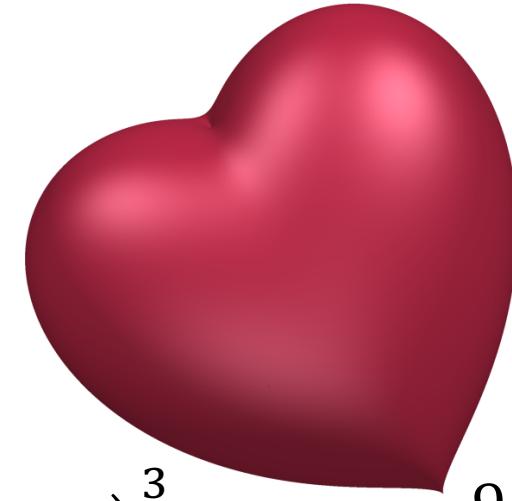
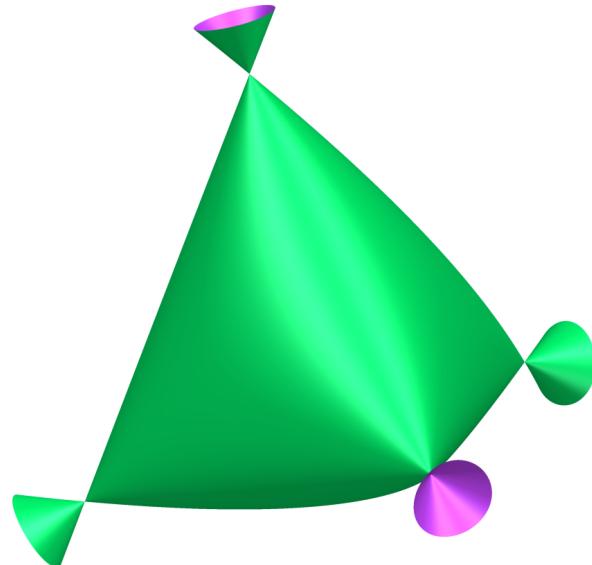


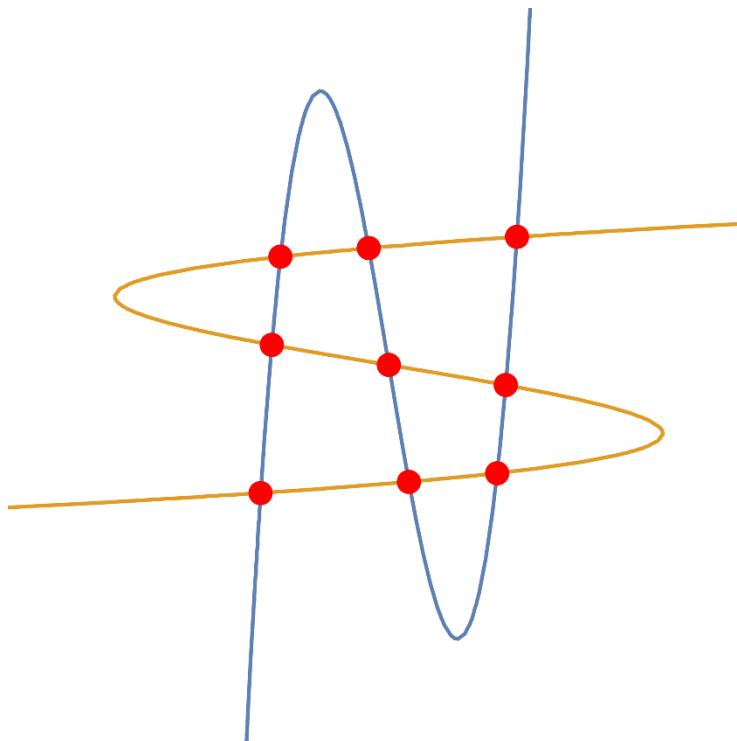
Algebraic varieties



$$\left(x^2 + \frac{9}{4y^2} + z^2 - 1\right)^3 - x^2z^3 - \frac{9}{80}y^2z^3 = 0$$



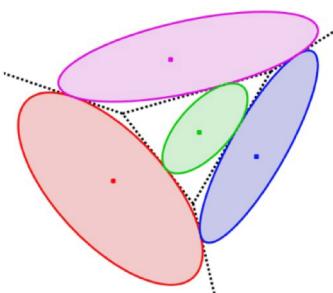
$$1 - x^2 - y^2 + 2xyz - z^2 = 0$$



$$\begin{cases} y - x^3 + 6x = 0 \\ x - y^3 + 6y = 0 \end{cases}$$

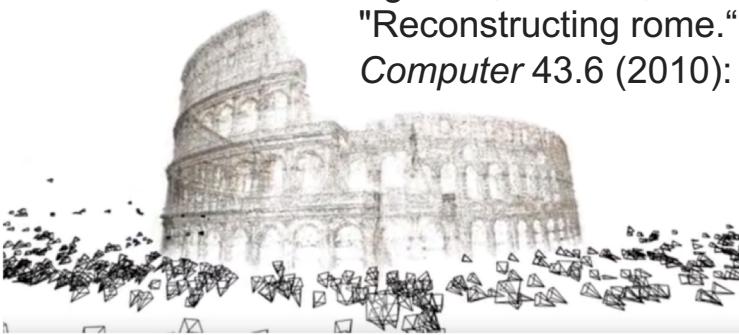
Algebraic varieties in applications

Polynomial optimization



Cifuentes, Harris, and Sturmfels. "The geometry of SDP-exactness in quadratic optimization." *Mathematical Programming* (2018): 1-30.

Computer vision



Agarwal, Sameer, et al.
"Reconstructing rome."
Computer 43.6 (2010): 40-47.

Does the system have solutions?

What is the dimension of the solution set?

Can we write them explicitly?

Algebraic varieties in applications



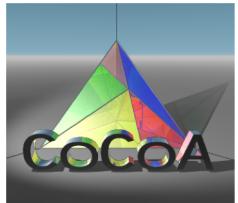
Maple™

Macaulay2



Homotopy
Continuation.jl

Computational
Algebraic Geometry



SINGULAR

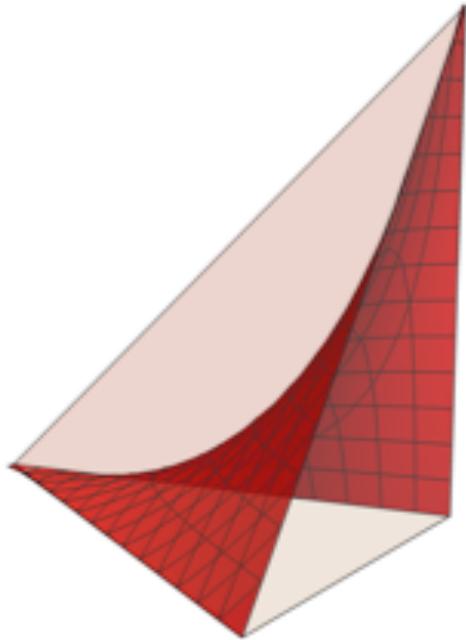
WOLFRAM
MATHEMATICA 11

Does the system have solutions?

What is the dimension of the
solution set?

Can we write them explicitly?

My Research Profile



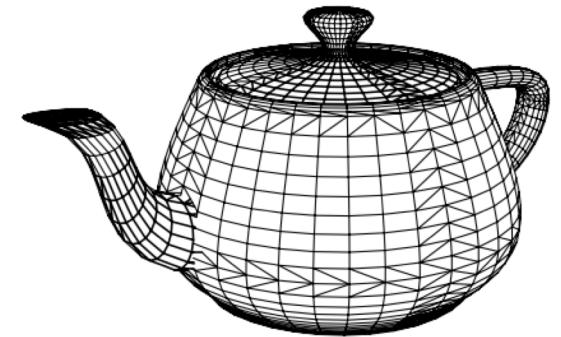
Algebraic Statistics

Ananiadi and Duarte (*J. Algebr. Stat.: in Rev.*) 2020

Duarte, Marigliano and Sturmfels (*Bernoulli: in Rev.*) 2019

Duarte and Görgen (*J. Symb. Comput.*) 2019

Guerra, Delgado-Baquerizo, Duarte, et al. (*in Rev.*)



Geometric Modeling

Duarte and Seceleanu (*Math. of Comp.: accepted*) 2020

Duarte (*J. Algebra its Appl.*) 2016

Duarte and Schenck (*Proc. Am. Math. Soc.*) 2014

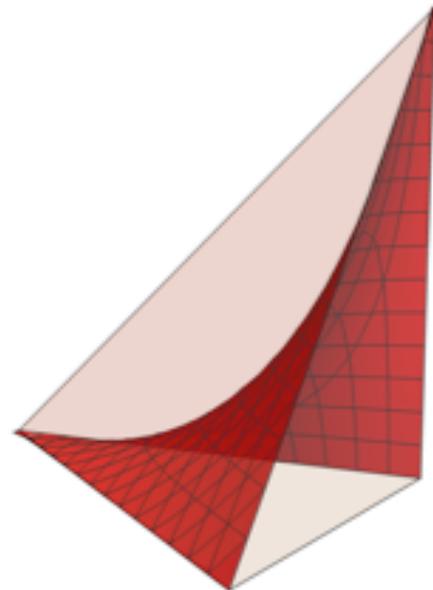


Duarte and Francis (*Conf. Proc. Transformables*) 2013

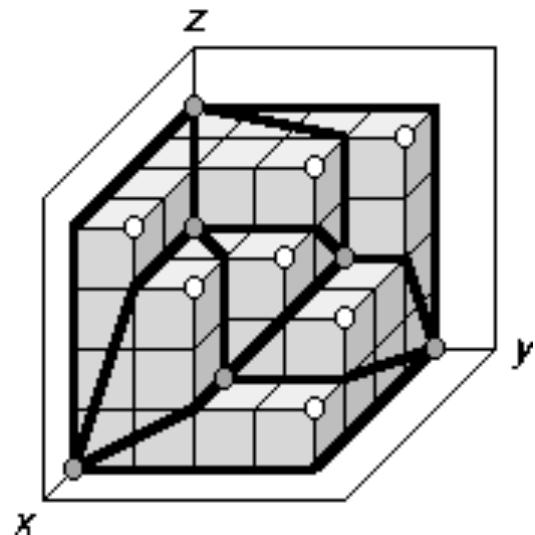
Rigidity theory

Algebraic Statistics

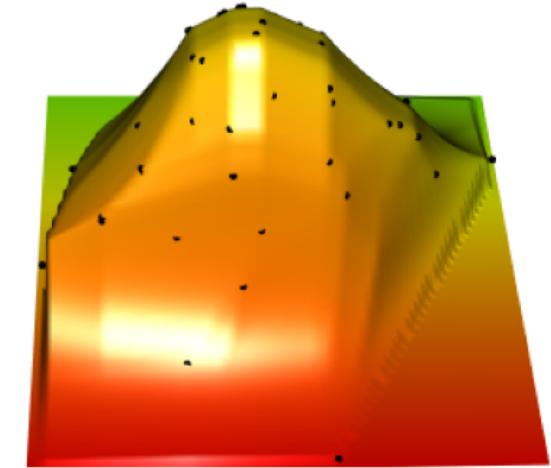
Branch of mathematical statistics employing and developing tools from...



