

THE KINGMAN COALESCENT AS A DENSITY ON A SPACE OF TREES

Lena Walter
Freie Universität Berlin
July 31st, 2018
joint work with Christian Haase



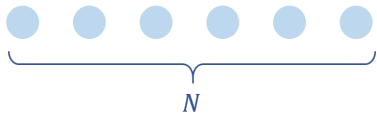
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- 2 SPACE OF TREES
- 3 A DENSITY
- 4 CONNECTION TO TROPICAL GEOMETRY
- 5 FURTHER DIRECTIONS

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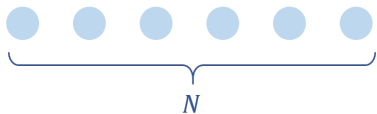
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THE KINGMAN n -COALESCENT



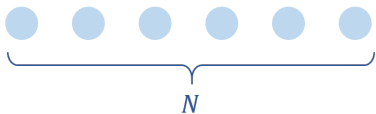
THE KINGMAN n -COALESCENT

population genetic model:



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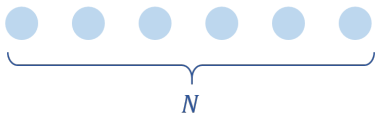
population genetic model:
Wright-Fisher 30's



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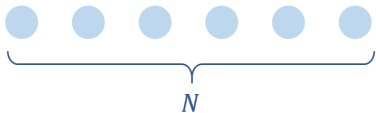
- fixed population size



THE KINGMAN n -COALESCENT

population genetic model:
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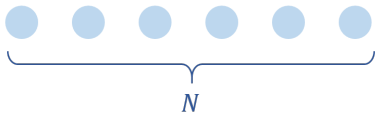
- fixed population size
- non-overlapping generations



THE KINGMAN n -COALESCENT

population genetic model:
Wright-Fisher 30's

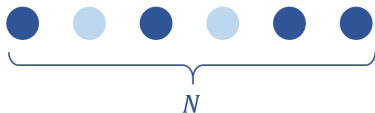
- fixed population size
- non-overlapping generations
- no recombination



THE KINGMAN n -COALESCENT

population genetic model:
Wright-Fisher 30's

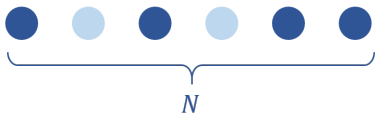
→ sample n individuals from
a population of N



THE KINGMAN n -COALESCENT

population genetic model:
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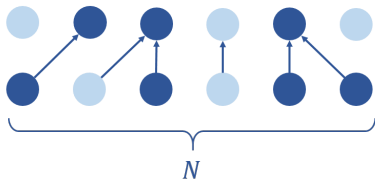
- sample n individuals from a population of N
- trace ancestry backwards in time



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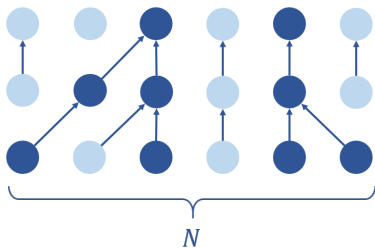
population genetic model:
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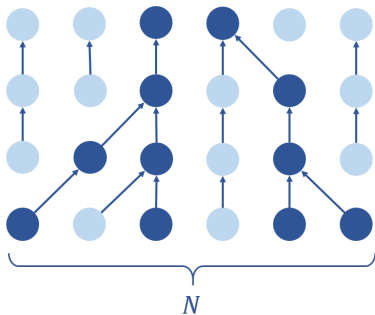
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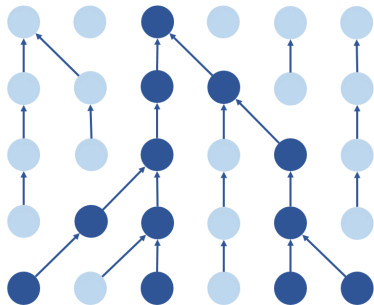


population genetic model:
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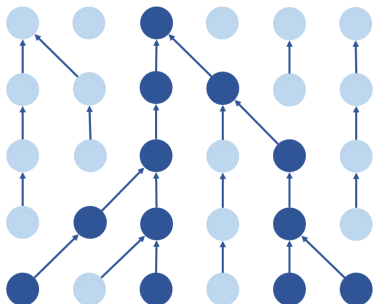


MRCA (Most Recent Common Ancestor)?

population genetic model:
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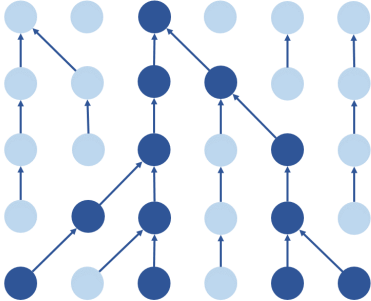


MRCA (Most Recent Common Ancestor)?

