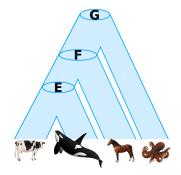
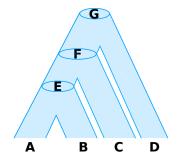
## **Computational Biology** Comparative Genomics and Phylogenies

Marc Hellmuth

Department of Mathematics Stockholm University

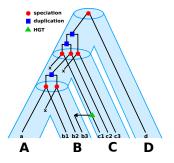




 species are characterized by its genome:
 a "bag of genes"

Genes" evolve along a *rooted* tree with unique coloring
 t: V<sup>0</sup> → M = {•, ■, ▲}

"×" = gene loss

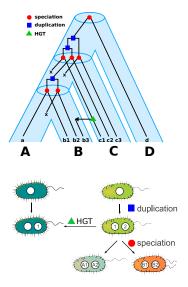


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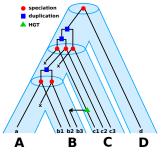
- Gene duplication : an offspring has two copies of a single gene of its ancestor
- Speciation : two offspring species inherit the entire genome of their common ancestor
- HGT : transfer of genes between organisms in a manner other than traditional reproduction and across different species



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#### Homology Relations [binary relations between genes]

Orthology and Paralogy (via vertex colors in *T*) Best Matches (evolutionary closest relatives) Xenology (HGT on the path between two genes)



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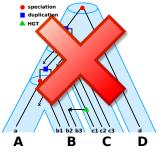
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gene functions & genome annotation  $\to$  medicine, drug development,  $\ldots$  understanding mechanisms that act on genes reconstruction of species trees



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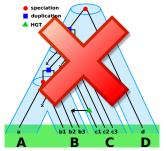
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# Plenty of homology relations exist and are defined in terms of the true history

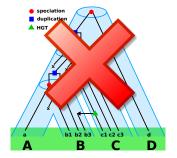


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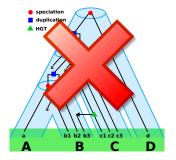
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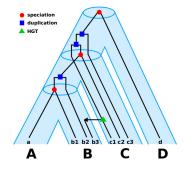
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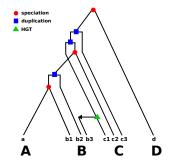
## What now?

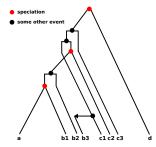
In the following, we will have closer look to two fundamental homology relations:

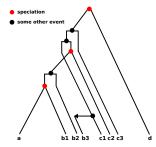
Orthology and Xenology

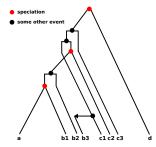






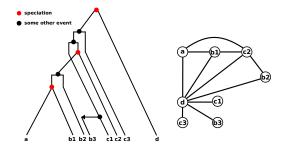






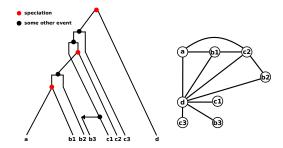
#### **Mathematical Translation:**

Given the *true* gene tree T = (V, E) with coloring  $t: V^0 \to \{\bullet, \bullet\}$ . Two leaves *x* and *y* of *T* are orthologs, if  $t(\operatorname{lca}_T(x, y)) = \bullet$ .



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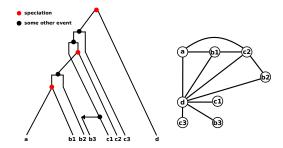
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Observation: *R*• has a precise mathematical definition in terms of the *true* history – *which is unkown!* 

#### **Tree-based inference**

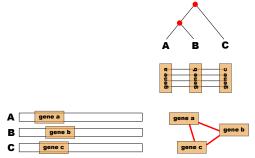
- $\blacktriangleright$  construct gene and species trees and find reconciliation map  $\mu$  between them
- based on the placing of vertices in gene tree to species tree on infers speciation events

## **Graph-based inference**

no tree required

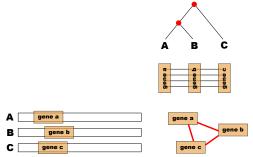
Typically run in two phases:

- a graph construction phase, in which pairs of orthologous genes are inferred and connected by edges
- a clustering/clean-up phase, in which (groups of) orthologous genes are constructed/extracted based on the structure of the graph



