

# Molecular Phylogenies Without Aligned Sequences

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## What can be used?

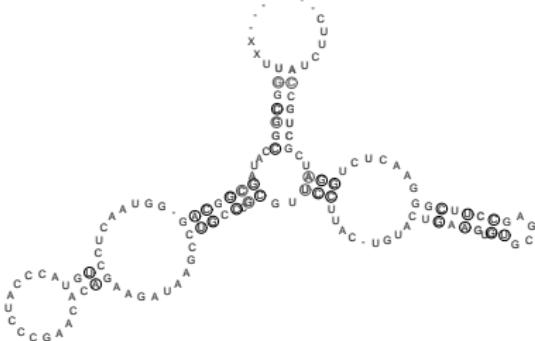
- ▶ “Molecular Morphology” of rRNAs  
(Caetano-Anollès, Misof)
- ▶ (Mitochondrial) Genome Structure  
(Sankoff, Boore, Warnow, . . . )
- ▶ Gene Content (Fitz-Gibbons, Snel)
- ▶ Repetitive Elements
- ▶ Presence/Absence of Phylogenetic Footprints  
(Prohaska et al)
- ▶ Structure of Metabolic Networks
- ▶ ???

## I. Phylogenetic Usage of RNA Structures

- ▶ SSU rRNAs are the most commonly used class of sequences in molecular phylogenetics
- ▶ LSU rRNAs are also regularly used in molecular phylogenetics
- ▶ The combined tRNA complement has been shown to contain phylogenetic information comparable to rRNAs
- ▶ Recent work indicates that other structured non-coding RNAs are phylogenetically informative
- ▶ RNA secondary structure is a valuable source of information
- ▶ EST sequencing covers a significant number of ncRNAs, many of which are structured

# Evolution of Structured RNA

- ▶ Sequences in stems evolve highly correlated



Sequence variation in stem regions of nine 5S rRNAs from Methanomicrobiales.

Almost all substitutions in stems **preserve** the structure.

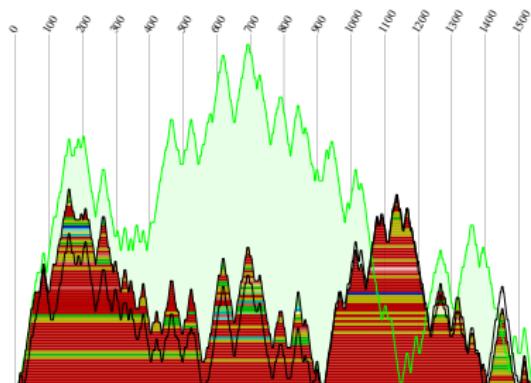
- ▶ **Consequences:**

- ▶ All methods that assume independent positions drastically overestimate statistical confidence.
- ▶ Incorrect substitution model may result in incorrect phylogenies

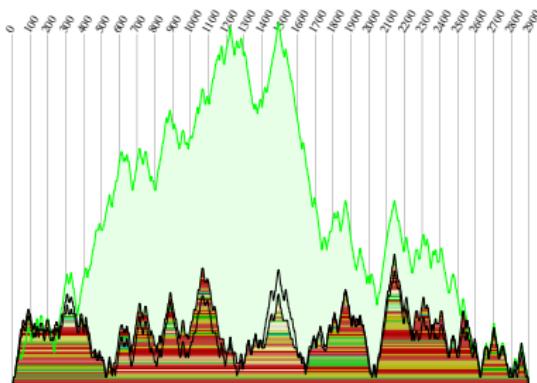
- ▶ **Remedy:** Use substitution models based on conserved RNA structure (E.g. Schöninger & von Haeseler, Knudsen, Higgs *et al.*)  
**SOFTWARE:** **phase package** (Paul Higg's lab, Hamilton, CND)

