

# Stochastic models for the space-time evolution of martensitic avalanches

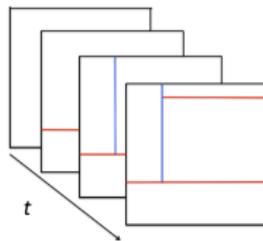
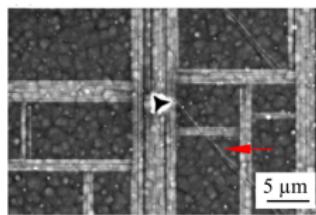
Pierluigi Cesana

Institute of Mathematics for Industry  
Kyushu University, Japan

Hysteresis, Avalanches and Interfaces in Solid Phase Transformations  
20<sup>th</sup> September, 2016

# Overview

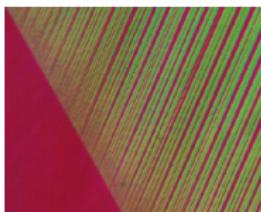
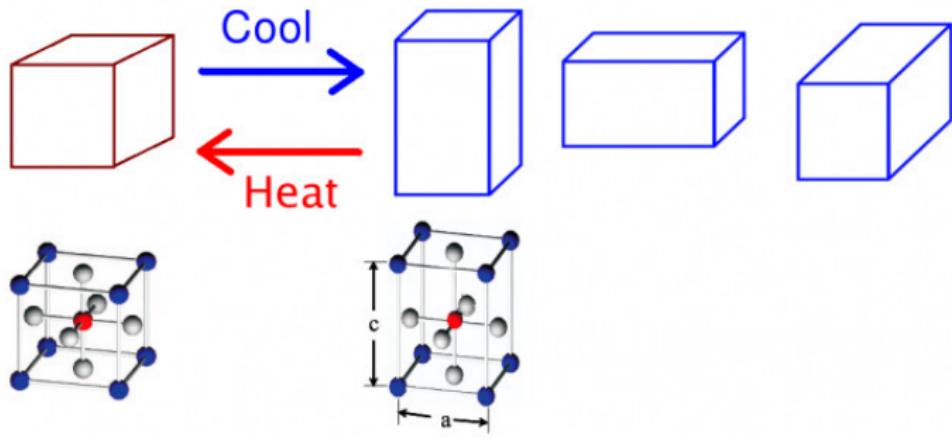
- General Branching Random Walk model for martensitic avalanches
- Fragmentation model (SOC à-la-Bak) for the crystal variants of an elastic crystal



Niemann et al. APL Mater. 4, 064101 (2016)

- Joint work with John Ball and Ben Hambly (Oxford)
  - J. Ball, P.C., B. Hambly, Proceedings ESOMAT15
  - P.C., B. Hambly, in progress
  - P.C., M. Porta, T. Lookman, Jmps 2014
  - S. Patching, P.C, A. Rueland, in preparation

# Martensitic transformation



Aus-Mar interface, C.Chu

# Elasticity framework

- $F \in \mathbb{R}^{3 \times 3}$  the deformation gradient
- $\psi(F)$  the free-energy density

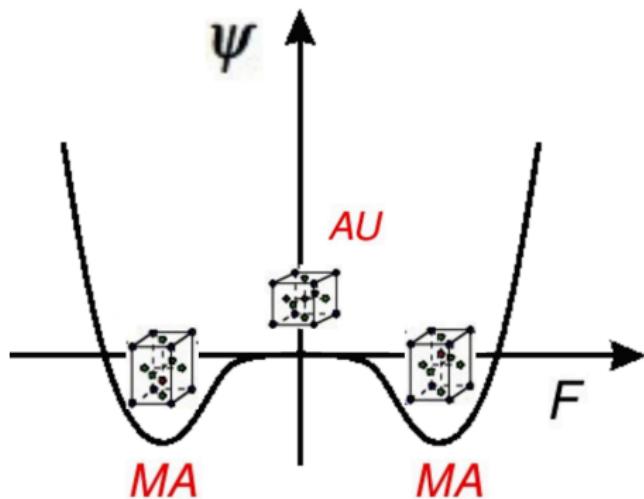
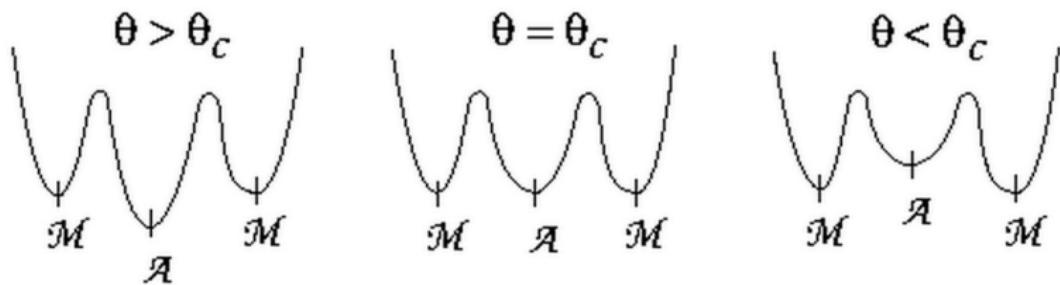


Figure : First-order phase transition, fixed temperature

# Effect of temperature

- $F \in \mathbb{R}^{3 \times 3}$  the deformation gradient
- $\psi(\theta; F)$  the free-energy density

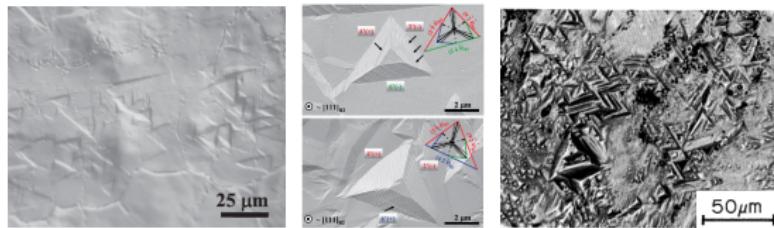


Courtesy Tim Duerig

# Self-similarity



Transformed sample of Cu-Zn-Al (after cooling). Optical microscope with polarized light 3mm x 2mm (Morin)



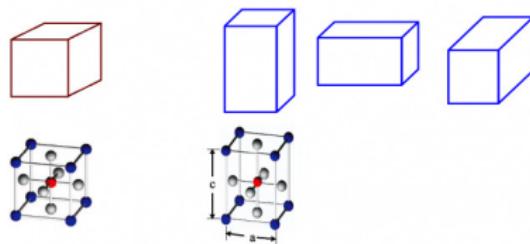
LEFT-CENTER: SEM micrograph pictures, Ti-Ni;  
RIGHT: Ti-Ni-Cu (orthorombic martensite), self-acc.

M. Nishida et al. (2012) Self-accommodation of B19 martensite in Ti-Ni shape memory alloys-Part 1. Morphological and crystallographic studies of the variant selection rule, Philosophical Magazine, 92:17, 2215-2233.