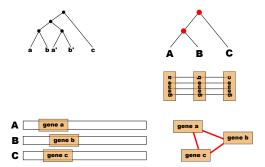
#### **Compute Species Tree:**

- Find 1:1-orthologs
  - = collection of genes such that from each species one gene and each gene is ortholog to all other genes in this collection
    - Select families of genes that rarely exhibit duplications (e.g. rRNAs, ribosomal proteins)



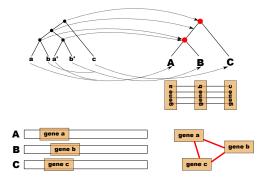
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- Alignments of protein or DNA sequences and standart techniques yield gene tree with speciation-events only This history is believed to be congruent to that of the respective species.



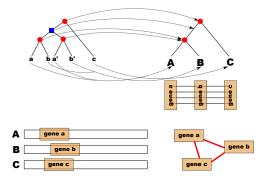
#### Compute Gene Tree without events:

Alignments of protein or DNA sequences and standart techniques



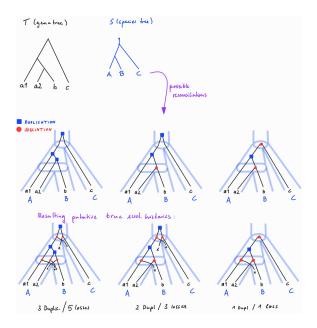
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#### **Compute Events of Gene Tree:**

- Find reconciliation map μ w.r.t. certain optimization criteria
  (e.g. parsimony = minimize number of losses and duplications)
- Use  $\mu$  to infer the events (and thus orthology, paralogs, ...)



- Compute Species Tree
  - some orthologs must already be known!
  - since only 1:1 orthologs are used, ~ 90% of the genetic sequence material remains unused

## Compute Gene Tree + Reconciliation

Methods that allow to reconstruct the history of arbitrary genes rely on "restrictive" evolutionary models (e.g. event probabilities, maximum parsimony)

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Reconstruction of species trees requires identifying events of the family evolution

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## **Orthology-Inference: Graph-based**

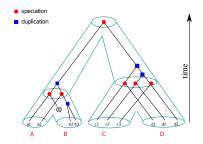
#### A perfect Example (no HGT):

- ► T gene tree, S species tree
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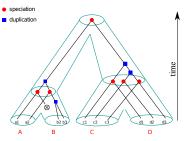


Orthologs tend to be the homologs that diverged least. Why?

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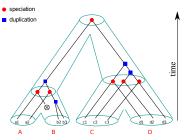


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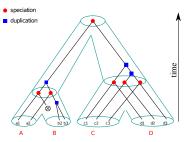


#### True divergence times of genes/species not known!

BUT: Sequence similarity sim(x, y) can be measured.

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#### Not too weired mutation rates:

(No const. mol. clock assumption!)

 $t_T(x,y) \le t_T(x,y') \iff sim(x,y) \ge sim(x,y')$ "closer related, higher similarity"

In Practice (e.g. ProteinOrtho):

- ► *T* gene tree, *S* species tree
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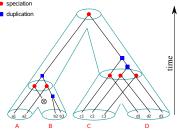
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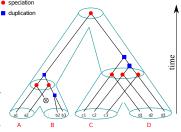
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Exmpl:  $sim(a2, b2) \ge sim(a2, b3)$ 

 $sim(b2, a2) \ge sim(b2, a1))$ 

 $\implies$  a2 and b2 are "estimated" orthologs



(b2 is one of the genes in B that is "closest" to a2)

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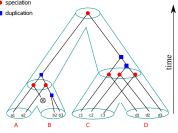
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Exmpl:  $sim(a1, b2) \ge sim(a1, b3)$ (b2 is one of the genes in B that is "closest" to a1) $sim(b2, a1) \ge sim(b2, a2)$ (a1 is not "closest" to b2 among the genes in A) $\implies$  a1 and b2 will not be estimated as orthologs



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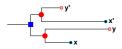
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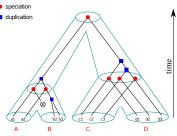
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This cannot work perfectly:







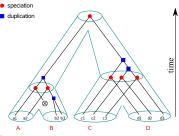
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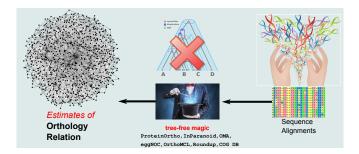
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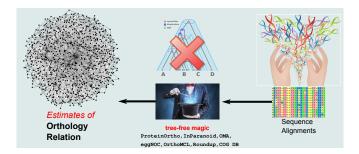
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Estimates of orthologs rely on reciprocal best match (RBM) heuristics.