# Basic Requirement: Good Structural Models

- ▶ Consensus structures of small datasets: RNAalifold



16S rRNA

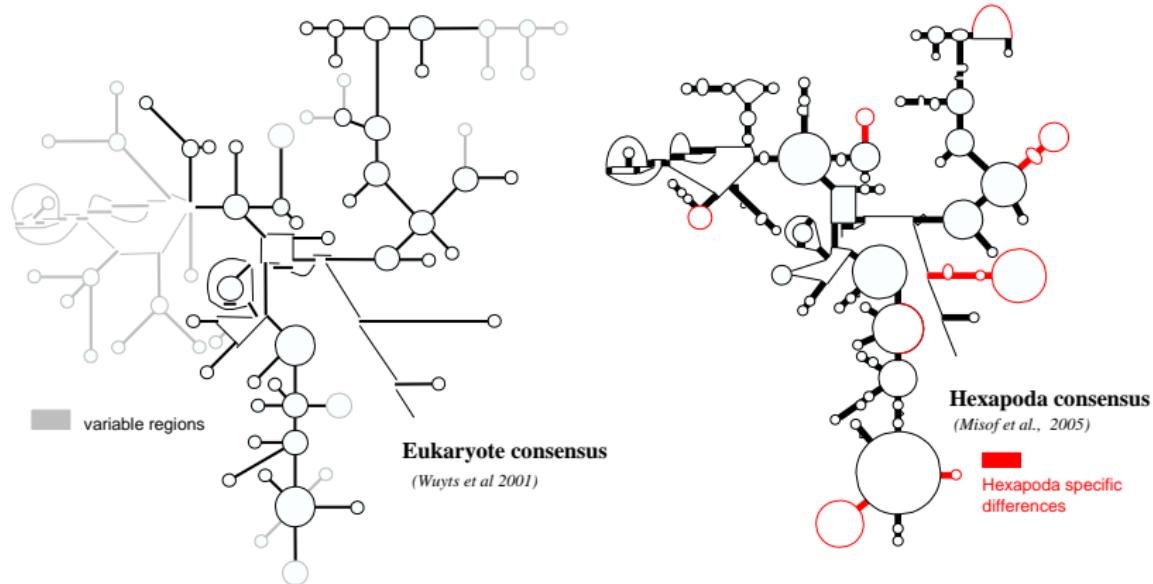


23S rRNA

Mountain representation of the secondary structure of *E. coli* rRNAs computed using RNAalifold from alignments of 5 prokaryotic sequences (16S: *A. globiformis*, *Anabaena*.sp., *A.tumefaciens*, *B.japonicum*, *E.coli*; 23S: *B.subtilis*, *T.thermoph.*, *Pir.marina*, *Rb.sphaero*, *E.coli*)

Green line: predicted single structure;  
black line: published consensus structure;  
solid colored area: RNAalifold prediction

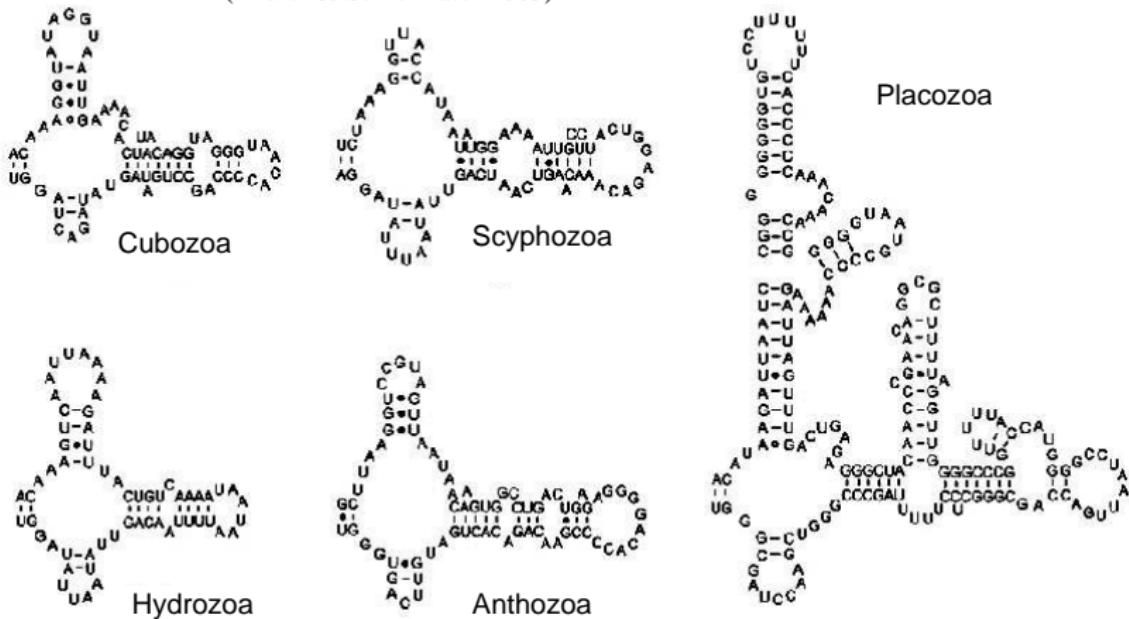
# RNA Secondary Structure is Phylogenetically Informative



Structural evolution of SSU rRNA

# Secondary Structure is Informative at Ancient Nodes

*mitochondrial LSU rRNA fragment*  
(Endler & Schierwater 2003)

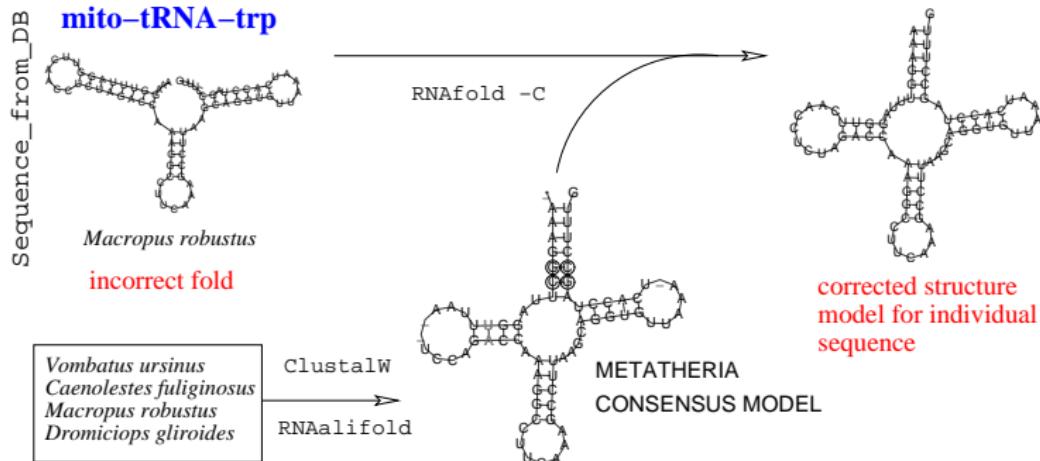


## Research Plan

- ▶ Develop Methods for Inferring Phylogenies *directly* from secondary structure models  
RNA secondary structure evolves much slower than sequence, hence it is ideal for resolving ancient nodes.
- ▶ Evaluate RNA secondary structure comparison tools such as RNAforrester, RNAdistance, MARNA, etc. for their use in phylogenetics
- ▶ Develop methods that can distinguish between uninformative variations and phylogenetically relevant structural differences.

