

# Algebraic varieties arising from phylogenetic trees

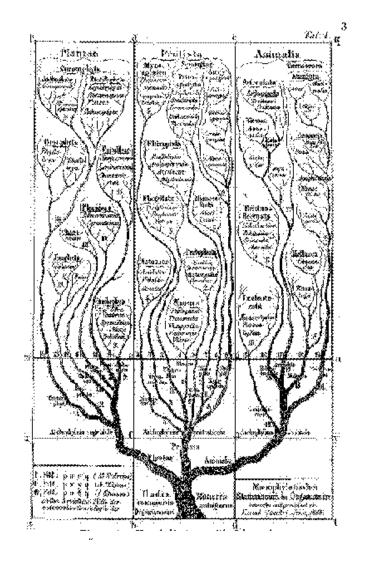
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## phylogenetics

Phylogenetics: reconstructing historical relation between species by analyzing their present features and putting their common ancestors in a diagram which forms a tree. [e.g. Häckel, 1866]



## three (un?)related problems

counting points in polyhedra



Algebraic varieties arising from phylogenetic trees - p.3/1

## three (un?)related problems

- counting points in polyhedra
- networks of paths in a tree

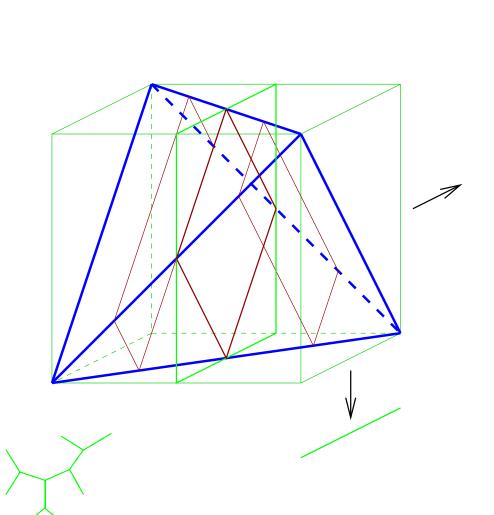
## three (un?)related problems

- counting points in polyhedra
- networks of paths in a tree
- Markov processes on a tree

For a positive integer n let  $[n] = \{0, ..., n\}$ . Function  $f : [n] \to \mathbb{Z}$  is symmetric if for every  $k \in [n]$  it holds f(k) = f(n - k). By  $\mathbf{1} : [n] \to \mathbb{Z}$  denote the unit function. For a positive integer n let  $[n] = \{0, ..., n\}$ . Function  $f : [n] \to \mathbb{Z}$  is symmetric if for every  $k \in [n]$  it holds f(k) = f(n - k). By  $\mathbf{1} : [n] \to \mathbb{Z}$  denote the unit function. If  $f_1 f_2 : [n] \to \mathbb{Z}$  are symmetric functions then we define their symmetric product  $f_1 \star f_2 : [n] \to \mathbb{Z}$ such that for  $k \le n/2$ :