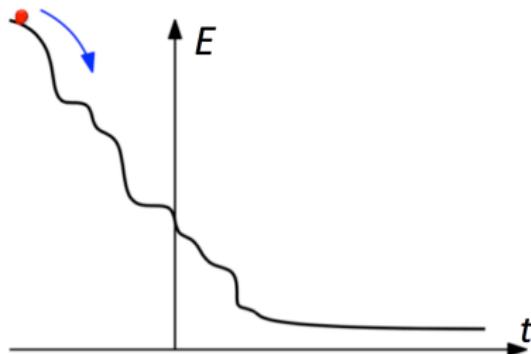
# Martensitic transformation

*A martensitic transformation is a phase transition which involves a cooperative motion of a set of atoms across an interface causing a **shape change** and a **sound**.*

Philip C. Clapp, ICOMAT95



# Avalanches

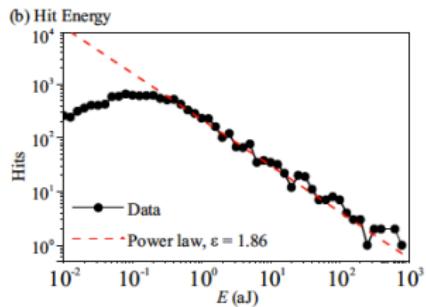
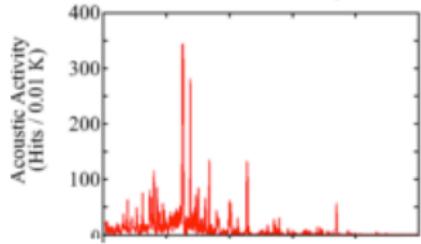
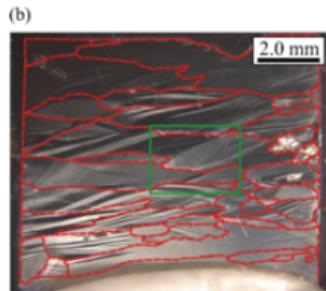


- intermittent evolution as a sequence of jerks (avalanches)
- athermal behavior
- jerky behavior is consequence of **disorder**



# Acoustic emissions

- Avalanches detected by ultrasonic AEs



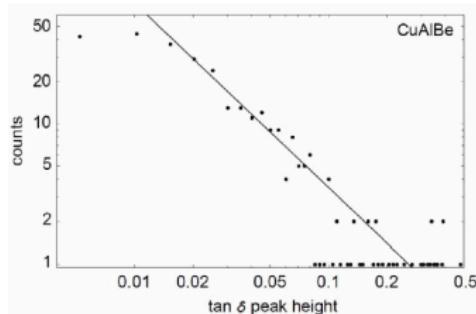
- 1) Polarized light optical micrograph of sample of martensitic NiMnGa at room temperature.
- 2) Emission hits per 0.01K temperature interval (acoustic activity).
- 3) Histogram of the number of hits vs the absolute energy.

Niemann et al. (2014), PRB

# Universality

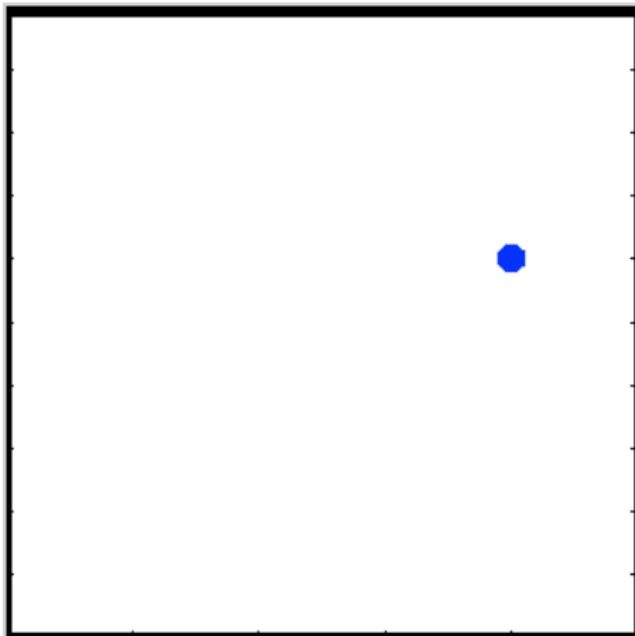
Universality class critical exponents  $\alpha$  and  $\epsilon$  and variant-multiplicity for systems transforming from cubic to selected martensitic symmetries. They are estimated as averaged values in the adiabatic limit. For monoclinic martensites, data reported for Cu-Al-Zn, Cu-Al-Be, Cu-Al-Mn [23] and Ni-Al [24] have been used. For orthorhombic martensite data are from two Cu-Al-Ni [23] and from a Cu-Al-Mn alloy [17]. For tetragonal martensite data from single- and poly-crystalline Fe-Pd have been used [27].

M-symmetry	$\alpha$	$\epsilon$	Multiplicity
Monoclinic	$3.0 \pm 0.2$	$2.0 \pm 0.2$	12
Orthorhombic	$2.4 \pm 0.1$	—	6
Tetragonal	$2.0 \pm 0.3$	$1.6 \pm 0.1$	3

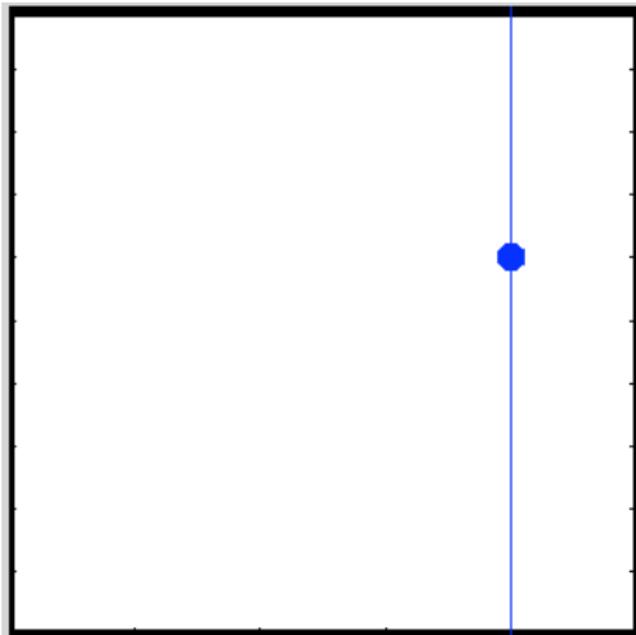


- A. Planes et al. (2013) *Acoustic emission in martensitic transformations*, Journal of Alloys and Compounds, 577S S699-S704
- E. Salje et al. (2009) *Jerky elasticity: Avalanches and the martensitic transition in shape-memory alloys*, APL 95