# Pipeline for Structure Annotation

Automatic structure annotation of known RNA sequences within  
**undisputed** monophyletic groups

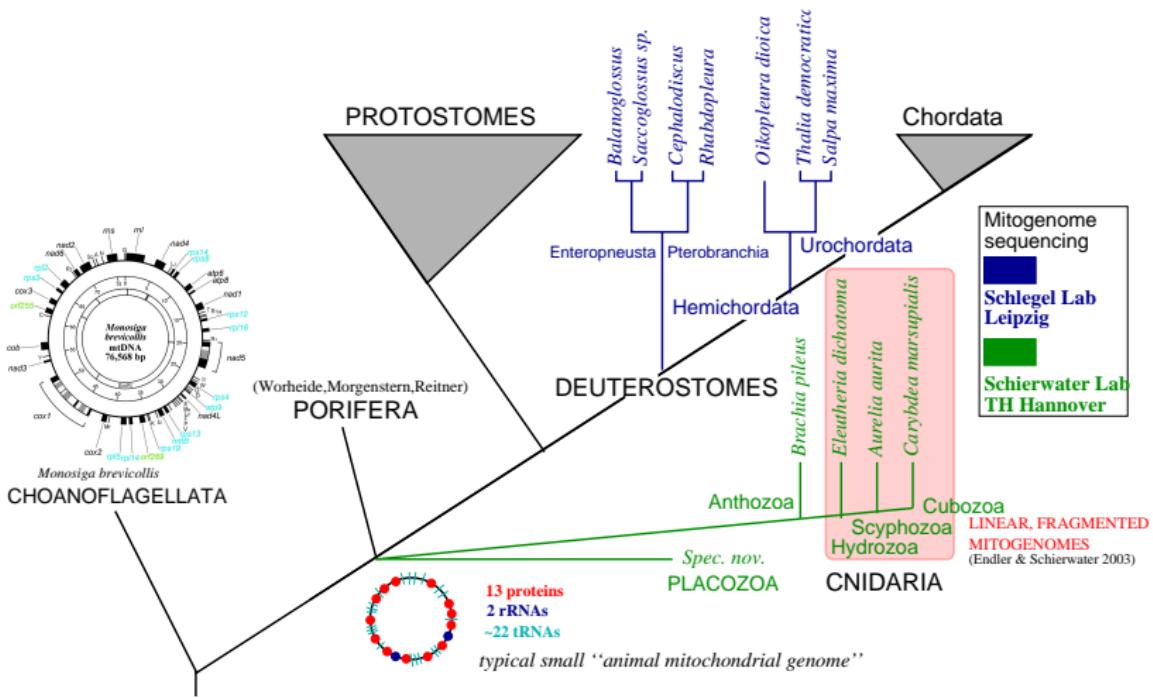


⇒ Roman

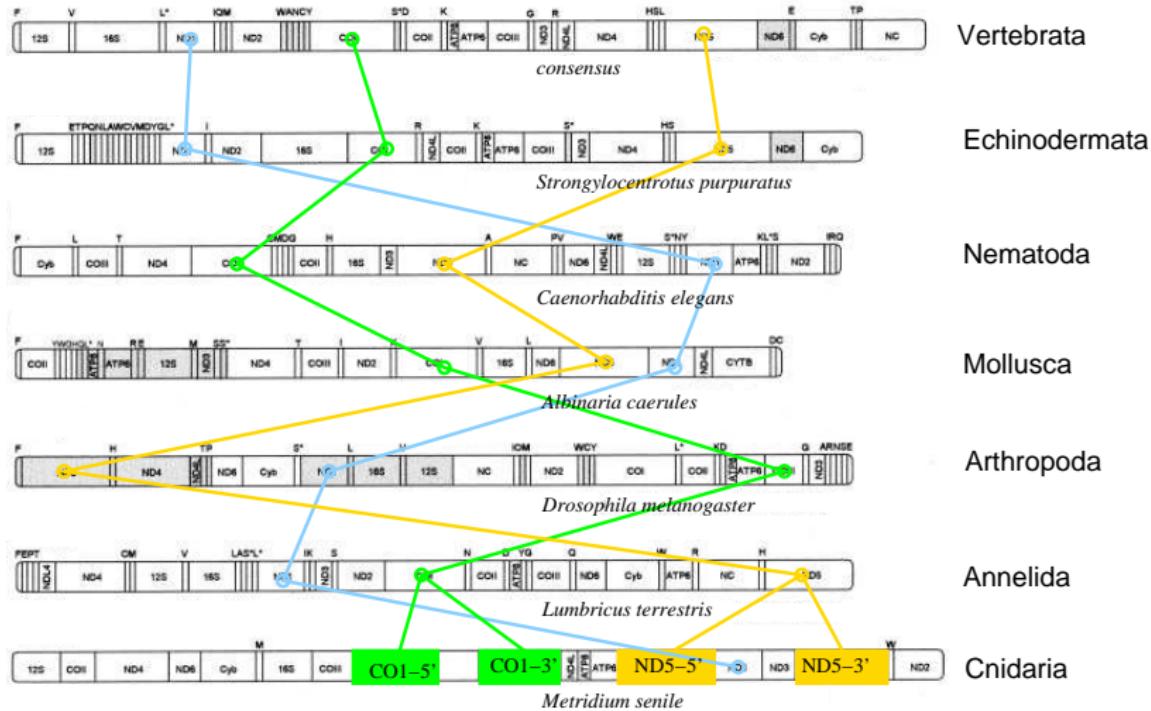
## The Plan: Structure-Based Phylogenies