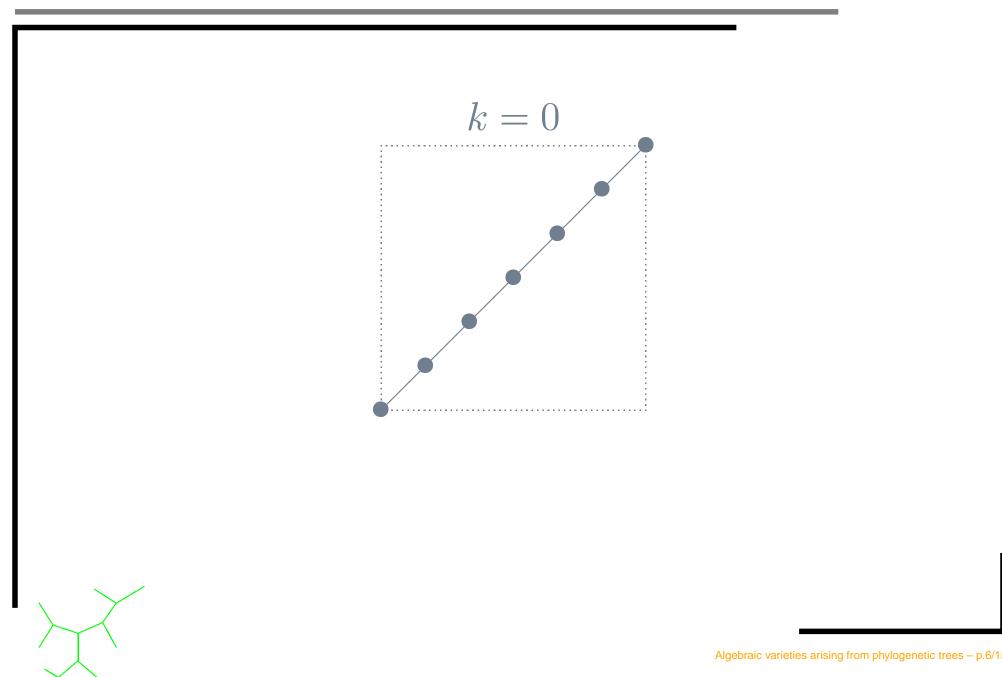
$$(f_1 \star f_2)(k) = 2 \cdot \left( \sum_{i=0}^{k-1} \sum_{j=0}^{i} f_1(i) f_2(k+i-2j) \right) \\ + \left( \sum_{i=k}^{n-k} \sum_{j=0}^{k} f_1(i) f_2(k+i-2j) \right)$$

## geometric interpretation of \*

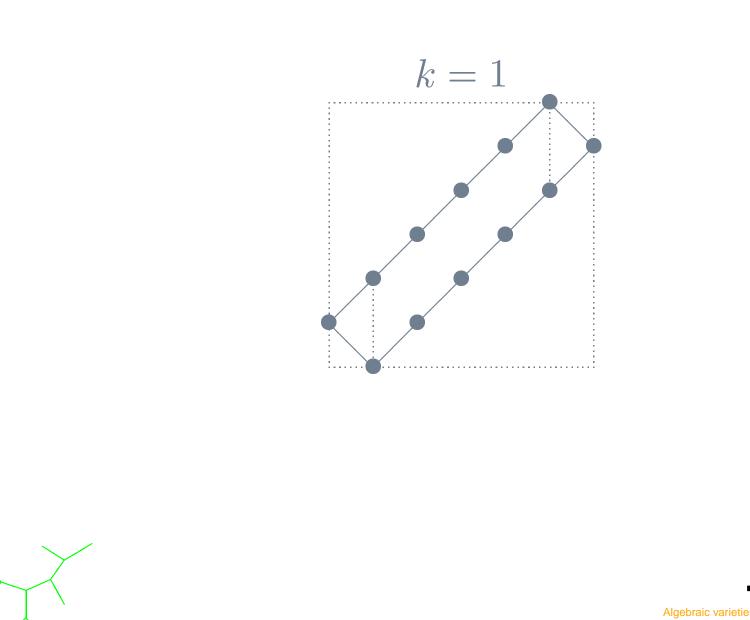


Consider the simplex  $\Delta$  as in the picture  $(f_1 \star f_2)(k)$  is equal to the sum of products of  $f_1$  and  $f_2$  counted over points of lattice spanned by  $\Delta$  in k-th slice of  $n \cdot \Delta$ k+1) is the number of lattice points in k-th slice of  $n \cdot \Delta$ 

travel trough  $6 \cdot \Delta$ 

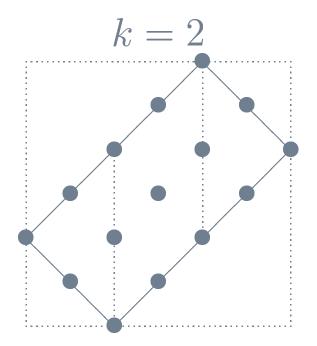


travel trough  $6 \cdot \Delta$ 



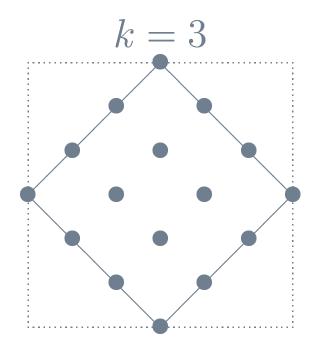
Algebraic varieties arising from phylogenetic trees - p.6/15

