

Recovering a tree from randomly sampled phylogenetic diversities

Steven N. Evans

June, 2015

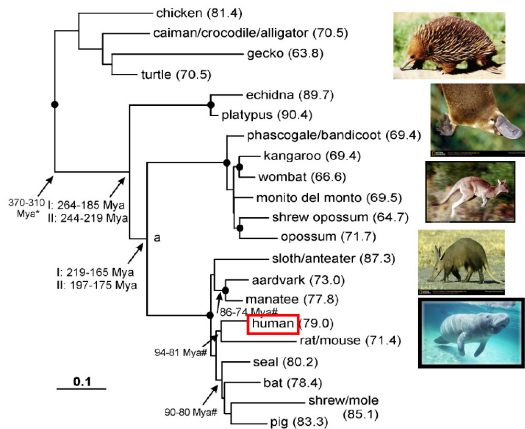
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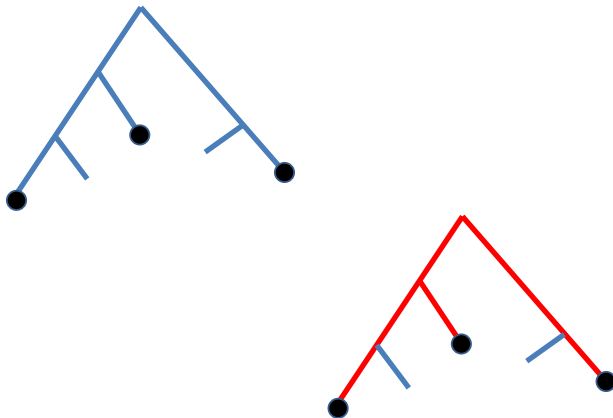
Pre-print at <http://arxiv.org/abs/1506.01091>.



Phylogenetic trees



A phylogenetic tree is just a tree with weights / lengths on the edges and labels on the leaves.



- The **phylogenetic diversity** of a collection of **taxa** (= **leaves**) is the **total length of the subtree they span**.
- This quantity is important in **ecology** and **conservation**.

- Consider a tree \mathbf{T} with
 - vertex set $\mathbf{V}(\mathbf{T})$,
 - edge set $\mathbf{E}(\mathbf{T})$,
 - leaf set $\mathbf{L}(\mathbf{T})$,
 - edge-lengths (edge-weights) $\mathbf{W}_{\mathbf{T}} : \mathbf{E}(\mathbf{T}) \rightarrow \mathbb{R}_{++}$.
- For $x, y \in \mathbf{V}(\mathbf{T})$ let $r_{\mathbf{T}}(x, y) :=$ length of the the (unique) path between x and y (= sum of the lengths of the edges on the path).
- Given $K \subseteq \mathbf{L}(\mathbf{T})$, write $\mathbf{W}_{\mathbf{T}}(K)$ for the length of the subtree spanned by K (= the phylogenetic diversity of K).

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How do we compute phylogenetic diversities easily?

- Write $d_{\mathbf{T}}(v)$ for the **degree** of $v \in \mathbf{V}(\mathbf{T})$.
- For distinct $x, y \in \mathbf{L}(\mathbf{T})$,
 - $I_{\mathbf{T}}(x, y) :=$ the set of **interior vertices** on the (unique) **path** in \mathbf{T} between x and y ,
 - $h_{\mathbf{T}}(x, y) := \prod_{v \in I_{\mathbf{T}}(x, y)} ((d_{\mathbf{T}}(v) - 1)!)^{-1}$,
 - $r_{\mathbf{T}}(x, y) :=$ **length** of the the **path** between x and y as above.
- Then (Semple & Steel '04 extending Pauplin '00), the **total length** of \mathbf{T} is

$$W_{\mathbf{T}}(\mathbf{L}(\mathbf{T})) = \sum_{\{x, y\} \subseteq \mathbf{L}(\mathbf{T}), x \neq y} h_{\mathbf{T}}(x, y) r_{\mathbf{T}}(x, y).$$

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WHAT DO WE LEARN
ABOUT A TREE
FROM THE PHYLOGENETIC DIVERSITIES
OF RANDOMLY SAMPLED SUBSETS OF TAXA???