- ▶ Structure-based alignments and reliable structure models are the basis to study the evolution of structure itself
- ▶ Distance measures for aligned structures are readily available:  
[tree alignment distances](#) (Giegerich), [tree edit distances](#) (Sankoff, Backofen, Vienna RNA Package), [profile distances](#) (Vienna RNA Package)  
⇒ **Distance-based phylogenies**
- ▶ Structure alignments also allow the development of [parsimony](#) based methods
- ▶ Reconstruct most basal nodes of the metazoan tree based on secondary structure information

## II. Mitochondrial Genome Structure



# Rearrangements of Mitochondrial Genomes



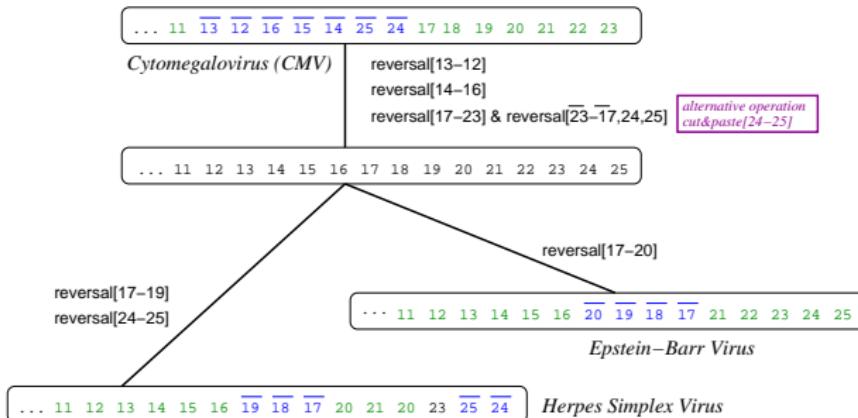
Number of tRNAs seems to vary; variation in protein content possible

# The Median Problem

## Multiple Genome Rearrangement Problem:

Find a phylogenetic tree  $T$  that minimizes the total number of reversal operations necessary to explain the observed genome orders

Already NP complete for 3 species: the **Median Problem**



adapted from Bourque & Pevzner (2002)

# Middendorf & Merkle's Revoluzer Approach

**Conserved interval**  $[a, b]$  in a set of permutations (Bergeron & Stoye 2003)

- ▶ either  $a$  precedes  $b$  or  $\bar{b}$  precedes  $\bar{a}$  in each step
- ▶ the unsigned elements between  $a$  and  $b$  are the same in every step.

EXAMPLE. From silkworm to locust in 6 steps:

1	2	3	4	5	6	7	8	9	10	11	12	14	13	15	16	17
1	2	3	4	-14	-12	-11	-10	-9	-8	-7	-6	-5	13	15	16	17
1	2	3	4	-14	5	6	7	8	9	10	11	12	13	15	16	17
1	2	3	4	-13	-12	-11	-10	-9	-8	-7	-6	-5	14	15	16	17
1	2	3	5	6	7	8	9	10	11	12	13	-4	14	15	16	17
1	2	3	5	4	-13	-12	-11	-10	-9	-8	-7	-6	14	15	16	17
1	2	3	5	4	6	7	8	9	10	11	12	13	14	15	16	17

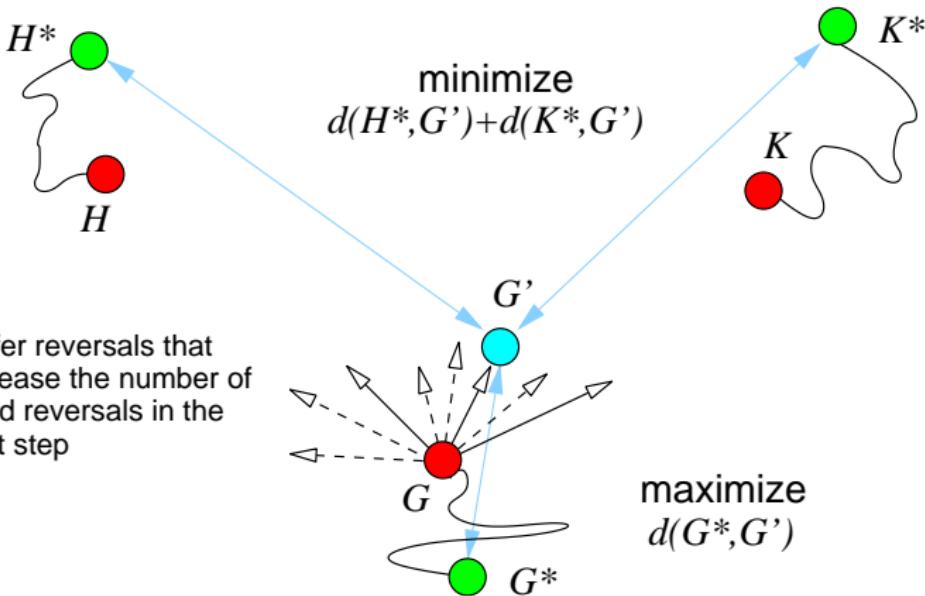
1	2	3	4	5	6	7	8	9	10	11	12	14	13	15	16	17
1	2	3	-4	5	6	7	8	9	10	11	12	14	13	15	16	17
1	2	3	-4	-5	6	7	8	9	10	11	12	14	13	15	16	17
1	2	3	5	4	6	7	8	9	10	11	12	14	13	15	16	17
1	2	3	5	4	6	7	8	9	10	11	12	-14	13	15	16	17
1	2	3	5	4	6	7	8	9	10	11	12	-14	-13	15	16	17
1	2	3	5	4	6	7	8	9	10	11	12	13	14	15	16	17

**Cycles of elementary intervals** (Hannenhalli & Pevzner, 1995)

Nearly all sorting and neutral reversals are on the same cycle.