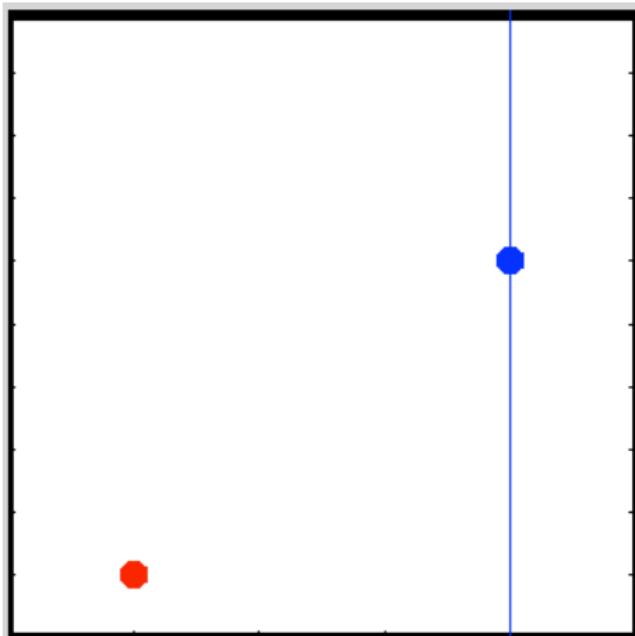
# Fragmentation



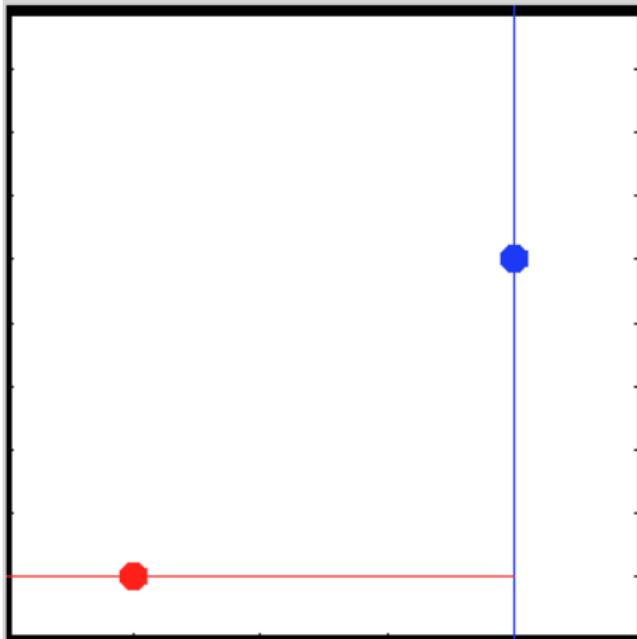
# Fragmentation



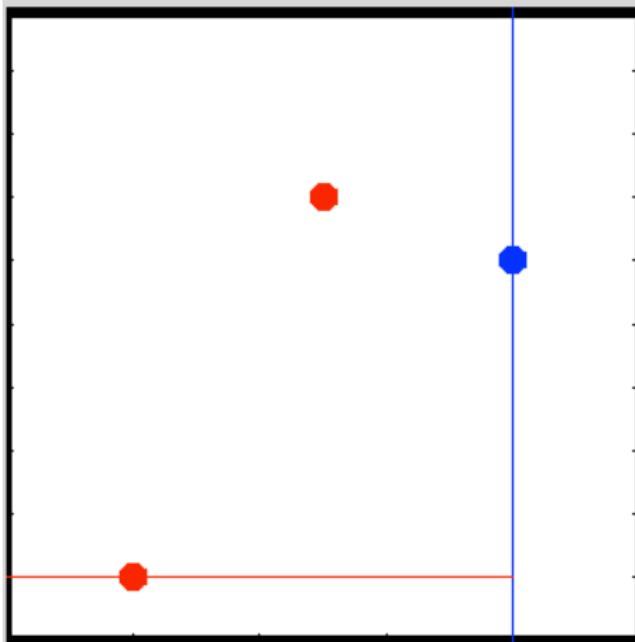
# Fragmentation



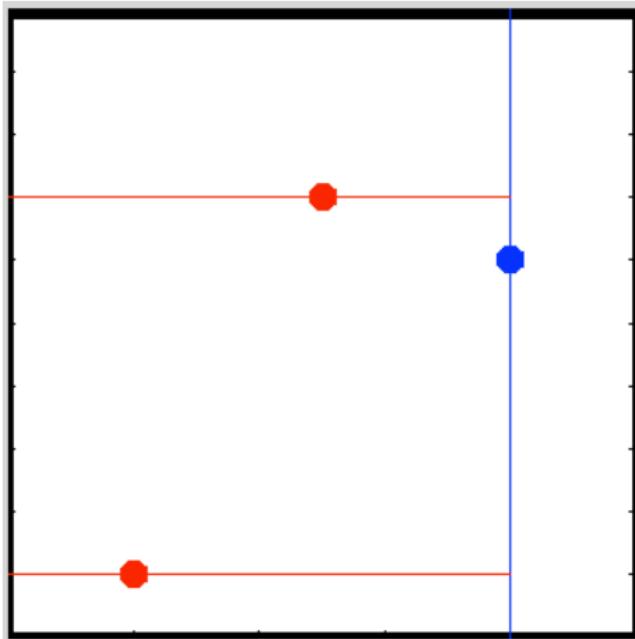
# Fragmentation



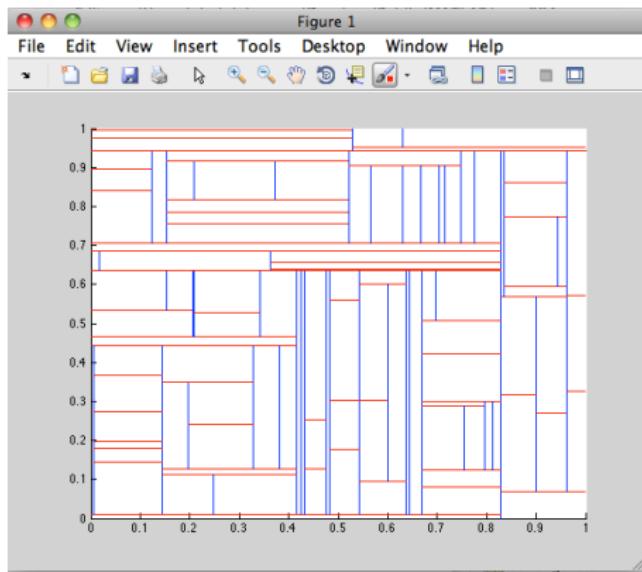
# Fragmentation



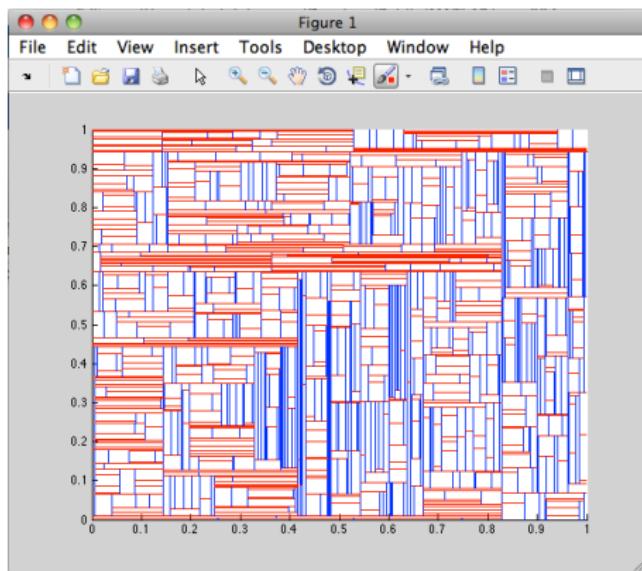
# Fragmentation



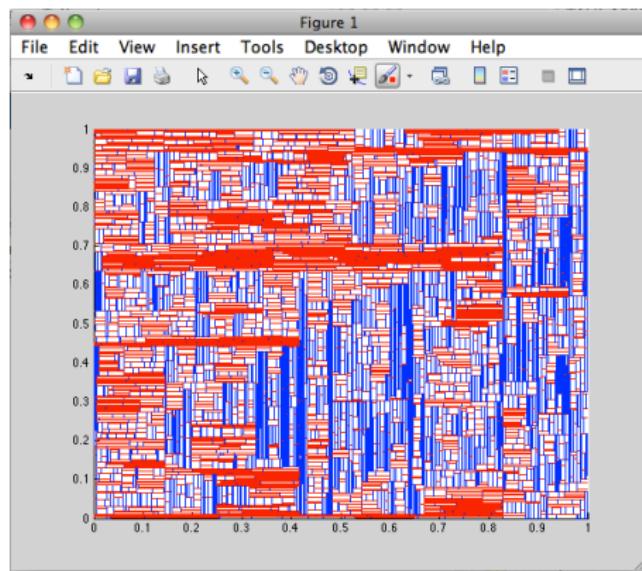
n=100



n=1000

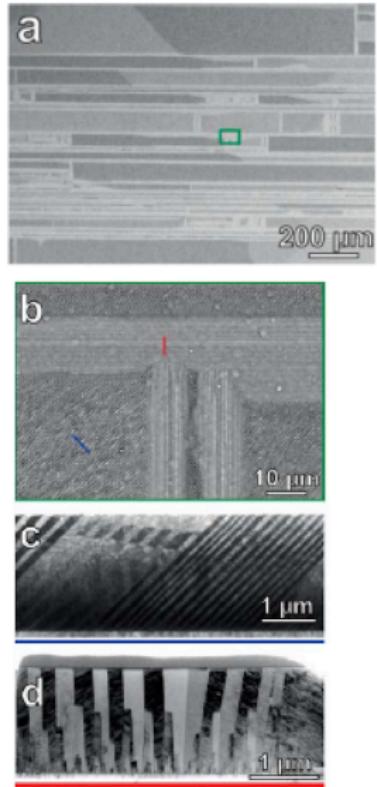


n=5000

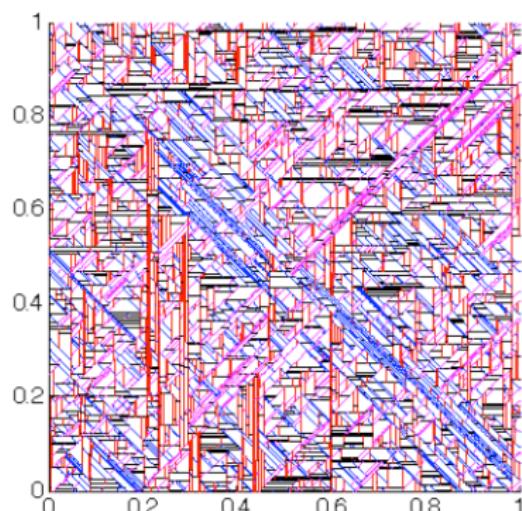
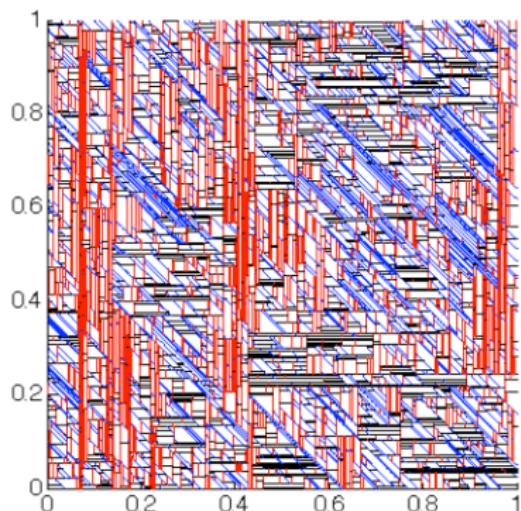


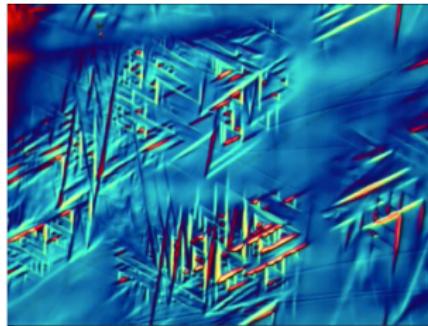
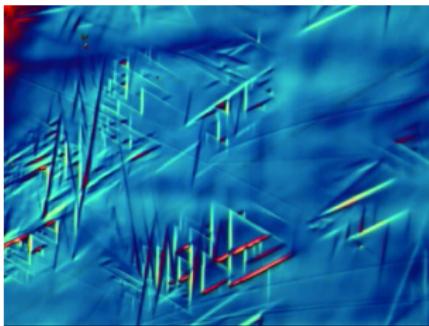
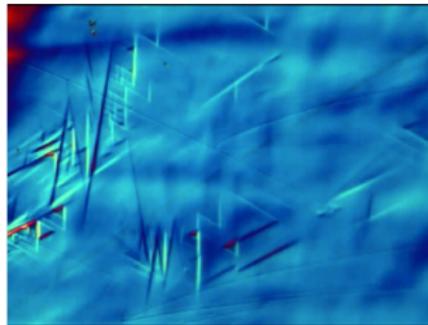
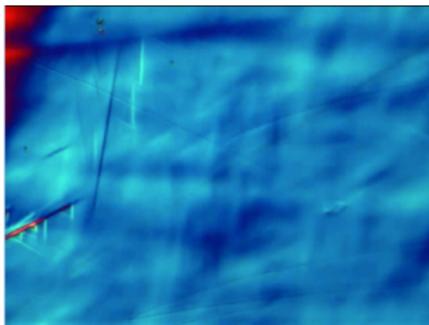