travel trough  $6 \cdot \Delta$ 



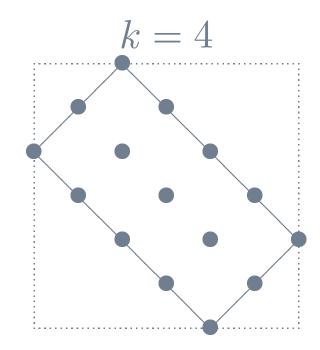


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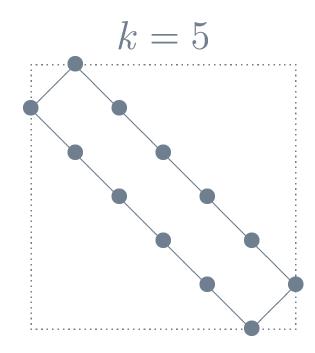


travel trough  $6 \cdot \Delta$ 



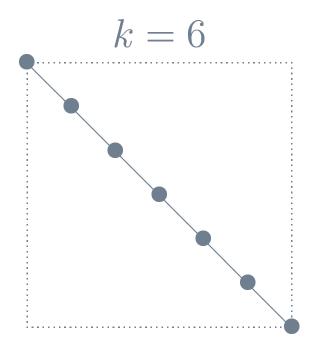
Algebraic varieties arising from phylogenetic trees - p.6/15

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#### • $\star$ is commutative, $f_1 \star f_2 = f_2 \star f_1$

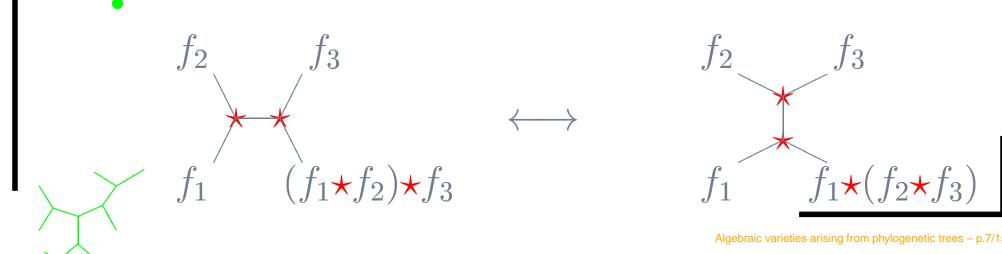


Algebraic varieties arising from phylogenetic trees - p.7/1

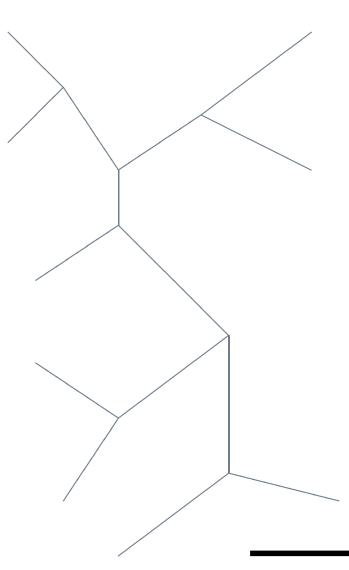
- $\star$  is commutative,  $f_1 \star f_2 = f_2 \star f_1$
- $\star$  is usually nonassociative, i.e.  $(f_1 \star f_2) \star f_3 \neq f_1 \star (f_2 \star f_3)$