Algebraic Geometry



Commutative Algebra



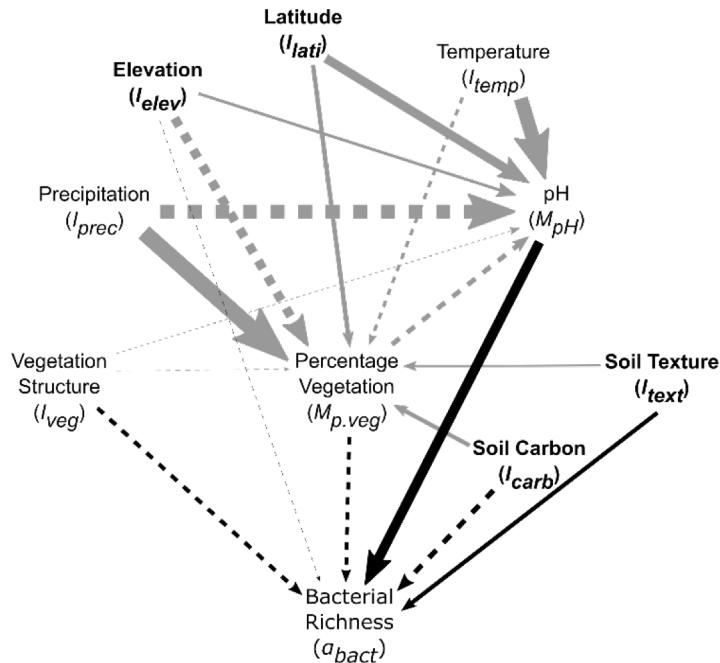
Discrete Geometry

...to tackle problems in statistics

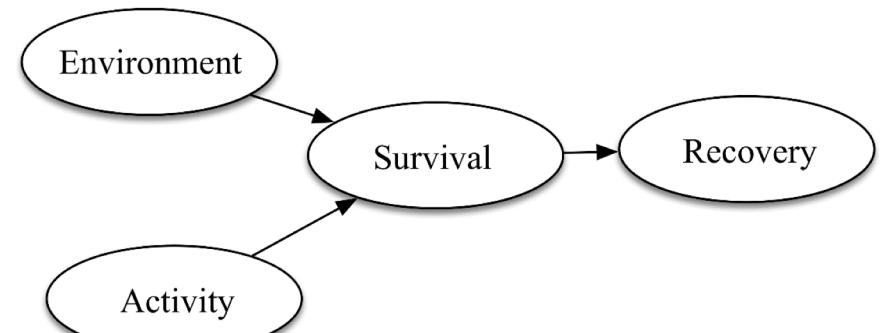
Graphical Models

family of statistical models that describes dependency relations among variables using a graph

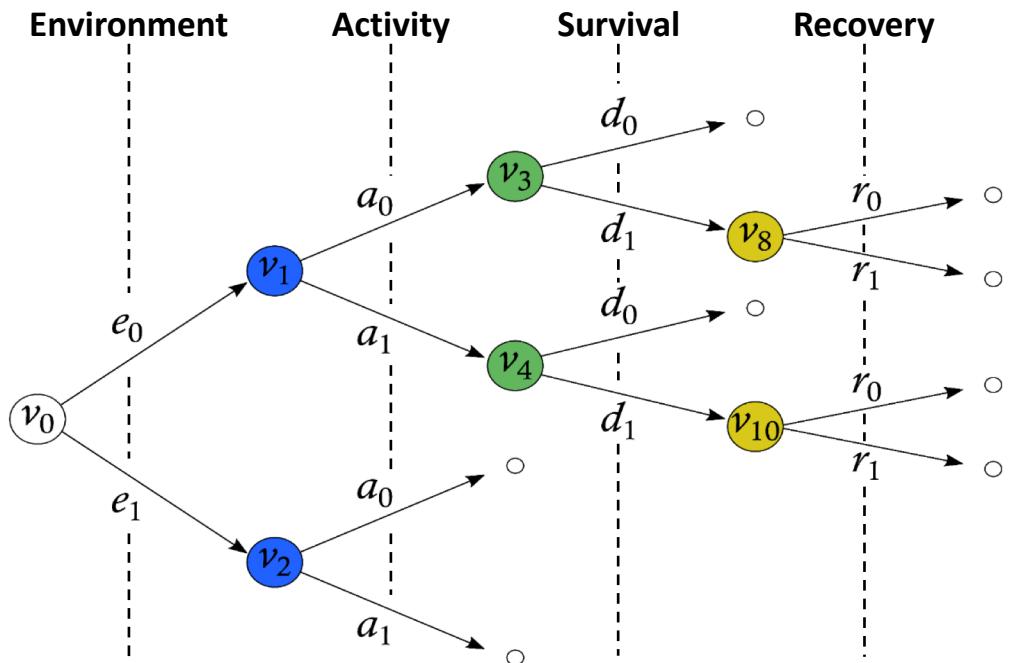
Structural equation models



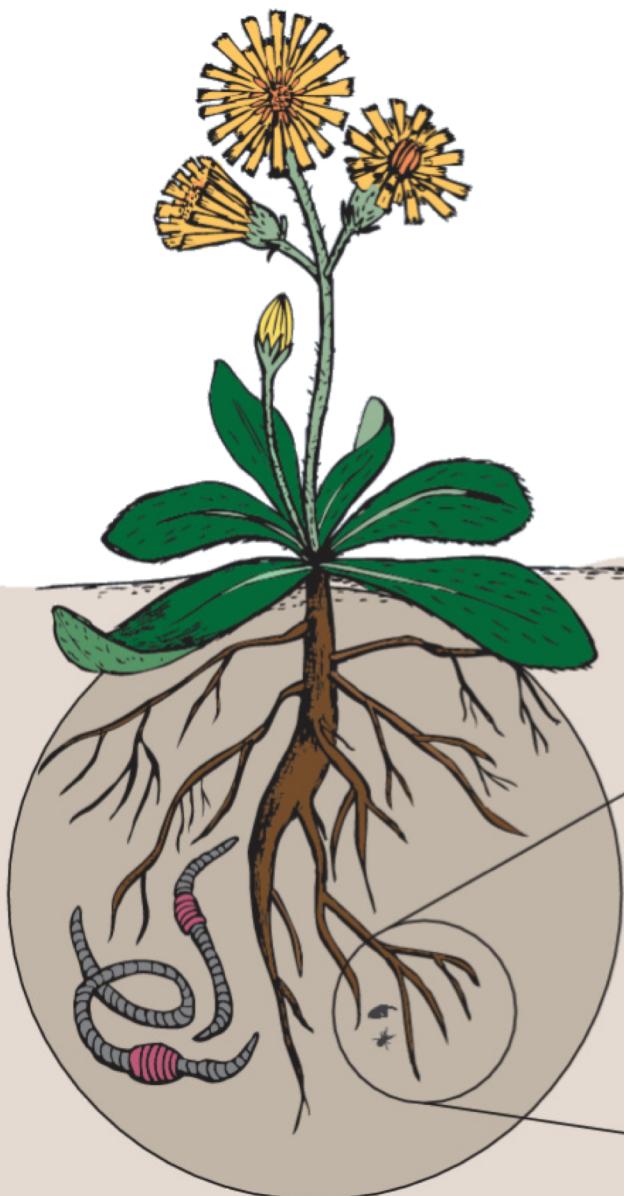
Bayesian networks



Staged tree models

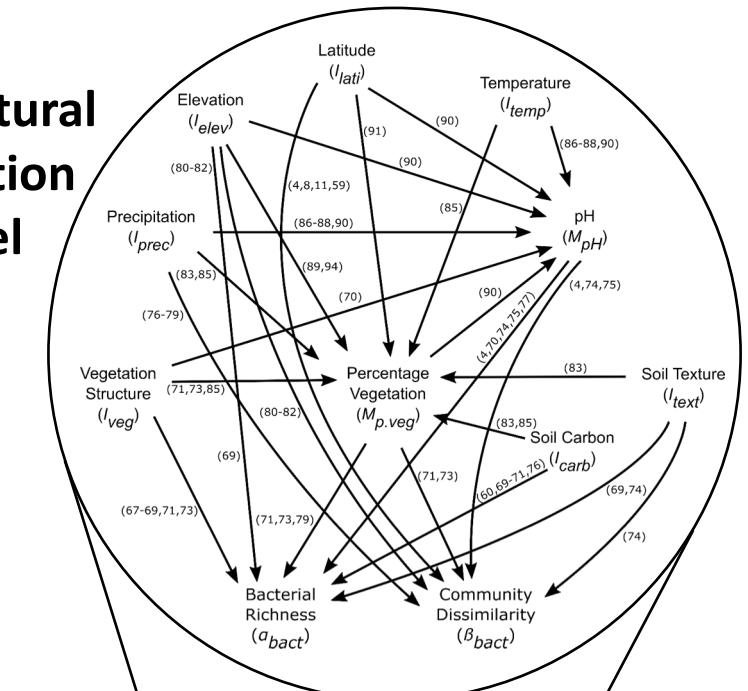


The soil microbiome

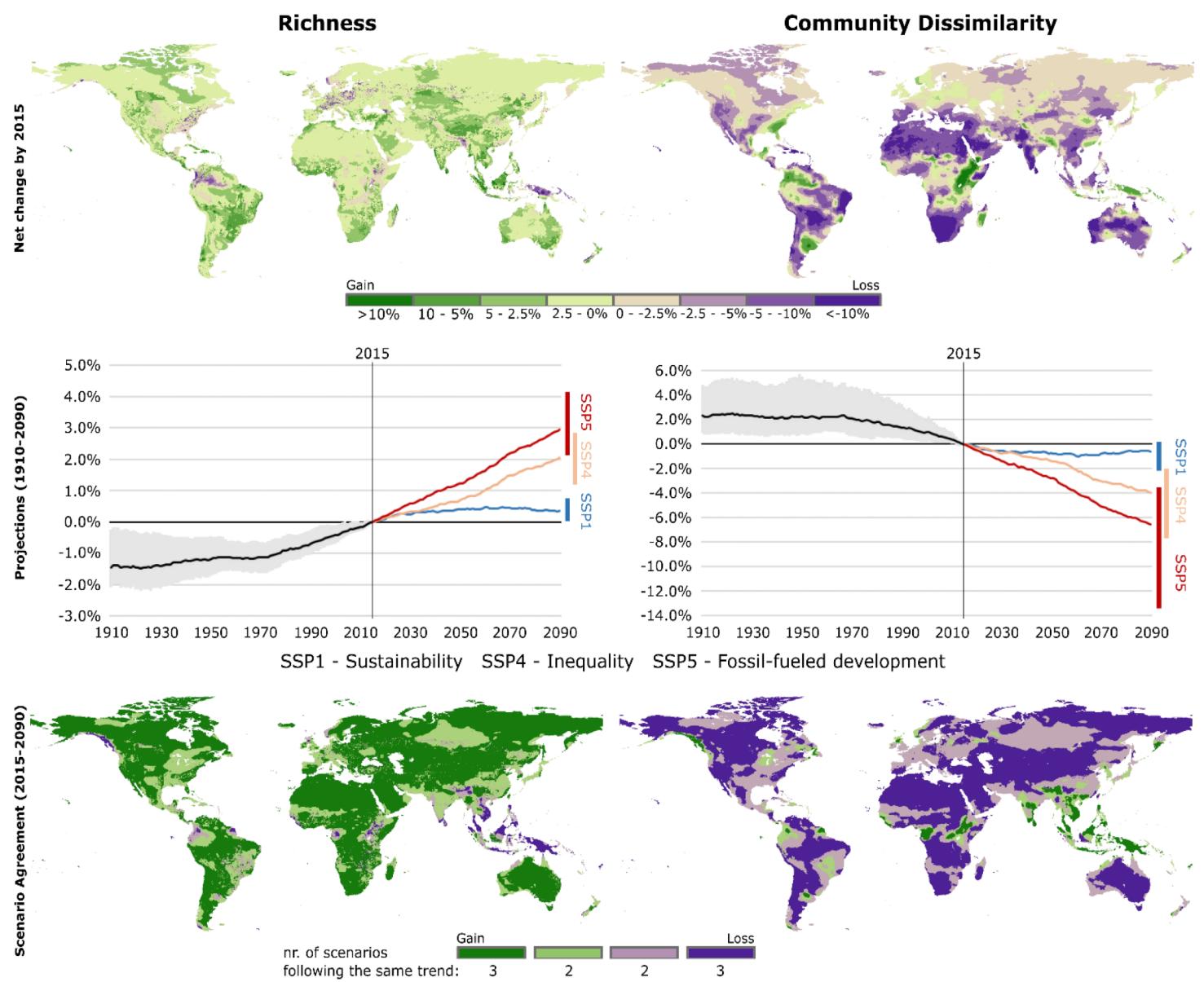
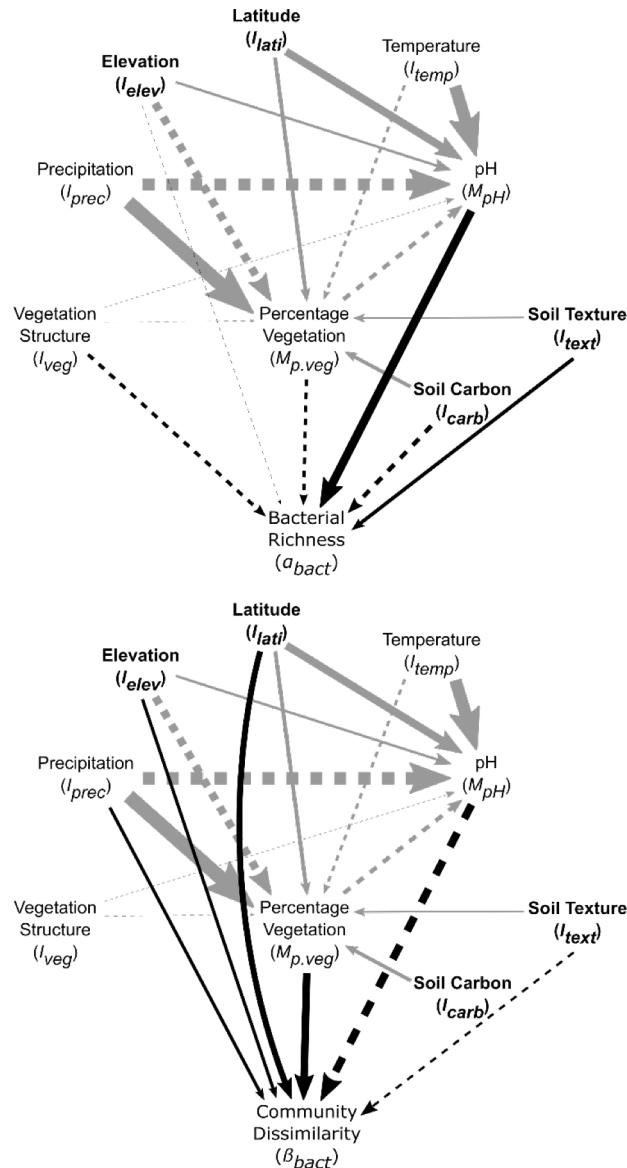