SEM micrograph (backscattered electron contrast) of an epitaxial Ni-Mn-Ga film in the martensitic state at room temperature. (b) A zoom-in shows two different microstructures. All contrast comes from mesoscopic twin boundaries. (c, d) TEM micrographs at cross-sections along the lines marked in (b).

R. Niemann et al. (2014) PRB



# 3, 4 Phases





Avalanche formation of a habit plane variant cluster with triangular morphology in TiNbAl [Kamioka, ..., T. Inamura, Proceedings of ESOMAT 2015]

# 6 Phases

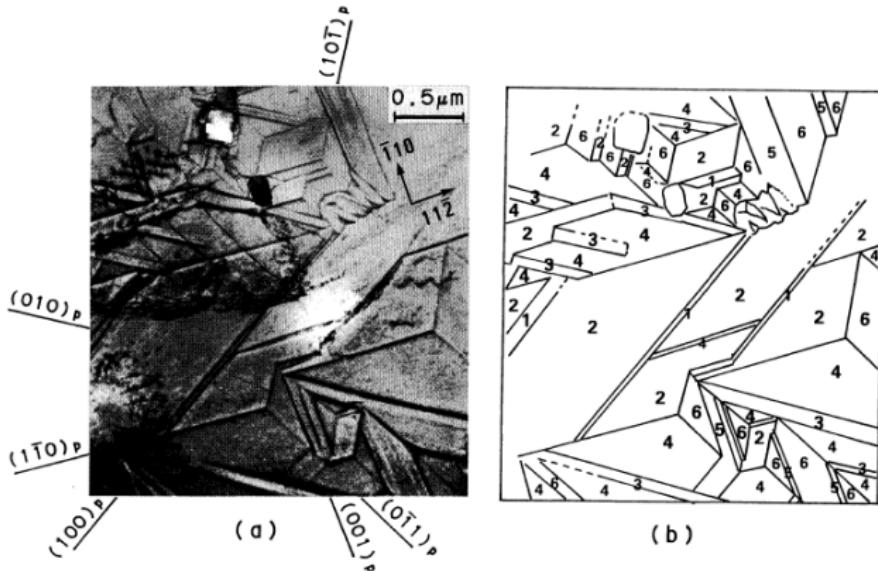
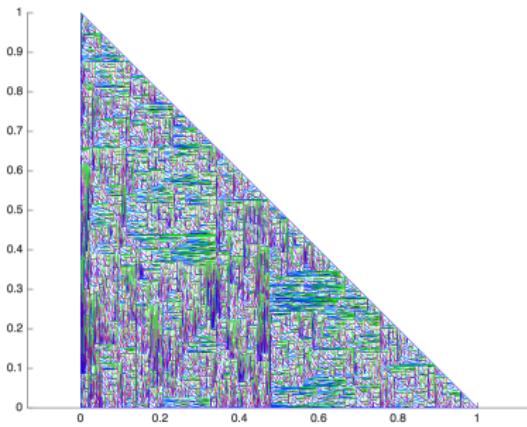
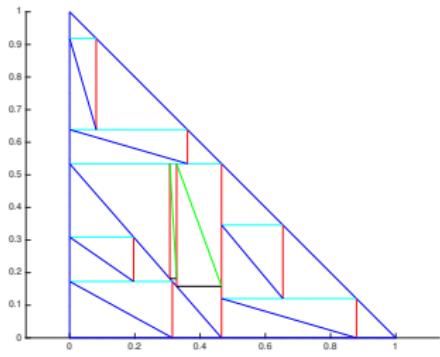


Fig. 9 (a) Configuration of six variants. Surface marking on the surface of the parent phase (electron micrograph).  
(b) Schematic explanation of (a).

Self-accommodation structure in Ti-Ni-Cu Orthorombic Martensite, Watanabe et al., J. Japan Inst. Metals, 54, N.8 1990.

