

# Steps on Crystalline Surfaces: From Elementary Models to Universal Fluctuation Phenomena

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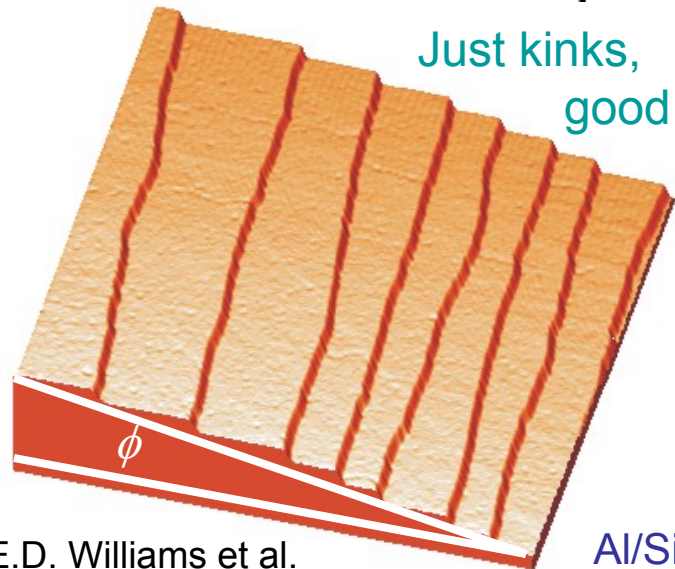
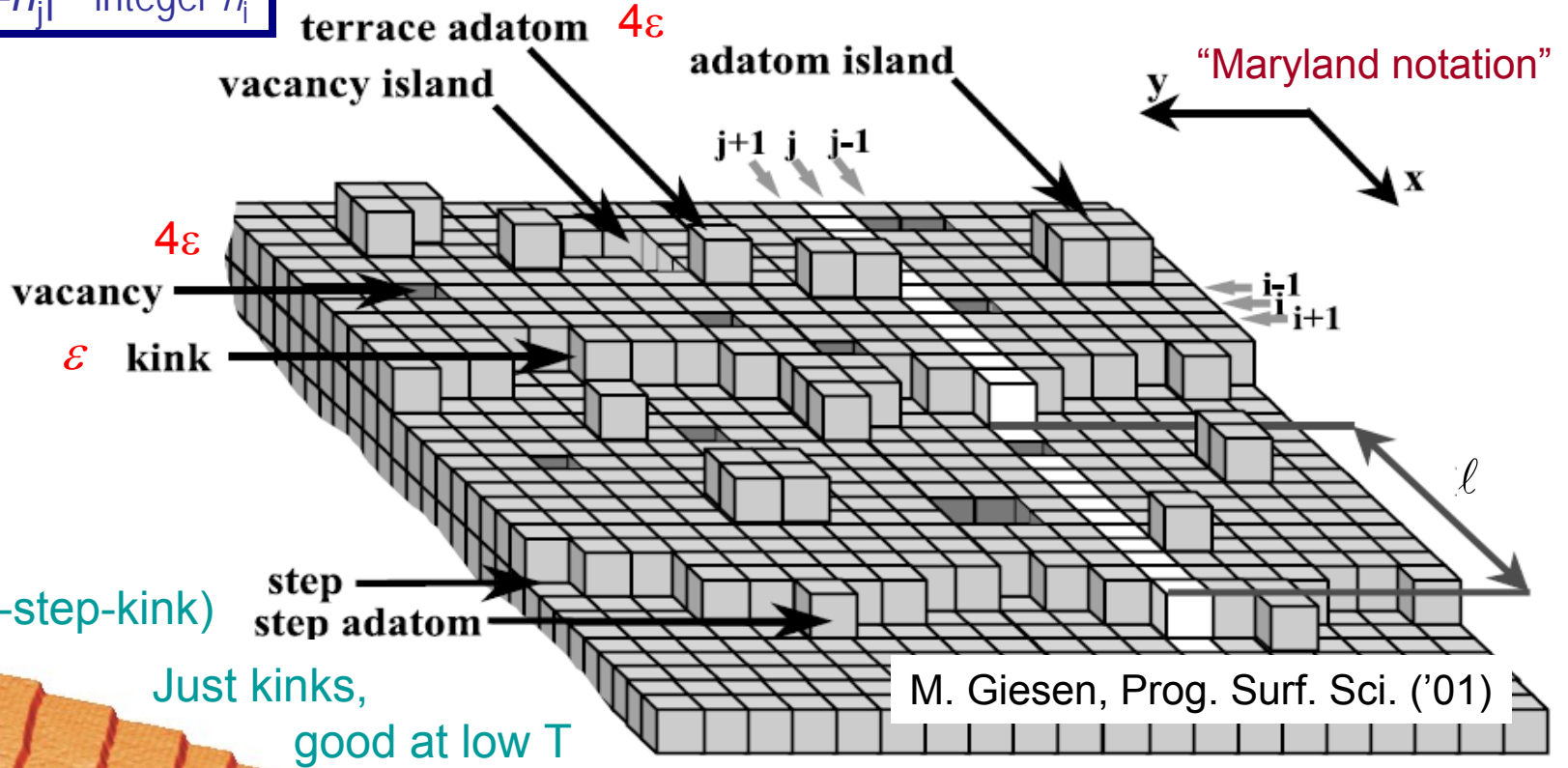
In **collaboration** with Alberto Pimpinelli, Hailu Gebremariam, Tim Stasevich, H.L. Richards, O. Pierre-Louis, S.D. Cohen, R.D. Schroll, N.C. Bartelt, and experimentalists Ellen D. Williams & J.E. Reutt-Robey at UM, M. Giesen & H. Ibach at FZ-Jülich, and J.-J. Métois at Marseilles

