# Distinguishing Convergence on Two-Taxon and Three-Taxon Networks

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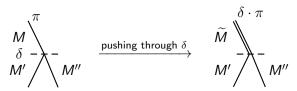
University of Tasmania

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- *M* plays the role of implementing correlated changes.
- Sumner et al. [2012] showed that the model can also be used for convergence.

• Examples of convergence are hybridisation, horizontal gene transfer or convergence of morphological traits.

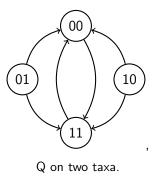
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- Are our convergence-divergence networks identifiable?
- Can our convergence-divergence networks be distinguished from simpler trees?

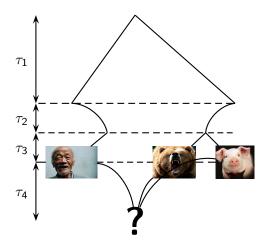
# Convergence-Divergence Network

Convergence of two taxa is as follows:



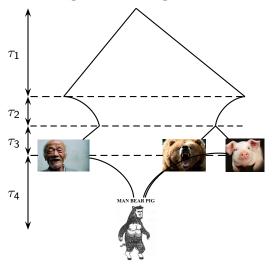
with each character state transition having the same rate,  $\lambda$ , from the binary symmetrical model.

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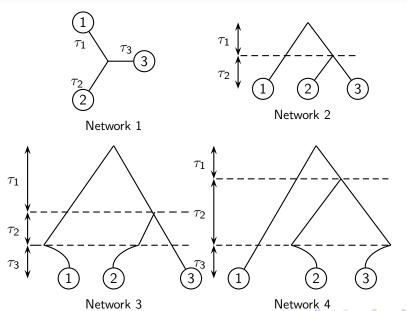
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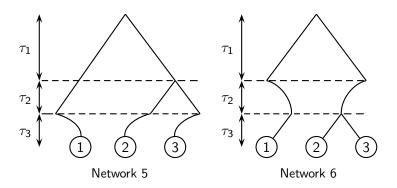
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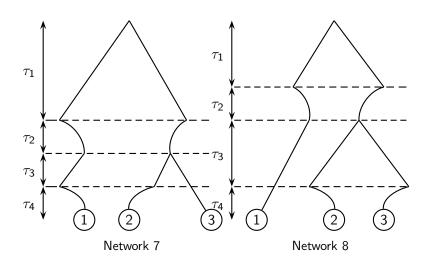
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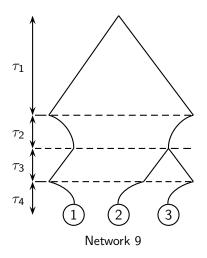
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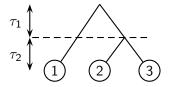
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- If two trees or networks have the same probability space they are said to not be **distinguishable**.











Three-taxon clock-like tree.

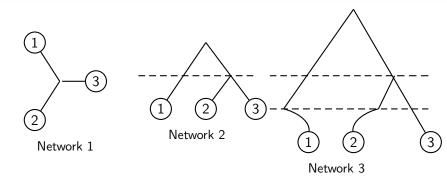
• In the regular basis, P, and the Hadamard basis,  $\widehat{P}$ , the probability distribution is

$$P = \begin{bmatrix} p_{000} \\ p_{001} \\ p_{010} \\ p_{011} \\ p_{100} \\ p_{101} \\ p_{110} \\ p_{111} \end{bmatrix}, \quad \widehat{P} = \begin{bmatrix} q_{000} \\ q_{001} \\ q_{010} \\ q_{011} \\ q_{100} \\ q_{101} \\ q_{110} \\ q_{111} \end{bmatrix} = \begin{bmatrix} 1 \\ 0 \\ 0 \\ e^{-2\tau_2} \\ 0 \\ e^{-2(\tau_1 + \tau_2)} \\ e^{-2(\tau_1 + \tau_2)} \\ 0 \end{bmatrix}.$$

• Make the substitutions,  $x_i = e^{-\tau_i}$ , to convert to polynomial functions.