Universidad de Alicante

Structural Equation Model



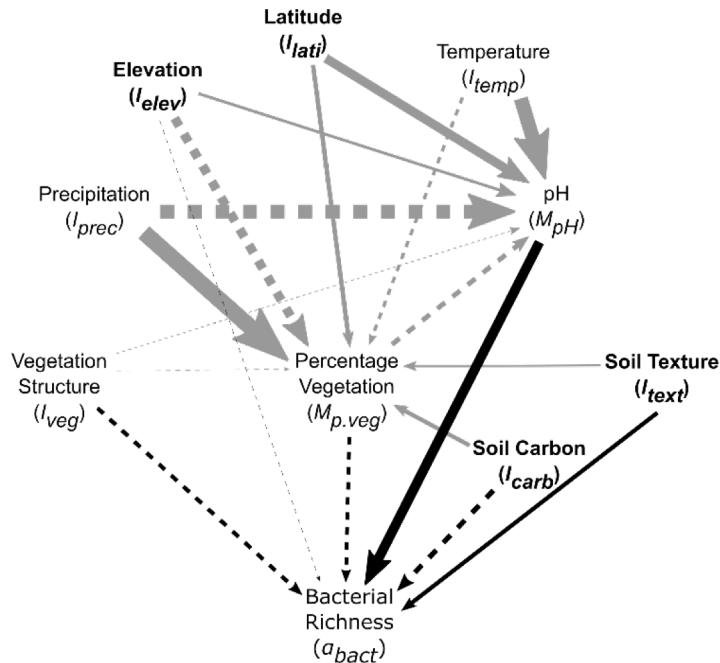
The soil microbiome



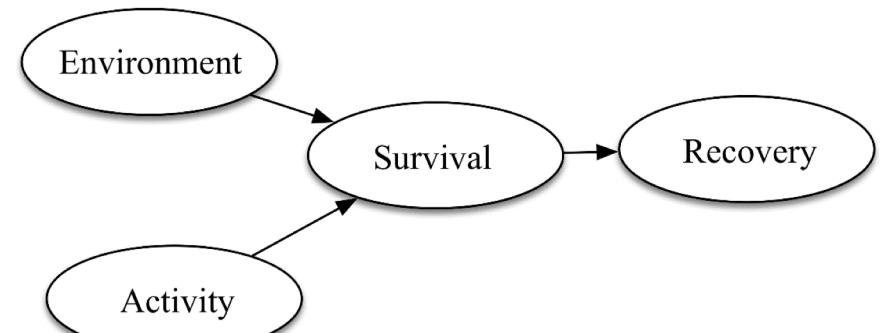
Graphical Models

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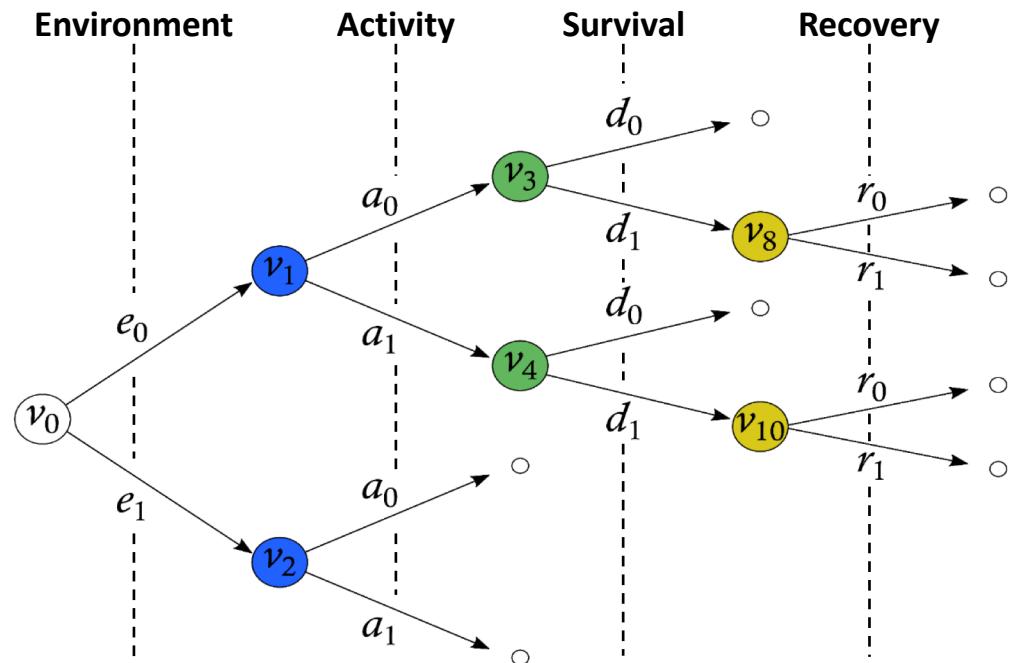
Structural equation models



Bayesian networks



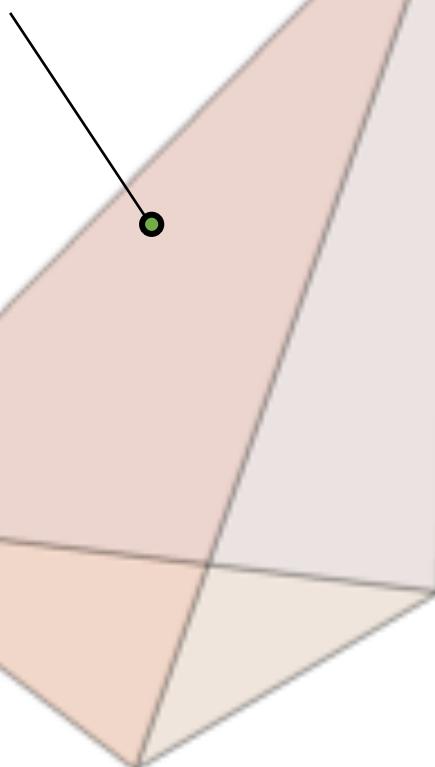
Staged tree models



Discrete statistical models

$$\Delta_{N-1} = \{(p_1, \dots, p_N) : p_i \geq 0, p_1 + \dots + p_N = 1\}$$

a point is a choice of
distribution



$N = 4$

A discrete statistical model with N outcomes is a family of distributions inside the $N-1$ dimensional probability simplex

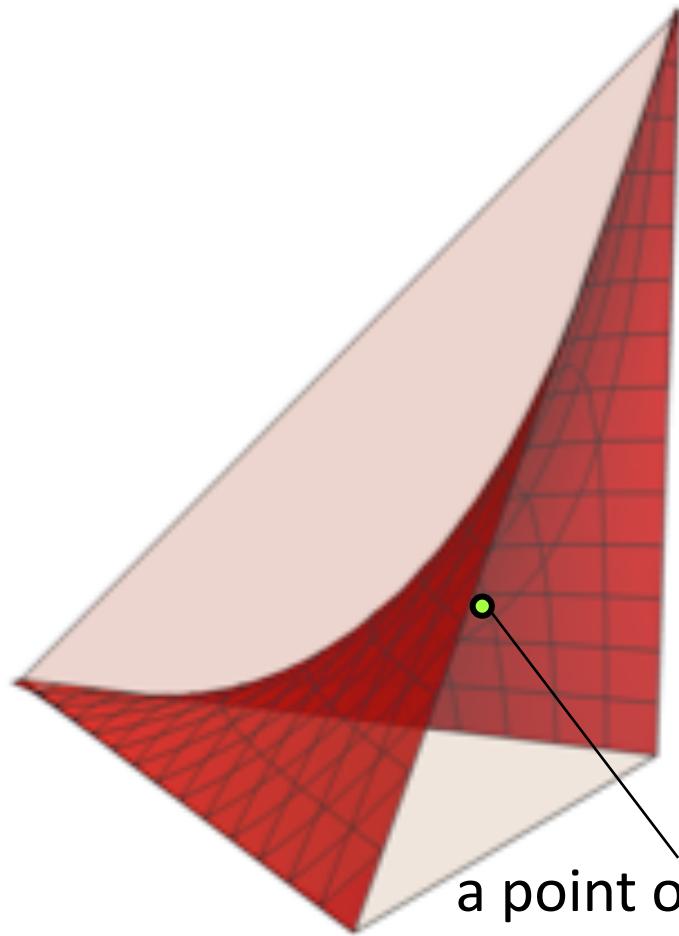
The independence model

X and Y are independent binary random variables

$$P_{00} + P_{01} + P_{10} + P_{11} = 1$$

$$P_{ij} \geq 0$$

$$P_{00}P_{11} - P_{01}P_{10} = 0$$



a point on the surface is a
distribution in the model

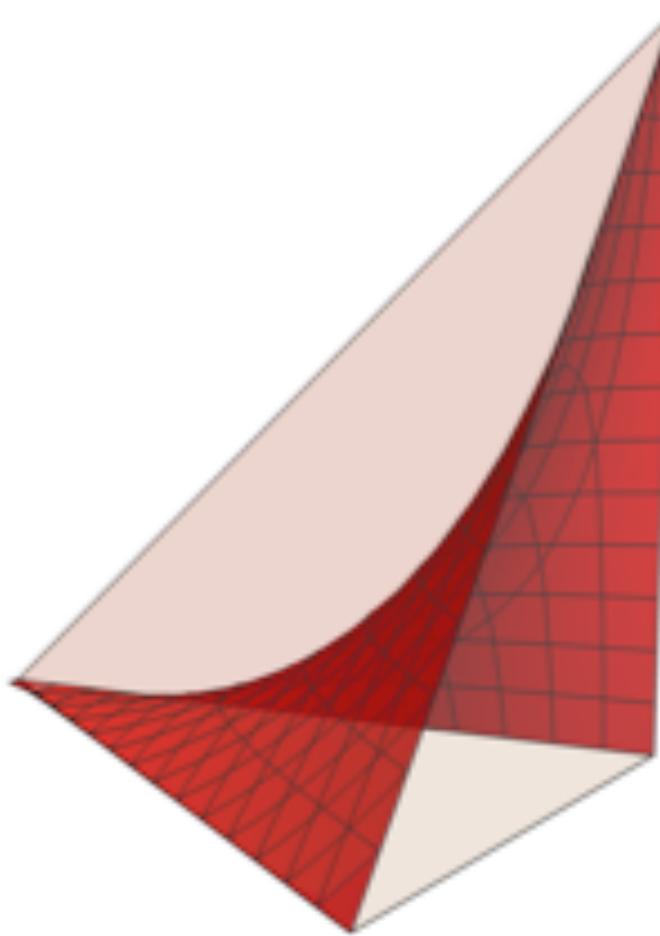
$$\Delta_1 \times \Delta_1 \rightarrow \Delta_3$$