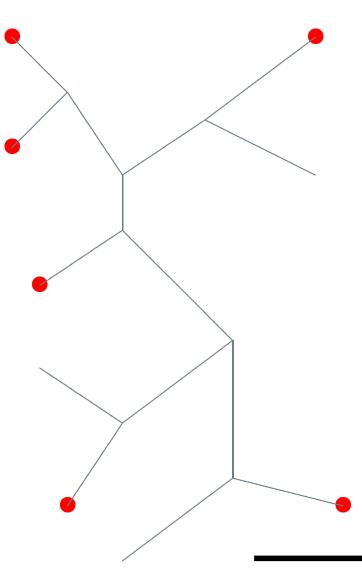
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- however, [theorem 1] If Ω is the smallest set of functions closed under \* and containing 1 then \* is associative within Ω

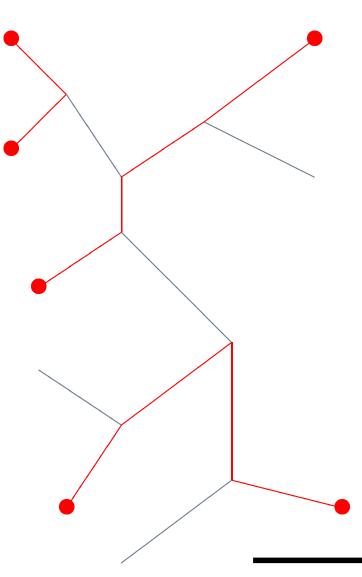
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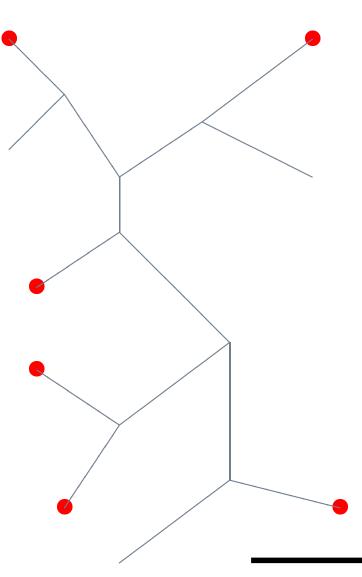


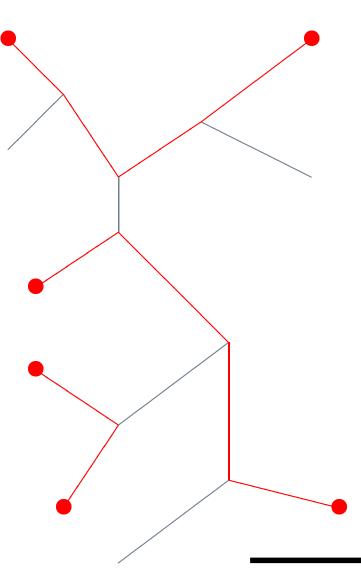
Algebraic varieties arising from phylogenetic trees - p.8/1











[lemma] There is a bijection between the set of sockets and networks, that is for every socket  $\sigma$  there exists a unique network  $\mu(\sigma)$  whose end points are in  $\sigma$ 

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For every edge  $e \in \mathcal{E}$  we consider a  $\mathbb{P}_e^1$  with homogeneous coordinates  $[y_0^e, y_1^e]$ . Moreover consider a projective space  $\mathbb{P}_{\Sigma}$  of dimension  $2^d - 1$  with homogeneous coordinates  $[z_{\sigma}]$ indexed by sockets of  $\mathcal{T}$ . [lemma] There is a bijection between the set of sockets and networks, that is for every socket  $\sigma$  there exists a unique network  $\mu(\sigma)$  whose end points are in  $\sigma$ 

Define rational map  $\prod_{e \in \mathcal{E}} \mathbb{P}^1_e \to \mathbb{P}_{\Sigma}$  such that

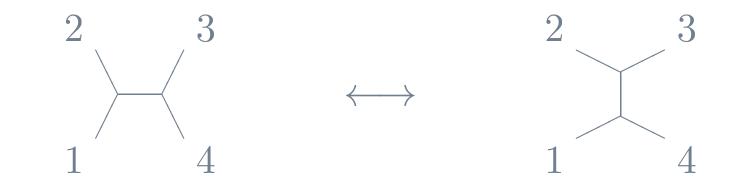
$$z_{\sigma} = \prod_{e \in \mu(\sigma)} y_1^e \cdot \prod_{e \notin \mu(\sigma)} y_0^e$$

The model of the tree,  $X(\mathcal{T}) \subset \mathbb{P}_{\Sigma}$ , is the closure of the image of this map,  $\dim X(\mathcal{T}) = 2d$ .