- In general, what information do we need to reconstruct an edge-weighted tree?
- What information do we need to determine whether two edge-weighted trees are the same?
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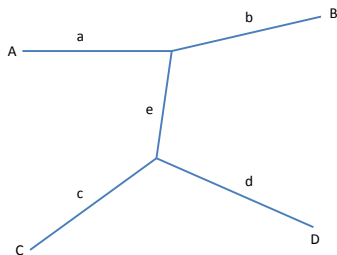
- A leaf-labeled, edge-weighted tree can be reconstructed from its matrix of leaf-to-leaf distances (Zaretskii '65, Simões Peraira '69, Buneman '71, Buneman '74).
- We will recall WHY on the next two slides.

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Leaf-labeled trees: why are leaf-to-leaf distances enough?

- In this **four-taxon tree** we can tell that A, B and C, D are **siblings** because

$$r_{\mathbf{T}}(A, B) + r_{\mathbf{T}}(C, D) \leq r_{\mathbf{T}}(A, C) + r_{\mathbf{T}}(B, D) = r_{\mathbf{T}}(A, D) + r_{\mathbf{T}}(C, D).$$



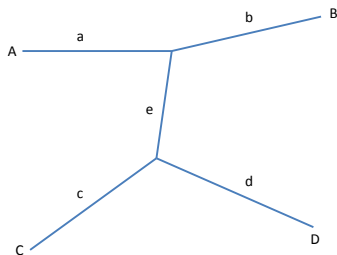
- We can recover the **edge-lengths** by solving **six linear equations** in **five unknowns**:

$$r_{\mathbf{T}}(A, B) = a + b, r_{\mathbf{T}}(A, C) = a + e + c, \dots, r_{\mathbf{T}}(C, D) = c + d.$$

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Leaf-labeled trees: why are leaf-to-leaf distances enough?

- Lastly, knowing the subtree spanned by every four taxa (= quartet) suffices to determine the whole tree (“quartet puzzling”).

- A leaf-labeled, edge-weighted tree with n leaves can be reconstructed from the collection of total lengths of subtrees spanned by all subsets of m leaves provided $n \geq 2m - 1$ (Pachter & Speyer '04).

- The multiset of leaf-to-leaf distances does not determine an unlabeled tree up to isomorphism. An example follows.

- A tree is a **caterpillar** if the deletion of the leaves along with the edges adjacent to them results in a path.

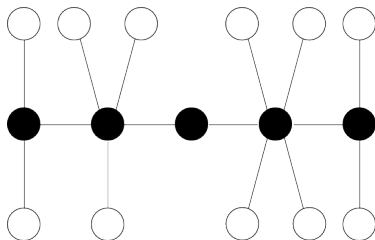


Figure: A caterpillar. Removing the leaves (white vertices) results in a path of length 5 (black vertices).

Unlabeled trees: leaf-to-leaf distance counterexample

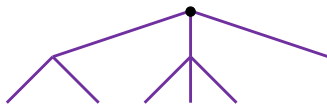
- Consider the two caterpillars \mathbf{T}' and \mathbf{T}'' with 25 leaves each, where
 - \mathbf{T}' has 3 internal vertices in order along a path that are adjacent respectively to 2, 11, 12 leaves,
 - \mathbf{T}'' has 3 internal vertices in order along a path that are adjacent respectively to 3, 14, 8 leaves,
 - all edges have length 1.
- Taking the $\binom{25}{2}$ pairs of distinct leaves in each tree,
 - the distance 2 appears $\binom{2}{2} + \binom{11}{2} + \binom{12}{2} = 122$ times in \mathbf{T}' and $\binom{3}{2} + \binom{14}{2} + \binom{8}{2} = 122$ times in \mathbf{T}'' ,
 - the distance 3 appears $2 \times 11 + 11 \times 12 = 154$ times in \mathbf{T}' and $3 \times 14 + 14 \times 8 = 154$ times in \mathbf{T}'' ,
 - the distance 4 appears $2 \times 12 = 24$ times in \mathbf{T}' and $3 \times 18 = 24$ times in \mathbf{T}'' .
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- Probabilistically, if we pick two distinct leaves uniformly at random from \mathbf{T}' and \mathbf{T}'' , then the two random leaf-to-leaf distances have the same probability distribution.

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Rooted unlabeled trees with equal edge lengths

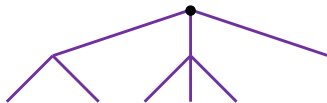
- Consider two rooted trees \mathbf{T}' and \mathbf{T}'' with all edge lengths 1.



- There is an isomorphism that preserves roots if and only if
 - the two roots have the same number of children,
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- This observation can be turned into a linear time algorithm for determining whether \mathbf{T}' and \mathbf{T}'' are isomorphic.
- An extension of this algorithm works for general rooted trees.