# Other shapes

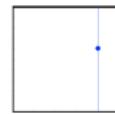


# The fragmentation model

- Pick a point at random (nucleation)

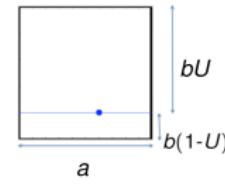
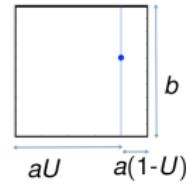


- Choose a direction, V (with probability p) or H



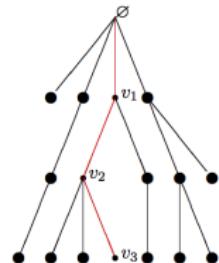
- The general rectangle  $(a, b)$  splits into

$$(a, b) \rightarrow \begin{cases} (aU, b), (a(1-U), b) \text{ with probability } p \\ (a, bU), (a, b(1-U)) \text{ with probability } 1-p \end{cases}$$



# General Branching Random Walk

- The whole structure can be captured in a tree as the evolution inside any rectangle does not affect what happens outside that rectangle.
- Thus in our tree each vertex will represent a rectangle .
- We use some results from Biggins<sup>1</sup>: super-critical GBRW have a shape theorem indicating the region where the number of particles will grow exponentially.



<sup>1</sup>How fast does a general branching random walk spread? *IMA Vol. Math. Appl.*, 84, Springer, New York, 1997.

## – log transformation

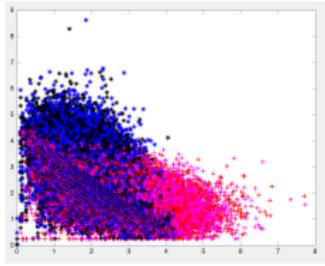
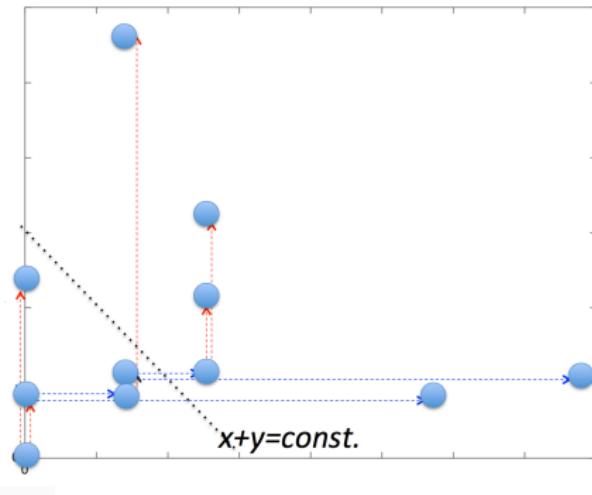
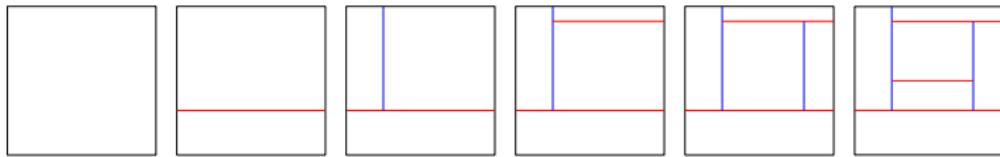
- Transformation:

$$x = -\log a \geq 0$$

$$y = -\log b \geq 0$$

- Each rectangle is an individual in the branching process and location is determined by its sides  $\rightarrow$  GBRW in  $\mathbb{R}_+^2$ .
- Ancestor  $(0, 1) \times (0, 1) \rightarrow (0, 0)$
- The smaller the rectangles, the larger the coordinates

# Constructing the tree



# Branching Random Walk

- In Crump-Mode-Jagers (General Branching Process) model an individual  $z$ :
  - is born at time  $\sigma_z \geq 0$ ,
  - has a lifetime  $L_z \geq 0$ ,
  - has offspring whose birth times are determined by a point process  $\xi_z$  on  $(0, \infty)$ .
- For a General Branching Random Walk we include a point process for the birth position  $\eta_z$  (as well as birth times).

# General Branching Random Walk

- Let the Bernoulli r.v.  $B_i = \begin{cases} 0 & \text{horizontal} \\ 1 & \text{vertical} \end{cases} \quad \begin{matrix} 1-p \\ p \end{matrix}$
- Let  $U_i$  uniform r.v. in  $[0, 1]$
- Outcomes of the general rectangle  $(a, b)$  are

$$(a, b) \rightarrow \begin{cases} (B_i U_i a, (1 - B_i) U_i b) \\ (B_i (1 - U_i) a, (1 - B_i)(1 - U_i) b) \end{cases}$$

# General Branching Random Walk

- Birth time: proportional to  $-\log(\text{Area})$  of rectangle splitting
- $(\eta_i, \xi_i) = \text{space, time position of offspring of } i$

$$\eta_i, \xi_i = \begin{cases} (-B_i \log U_i, -(1 - B_i) \log U_i) & -\log U_i \\ (-B_i \log(1 - U_i), -(1 - B_i) \log(1 - U_i)) & -\log(1 - U_i) \end{cases}$$

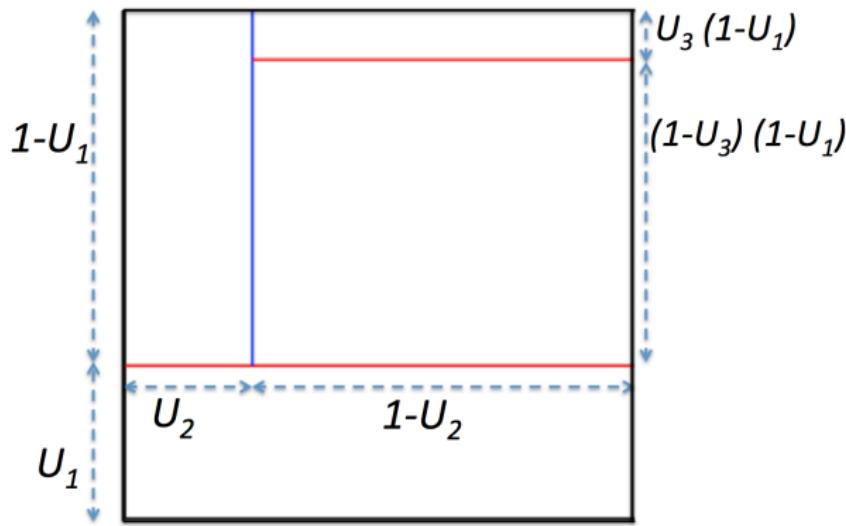
- The space-time point process:

$$(\eta(dx), \xi(dt)) = \begin{cases} (\delta_{(-\log u, 0)}(dx), \delta_{-\log t}(dt)) I_{\{u=t\}} + \\ (\delta_{(-\log(1-u), 0)}(dx), \delta_{-\log(1-t)}(dt)) I_{\{u=t\}} & 1/2 \\ (\delta_{(0, -\log u)}(dx), \delta_{-\log t}(dt)) I_{\{u=t\}} + \\ (\delta_{(0, -\log(1-u))}(dx), \delta_{-\log(1-t)}(dt)) I_{\{u=t\}} & 1/2 \end{cases}$$

- birth time of  $\sigma_\emptyset = 0$
- birth time of  $\sigma_{ij} = \sigma_i + \inf\{t : \xi_i(t) \geq j\}$

# Time

- $t = -\log(1 - U_1) - \log(1 - U_2) - \log(1 - U_3)$
- Largest area is  $(1 - U_1)(1 - U_2)(1 - U_3)$
- That is  $t = -\log(\text{Area})$
- at time  $t$  largest area is  $e^{-t}$



# Shape Theorem

- We want to keep track of  $N_t(A) = \#$  individuals in the set  $A$  at time  $t$ .

Take  $A \subset \mathbb{R}_+^2$  closed, convex, non-empty interior.