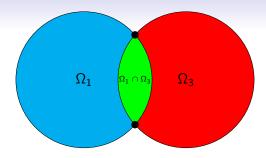
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- Constraints are,  $\{q_{101} = q_{110}, q_{011} \ge q_{101}\}.$



Network(s)	$q_{101} = q_{110} (Y/N)$	$q_{110} \geq q_{101} \; (Y/N)$	$q_{011} \ge q_{101} \; (Y/N)$	$q_{011}(1-q_{110})^2 \ge$
				$(q_{011} - q_{101})^2 (Y/N)$
1	N	N	N	N
2, 4, 5, 6, 8, 9	Y	N	Y	N
3, 7	N	Y	Y	Y

In addition, the non-clock-like tree (Network 1) must meet the constraints  $\{q_{011} \geq q_{101}q_{110}, q_{101} \geq q_{011}q_{110}, q_{110} \geq q_{011}q_{101}\}.$ 



Probability spaces of the networks. The probability space for Network 2 is the two black dots where the probability spaces for networks 1 and 3 intersect. Not to scale.

Colour	Probability Space	Constraints
Blue	$\Omega_1$	$\{q_{011} \geq q_{101}q_{110}, q_{101} \geq q_{011}q_{110}, q_{110} \geq q_{011}q_{101}\}$
Red	$\Omega_3$	$\{q_{011} \geq q_{101}, q_{110} \geq q_{101}, q_{011}(1-q_{110})^2 \geq (q_{011}-q_{101})^2\}$
Green	$\Omega_1 \cap \Omega_3$	$\{q_{011} \geq q_{101},  q_{110} \geq q_{101},  q_{101} \geq q_{011}q_{110}\}$
Black	$\Omega_1 \cap \Omega_2 \cap \Omega_3$	$\{q_{101}=q_{110}, q_{011}\geq q_{110}\}$

Summary of network constraints which must be met in the region of the probability space.

• As an example, the constraints for the black region in regular basis are  $\{p_{010}+p_{101}=p_{001}+p_{110}, p_{011}+p_{100}\geq p_{001}+p_{110}\}.$ 



 How does the convergence-divergence network perform in a likelihood scenario (BIC)?

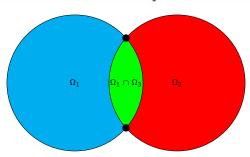
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- 30 taxa (not including 3 outgroups) and 137 sites, with some taxa missing data at particular sites.
- Analysed all sets of triplets.



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$BIC_{nc}$	BIC <sub>cl</sub>	$BIC_{cd0+}$	$BIC_{cd2+}$	BIC <sub>cd6+</sub>	BIC <sub>cd10+</sub>
0.0367	0.8547	0.1451	0.03153	0.009113	0.007635

Summary statistics.

Note:  $BIC_{nc} + BIC_{cl} + BIC_{cd0+} = 0.0367 + 0.8547 + 0.1451 = 1.0365 > 1$ . For some triplets the BIC values tied between two or more of the trees and networks. In these circumstances each tree or network was counted as having the lowest BIC value.

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- For more than three taxa we can use methods from alegbraic geometry (Gröbner bases).

## References

- B. R. Holland, H. G. Spencer, T. H. Worthy, and M. Kennedy. Identifying cliques of convergent characters: Concerted evolution in the cormorants and shags. *Systematic Biology*, 59(4): 433–445, 2010.
- D. Siegel-Causey. Phylogeny of the phalacrocoracidae. Condor, pages 885–905, 1988.
- J. G. Sumner, B. R. Holland, and P. D. Jarvis. The algebra of the general markov model on phylogenetic trees and networks. *Bulletin of Mathematical Biology*, 74:858–880, 2012.