Algebraic varieties arising from phylogenetic trees - p.9/1

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Algebraic varieties arising from phylogenetic trees - p.10/1

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These varieties can be non-isomorphic (one can check it), however [theorem 2] they are in the same connected component of the Hilbert scheme of  $\mathbb{P}_{\Sigma}$ , that is  $X(\mathcal{T}_1)$  can be deformed to  $X(\mathcal{T}_2)$  if only  $\mathcal{T}_1$  and  $\mathcal{T}_2$  have the same number of leaves.

Algebraic varieties arising from phylogenetic trees - p.10/1

Fix a root r in tree  $\mathcal{T}$  - this implies an order < on the set of vertexes  $\mathcal{V} = \mathcal{L} \cup \mathcal{N}$ . To each vertex  $v \in \mathcal{V}$  assign a random variable  $\xi_v$  which takes value in  $\{\alpha_1, \alpha_2\}$ .

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u < v define the transition matrix  $A^e$ :

$$A_{ij}^e = P(\xi_v = \alpha_j | \xi_u = \alpha_i)$$



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and set the probability of the variable  $\xi_r$  at the root:  $P_i^r = P(\xi_r = \alpha_i)$ 

Algebraic varieties arising from phylogenetic trees - p.11/1

### from Markov to phylogenetics

# For a Markov process on a rooted tree $\ensuremath{\mathcal{T}}$ as above



### from Markov to phylogenetics

For a Markov process on a rooted tree  $\mathcal{T}$  as above and any function  $\mathcal{V} \ni v \to \rho(v) \in \{1, 2\}$ 

$$P(\bigwedge_{v\in\mathcal{V}}\xi_v=\alpha_{\rho(v)})=P^r_{\rho(r)}\cdot\prod_{e=\langle u,v\rangle\in\mathcal{E}}A^e_{\rho(u)\rho(v)}$$

### from Markov to phylogenetics

For a Markov process on a rooted tree  $\mathcal{T}$  as above and any function  $\mathcal{L} \ni v \to \rho(v) \in \{1, 2\}$ 

$$P(\bigwedge_{v \in \mathcal{L}} \xi_v = \alpha_{\rho(v)}) = \sum_{\widehat{\rho}} P^r_{\widehat{\rho}(r)} \cdot \prod_{e = \langle u, v \rangle \in \mathcal{E}} A^e_{\widehat{\rho}(u)\widehat{\rho}(v)}$$

where the sum is taken over all  $\hat{\rho} : \mathcal{V} \to \{1, 2\}$ which extend  $\rho$ .

Algebraic varieties arising from phylogenetic trees - p.12/1

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where the sum is taken over all  $\hat{\rho} : \mathcal{V} \to \{1, 2\}$ which extend  $\rho$ .

Phylogenetics: understand the shape of  $\mathcal{T}$  by looking at the distribution of  $P(\bigwedge_{v \in \mathcal{L}} \xi_v = \alpha_{\rho(v)})$ , that is

Algebraic varieties arising from phylogenetic trees - p.12/1

Phylogenetics wants to understand the locus of possible probability values of a Markov process on a fixed tree  ${\cal T}$ 

$$\begin{aligned} \mathcal{X}(\mathcal{T}) &:= \\ \{\zeta_{\rho} = P(\bigwedge_{v \in \mathcal{L}} \xi_{v} = \alpha_{\rho(v)}) : A^{e}_{ij}, P^{r}_{i} \text{ are arbitrary} \} \\ \text{in the simplex with coordinates } \zeta_{\rho} \text{ where } \zeta_{\rho} \geq 0, \\ \sum_{\rho} \zeta_{\rho} = 1. \end{aligned}$$

#### Assume:



Algebraic varieties arising from phylogenetic trees - p.13/1

• the root distribution is uniform,  $P_1^r = P_2^r$ 

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Algebraic varieties arising from phylogenetic trees - p.13/1

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$$A_{12}^e = A_{21}^e, \ A_{11}^e = A_{22}^e$$



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then [proposition] after suitable change of coordinates (and identifying spaces) the varieties  $\mathcal{X}(\mathcal{T})$  and  $X(\mathcal{T})$  coincide.