- ① If  $A \cap \{(x, y) : x + y = 1\} = \emptyset$  then

$$t^{-1} \log N_t(tA) \rightarrow -\infty \quad t \rightarrow \infty, \text{a.s.}$$

- ② If  $A \cap \{(x, y) : x + y = 1\} \neq \emptyset$  then

$$t^{-1} \log N_t(tA) \rightarrow \beta \geq 0 \quad t \rightarrow \infty, \text{a.s.}$$

where

- $\beta = \sup\{\alpha^*(a) : a \in A\}$
- $\alpha^*(\mathbf{a}) = \inf_{\mathbf{w}}\{\mathbf{a} \cdot \mathbf{w} + \alpha(\mathbf{w})\}$
- $\alpha(\mathbf{a}) = \inf\{\phi : m(\mathbf{w}, \phi) \leq 1\}$
- 

$$m(\mathbf{w}, \phi) = E \int e^{-\mathbf{w} \cdot \mathbf{x} - \phi t} \eta_\emptyset(d\mathbf{x}) \xi_\emptyset(dt), \quad \mathbf{w} \in \mathbb{R}^2, \phi \in \mathbb{R}_+.$$

the moment-generating function for the position and birth times of offsprings.

# Interpretation

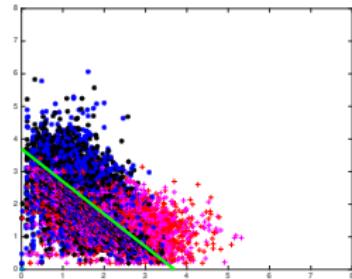
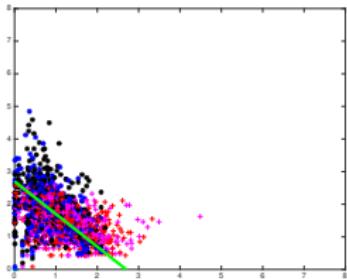
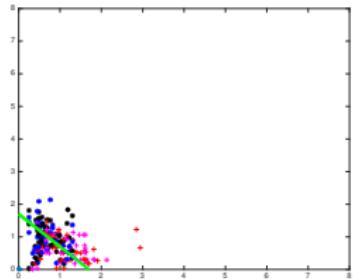


Figure :  $n = 10^2, 10^3, 10^4$

The line  $x + y = t$   
Areas  $\sim e^{-t}$

# Application

- At time  $t$  largest Area =  $e^{-t} \rightarrow t = -\log \text{Area}$
- Shape theorem describes exponential growth of individuals  $N$  in a certain set  $A \subset \mathbb{R}_{++}^2$

$$\lim_{t \rightarrow \infty} t^{-1} \log(t N_t(A)) = \beta \geq 0$$

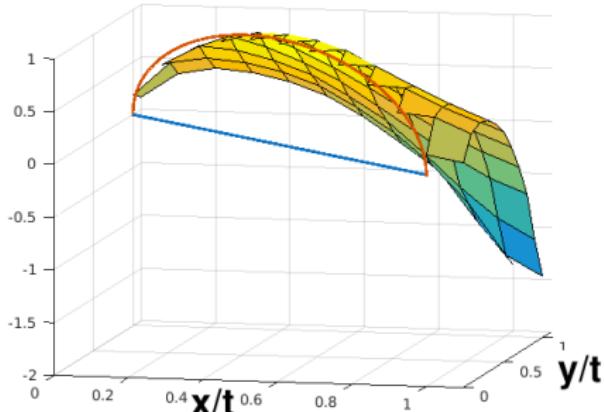
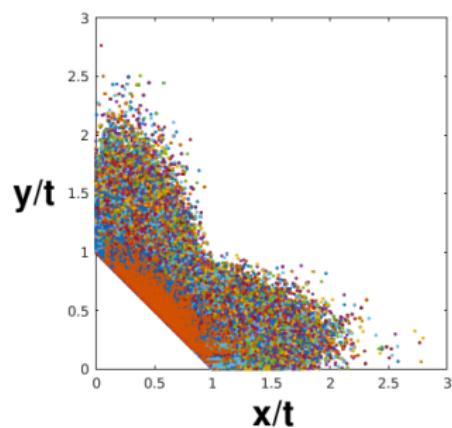
- for finite  $t$ , approximation formula

$$N_t(A_{x,y}) = e^{t f(\frac{x}{t}, \frac{y}{t})}$$

with:

$$f\left(\frac{x}{t}, \frac{y}{t}\right) = \begin{cases} \sqrt{1 - (2p - 1)^2} \sqrt{1 - \left(\frac{x}{t} - \frac{y}{t}\right)^2} + \\ \quad +(1 - 2p)\left(\frac{x}{t} - \frac{y}{t}\right) & \text{if } \frac{x}{t} + \frac{y}{t} = 1 \\ -\infty & \text{if } \frac{x}{t} + \frac{y}{t} \neq 1 \end{cases}$$

# Numerical results (rectangles)

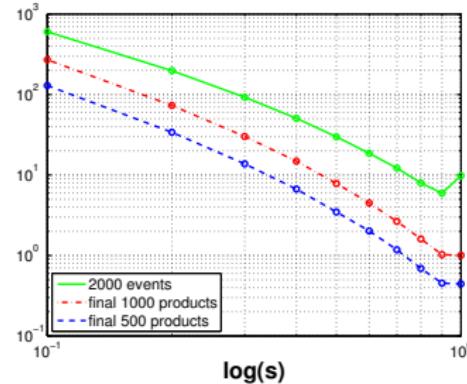
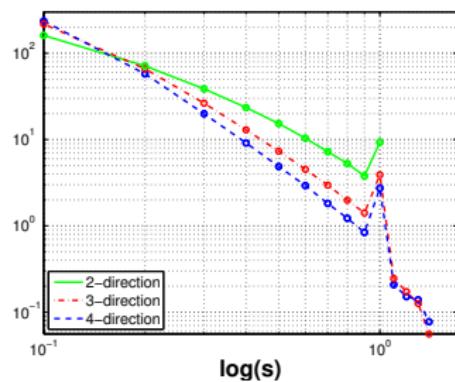


- for  $p = \frac{1}{2}$ ,  $n = 2000$ ,  $t \approx 6.9$
- Analytical solution

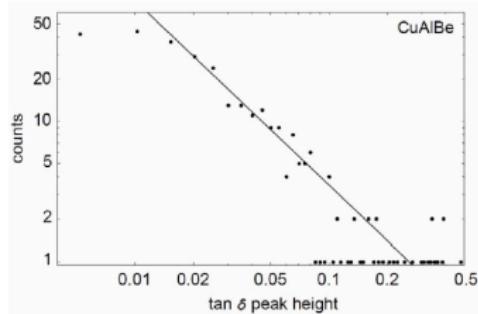
$$f\left(\frac{x}{t}, 1 - \frac{x}{t}\right) = 2\sqrt{\frac{x}{t}\left(1 - \frac{x}{t}\right)}$$

holds on the line  $\frac{x}{t} + \frac{y}{t} = 1$  ( $ab = e^{-t}$ )

# Numerical results (interfaces)



M-symmetry	$\alpha$	$\epsilon$	Multiplicity
Monoclinic	$3.0 \pm 0.2$	$2.0 \pm 0.2$	12
Orthorhombic	$2.4 \pm 0.1$	—	6
Tetragonal	$2.0 \pm 0.3$	$1.6 \pm 0.1$	3



Salje et al. (2009) *Jerky elasticity: Avalanches and the martensitic transition in shape-memory alloy*, APL 95