$$(s_0, s_1) \times (t_0, t_1) \mapsto (s_0 t_0, s_0 t_1, s_1 t_0, s_1 t_1)$$

$$s_0 + s_1 = 1$$

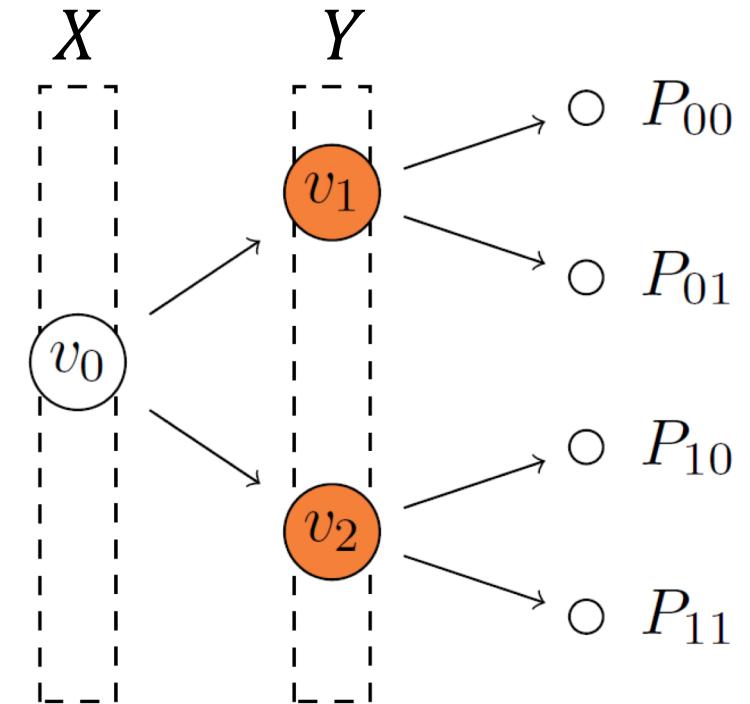
$$t_0 + t_1 = 1$$

The independence model is a graphical model



Bayesian network

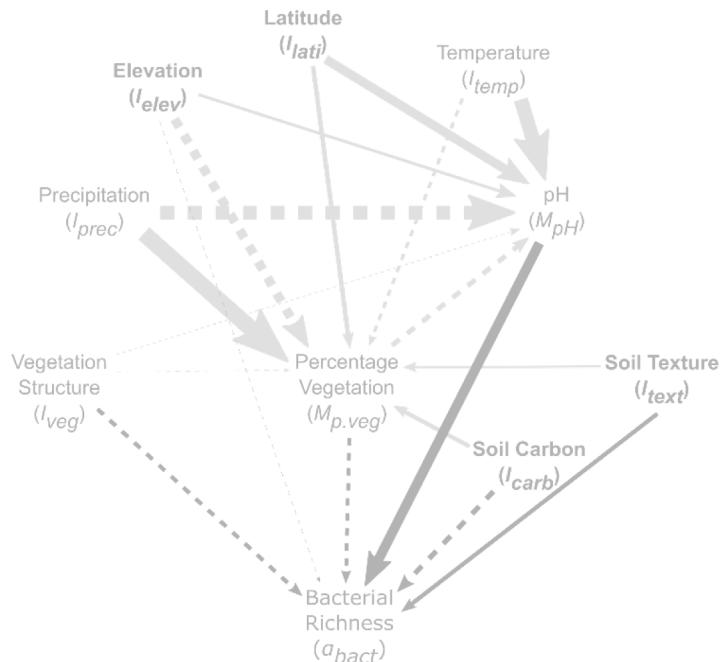
Staged tree Model



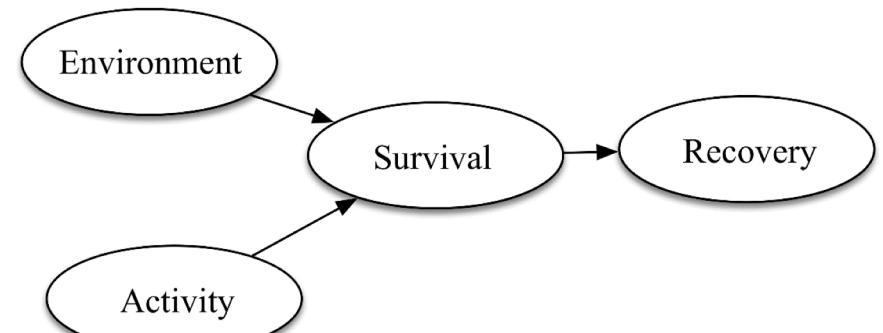
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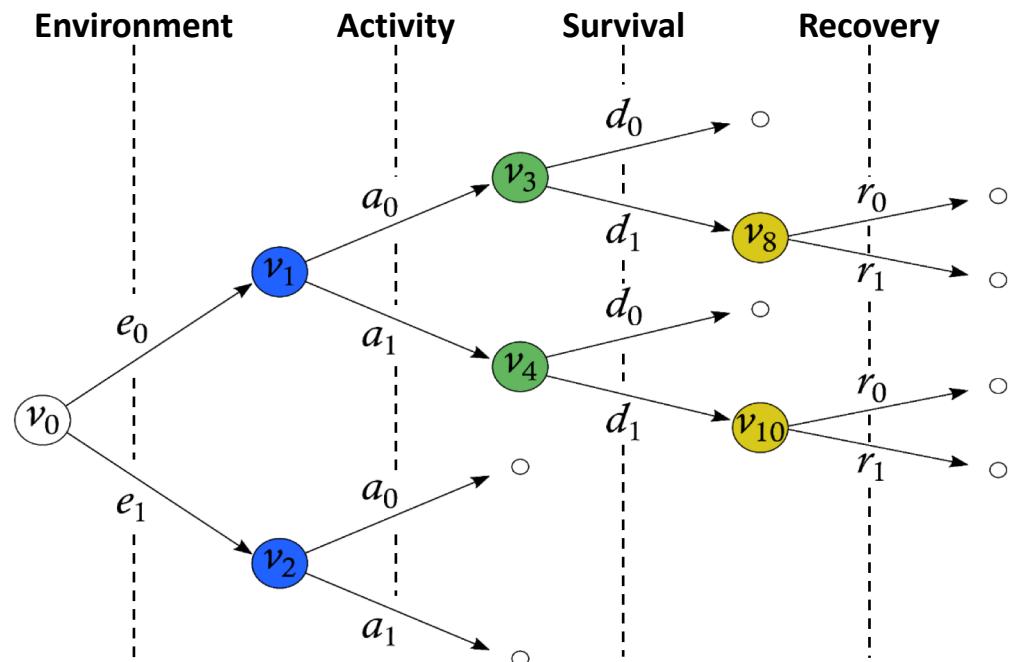
Structural equation models