Algebraic varieties arising from phylogenetic trees - p.13/1

#### Translate the original problem into toric geometry



Algebraic varieties arising from phylogenetic trees - p.14/1

Translate the original problem into toric geometry

tree



#### Translate the original problem into toric geometry

#### tree

variety



tree

#### Translate the original problem into toric geometry

#### polytope variety

Translate the original problem into toric geometry

tree polytope variety

understand the basic objects

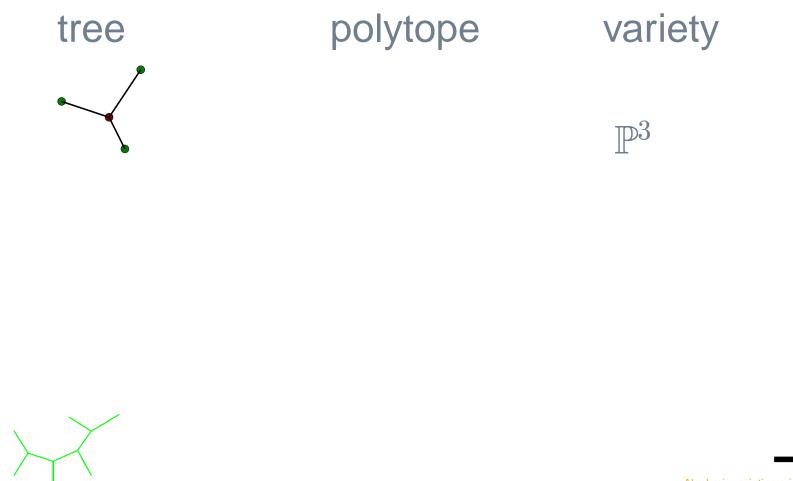
Algebraic varieties arising from phylogenetic trees - p.14/1

tree

#### Translate the original problem into toric geometry



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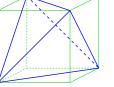
Algebraic varieties arising from phylogenetic trees - p.14/1

#### Translate the original problem into toric geometry











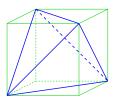
 $\mathbb{P}^3$ 

#### Translate the original problem into toric geometry













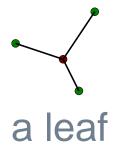


#### Translate the original problem into toric geometry

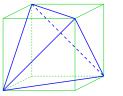
variety

 $\mathbb{P}^3$ 









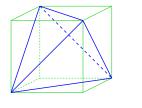
projection

#### Translate the original problem into toric geometry



a leaf





projection

variety

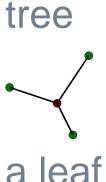
 $\mathbb{P}^3$  $\mathbb{C}^*$  action



polytope

projection

#### Translate the original problem into toric geometry



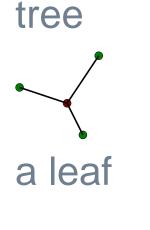


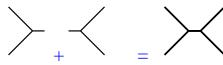
variety

 $\mathbb{P}^3$  $\mathbb{C}^*$  action

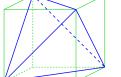
#### Algebraic varieties arising from phylogenetic trees - p.14/1