Consider two lineages:



THE KINGMAN n -COALESCENT



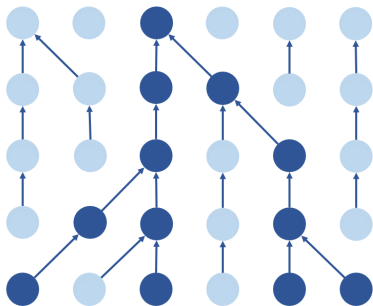
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$$P(\text{c. 1 generation ago}) = \frac{1}{N}$$



THE KINGMAN n -COALESCENT



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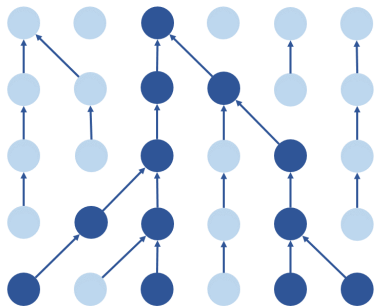
Consider two lineages:

$$P(\text{c. 1 generation ago}) = \frac{1}{N}$$

$$P(\text{c. 2 generations ago}) = \left(1 - \frac{1}{N}\right) \frac{1}{N}$$



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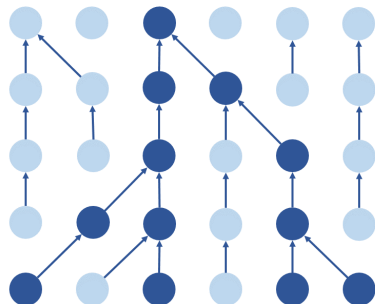
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$$P(\text{c. } t \text{ generations ago}) = \left(1 - \frac{1}{N}\right)^{t-1} \frac{1}{N}$$

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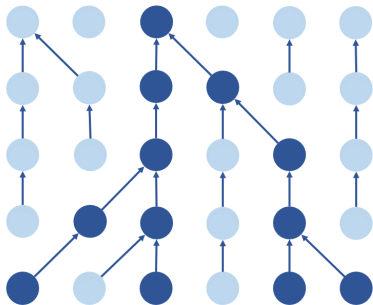
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→ geometric distribution

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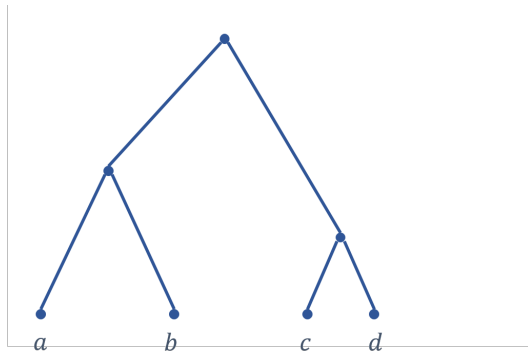
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→ geometric distribution

THEOREM [KINGMAN '82]

For $N \rightarrow \infty$ this will converge to the Kingman n -coalescent.