Bayesian networks

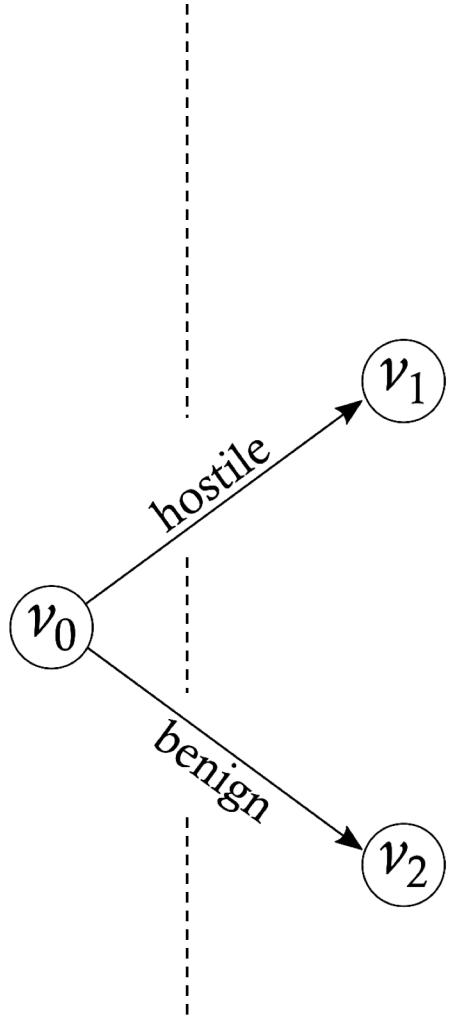


Staged tree models



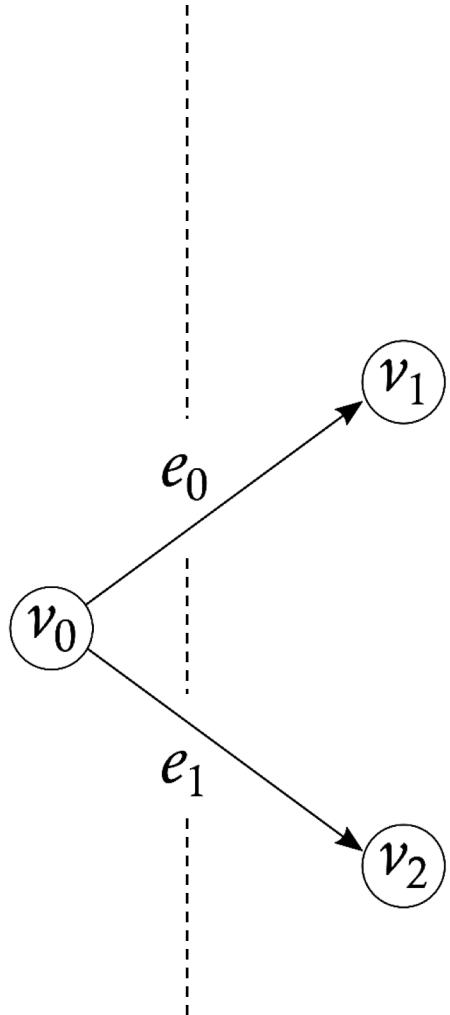
Unfolding of events in a cell culture

Environment



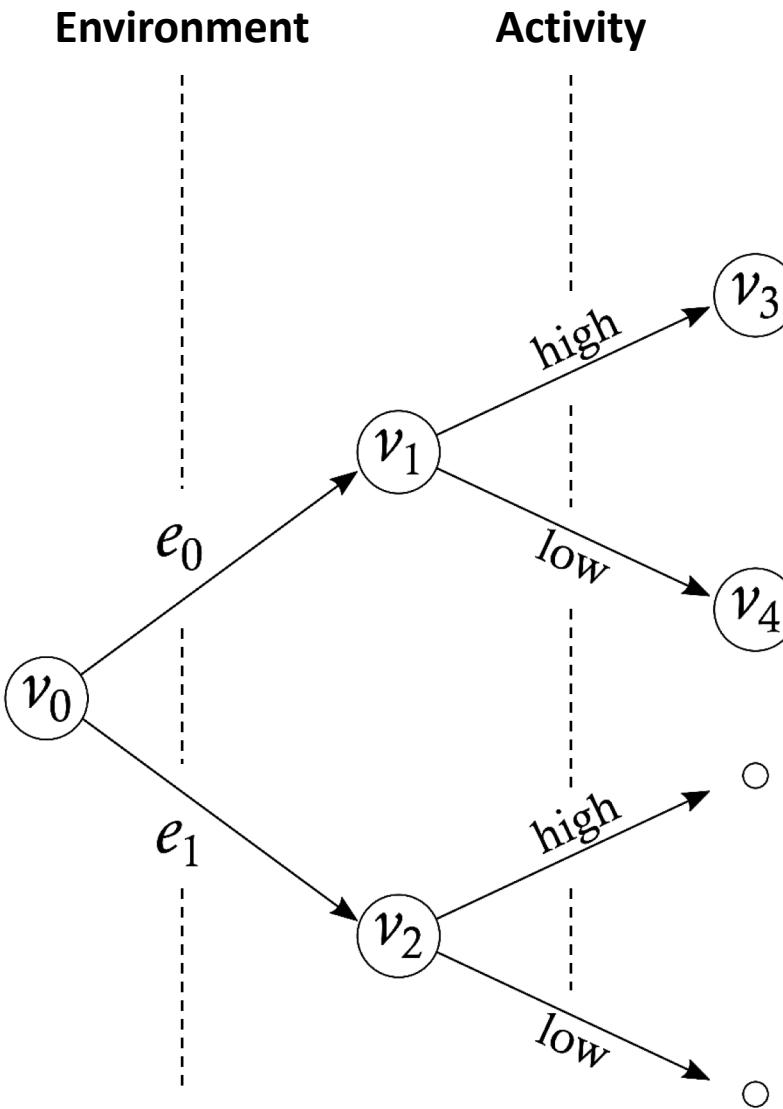
Unfolding of events in a cell culture

Environment

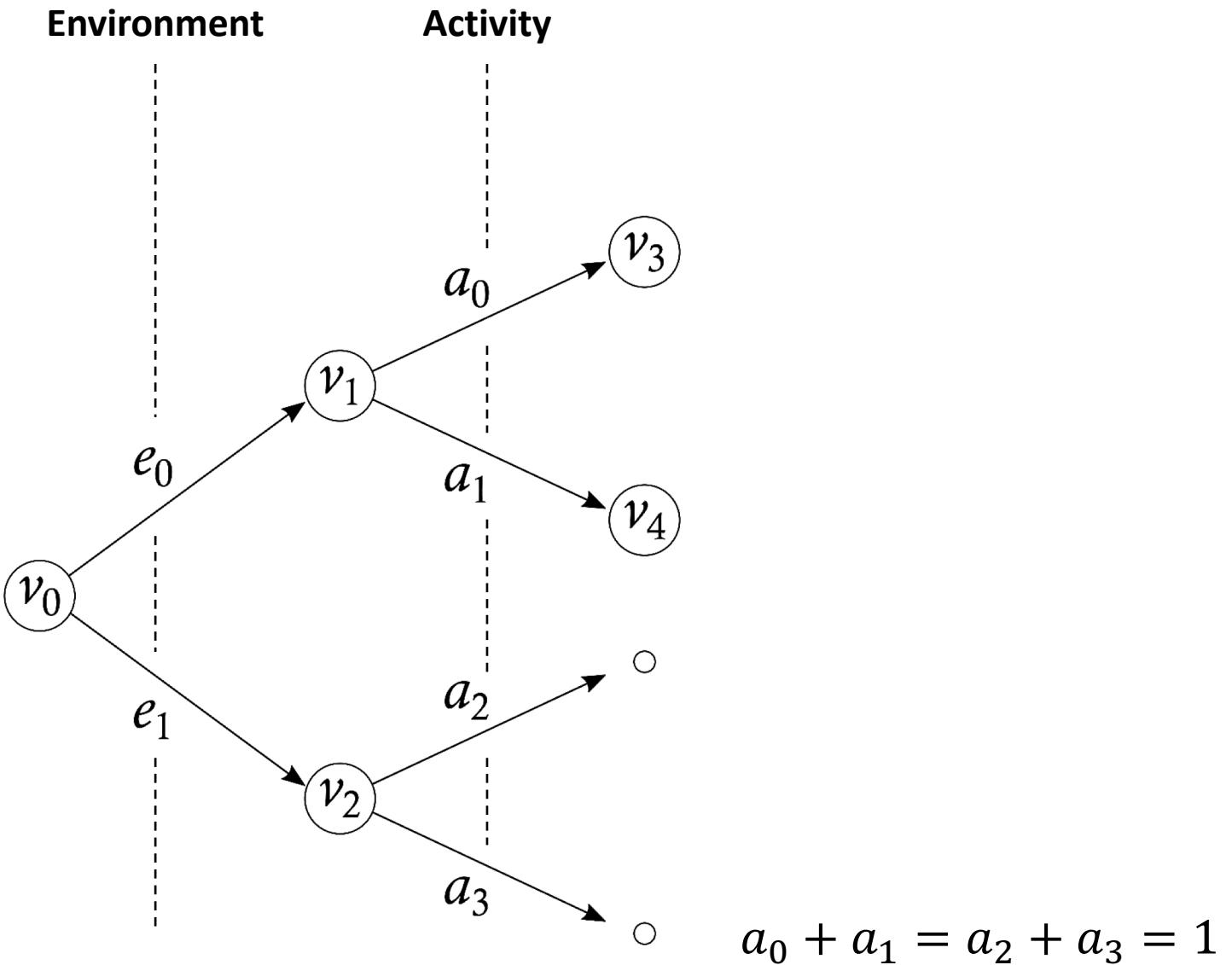


$$e_0 + e_1 = 1$$

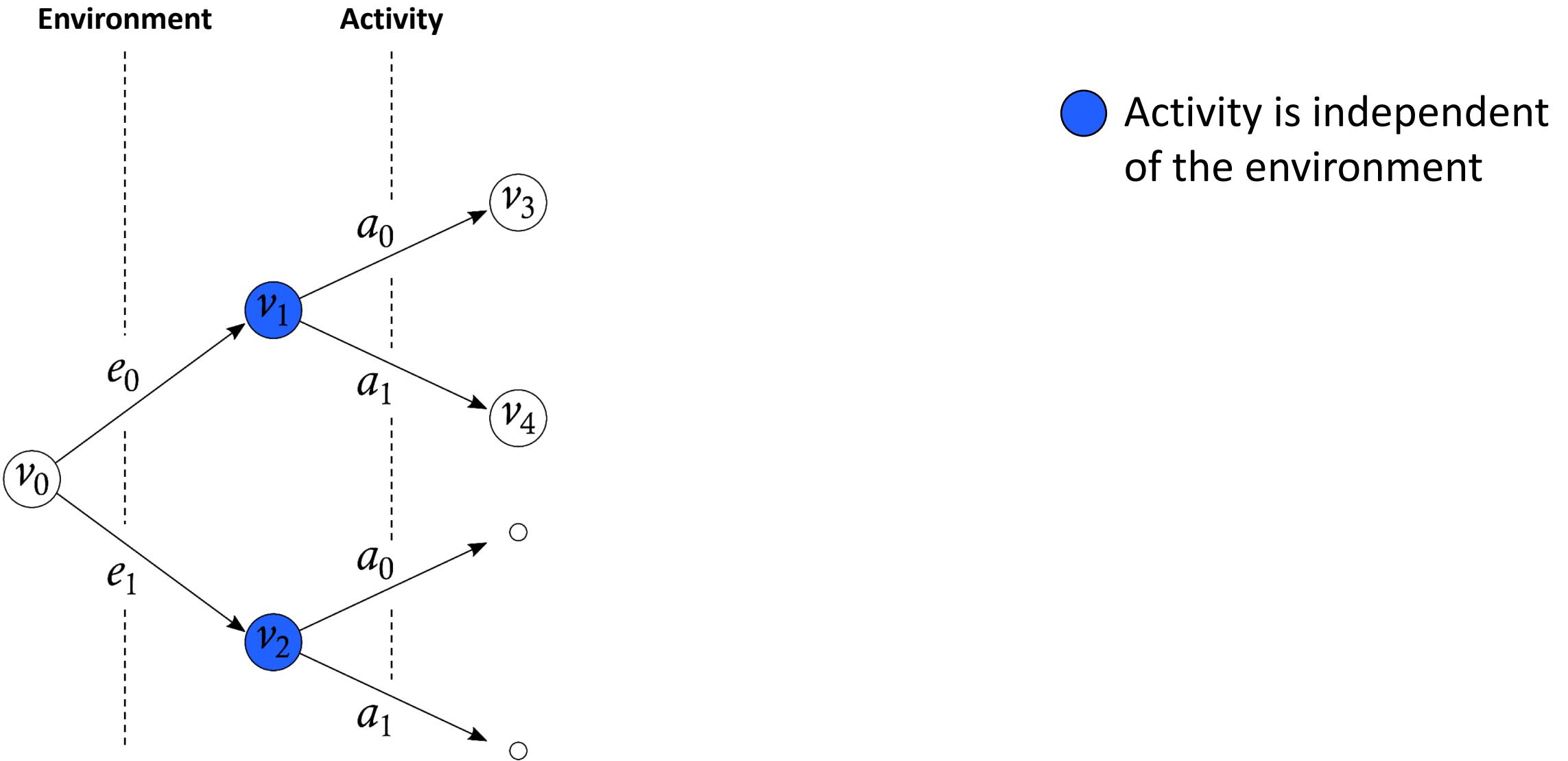
Unfolding of events in a cell culture



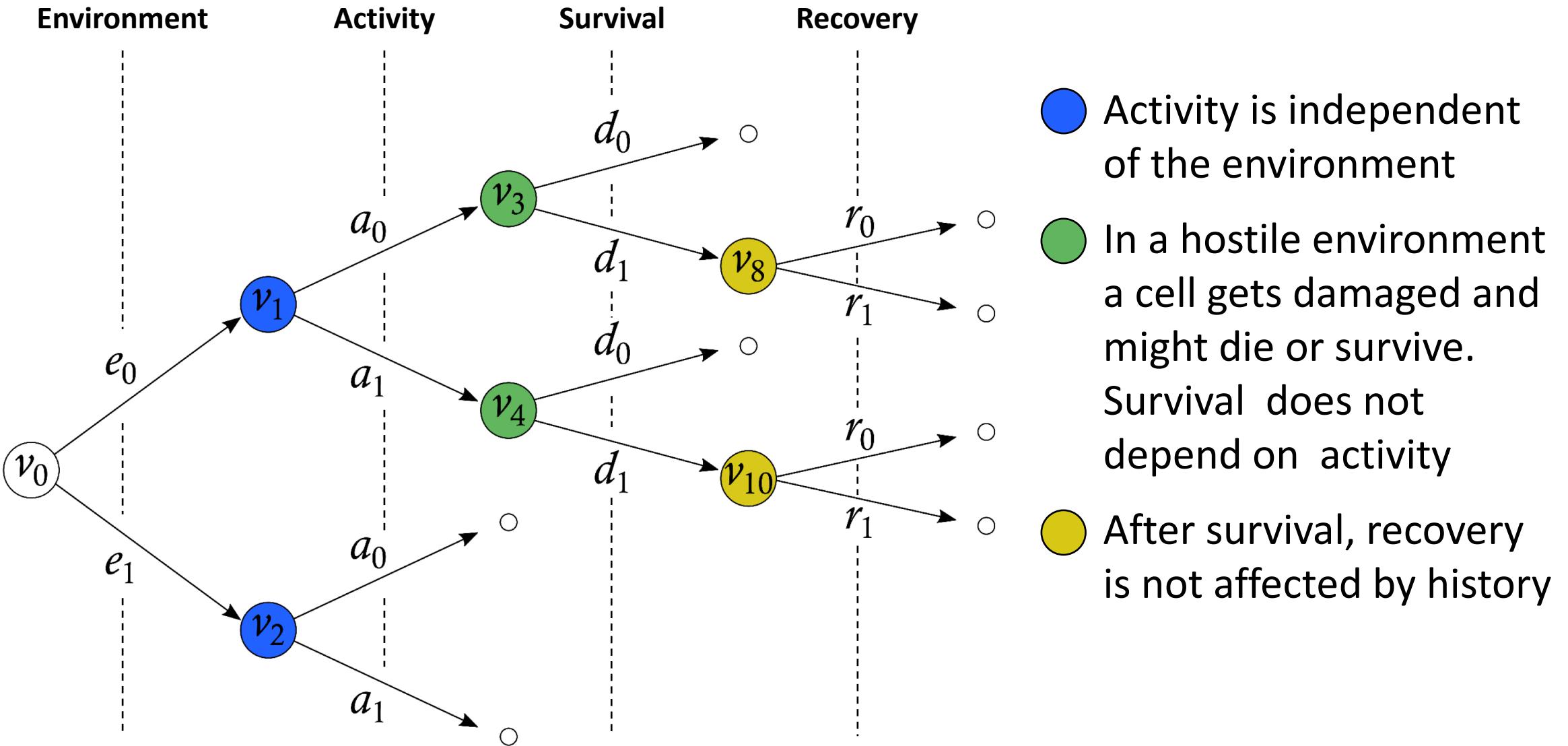
Unfolding of events in a cell culture



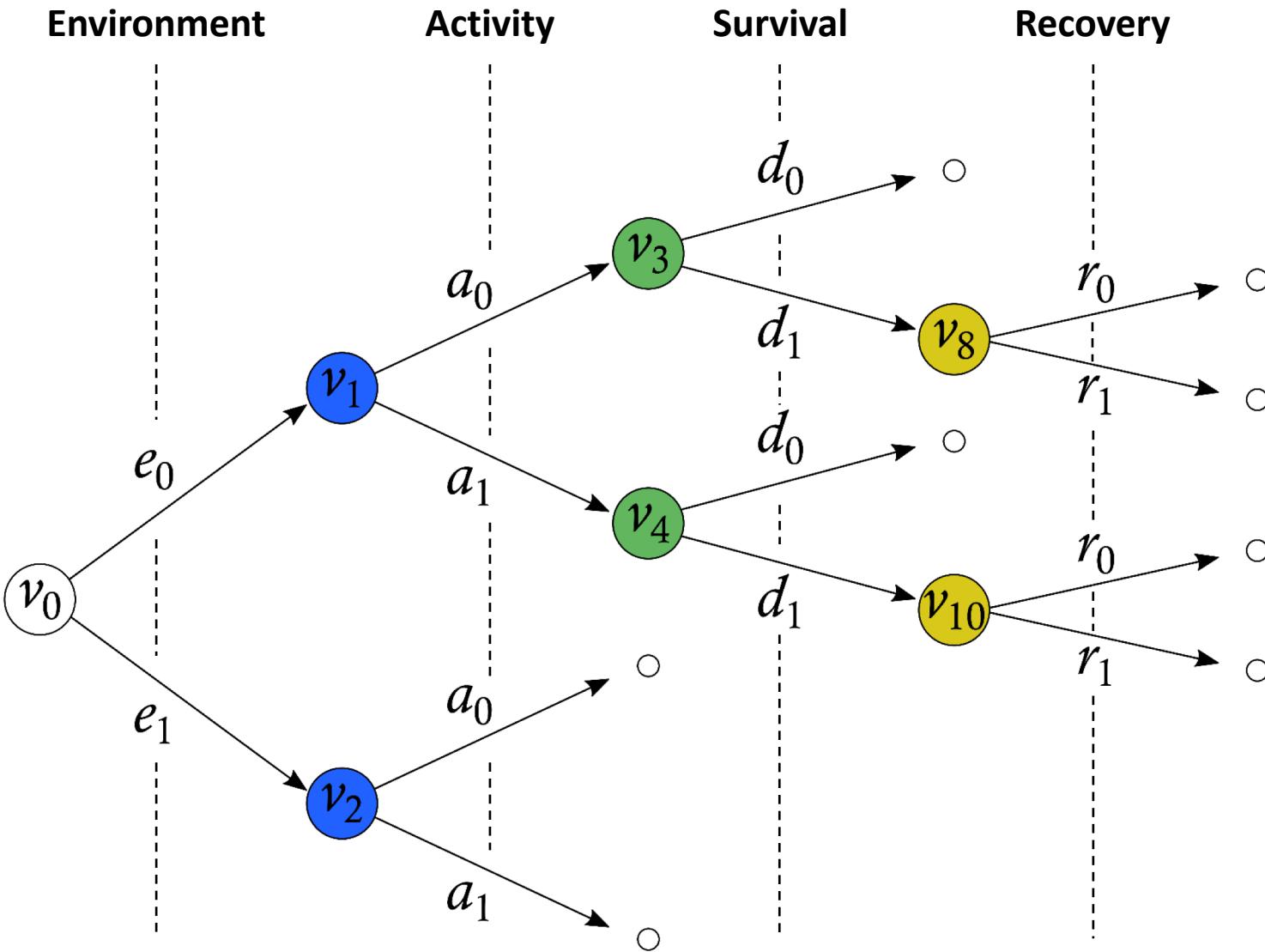
Unfolding of events in a cell culture



Unfolding of events in a cell culture



Unfolding of events in a cell culture



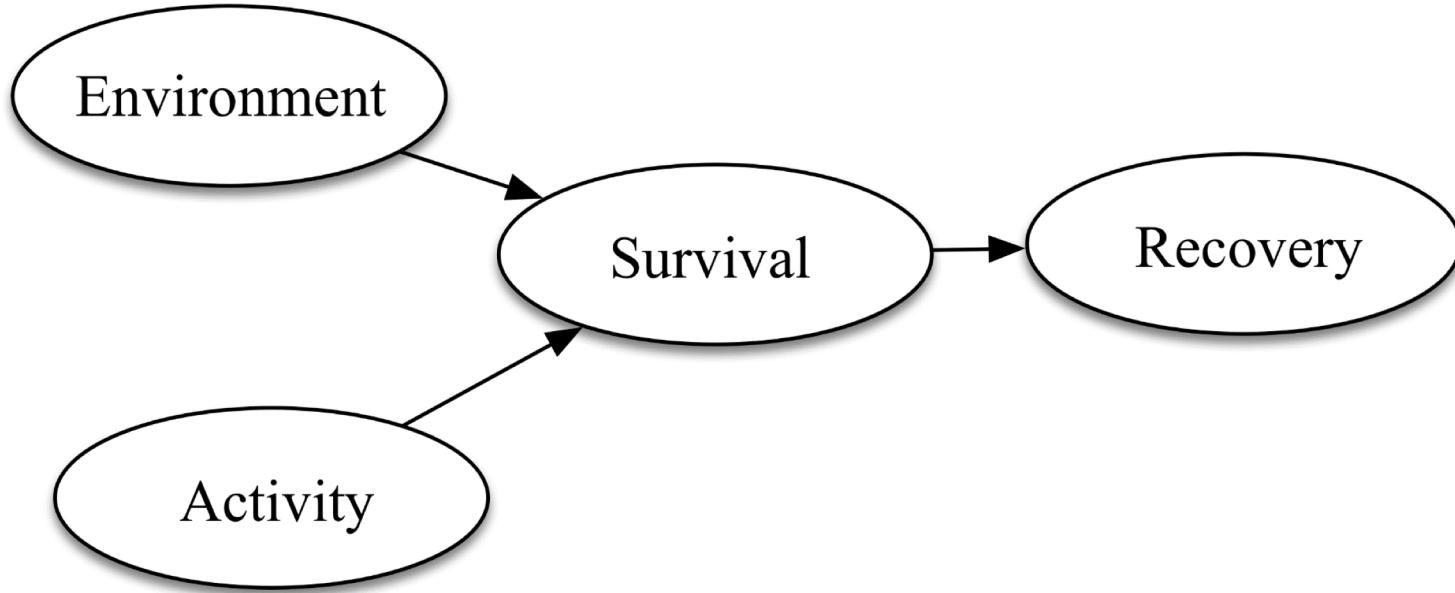
The staged tree model \mathcal{M}_J
is the image of

$$\psi : [0,1]^4 \rightarrow \Delta_7$$

$$(e_0, a_0, d_0, r_0) \mapsto (e_0 a_0 d_0, \dots)$$