# Case with bias

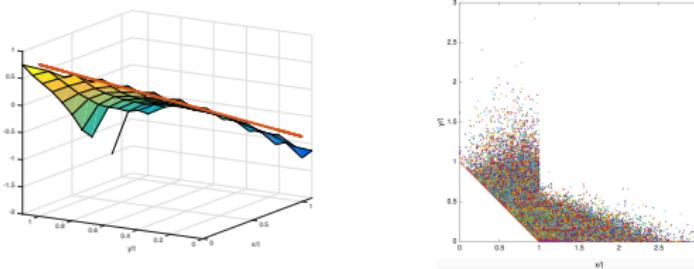


Figure : Histograms,  $p = 0.1$

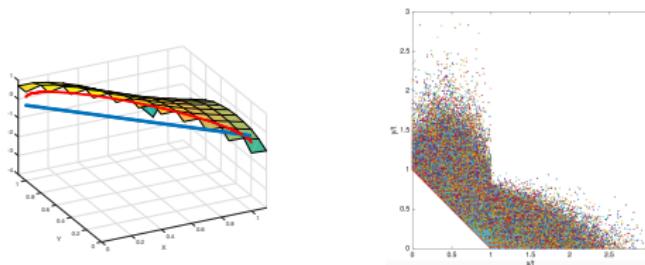
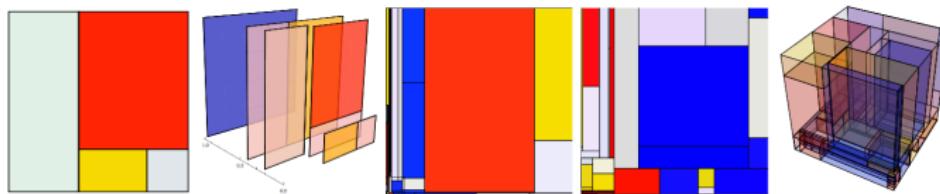


Figure : Histograms,  $p = 0.3$

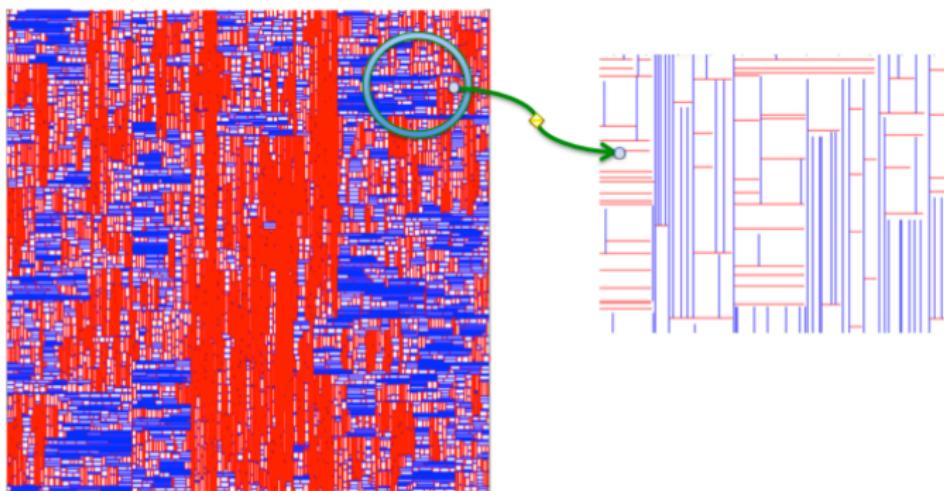
# Mondrian process

The Mondrian Process, D. M. Roy, Y. W. Teh, Advances in Neural Information Processing Systems 21 (NIPS 2008)

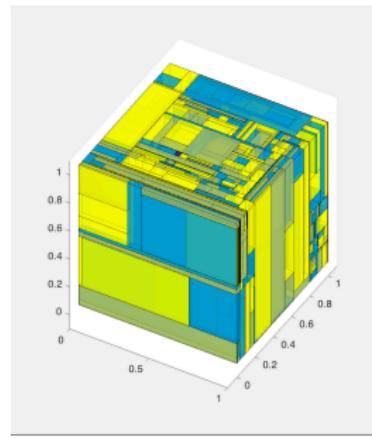
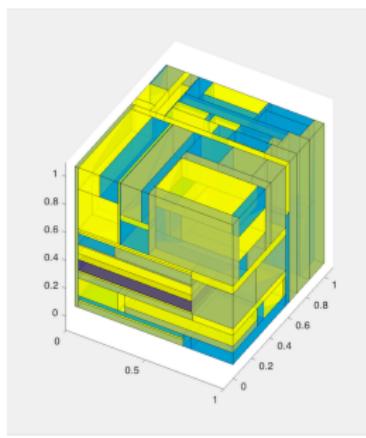
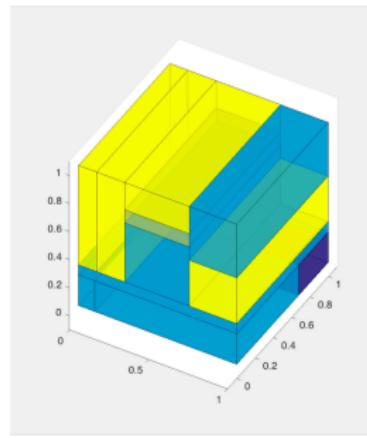


- Initial budget  $\lambda > 0$
- Nucleus picked at random
- Cut is made with probability proportional to its length
- Cost of cut  $\propto$  its length
- Arrest when the total length reaches the budget

# Fractal microstructure

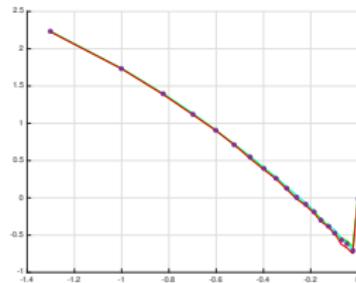
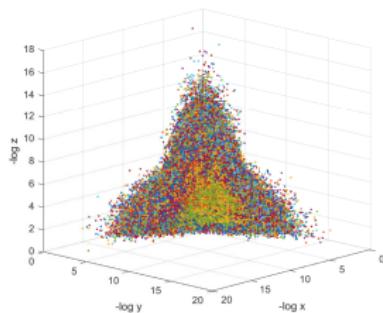


# 3D model



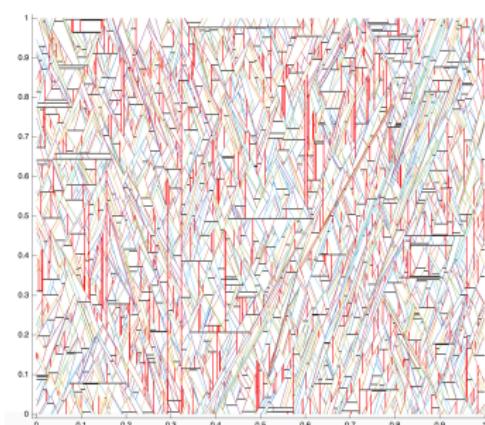
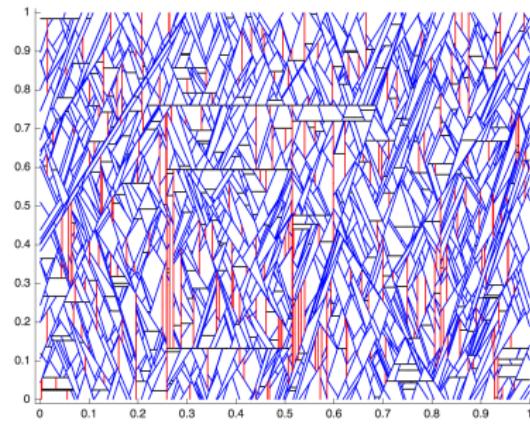
$n = 10, 10^2, 10^3$  events.

# 3D model



Cloud and plate distribution.