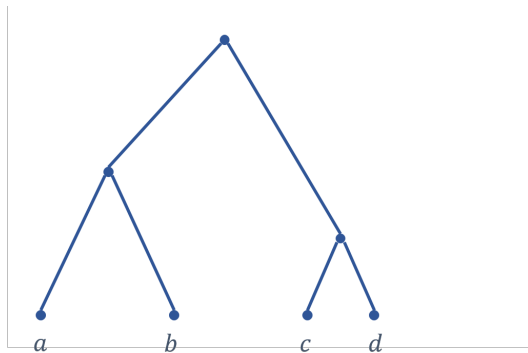
THE KINGMAN n -COALESCENT



→ consider their genealogy as a binary rooted equidistant n -tree



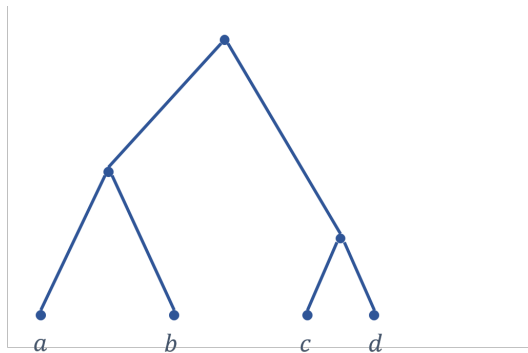
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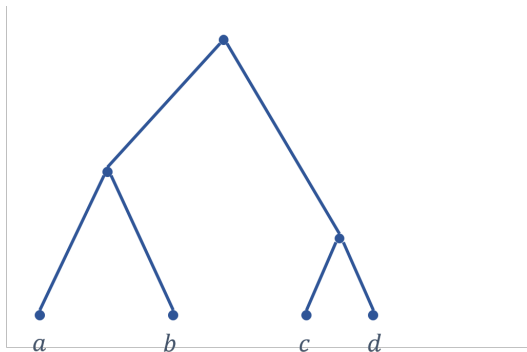


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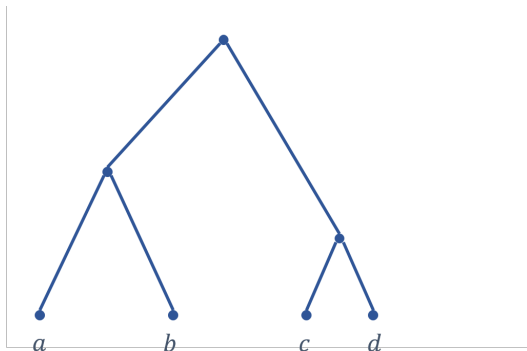
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THE KINGMAN n -COALESCENT

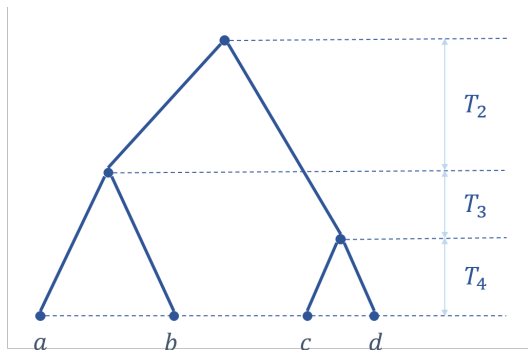


→ consider their genealogy as a binary rooted equidistant n -tree

Discrete: Choosing pairs to coalesce



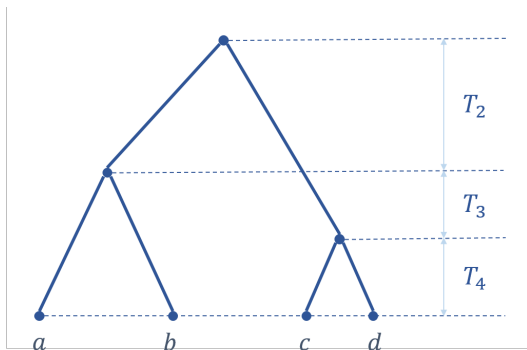
THE KINGMAN n -COALESCENT



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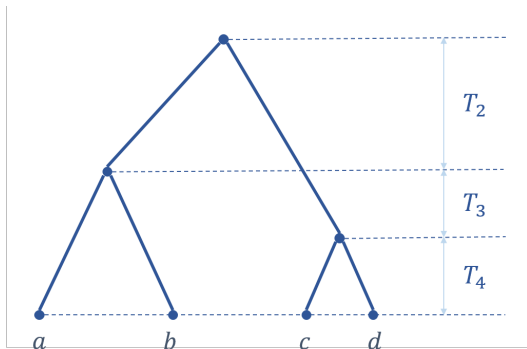
THE KINGMAN n -COALESCENT



→ consider their genealogy as a binary rooted equidistant n -tree
 T_j = time during which there are exactly j lineages in the sample

