# The epic battle between Markov and phylogenetic invariants: equations

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#### The people I did this with





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#### Symmetry in phylogenetics: Sequence and leaf permutations

$$\Delta_{1} = \{ \text{residual for } T_{1} = {}^{A}_{B} \longrightarrow {}^{C}_{C} \}$$
  
$$\Delta_{2} = \{ \text{residual for } T_{2} = {}^{A}_{C} \longrightarrow {}^{B}_{D} \}$$
  
$$\Delta_{3} = \{ \text{residual for } T_{3} = {}^{A}_{D} \longrightarrow {}^{B}_{C} \}$$

**ALGEBRA ALERT**  
i.e. a "representation"  
of 
$$\mathfrak{S}_4$$
 on  $\{T_1, T_2, T_3\}$ 

$$\begin{array}{ccc} \stackrel{seqA}{seqB} & \longrightarrow & \begin{array}{c} PHYLOGENETIC \\ METHOD \end{array} & \longrightarrow & (\Delta_1, \Delta_2, \Delta_3) \end{array}$$

$$\begin{array}{ccc} \stackrel{seqD}{seqC} & \longrightarrow & \begin{array}{c} PHYLOGENETIC \\ METHOD \end{array} & \longrightarrow & (\Delta_1, \Delta_2, \Delta_3) \end{array}$$

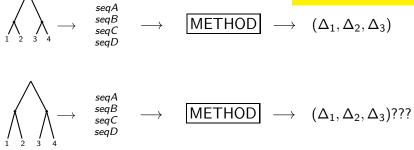
$$\begin{array}{ccc} \stackrel{seqA}{seqB} & \longrightarrow & \begin{array}{c} PHYLOGENETIC \\ METHOD \end{array} & \longrightarrow & (\Delta_3, \Delta_1, \Delta_2) \end{array}$$

$$\begin{array}{ccc} \stackrel{seqA}{seqC} & \longrightarrow & \begin{array}{c} PHYLOGENETIC \\ METHOD \end{array} & \longrightarrow & (\Delta_3, \Delta_1, \Delta_2) \end{array}$$

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# The leaf action

ALGEBRA ALERT i.e. "action" of  $\times^4 GL(n)$ with Markov matrices  $M_i$ 

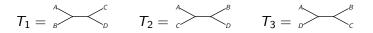


Ideally tree support should depend only on "internal" part of tree

Isn't this what "phylogenetic invariants" achieve?

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#### **Phylogenetic invariants**



Consider polynomials  $f(P) = f(p_{AAAA}, p_{AAAC}, p_{AAAG}, \dots, p_{TTTT})$ Phylogenetic "invariant": (Cavender, Felsenstein, Lake, etc.)

$$f(P_1) = 0$$
  $f(P_2) \neq 0$   $f(P_3) \neq 0$ 

Algebraic statistics (Sturmfels, Pacter, et. al.): Ideals, varieties, etc. Our perspective: Groups, modules, etc. In either case f becomes an infinite space  $\langle f_1, f_2, f_3, \ldots \rangle$ 



#### Back to sequence and leaf permutations



 $\mathsf{Permute \ seqA} \leftrightarrow \mathsf{seqB} \implies (\Delta_1, \Delta_2, \Delta_3) \rightarrow (\Delta_1, \Delta_3, \Delta_2)?$ 

'Biologically symmetric' invariants (E 2009, R&H 2012) 'Invariant' invariants! (F-S pers. comm.)

QuartetStabilizer $A \rightarrow f^{C}_{D}$  $\mathcal{G} = \mathfrak{S}_{2} \wr \mathfrak{S}_{2}$ <br/> $= \langle (AB), (CD), (AC)(BD) \rangle$ ALGEBRA ALERTIrreduciblerepresentations<br/>of  $\mathcal{G}$  provide distinguished basis<br/>for invariants (S&J 2009)



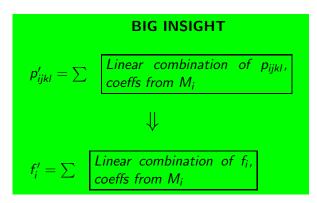
From an algebraic point of view, this is only half the story. What about the leaf action?



The problem with phylogenetic invariants  $\langle f_1, f_2, f_3, \ldots \rangle$ 



**ALGEBRA ALERT** i.e. "action" of  $\times^4 GL(n)$ with Markov matrices  $M_i$ 

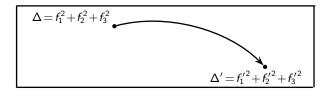




The problem with using phylogenetic invariants  $\langle f_1, f_2, f_3, \ldots \rangle$ 

Tree "residual"  $\Delta := \sum_{i} |f_i(P)|^2$  depends on choice of *basis*  $\{f_1, f_2, f_3 \dots\}$ 





Any measure  $\Delta$  entails a choice of phylogenetic "invariants" equivalent to alternative choice evaluated at a displaced P. i.e.  $\Delta$  is not invariant to leaf action

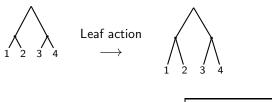
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### Markov invariants solve this problem!