Use only preserving reversals on cycles  $\Rightarrow$  only  $\mathcal{O}(n^2)$  candidates

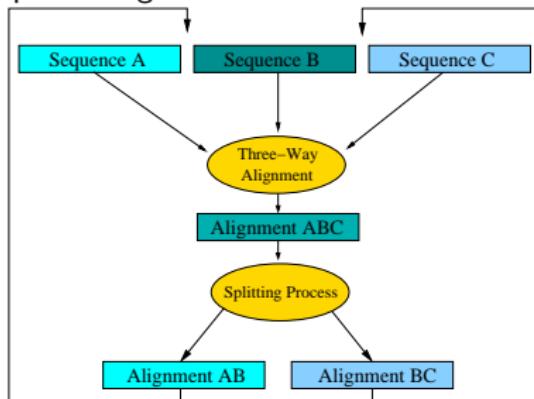
## Solving the Median Problem with Revoluzer



Iterative procedure terminates when  $G = H = K$ .  
If stuck, retracts last step(s) and uses different candidate  $G'$ .

# From Medians to Phylogenetic Networks

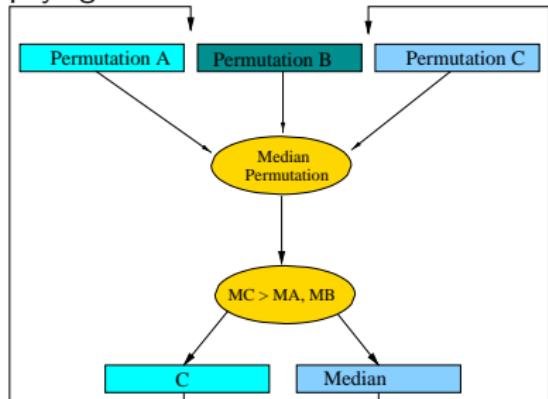
Generalization of progressive multiple sequence alignment:



Combination of Bryant's nnet algorithm with three-way sequence alignments.

Matthias Kruspe's talk

Proposed algorithm for reconstructing phylogenies:

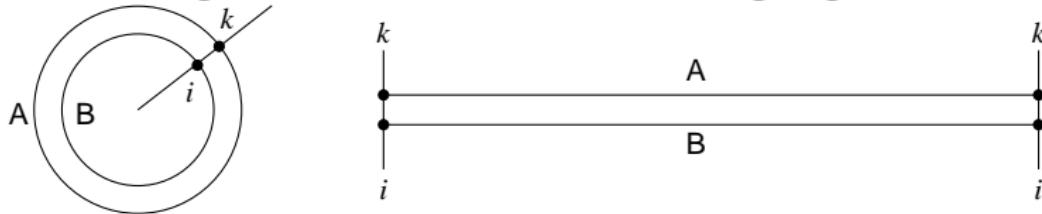


Combination of Bryant's nnet algorithm with solution of median problems by revoluzer.

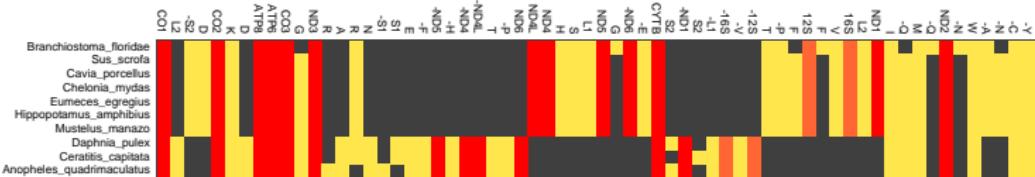
- ▶ **Advantage:** Self-correcting, i.e., mistakes in early steps are not frozen immediately.
- ▶ Detailed comparison with “classical” sequence-based analysis
- ▶ Combined analysis: use sequence data to determine supported splits predicted from rearrangement data and vice versa.

## Differences in Content: Circular List Alignments

- ▶ Regard mitogenomes as circularly ordered lists of genes (instead of permutations)
  - ▶ Circular alignments can be reduced to string alignments



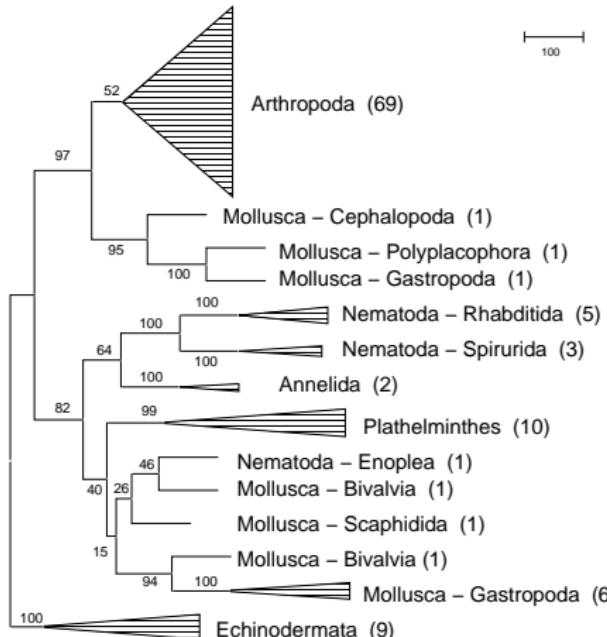
- Convenient representation of results



List alignments: Fried *et al.* J. Chem. Inf. Comput. Sci. 44: 332-338 (2004)

Generalization to circular lists: Fritzsch *et al.*, submitted (2004)