Discrete: Choosing pairs to coalesce

THE KINGMAN n -COALESCENT



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 T_j = time during which there are exactly j lineages in the sample

Discrete: Choosing pairs to coalesce

Continuous: Exponentially distributed waiting times $T_j \sim \text{Exp}(\binom{j}{2})$

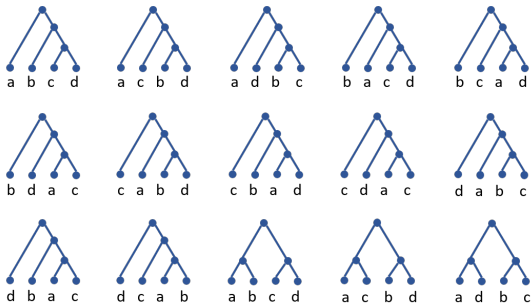


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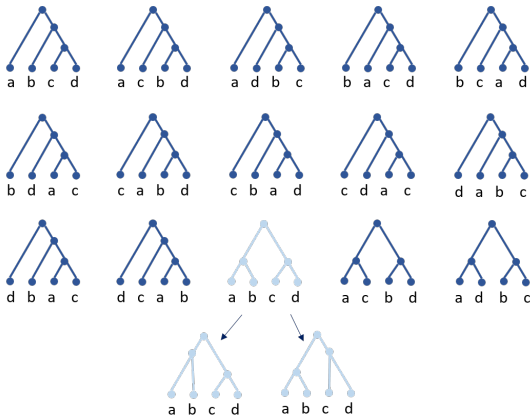
SPACE OF TREES

Coarse combinatorial types of binary rooted equidistant 4-trees



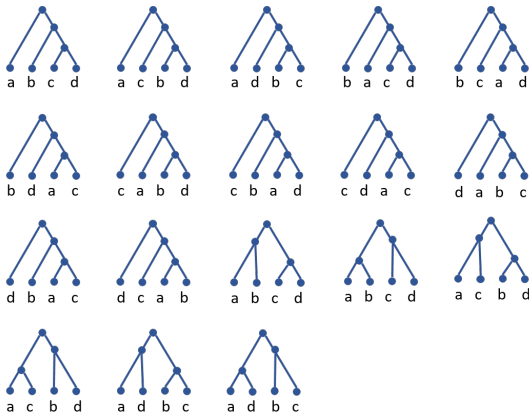
SPACE OF TREES

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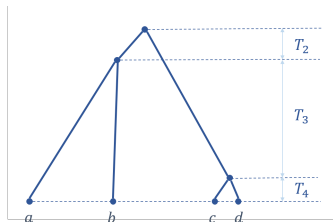
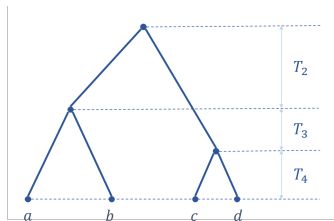


SPACE OF TREES

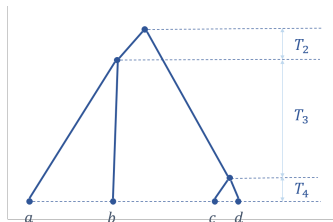
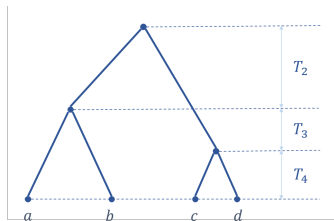
Fine combinatorial types of binary rooted equidistant 4-trees



SPACE OF TREES

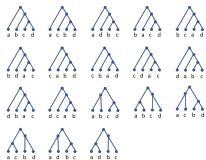
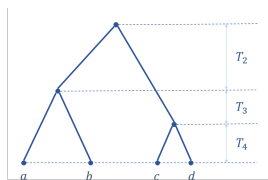


SPACE OF TREES



→ Parametrization?

