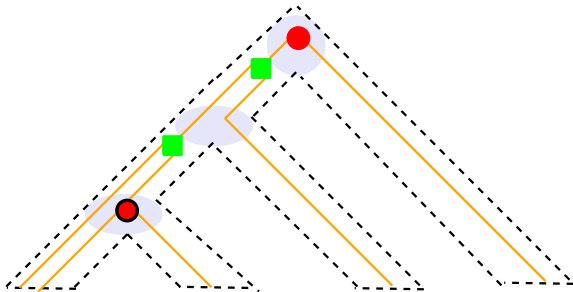
## Nearest Mapping Change

### Upward NMC

- Changes a speciation into a duplication.
- Moves a duplication upward.

### Downward NMC

- Changes a duplication into a speciation.
- Moves a duplication downward.



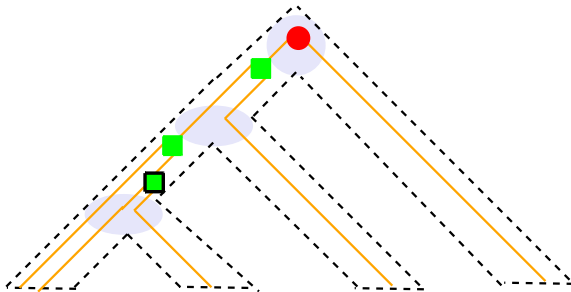
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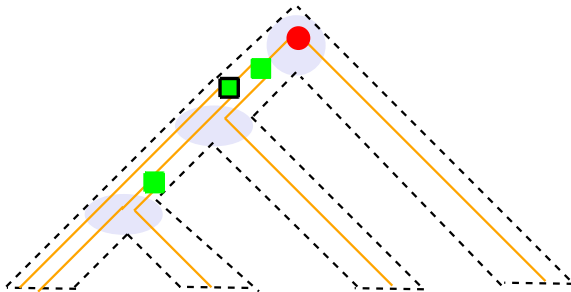
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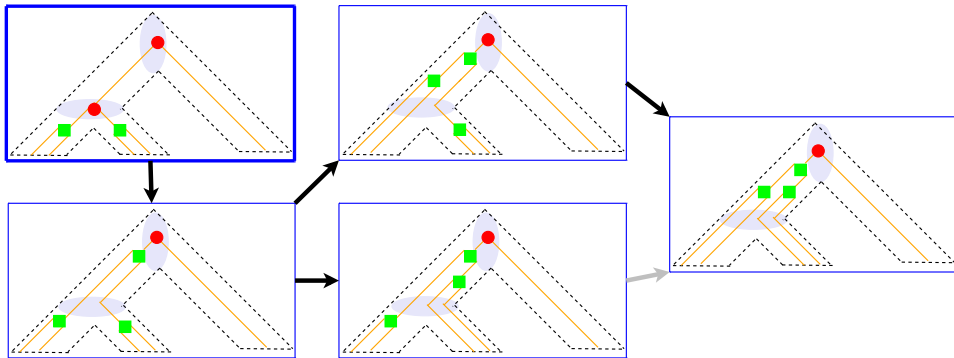
### Downward NMC

- Changes a duplication into a speciation.
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Sufficient to explore the whole space of reconciliations.

## Exhaustive Exploration



- Architecture rooted at  $\alpha_{min}$ ;
- Exploration of the whole space of reconciliations in time  $\Theta(\#rec)$ .



## Probabilistic framework

### Input data

- A gene tree  $G$  and a species tree  $S$ .
- Branch lengths (in time) and duplication/loss rates along  $S$ .

### Posterior Probability $P(\alpha|G)$

$P(G, \alpha)$  is the probability that the evolution of a gene along  $S$  generates

- the Gene Tree  $G$ ;
- and the Reconciliation  $\alpha$ .

$$\begin{aligned} P(\alpha|G) &= \frac{P(G, \alpha)}{P(G)} \\ &= \frac{P(G, \alpha)}{\sum_{\alpha' \in \mathcal{T}} P(G, \alpha')} \end{aligned}$$

## Experimental Results

Two expected observations....

### Whole Probability Mass

is technically covered by a small set of reconciliations located close to  $\alpha_{min}$ .

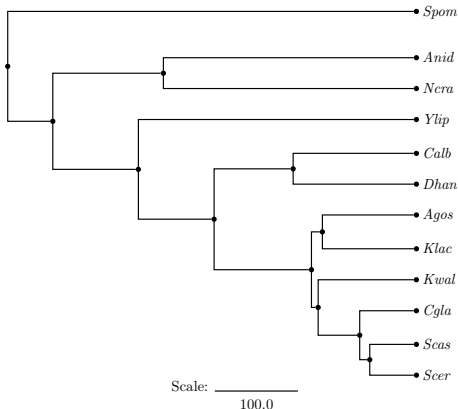
### Approximation of the Most Probable Reconciliations

can easily and efficiently be computed.

## Experimental Results

### Input Data

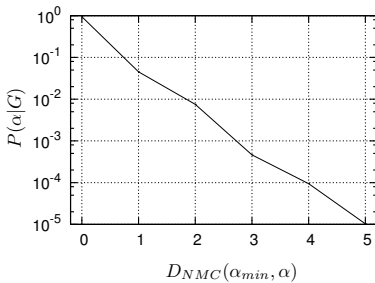
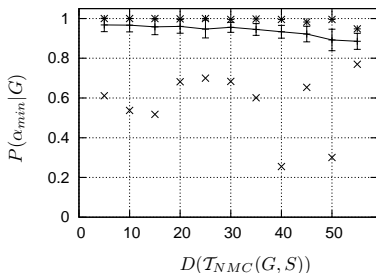
- 12 fungal genomes and 1278 gene family trees.
- Branch lengths computed by a Bayesian Framework.
- Branch rates estimated by an Expectation Maximization approach.



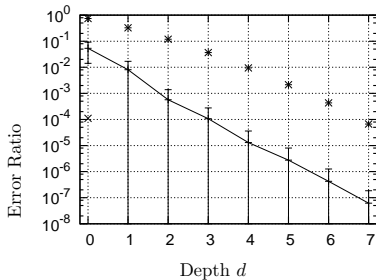
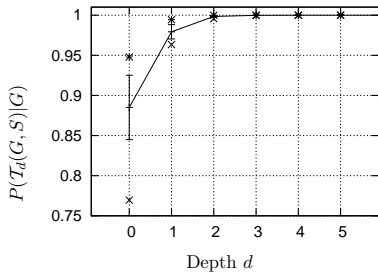
## Experimental Results

### 1278 Fungal gene trees

- In 1276 cases,  $\alpha_{min}$  is the Most Probable Reconciliation.
- $\alpha_{min}$  covers most of the Probability Mass.
- The more a reconciliation is located close to  $\alpha_{min}$ , the more it is probable.



## Experimental Results



$$\text{Error Ratio} = 1 - \frac{\text{approx}}{\text{exact}}$$

# Conclusion

## Main Observations

1. Small # of reconciliations are needed to approximate probabilities.
2. The neighborhood of  $\alpha_{min}$  “covers” the probability mass.
3. Similar results for synthetic gene trees generated with higher rates.

## Future Work

1. Higher rates along  $S$ .
2. Reconciliation spaces where  $\alpha_{min}$  is located far from  $\alpha^*$ ?
3. Reconciliation spaces with more than one peaks?
4. Similar Bayesian Framework for dup./loss rates probabilistic analysis.