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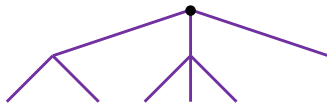
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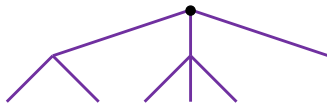
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- Two **unrooted trees** with equal edge lengths are isomorphic if and only if there is some **choice of roots** such the resulting **rooted trees** are isomorphic.
- - The **center** of a tree with equal edge lengths is a vertex with **minimal greatest distance** to a **leaf**.
 - A tree with equal edge lengths has **either one or two centers** (Jordan 1869).
 - Rooting each tree at one of its centers followed by a determination of whether the resulting two rooted trees are isomorphic requires **linear time** to detect isomorphism.

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- The same is true for the **eigenvalues** of the **matrix of leaf-to-leaf distances** and the **matrix of vertex-to-vertex distances**.
- Indeed, the **proportion** of trees of various types with n leaves that **share a spectrum** with another tree of the same type converges to 1 as $n \rightarrow \infty$.

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- Eisenstat & Gordon '06 produced an infinite family of **counterexamples**.
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- Suppose that $\#\mathbf{L}(\mathbf{T}) = n$ and Y_1, \dots, Y_n is the result of **sampling the leaves** of \mathbf{T} **uniformly at random without replacement**.
- The **random variable** $W_k := \mathbf{W}_{\mathbf{T}}(\{Y_1, \dots, Y_k\})$ is the **length of the subtree spanned** by the first k randomly chosen leaves.
- The $(n - 1)$ -dimensional **random vector** $\mathcal{W}_{\mathbf{T}} := (W_2, \dots, W_n)$ is the **random length sequence** of \mathbf{T} .
- **Is it possible to reconstruct the edge-weighted tree \mathbf{T} up to isomorphism from the joint probability distribution of the random length sequence $\mathcal{W}_{\mathbf{T}}$?**
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Theorem 1

The isomorphism class of a simple, edge-weighted tree \mathbf{T} with 4 leaves is uniquely determined by the joint probability distribution of its random length sequence.

- The total length of \mathbf{T} is W_4 .
- The multiset of lengths of the **pendent edges** (= edges adjacent to leaves) can be determined from the distribution of $W_4 - W_3$; e.g. the pendent edges are a, a, b, c if and only if $W_4 - W_3$ takes the values a, b, c with probabilities $\frac{1}{2}, \frac{1}{4}, \frac{1}{4}$.
- If the lengths of the pendent edges sum to the total length of \mathbf{T} , then \mathbf{T} is a **star** and its isomorphism class is determined.
- Otherwise, \mathbf{T} has two degree 3 internal vertices and we can determine the length e of the **single internal edge**.

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- Otherwise, \mathbf{T} has two degree 3 internal vertices and we can determine the length e of the **single internal edge**.

- Suppose \mathbf{T} has two degree 3 internal vertices and a single internal edge of length e .
- If the multiset of pendent edge lengths is of the form $\{a, a, a, a\}$ or $\{a, a, a, b\}$, then \mathbf{T} is determined.
- Suppose the pendent edge lengths are of the form $\{a, a, b, b\}$.
 - If the possible values of W_2 are $(a + a), (b + b), (a + b + e)$ with probabilities $\frac{1}{6}, \frac{1}{6}, \frac{2}{3}$, then the leaves with pendent edges of length a (resp. b) are siblings.
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- The edge weights of an edge-weighted tree \mathbf{T} are **in general position** if the **sums of the lengths** of **any two distinct subset of edges** of \mathbf{T} are **not equal**.

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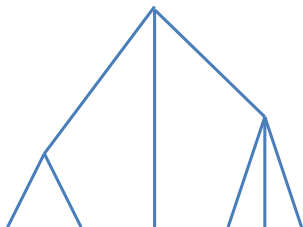
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- Recall that for $i, j \in \mathbf{L}(\mathbf{T})$, $r_{\mathbf{T}}(i, j)$ is the sum of the lengths of the edges on the path between i and j .
- An edge-weighted tree \mathbf{T} is **ultrametric** if for any $i, j, k \in \mathbf{L}(\mathbf{T})$ we have

$$r_{\mathbf{T}}(i, k) \leq r_{\mathbf{T}}(i, j) \vee r_{\mathbf{T}}(j, k),$$

from which it follows that **at least two** of $r_{\mathbf{T}}(i, j)$, $r_{\mathbf{T}}(i, k)$, and $r_{\mathbf{T}}(j, k)$ are **equal** while **the third is no greater than that common value**.