SPACE OF TREES

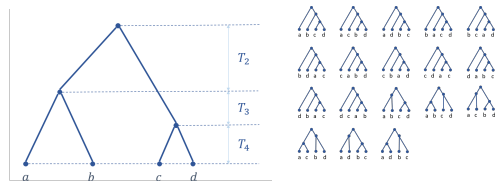


→ Parametrization

- global



SPACE OF TREES



→ Parametrization

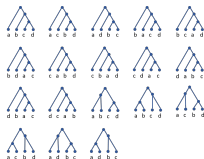
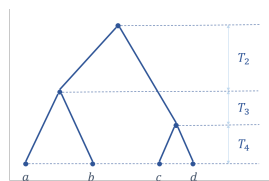
- global

DEFINITION

$$\text{MUM}_n := \{d \in \mathbb{R}_{\geq 0}^{\binom{n}{2}} : \forall i, j, k : \max \{d_{ij}, d_{ik}, d_{jk}\} \text{ is attained at least twice}\}$$

Metrics that are UltraMetrics

SPACE OF TREES



→ Parametrization

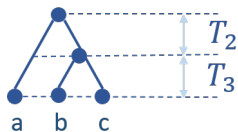
- global
- local

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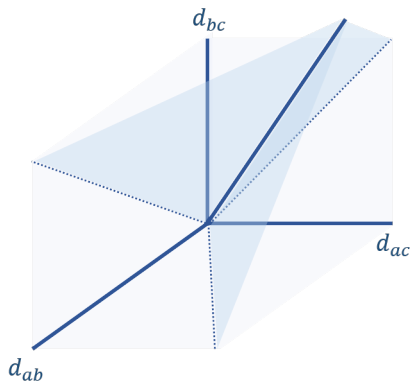
Metrics that are UltraMetrics

SPACE OF TREES



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- global: coordinates d_{ab} , d_{ac} , d_{bc}

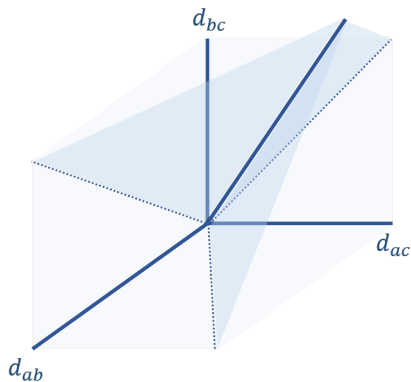


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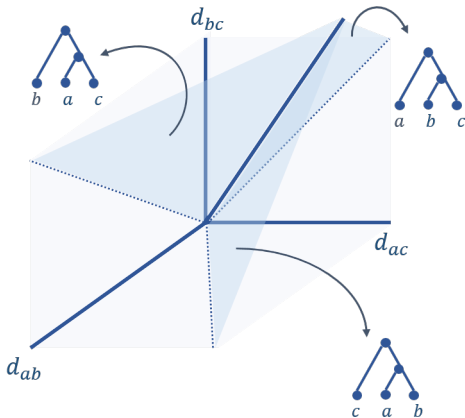


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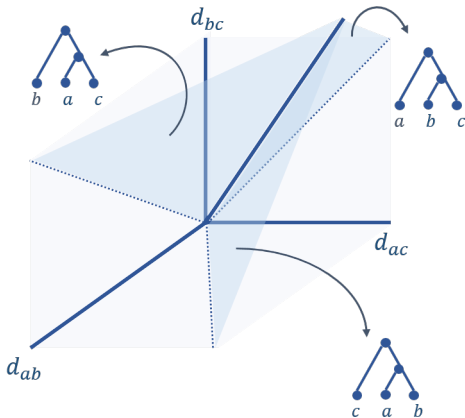


SPACE OF TREES



→ Parametrization

- global: coordinates d_{ab} , d_{ac} , d_{bc}
→ one cone for each combinatorial type