**THE BIG INSIGHT**: 
$$f'_i = \sum_{i=1}^{i} coeffs from the M_i$$

Markov invariants:  $q \rightarrow \lambda q$ 

Existence theorem (s,c,J,& J, 2009):  $\lambda = \text{ products of } \det(M_i)$ 

*Surely* Markov invariants are good because they don't depend on "internal" part of the tree?

Yes! Log-det and Hadamard *q*-coordinates; the magical squangles (H,S,& J 2012).

#### Binary quartet: The simplest case possible

12|34 "flattening" of quartet probability distribution P:

$$P = \begin{pmatrix} p_{00,00} & p_{00,01} & p_{00,10} & p_{00,11} \\ p_{01,00} & p_{01,01} & p_{01,10} & p_{01,11} \\ p_{10,00} & p_{10,01} & p_{10,01} & p_{10,11} \\ p_{11,00} & p_{11,01} & p_{11,10} & p_{11,11} \end{pmatrix}$$

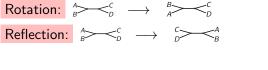
Initial value on "stubby"  $T_1$ ,  $T_2$ , and  $T_3$ :

$$P_{1} = \begin{bmatrix} 00 & 01 & 10 & 11 \\ 00 & (* & 0 & 0 & * \\ 0 & 0 & 0 & 0 \\ 10 & (* & 0 & 0 & 0 \\ 11 & (* & 0 & 0 & * \\ 0 & 0 & 0 & * \\ 0 & 0 & 0 & * \\ \end{bmatrix} \quad P_{2} = P_{3} = \begin{bmatrix} 00 & (* & 0 & 0 & 0 \\ 0 & (* & 0 & 0 & 0 \\ 0 & (* & 0 & 0 & 0 \\ 0 & 0 & (* & 0 & 0 \\ 0 & 0 & 0 & * \\ 0 & 0 & 0 & * \\ 0 & 0 & 0 & * \\ \end{bmatrix}$$

Notice 3 × 3 minors are 0 on  $T_1$  and non-zero on  $T_2$  and  $T_3$ LEAF ACTION+BIG INSIGHT  $\implies$  minors are **phylo invariants** 



## Minors and leaf permutations DETAIL OPTIONAL



Flattening: 
$$P \longrightarrow KP$$
 and  $P^t$ , where  $K = \begin{pmatrix} 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}$ 

 $3\times3$  minors under leaf permutations:



(1000)

Gives six possible leaf perm invariant residuals:  $\Delta = \circ^2 + \diamondsuit^2 + \square^2 + \bigstar^2 + \bigstar^2 + \ast^2$ 



#### But what about the leaf action?

Leaf action for flattening:  $P \rightarrow XPY^{t}$  (where  $X = M_{1} \otimes M_{2}$  and  $Y = M_{3} \otimes M_{4}$ ) Under the leaf action the minors become all mixed up!

# BADNESS!

Leaf action

Markov invariants, "the squangle":  $q \longrightarrow \lambda q$ 

 $\Delta = q^2$  provides a tree-topology residual that is invariant to changes of parameter values at leaves of tree

# AWESOMENESS!

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#### But wait, there's more: Signed least squares

Three flattenings  $\implies$  three squangles:  $q_1, q_2, q_3$ . Rep theory:  $q_1 + q_2 + q_3 = 0$  use  $q_3 = -q_2$  in place of  $q_1 = 0$ . Leaf action gives semi-algebraic constraints: u, v, w > 0

Hypothesis	$E[q_1]$	$E[q_2]$	$E[q_3]$
$T_1$	0	- <i>u</i>	u
$T_2$	V	0	-v
<i>T</i> <sub>3</sub>	-w	w	0

Least squares estimate:  $\hat{u} = \frac{1}{2}(q_3 - q_2)$  or  $\hat{u} = 0$ . Residuals:  $\Delta = \frac{1}{2}q_1^2$  or  $q_2^2 + q_3^2$ Second case sends  $q_2, q_3 \rightarrow 0$  as best estimate.

## Analogous situation for minors



#### Origin of signed least squares

Leaf action:  $P \rightarrow XPY^{t}_{(where X = M_{1} \otimes M_{2} \text{ and } Y = M_{3} \otimes M_{4})}$ On matrix of minors, inverses get in the act:

$$M = \begin{pmatrix} 1-a & b \\ a & 1-b \end{pmatrix} \implies M^{-1} = \begin{pmatrix} + & - \\ - & + \end{pmatrix}$$

Leaf action on minors:

$$\begin{pmatrix} \circ & \diamond & \diamond & \Box \\ \diamond & \star & \star & \bullet \\ \ominus & \star & \star & \bullet \\ \Box & \bullet & \star & \star \end{pmatrix} = \begin{pmatrix} + - - + + - \\ - + + - - \\ + - - + \end{pmatrix} \begin{pmatrix} * & 0 & 0 & 0 \\ 0 & * & 0 & 0 \\ 0 & 0 & 0 & * \end{pmatrix} \begin{pmatrix} + - - + + - \\ - + + - - \\ + - - + \end{pmatrix}$$
$$= \begin{pmatrix} + - - + - \\ - + + - \\ - + + - \\ + - - + \end{pmatrix}$$



#### Take home message

- Theory says "Markov invariants" > "phylogenetic invariants"
- In particular, the squangles should give stable tree residual function in face of changing rate parameters.
- Over to you Barbara...

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