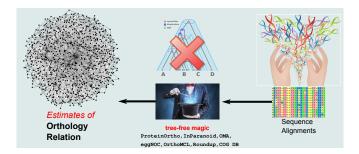
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Ask for an event-labeled gene tree that supports our observation.



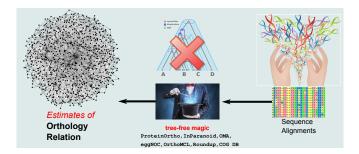
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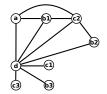
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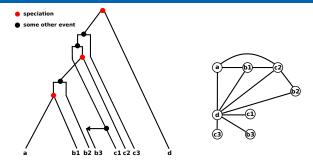
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#### Theorem

The following statements are equivalent:

- An (estimated) orthology relation is feasible.
- Its graph-representation does not contain induced P<sub>4</sub>s.
- Its graph-representation is a cograph.

terminology + proof in whiteboard

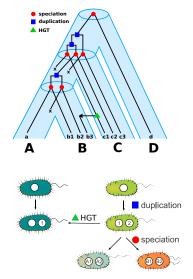


 species are characterized by its genome: a "bag of genes"

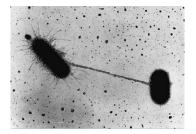
Genes" evolve along a *rooted* tree with unique coloring
 t: V<sup>0</sup> → M = {●, ■, ▲}

"×" = gene loss

- Gene duplication : an offspring has two copies of a single gene of its ancestor
- Speciation : two offspring species inherit the entire genome of their common ancestor
- HGT : transfer of genes between organisms in a manner other than traditional reproduction and across different species



#### Bacteria to Bacteria:





HGT is a significant cause of increased drug resistance when one bacterial cell acquires resistance, and the resistance genes are transferred to other species.

Stearns and Hoekstra, Evolution: An introduction (2nd ed.), Oxford Univ. Press, 2005

Barlow, What antimicrobial resistance has taught us about horizontal gene transfer, Methods in Molecular Biology. 532: 397-411, 2009

Hawkey and Jones, The changing epidemiology of resistance, Journal of Antimicrobial Chemotherapy. 64 (Suppl 1): i3-10., 2009

#### **Bacteria to Animals:**



A bacterial gene discovered in the genome of the *coffee berry borer beetle*, a major pest, allows the beetle to occupy a unique ecological niche and feed exclusively on coffee beans.

The transferred gene, which lets the beetle break down complex sugars in the coffee bean, came from the beetle's gut bacteria.

Acuna et al. , Adaptive horizontal transfer of a bacterial gene to an invasive insect pest of coffee, PNAS. 109 (11): 4197-4202, 2012

Phillips, Bacterial gene helps coffee beetle get its fix, Nature News, 2012

### Fungi to Animals:



In the *pea aphid* (Erbsenlaus) red and green color insects frequently coexist in natural populations.

Color polymorphism in the pea aphid is determined by carotenoid genes that were transferred from a fungus.

Pea aphids are the only animals the can synthesize carotenoid and thus, to produce the red pigment carotin. Due to a symbiosis with a bacteria, some of the pea aphids are colored green.

Moran and Jarvik, Lateral Transfer of Genes from Fungi Underlies Carotenoid Production in Aphids, Science. 328 (5978): 624-627, 2010

### Fungi to Animals:



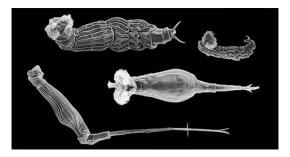
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Natural enemies: *lady beetles* preferentially attack red aphids on green plants, *parasitoid wasps* deposit eggs in green aphids more frequently. **HYP:** Opposite predation and parasitism pressures maintain the color variation in the aphid populations.

Moran and Jarvik, Lateral Transfer of Genes from Fungi Underlies Carotenoid Production in Aphids, Science. 328 (5978): 624-627, 2010

#### Bacteria/Fungi to Animals:

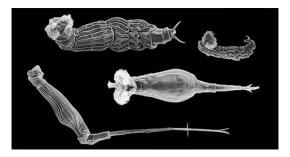


Bdelloid rotifers currently hold the 'record' for HGT in animals with  ${\sim}8\%$  of their genes from bacterial origins.