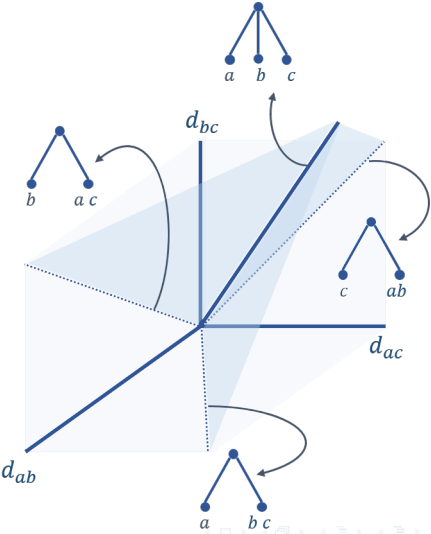


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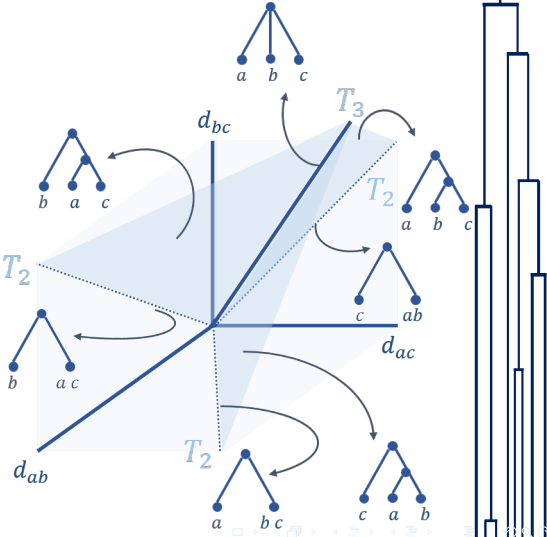


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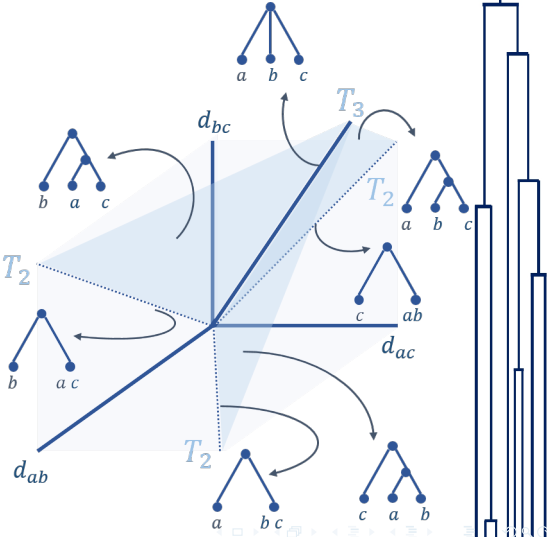


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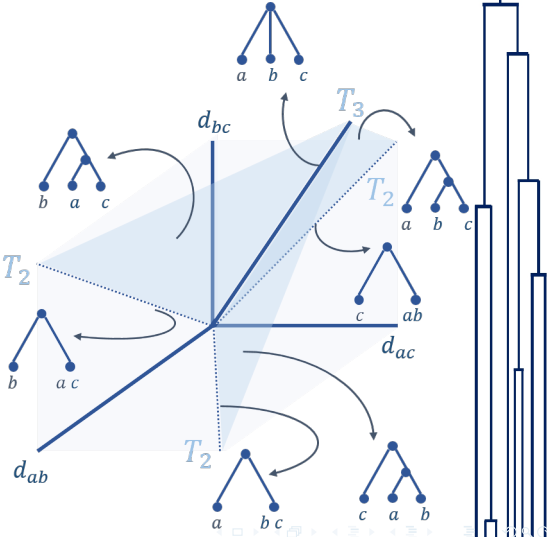


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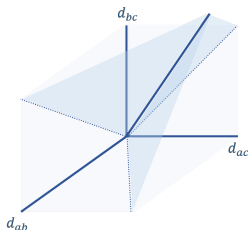
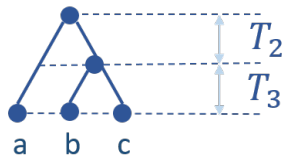
- global: coordinates d_{ab}, d_{ac}, d_{bc}
 → one cone for each combinatorial type
- local: coordinates T_2, T_3



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A DENSITY



PROPOSITION [HAASE, W.]

The Kingman n -coalescent is given by the continuous density

$$\rho_n(T_2, \dots, T_n) = \prod_{j=2}^n \binom{j}{2} \exp\left(-\binom{j}{2} T_j\right).$$

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CONNECTION TO TROPICAL GEOMETRY

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Metrics that are Ultrametrics

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Dissimilarity maps that are UltraMetrics

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A *dissimilarity map* on $[n]$ is a map $\delta : [n] \times [n] \rightarrow \mathbb{R}$ such that $\delta(i, i) = 0$ for all $i \in [n]$, and $\delta(i, j) = \delta(j, i)$ for all $i, j \in [n]$.