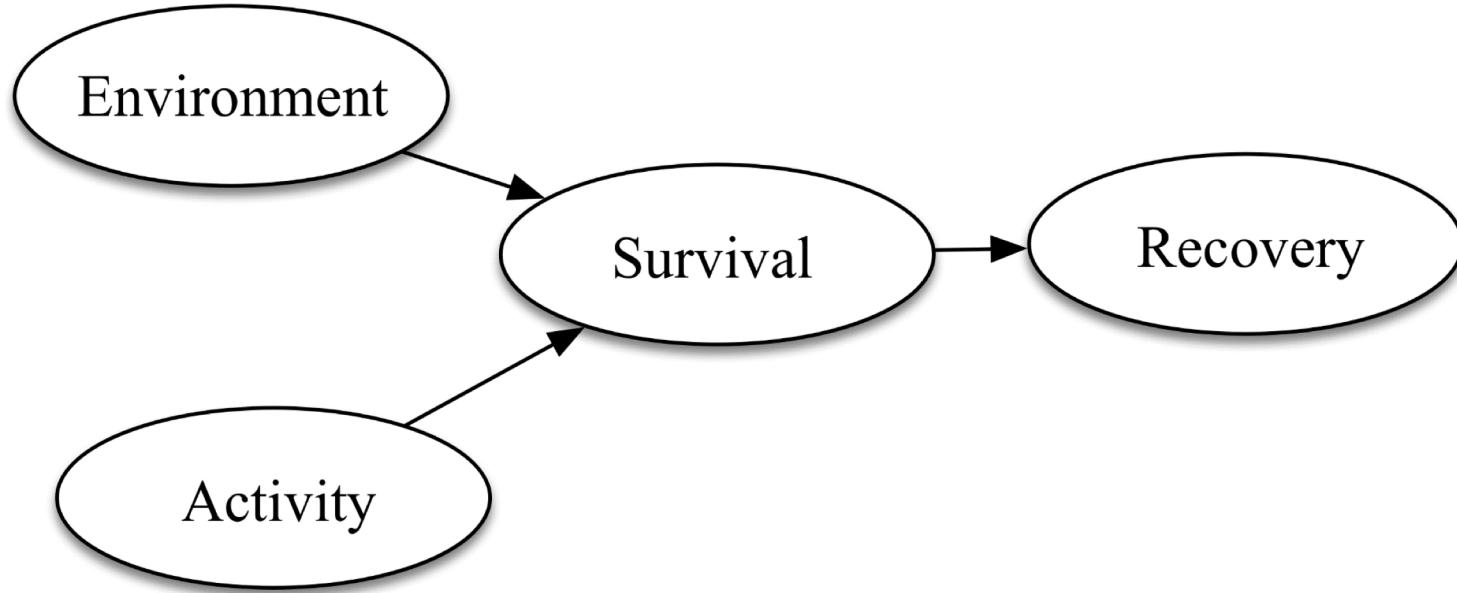
$$\left\{ \begin{array}{l} P_0 + \cdots + P_7 - 1, \\ P_5 P_6 - P_2 P_7, \\ P_4 P_6 - P_1 P_7, \\ P_3 P_6 - P_0 P_7, \\ P_2 P_4 - P_1 P_5, \\ P_2 P_3 - P_0 P_5, \\ P_1 P_3 - P_0 P_4 \end{array} \right.$$

Bayesian network approach



- Activity is independent of the environment
- In a hostile environment a cell gets damaged and might die or survive. Survival does not depend on activity
- After survival, recovery is not affected by history

Bayesian network approach

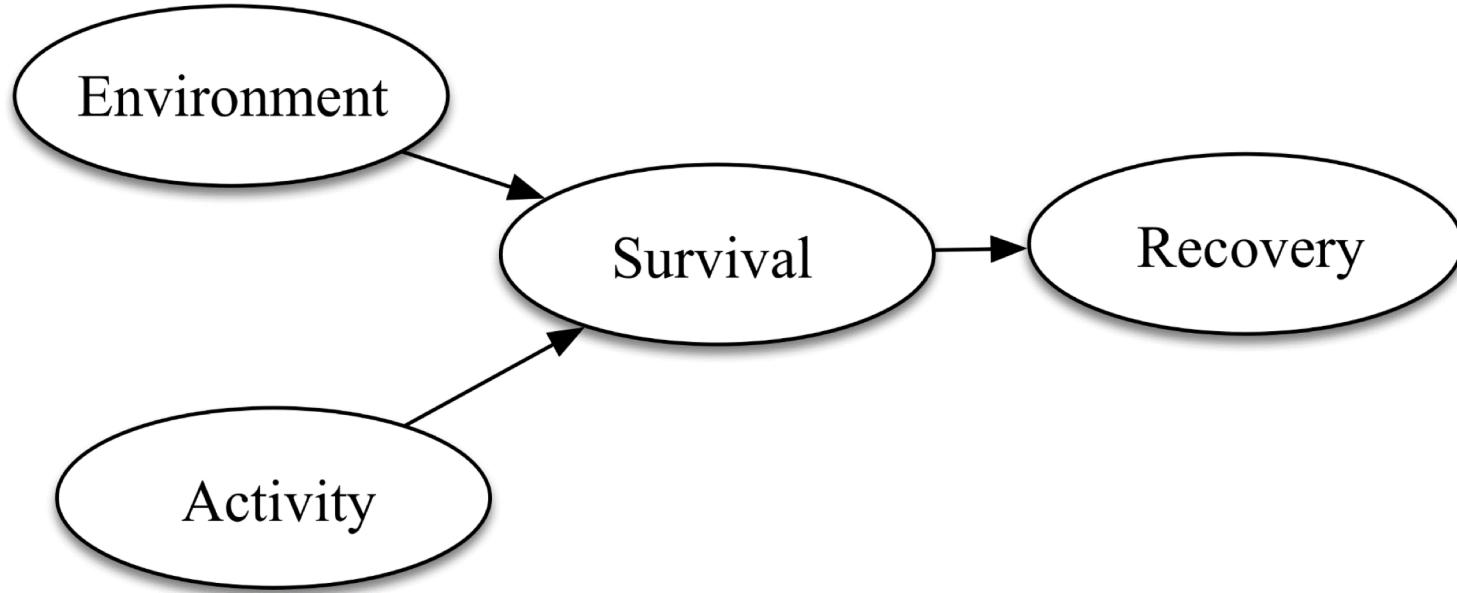


● Environment $\perp\!\!\!\perp$ Activity

● Recovery $\perp\!\!\!\perp$ (Activity , Environment) | Survival

- Activity is independent of the environment
- In a hostile environment a cell gets damaged and might die or survive. Survival does not depend on activity
- After survival, recovery is not affected by history