Watson, Bdelloids Surviving on Borrowed DNA, Science/AAAS News, 2012

Crisp et al. , Expression of multiple horizontally acquired genes is a hallmark of both vertebrate and invertebrate genomes, Genome Biol. 16: 50, 2015

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Bdelloid rotifers currently hold the 'record' for HGT in animals with  ${\sim}8\%$  of their genes from bacterial origins.

A study found the genomes of 40 animals (including 10 primates, four Caenorhabditis worms, and 12 Drosophila insects) contained genes which had been transferred from bacteria and fungi by HGT.

Watson, Bdelloids Surviving on Borrowed DNA, Science/AAAS News, 2012

Crisp et al. , Expression of multiple horizontally acquired genes is a hallmark of both vertebrate and invertebrate genomes, *Genome Biol.* 16: 50, 2015

#### Plant to Plant





*Ferns* have the neochrome-gene that allows them to "produce" an unconventional photoreceptor that senses both blue *and* red light, affording ferns a unique advantage in forests shaded by flowering plants.

This neochrome-gene is not part of any other "higher" plant.

There is strong evidence that Ferns acquired the neochrome-gene from the moss-like plant *Hornwort* via HGT.

Li et al. , Horizontal transfer of an adaptive chimeric photoreceptor from bryophytes to ferns, PNAS 111:18, 6672-6677, 2014

Zimmer, Plants That Practice Genetic Engineering, New York Times, 2015

### Artificial HGT (genetic engineering)



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**1973 - 1982:** Normally insulin is produced in the pancreas, but in people with type-1 diabetes there is a problem with insulin production and thus, they have to inject insulin to control their blood sugar levels.

Genetic engineering has been used to produce a type of insulin, very similar to our own, from yeast and bacteria like E. coli.

This genetically modified insulin, "Humulin" was licensed for human use in 1982.

Cohen et al. , Construction of biologically functional bacterial plasmids in vitro, PNAS 70: 3240-3244, 1973

### Artificial HGT (genetic engineering)





**2001:** Enviropig (Frankenswine) - "greener" and cheaper pig.

Golovan et al. , Pigs expressing salivary phytase produce low-phosphorus manure, Nature Biotechnology 19(8): 741-5, 2001

### Artificial HGT (genetic engineering)





**2011:** Glow-in-the-dark cats; Scientists in South Korea altered the DNA (using jellyfish genes) of a kitty so that its fur would glow in the dark.

Wongsrikeao et al. , Antiviral restriction factor transgenesis in the domestic cat, Nature Methods 8, 853-859, 2011

### Artificial HGT (genetic engineering)



**August 2017:** For the first time, scientists corrected a heart-disease-causing mutation in early stage human embryos with gene editing.

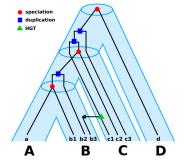
Using the CRISPR-Cas9 method, they corrected the mutation within the embryo and so, the defect would also not be passed on to future generations.

Hong Ma et al., Correction of a pathogenic gene mutation in human embryos, Nature 548, 413-419, Aug. 2017

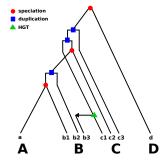
### Artificial HGT (genetic engineering)



### We consider here non-artificial HGT.



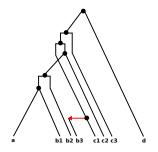
Two genes are homologs if they share a common ancestor in the *true* history. Two genes x and y are xenologs if there was a transfer along the path between x, y in the *true* history.



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#### **Mathematical Translation:**

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- $\blacktriangleright$  construct gene and species trees and find reconciliation map  $\mu$  between them
- based on the placing of vertices in gene tree to species tree on infers HGT-edges

### Parametric inference

- no tree required
- use certain characteristics of the genome sequences under consideration
  - If some fragment or gene of the genome significantly deviates from the characteristics, this is a sign for putative HGT
- requires description of what defines a "typical" gene in terms of parameters such as nucleotide composition (e.g. the GC-content), oligonucleotide frequencies, or other structural features.

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#### Theorem

The following statements are equivalent:

- An (estimated) xenology relation is feasible.
- 2 Its graph-representation does not contain induced  $K_1 + K_2 s$ .
- Its graph-representation is a complete multipartite graph.

terminology + proof in whiteboard