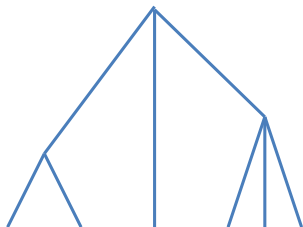


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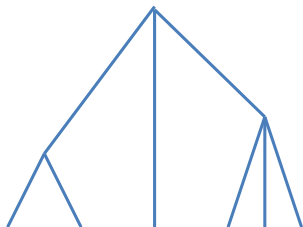


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Caterpillars: what goes into the proof

- Suppose that the caterpillar has $\ell + 1$ internal vertices with respective numbers of leaves n_0, \dots, n_ℓ . Write (W_2, \dots, W_n) for the random subtree length sequences.
- Consider a box with n tickets. Each ticket has a label belonging to $\{0, 1, \dots, \ell\}$ and there are n_i tickets with label i for $0 \leq i \leq \ell$.
- Let X_1, X_2, \dots, X_n be the result of drawing tickets uniformly at random from the box without replacement and noting their labels.

- Set

$$K_r := \max_{1 \leq j \leq r} X_j - \min_{1 \leq j \leq r} X_j$$

= difference between the largest and smallest labels seen in first r draws.

- Note that (W_2, W_3, \dots, W_n) has the same distribution as $(K_2 + 3, K_3 + 3, \dots, K_n + n)$. It suffices to show that it is possible to determine $\{(n_0, n_1, \dots, n_{\ell-1}, n_\ell), (n_\ell, n_{\ell-1}, \dots, n_1, n_0)\}$ from the distribution of $\mathcal{K} := (K_2, \dots, K_n)$.
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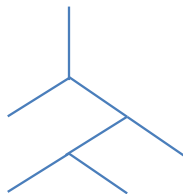
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$k + 1$ -valent trees can be reconstructed

- For $k \geq 2$, a $(k + 1)$ -valent tree is a tree for which all internal vertices have degree $k + 1$.

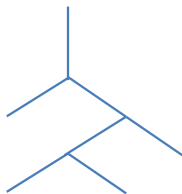


Theorem 5

The isomorphism class of a $(k + 1)$ -valent tree with all edges of length 1 is uniquely determined by the joint distribution of its random length sequence.

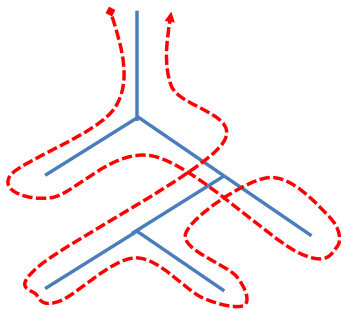
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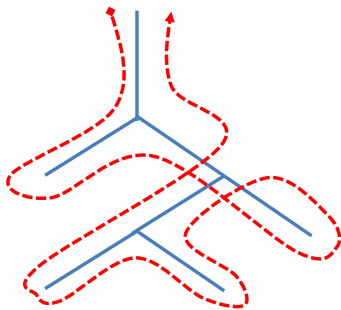


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- A subtree \mathbf{S} of a $(k + 1)$ -valent tree \mathbf{T} has all vertices of degree $k + 1$ or 1 except for a single vertex of degree k if and only if

$$\#\mathbf{E}(\mathbf{S}) = \frac{k}{k-1}(\#\mathbf{L}(\mathbf{S}) - 1).$$

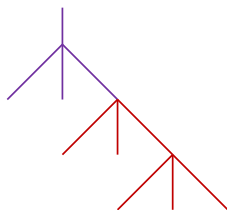


Figure: Here $k = 3$. The **red subtree \mathbf{S}** has $\#\mathbf{E}(\mathbf{S}) = 6$ and $\#\mathbf{L}(\mathbf{S}) = 5$. Note that $6 = \frac{3}{2}(5 - 1)$.

- There is a **total order** on the set of possible **length sequences** for a $(k + 1)$ -valent tree with unit edge lengths such that the **minimal** sequence is guaranteed to come from a **traversal**.

- Is it possible to reconstruct a **general** simple, edge-weighted tree up to isomorphism from the **joint probability distribution** of its **random length sequence**?
- For the purposes of **simulations studies** in **phylogenetics**, we would like to have **generative models** for **random trees** that produce trees which are “like” **biological trees**. Are there features of the **joint distribution** of the **random length sequence** that are **common** to many **biological trees** and can be used to determine which **generative models capture features of biological trees**?

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