Bayesian network approach

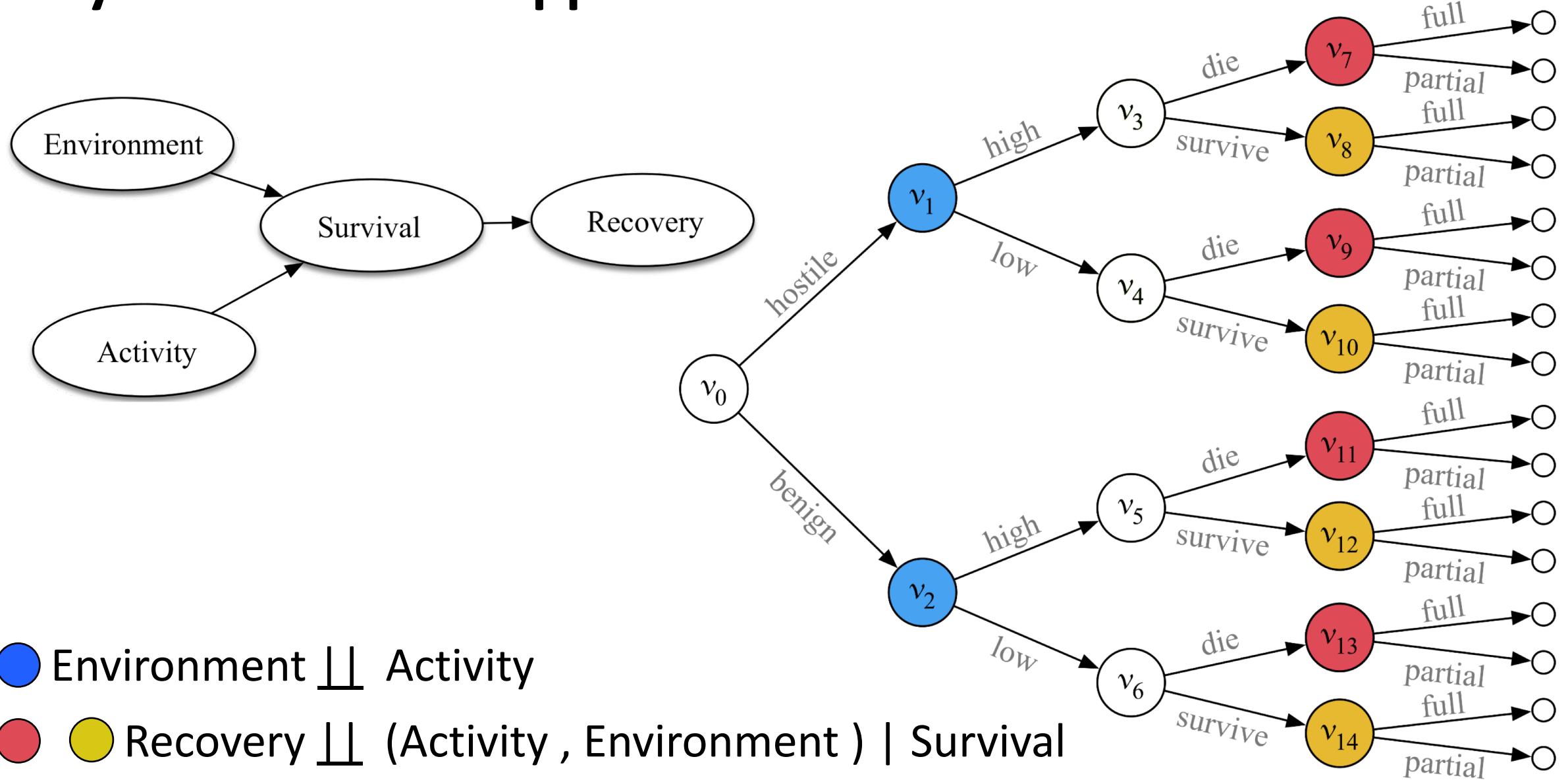


● Environment $\perp\!\!\!\perp$ Activity

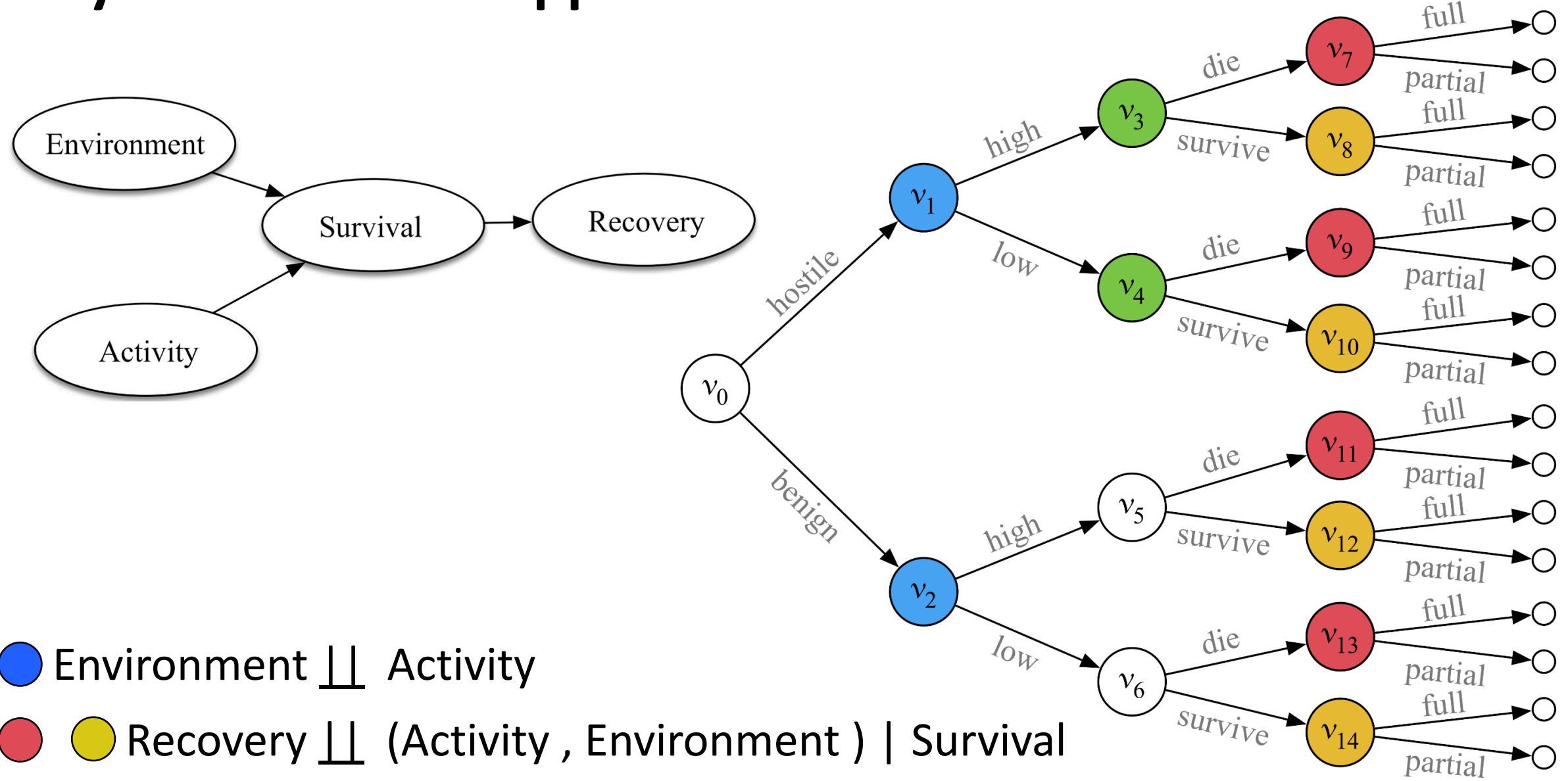
● Recovery $\perp\!\!\!\perp$ (Activity , Environment) | Survival

- Activity is independent of the environment
- ~~In a hostile environment a cell gets damaged and might die or survive.~~
~~Survival does not depend on activity~~
- After survival, recovery is not affected by history