#### Translate the original problem into toric geometry

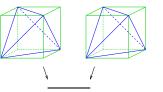








projection

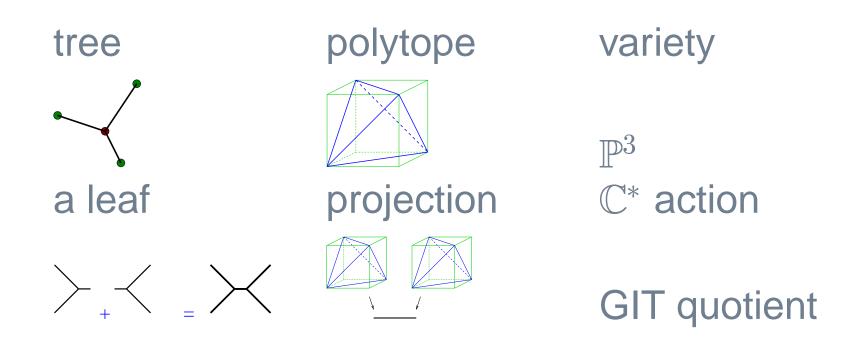


variety

 $\mathbb{P}^3$  $\mathbb{C}^*$  action

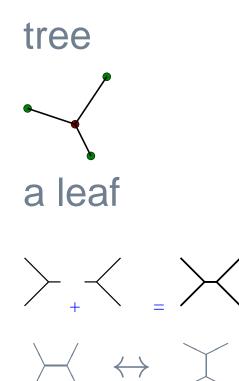
Algebraic varieties arising from phylogenetic trees - p.14/1

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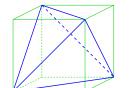


Algebraic varieties arising from phylogenetic trees - p.14/1

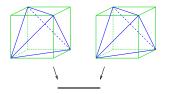
#### Translate the original problem into toric geometry







projection



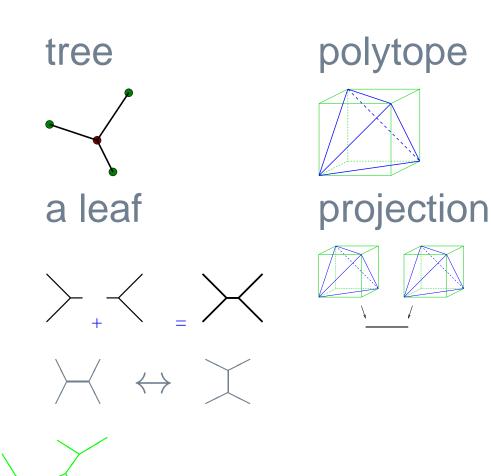
variety

 $\mathbb{P}^3$  $\mathbb{C}^*$  action

**GIT** quotient

Algebraic varieties arising from phylogenetic trees - p.14/1

#### Translate the original problem into toric geometry



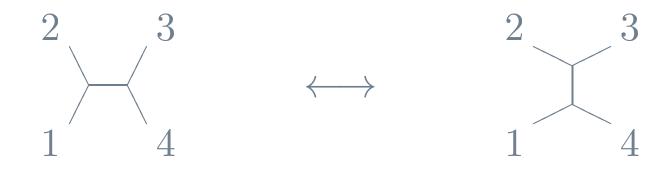
variety

 $\mathbb{P}^3$  $\mathbb{C}^*$  action

GIT quotient deformation

Algebraic varieties arising from phylogenetic trees - p.14/1

#### The mutation of a 4-leaf tree



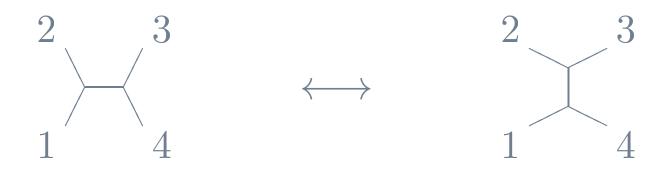
can be explicitely written as deformation which preserves the action of  $\mathbb{C}^*$  groups associated to leaves,

Algebraic varieties arising from phylogenetic trees - p.15/1

12

#### The mutation of a 4-leaf tree

3



can be explicitely written as deformation which preserves the action of  $\mathbb{C}^*$  groups associated to leaves, thus via GIT quotient it can be extended to a mutation of any tree along any inner edge



 $\mathcal{T}_3$ 

2