## First Results and Difficulties



#### Features and Results:

- ▶ easily deals with insertions/deletions and missing data
  - ▶ allows reconstruction of ancestral states by means of “normal” parsimony algorithms
  - ▶ plausible trees: e.g protostome/deuterostome split and protostome tree shown here

## Problems:

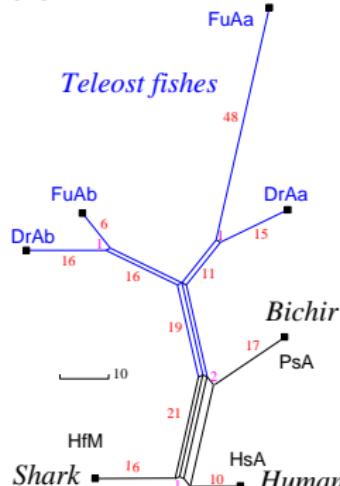
- ▶ does not exactly recover reversal distances
  - ▶ high computational cost for exact circular alignments
  - ▶ cost model for size and content-dependent indels not yet optimized

### III. Footprints and Phylogeny

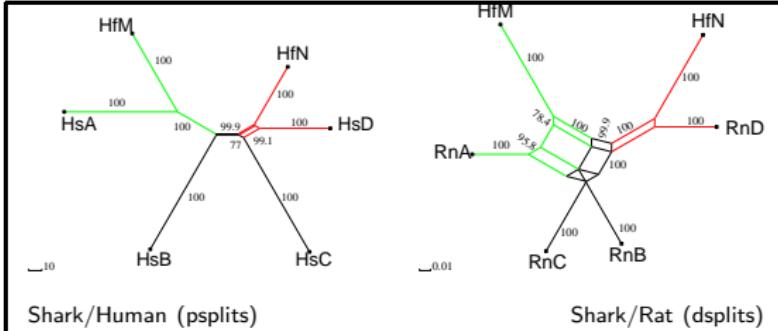
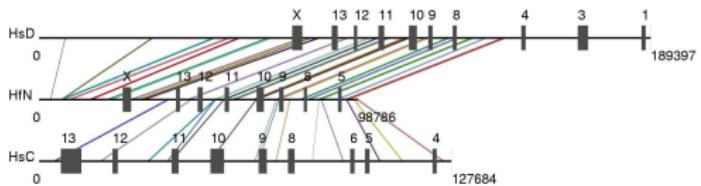
#### Application:

Identity of the shark *Hox-N* cluster

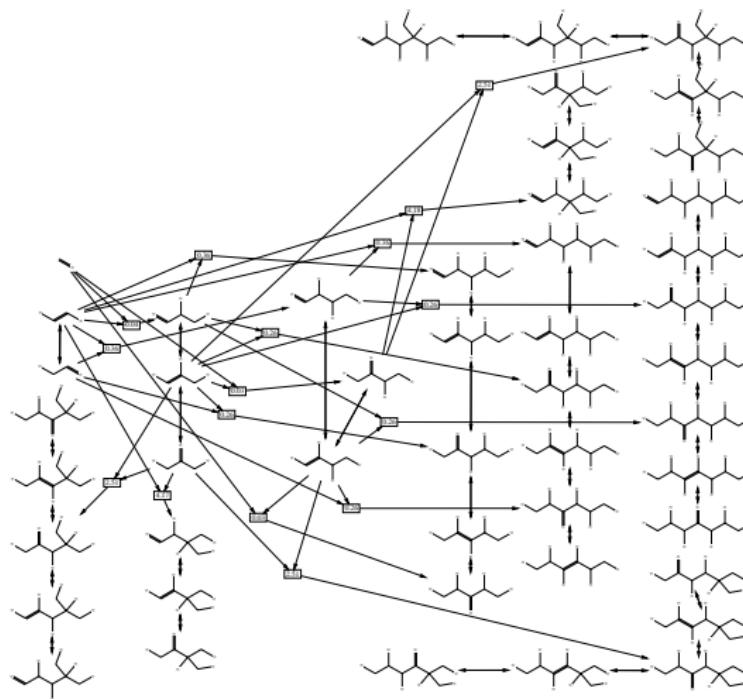
Footprints contains phylogenetic information



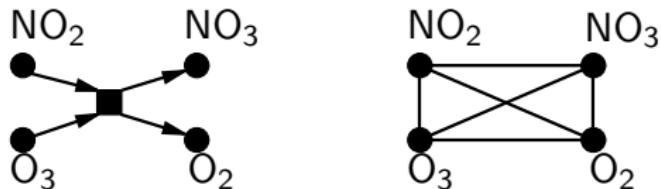
ntax=7 nchar=188 const=6 nonparsi=55 -psplits



## IV. Metabolic Network Structure



## Representation of Chemical Reaction Networks



Representations of the reaction  $\text{NO}_2 + \text{O}_3 \rightarrow \text{NO}_3 + \text{O}_2$  in hypergraph form drawn as the equivalent directed bipartite graph (l.h.s) and as part of a substrate graph (r.h.s).

Set  $X$  of reactants. Reaction  $E^- \rightarrow E^+$ ,  $E^\pm \subseteq X$ .

stoichiometric coefficients  $n_{x,E}^+$ ,  $n_{x,E}^-$ .