# Random angles

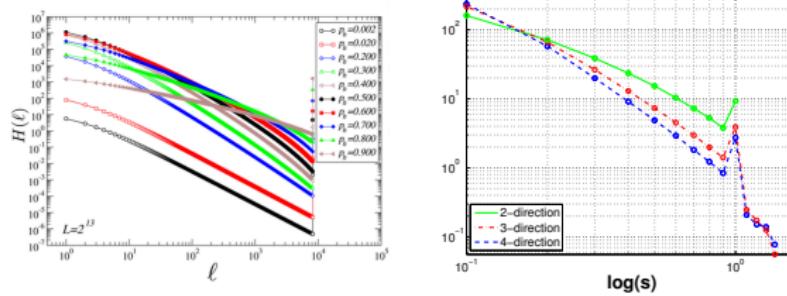


- Surface energy
- Unpinning strategy (joint w. A. Collevecchio, Monash)

# TIVP model

G. Torrents et al., Geometrical model for martensitic phase transitions: understanding criticality and weak universality during microstructure growth, to appear

- discrete model
- our focus on new individuals
- discrete features



- statistics for interfaces and areas

# Self-similar nested microstructure

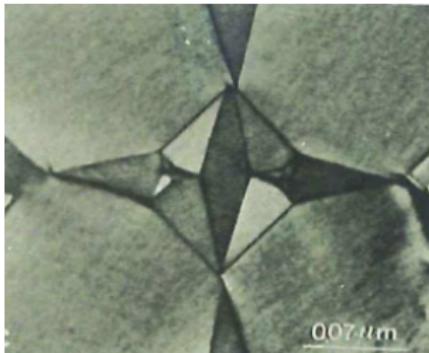


Figure : Star disclination in  $\text{Pb}_3(\text{VO}_4)_2$  (HREM), C. Manolikas, S. Amelinckx, Phys. Stat. Sol. 1980.

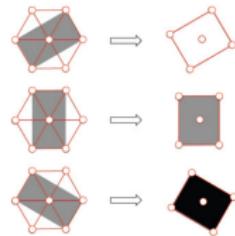
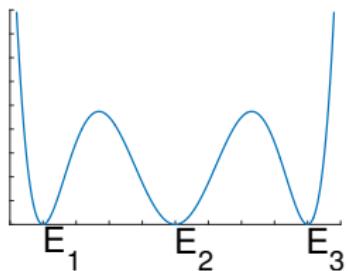


Figure : The 2D version of the hexagonal-to-orthorhombic transformation ( $\text{Mg}-\text{Cd}$ ,  $\text{Mg}_2\text{Al}_4\text{Si}_5\text{O}_{18}$ ) is the triangle-to-centered-rectangle (TR) transformation.

# Exact solutions

- $\Psi(F) \leftarrow \min_{F \in \mathbb{R}^{3 \times 3}} + \text{Kinematic Compatibility}$

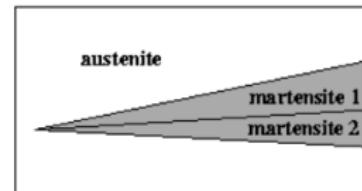
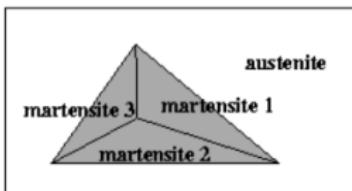
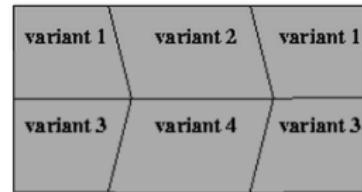
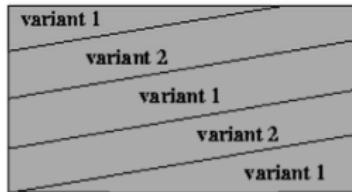
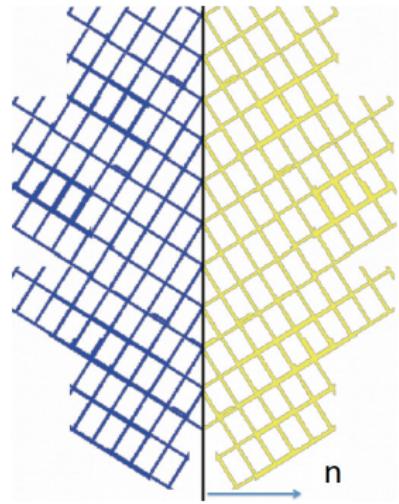


- To find a deformation field  $y : \Omega \rightarrow \mathbb{R}^3$  s.t.

$$\nabla y \in \{E_1, E_2, E_3\}$$

and  $y$  is Hölder continuous.

# Kinematic compatibility (KC)

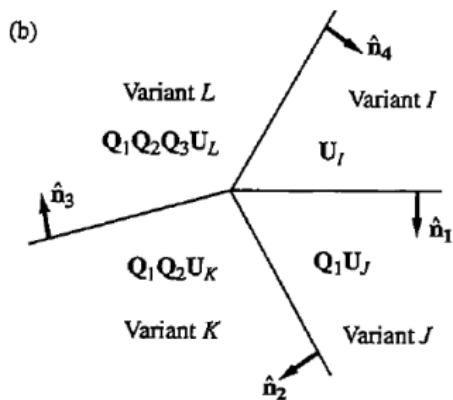
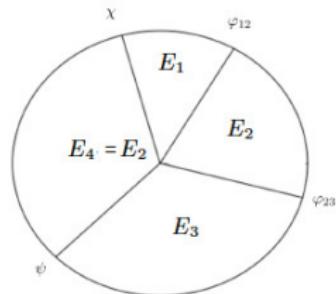


$$F_1 = \nabla y_1 \quad F_2 = \nabla y_2$$

Conservation of tangential component of  $\nabla y_1, \nabla y_2 \rightarrow F_1 - F_2 = a \otimes n$

# Kinematic compatibility

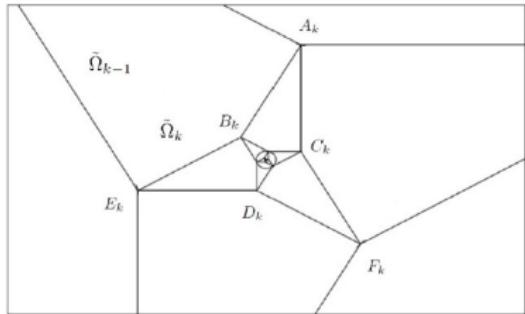
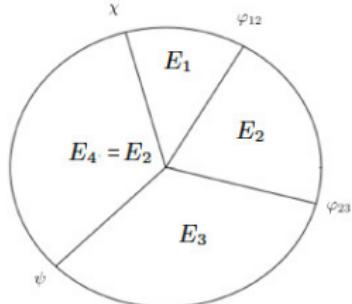
$$y : \Omega \rightarrow \mathbb{R}^3 : \nabla y \in \{E_1, E_2, E_3\}$$



1.  $Q_1 U_J - U_I = b_1 \otimes \hat{n}_1$
2.  $Q_1 Q_2 U_K - Q_1 U_J = b_2 \otimes \hat{n}_2$
3.  $Q_1 Q_2 Q_3 U_L - Q_1 Q_2 U_K = b_3 \otimes \hat{n}_3$
4.  $U_I - Q_1 Q_2 Q_3 U_L = b_4 \otimes \hat{n}_4$
5.  $\hat{n}_1, \hat{n}_2, \hat{n}_3$  and  $\hat{n}_4$  lie on a plane

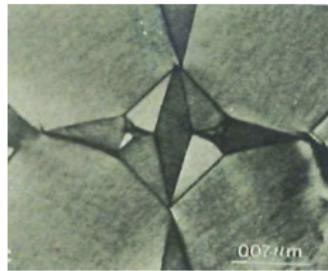
## Parallelogram Martensite Microstructure

# Star-disclination



→ Rigidity: solution is unique

S. Patching, P.C., A. Rueland  
P.C., M. Porta, T. Lookman J MPS14



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- LANL-work is unclassified

p.cesana@latrobe.edu.au