

# Orthology Analysis

part of “Graphen und Netzwerke in der Biologie”

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# Deriving orthology information from multiple genomes

- **given:** gene inventory of multiple genomes
- **to be found:** sets of orthologous genes
- **approach:** pairwise reciprocal best alignment heuristic
- **idea:** compute alignments between genes of different genomes, construct a graph  $\vec{\Gamma}$  with genes as nodes, alignments as edges and edge weights  $\omega_{x \rightarrow y}$  holding the bit score (similarity measure).

# Translating the task into a graph theoretic problem

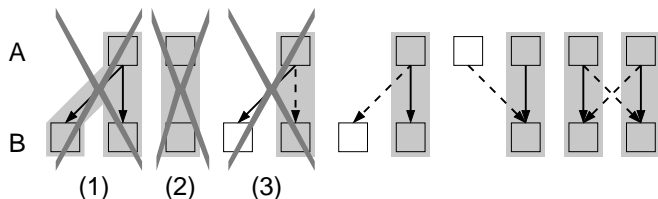
Orthologous sets detection = finding *nearly* disjoint maximal *nearly*-complete multipartite subgraphs in the edge-weighted directed graph  $\vec{\Gamma}$ .

**multipartite graph** ... a graph whose vertices can be divided into  $n$  disjoint sets such that every edge connects a vertex from  $A$  to a vertex from  $B$  for all pairs of sets, while  $A$  and  $B$  is such a pair of disjoint sets and  $B \neq A$  ( $n$  is the number of genomes, each  $U$  is the set of genes of one species).

**complete directed graph** ... directed graph in which every pair of distinct vertices is connected by two edge, one in either direction.

# idealized dataset

- each protein  $x$  from species  $A$  has at most one ortholog in any other species  $B \neq A$
- if  $y \in B$  is an ortholog of  $x \in A$ ,
  - then a search of  $x$  against  $B$  yields at least one alignment
  - and the unique best alignment of query  $x$  against  $B$  is the true ortholog  $y$  of  $x$



**grey shadows:** true orthology relations

**solid arrows:** refer to the best alignment

**dotted arrows:** refer to alignments other than the best one

**cases (1)-(3)** cannot occur by definition of an idealized dataset

# reciprocal pairwise best alignment heuristic

construct a subgraph  $\vec{\Upsilon}_{RBAH}$  of  $\vec{\Upsilon}$  such that for each protein  $x$  in species  $A$  and a given species  $B \neq A$  only the edge with maximal weight is retained:

$$(x \rightarrow y) \in \vec{\Upsilon}_{RBAH} \text{ iff } \omega_{x \rightarrow y} = \max_{y' \in B} \omega_{x \rightarrow y'} \quad (1)$$

The symmetric subgraph of  $\vec{\Upsilon}_{RBAH}$ , containing only reciprocal best alignments, can be regarded as an undirected graph  $\Upsilon_{RBAH}$ .

A directed graph  $D$  is symmetric

iff, for every directed edge  $(x \rightarrow y)$  in  $D$  the corresponding inverted edge  $(y \rightarrow x)$  also belongs to the graph  $D$ .

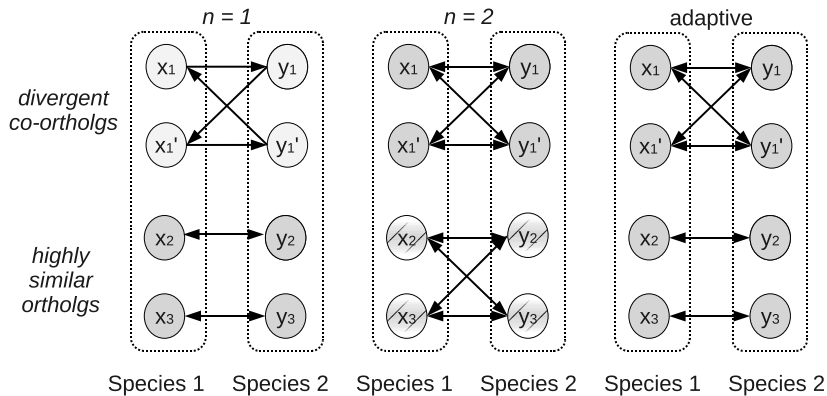
## What did we achieve so far?

- any two vertices are connected by edges in  $\Upsilon_{RBAH}$  if and only if they are orthologs
- a set of orthologs is a complete multipartite subgraph of  $\vec{\Upsilon}_{RBAH}$  in which every species is represented at most once.
- sets of orthologs correspond to the connected components of  $\vec{\Upsilon}_{RBAH}$

Holds for ideal data sets only!

# Handling of co-orthologs

- one-to-many and many-to-many orthology relations could be handled iff they all scored maximal
- they will show slightly different scores in real data



$n$  ... number of best alignments to include per protein (number of expected co-orthologs)

# Adaptive selection of the number of best alignments to include

introduce a cut-off value that depends on the quality of the matches, namely the maximal value multiplied with a factor  $f < 1$  (generally close to 1).

$$(x \rightarrow y) \in \vec{\Gamma}^* \text{ iff } \omega_{x \rightarrow y} \geq f \max_{y' \in B} \omega_{x \rightarrow y'} \quad (2)$$

This increases the number of edges among co-orthologs/in-paralogs and reduces spurious edges. (Some false positive and false negative edges remain.)