*stoichiometric matrix  $\mathbf{S}$*  with entries  $\mathbf{S}_{xE} = n_{x,E}^+ - n_{x,E}^-$

$\Rightarrow$  Metabolic Flux Analysis

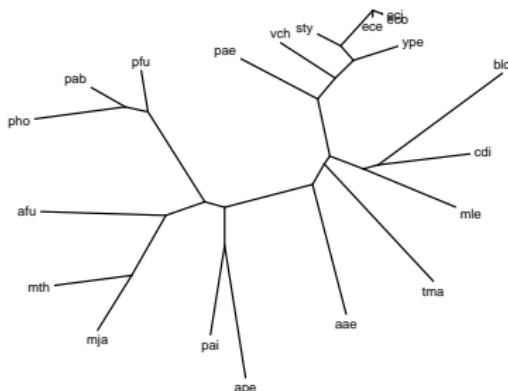
# Algebra of Reaction Networks

- ▶ Support  $\text{supp}\mathcal{E} = \bigcup\{E|E \in \mathcal{E}\}$
- ▶ CleanUp  $[\mathfrak{M}] = (\text{supp}\mathcal{E}, \mathcal{E})$
- ▶ Restriction  $\mathcal{E}[A] = \{E \in \mathcal{E}|A \subseteq (E^+ \cup E^-)\}$   
 $\mathfrak{M}[A] = \lfloor (A, \mathcal{E}[A]) \rfloor$   
 $\mathfrak{M}[\mathcal{E}] = \mathfrak{M}[\text{supp}\mathcal{E}]$
- ▶ Union  $\mathfrak{M} = \mathfrak{M}' \cup \mathfrak{M}'' = (X' \cup X'', \mathcal{E}' \cup \mathcal{E}'')$
- ▶ Intersection  $\mathfrak{M} = \mathfrak{M}' \cap \mathfrak{M}'' = \lfloor (X' \cap X'', \mathcal{E}' \cap \mathcal{E}'') \rfloor$
- ▶ Difference  $\mathfrak{M} = \mathfrak{M}' \setminus \mathfrak{M}'' = \lfloor (\text{supp}(\mathcal{E}' \setminus \mathcal{E}''), \mathcal{E}' \setminus \mathcal{E}'') \rfloor$
- ▶ Strict Difference  $\mathfrak{M} = \mathfrak{M}' \setminus\setminus \mathfrak{M}'' = \lfloor (X' \setminus X'', (\mathcal{E}' \setminus \mathcal{E}'')[X' \setminus X'']) \rfloor$
- ▶ Symmetric Difference  $\mathfrak{M} = \mathfrak{M}' \Delta \mathfrak{M}'' = \lfloor (\mathfrak{M}' \cup \mathfrak{M}'') \setminus (\mathfrak{M}' \cap \mathfrak{M}'') \rfloor$
- ▶ Symmetric Strict Difference  $\mathfrak{M} = \mathfrak{M}' \diamond \mathfrak{M}'' \lfloor (\mathfrak{M}' \cup \mathfrak{M}'') \setminus\setminus (\mathfrak{M}' \cap \mathfrak{M}'') \rfloor$

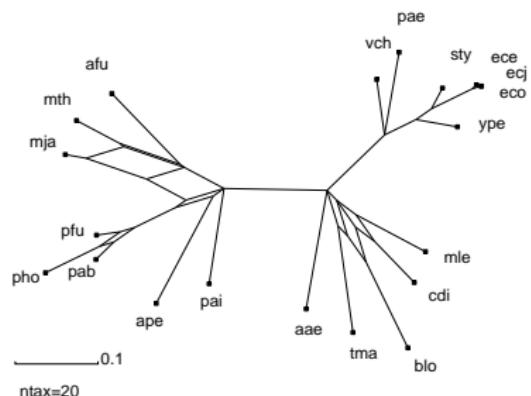
# Distance of Networks

$$d(\mathfrak{M}', \mathfrak{M}'') = \frac{\|\mathfrak{M}' \Delta \mathfrak{M}''\|}{\|\mathfrak{M}'\| + \|\mathfrak{M}''\| - \|\mathfrak{M}' \cap \mathfrak{M}''\|}$$

Alternatively, use strong symmetric difference.



Fitch algorithm

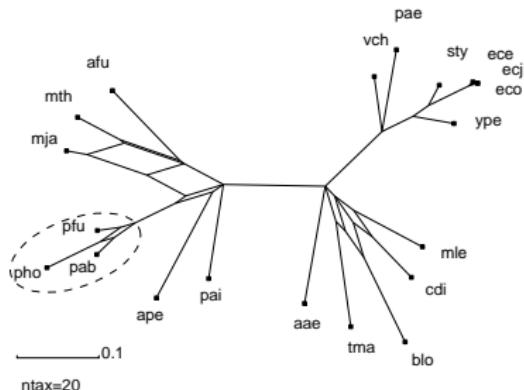


Splits decomposition with  
Fitch-Margoliash Power 2 distance

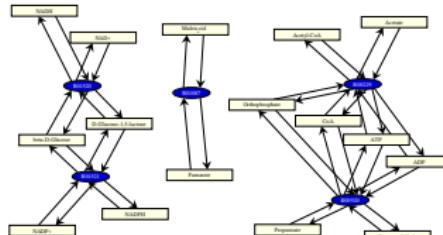
# Metabolic Innovations

For a split  $\sigma = \{U, \bar{U}\}$  in the tree define

$$\mathfrak{D}(\sigma) = \left( \bigcup_{k \in U} \mathfrak{M}_k \right) \setminus \left( \bigcup_{k \in \bar{U}} \mathfrak{M}_k \right)$$