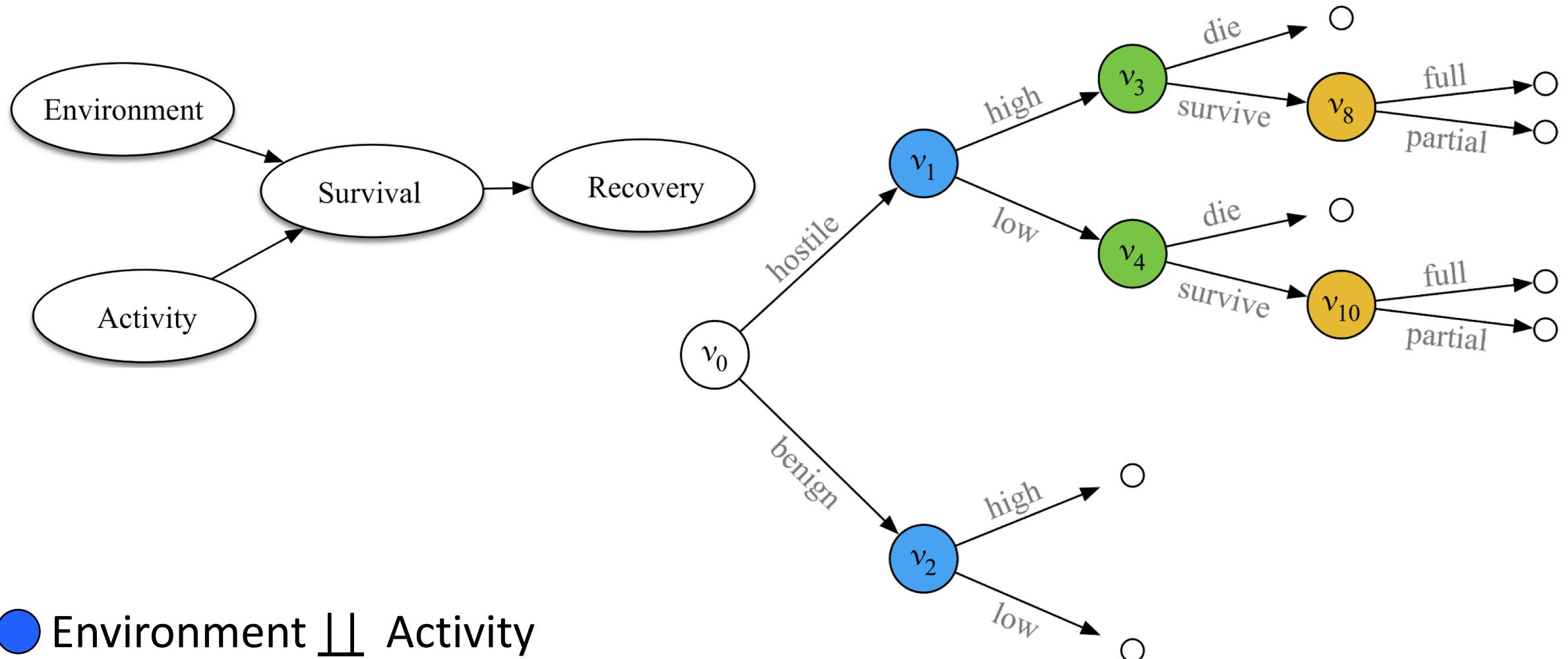
Bayesian network approach



Bayesian network approach



Bayesian network approach

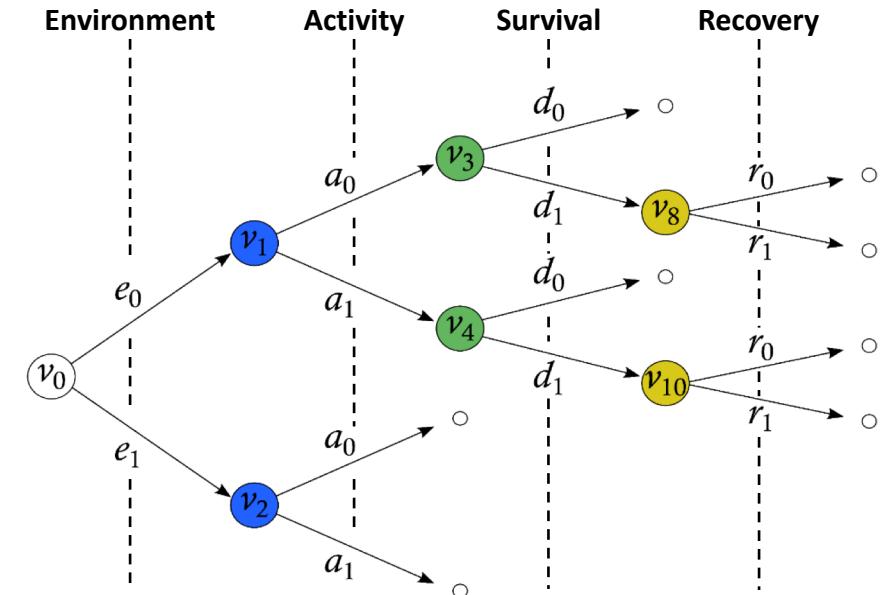
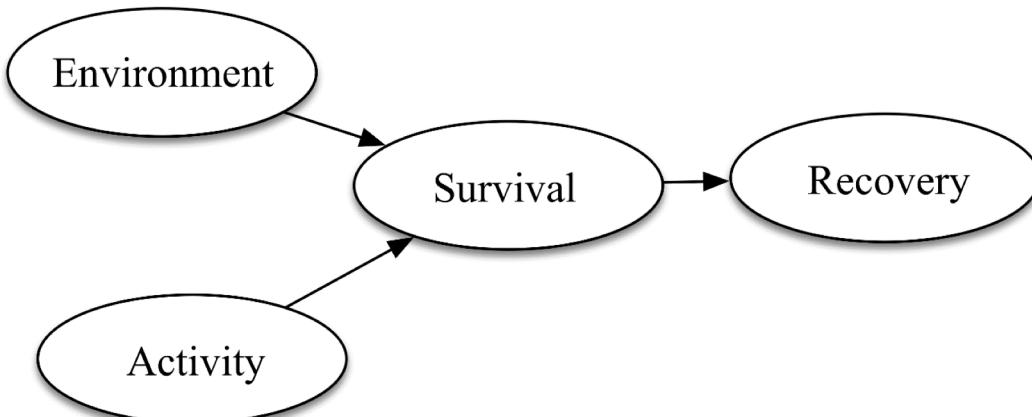


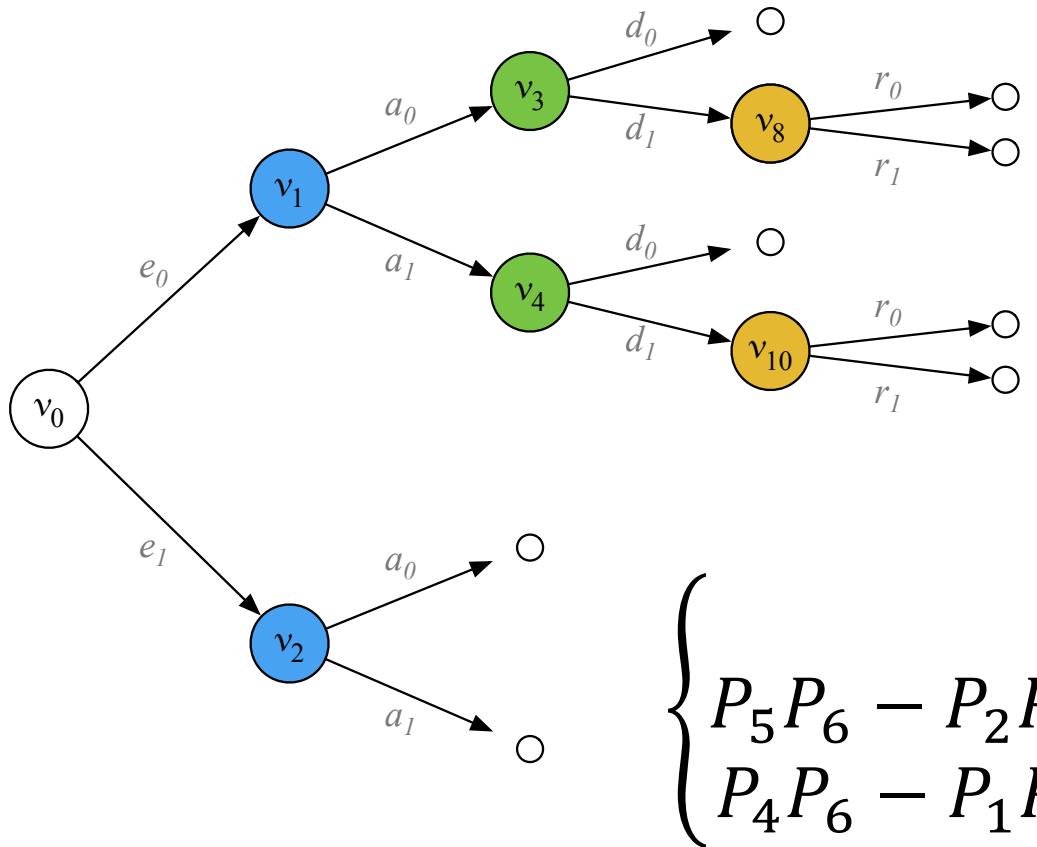
Environment || Activity

  Recovery  (Activity , Environment) | Survival

Properties of staged tree models

- Encode conditional independence statements
- Generalize discrete Bayesian networks
- They capture context specific information
- The outcome space is not necessarily a cartesian product
- 3-valent phylogenetic trees are staged tree models (Améndola et al. 2019)





Toric varieties are a class of algebraic varieties whose defining equations only have two terms

$$\left\{ \begin{array}{lll} P_0 + \cdots + P_7 - 1, & & \\ P_5 P_6 - P_2 P_7, & P_3 P_6 - P_0 P_7, & P_2 P_3 - P_0 P_5, \\ P_4 P_6 - P_1 P_7, & P_2 P_4 - P_1 P_5, & P_1 P_3 - P_0 P_4 \end{array} \right.$$

- Discrete exponential families are toric varieties
- Discrete Bayesian networks with chordal graphs are toric varieties

What are the algebraic and geometric properties of staged tree models?

When is a staged tree model a toric variety/discrete exponential family?

Duarte and Görgen (J. Symb. Comput.) 2019

What are the algebraic and geometric properties of staged tree models?

What are the implicit equations that define the model?

Ananiadi and Duarte (J. Algebr. Stat.: *in Rev.*)

What is the geometry of interventional distributions?

Duarte and Solus (*in Prep.*)

When is a staged tree model a toric variety/discrete exponential family?

Duarte and Görgen (J. Symb. Comput.) 2019

Unifying principle to study equations of discrete graphical models

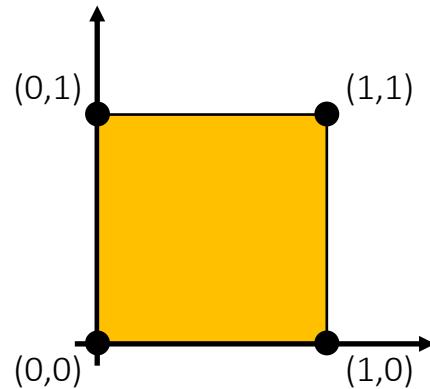
*What are the implicit equations
that define the model?*

Ananiadi and Duarte (J. Algebr. Stat.: *in Rev.*)

*What is the geometry of interventional
distributions?*

Duarte and Solus (*in Prep.*)

Geometric Modeling and Algebraic Statistics



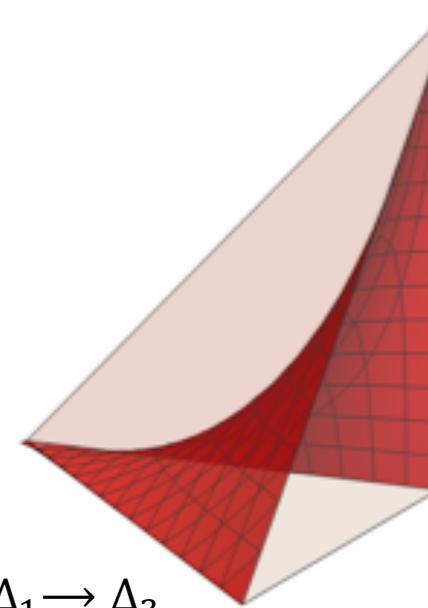
Polytope (2D)

Polytopes with rational linear precision



Polytopes in higher dimensions

Toric Geometry



$$\Delta_1 \times \Delta_1 \rightarrow \Delta_3$$

$$(s_0, s_1) \times (t_0, t_1) \mapsto (s_0 t_0, s_0 t_1, s_1 t_0, s_1 t_1)$$

Rational Maximum Likelihood Estimator (MLE)

$$(u_{00}, u_{01}, u_{10}, u_{11}) \mapsto \left(\frac{u_{0+}u_{+0}}{u_{++}^2}, \frac{u_{0+}u_{+1}}{u_{++}^2}, \frac{u_{1+}u_{+0}}{u_{++}^2}, \frac{u_{1+}u_{+1}}{u_{++}^2} \right)$$

Duarte, Marigliano and Sturmfels (Bernoulli: *in Rev.*)

Staged tree models have Rational MLE

$$\Delta_1 \times \Delta_2 \times \Delta_2 \rightarrow \Delta_5$$

$$(S_0, S_1, a_0, \dots, a_5) \mapsto (S_0 a_0, \dots, S_1 a_5)$$

P_1 P_6

$$T = (V, E)$$

$$P_{[v]} = \sum \text{of all atomic prob. whose root to leaf paths go through } v.$$

$$(S_0, S_1) \times (a_0, \dots, a_2)$$

HW

* Thm 10

$$\Delta_1 \times \Delta_2 \rightarrow \Delta_5$$

$$P_1, S_0 a_0$$

$$\text{Ker } \tilde{\varphi}?$$

* ratio eqns

* path eqns

* extended pa
eqns

Are there any questions?

<https://emduart2.github.io/>



Max-Planck-Institut für
Mathematik
in den Naturwissenschaften

OTTO VON GUERICKE
UNIVERSITÄT
MAGDEBURG



DFG-Graduiertenkolleg
MATHEMATISCHE
KOMPLEXITÄTSREDUKTION

$$\frac{P_1 P_6 - P_3 P_4}{P_1 P_5 - P_2 P_4, P_2 P_6 - P_3 P_5}$$

Dankeschön

Thank you →
Gracias

$R[S_0, S_1, a_0, \dots, a_5] / \langle S_0 + S_1 - 1, a_0 + \dots + a_2 - 1, a_3 + \dots + a_5 \rangle$

product of edge labels from the path starting at v_0 to the leaf ending at P_i