CONNECTION TO TROPICAL GEOMETRY

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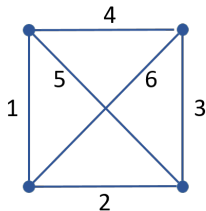
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THEOREM [ARDILA KLIVANS '06]

$$\text{DUM}_n / \mathbb{R}1 = \text{trop}(\text{matroid}(K_n)) = \mathcal{B}(K_n)$$

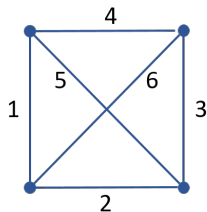
THE BERGMAN FAN OF A GRAPHICAL MATROID

complete graph K_4



THE BERGMAN FAN OF A GRAPHICAL MATROID

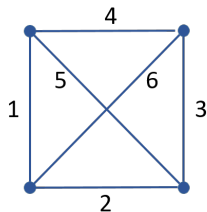
complete graph K_4



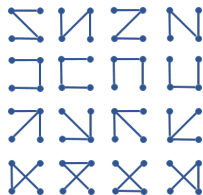
$$E = \{1, 2, 3, 4, 5, 6\}$$

THE BERGMAN FAN OF A GRAPHICAL MATROID

complete graph K_4

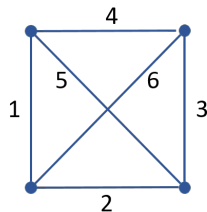


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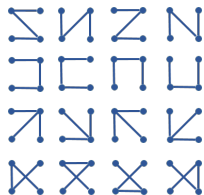


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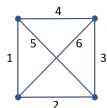


Bases of the graphical matroid
 $M(K_4) = (E, B)$

$$B = \{\{2, 4, 5\}, \{1, 3, 6\}, \{2, 4, 6\}, \\ \{1, 3, 5\}, \{2, 3, 4\}, \{1, 2, 4\}, \\ \{1, 3, 4\}, \{1, 2, 3\}, \{3, 4, 6\}, \\ \{2, 3, 5\}, \{1, 4, 5\}, \{1, 5, 6\}, \\ \{4, 5, 6\}, \{2, 5, 6\}, \{3, 5, 6\}\}$$

THE BERGMAN FAN OF A GRAPHICAL MATROID

complete graph $K_4 \rightsquigarrow$



$E = \{1, 2, 3, 4, 5, 6\}$

Graphical matroid

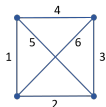
$M(K_4) = (E, B)$



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THE BERGMAN FAN OF A GRAPHICAL MATROID

complete graph $K_4 \rightsquigarrow$



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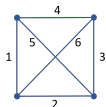


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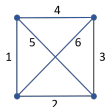


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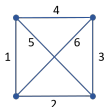


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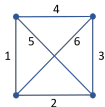
Bergman fan

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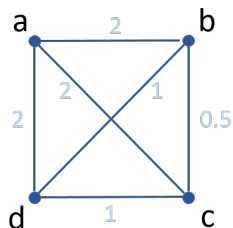
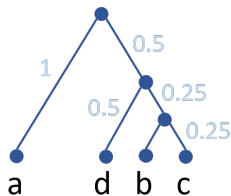
THEOREM [ARDILA KLIVANS '06]

A dissimilarity map is an ultrametric if and only if the corresponding weight vector on the edges of K_n is in the Bergman fan $\mathcal{B}(K_n)$.

THE BERGMAN FAN OF A GRAPHICAL MATROID

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SPACE OF TREES

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Dissimilarity maps that are TreeMetrics

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THEOREM [SPEYER STURMFELS '03]

$$\text{DTM}_n / \mathbb{R}1 = \text{trop}(\text{Gr}(2, n))$$

CONTENTS

- 1 THE KINGMAN n -COALESCENT
- 2 SPACE OF TREES
- 3 A DENSITY
- 4 CONNECTION TO TROPICAL GEOMETRY
- 5 FURTHER DIRECTIONS

FURTHER DIRECTIONS

- fan with density in $\mathbb{R}^{\binom{N}{2}}$?
- fan for species trees?
- include mutations?
- consider non-binary trees?

Thank you for your attention!