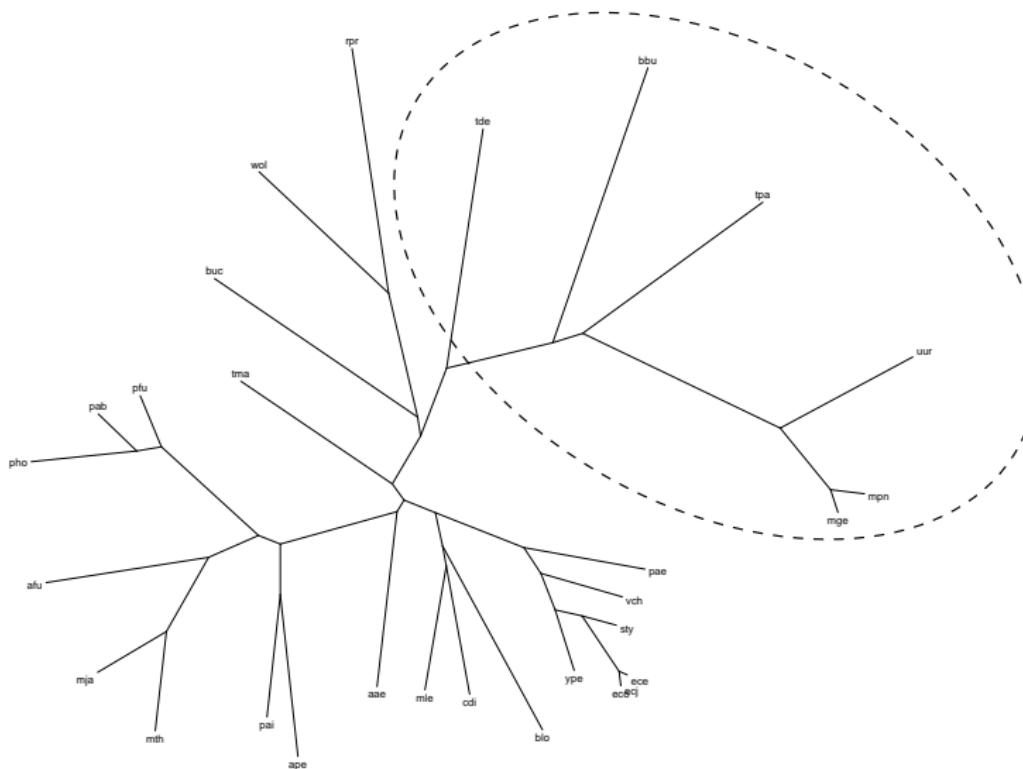


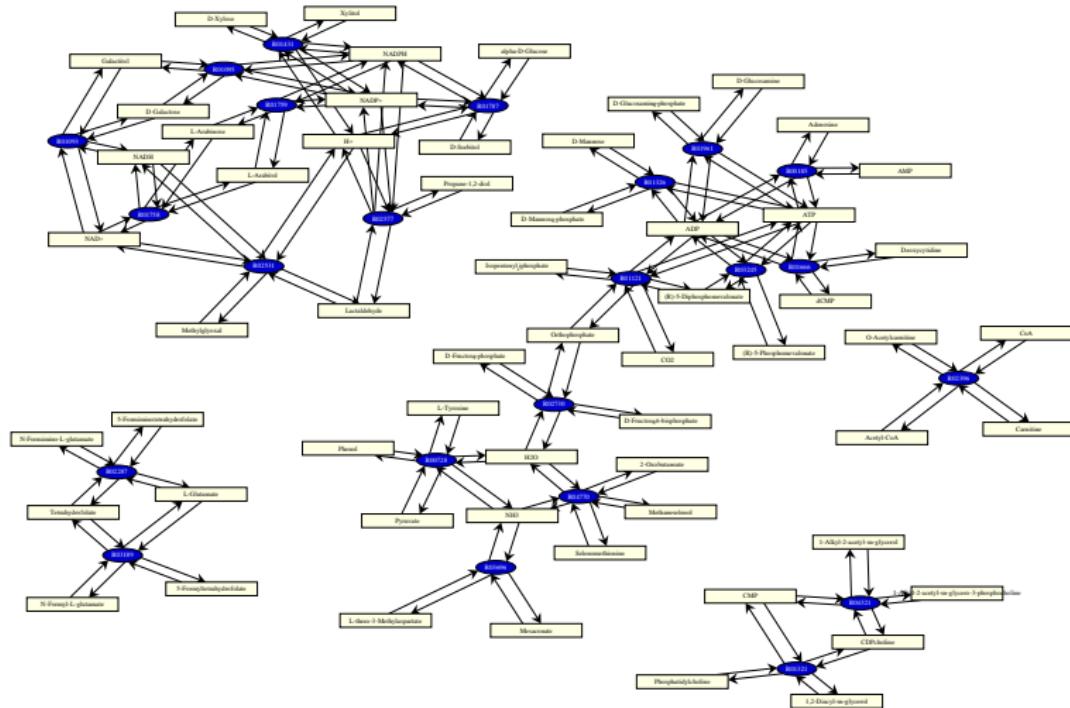
### *Pyrococcus* spp. clade



differential network

# Intracellular pathogens





*Mollicutes*, such as *Mycoplasma*, and *Spirochets*, such as *Treponema*, are grouped together.

These pathogens possess a minimal gene-sets.  $\Rightarrow$  metabolic networks are highly optimized and host-dependent. This set of organism exhibits specific reactions that are absent in the remaining organisms of the phylogeny.

# Thanks

- ▶ Ivo L. Hofacker, Roman Stocsics (RNA morphologies)
- ▶ Matthias Kruspe (Alignments)
- ▶ Sonja Prohaska, Claudia Fried, Günter P. Wagner (Footprint evolution)
- ▶ Guido Fritzsch, Martin Schlegel, Daniel Merkle, Martin Middendorf (Mitochondrial Genomes)
- ▶ Christian V. Forst, Ivo Hofacker, Christoph Flamm (Metabolic Networks)