- Background, terminology, models
- Different roles of steps; applications in crystal growth, chemistry, nanowires, polymers
- Steps as Brownian strings; seeking signatures of mass transport modes
- **Steps on vicinal surfaces as meandering fermions in (1+1)D...? interactions?**
- Terrace width distributions (TWDs), and what they reveal
- Simple models: mean field & 1D Schrödinger eqn...and their shortcomings
- Relevance of random matrix theory—**universal features of fluctuations**
- Generalizing the Wigner surmise from symmetry-based: meaning of  $\varrho$
- Fokker-Planck formulation: study of relaxation to equilibrium
- Growth: TWD narrowing; **scaling of capture zones of islands**

Prototype systems: Si (111), Cu (001) and (111)

# SOS (solid-on-solid) model of vicinals

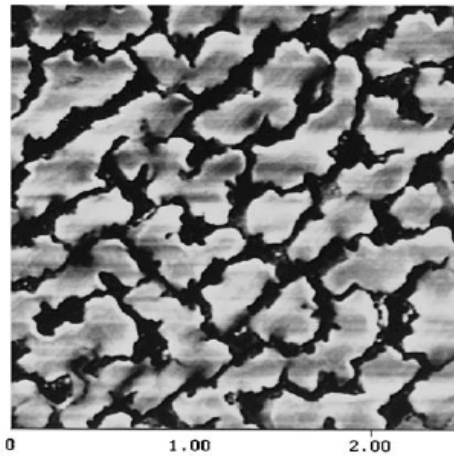
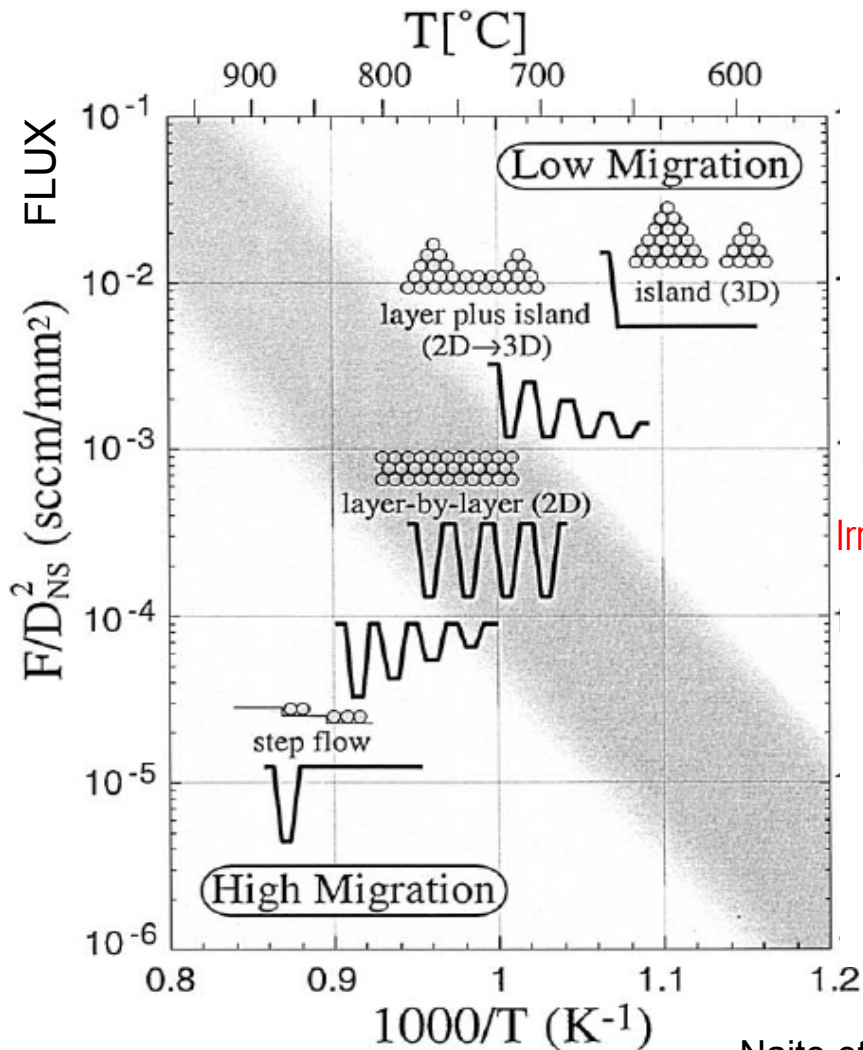
$$H = \varepsilon \sum_{\langle ij \rangle} |h_i - h_j| \quad \text{integer } h_i$$



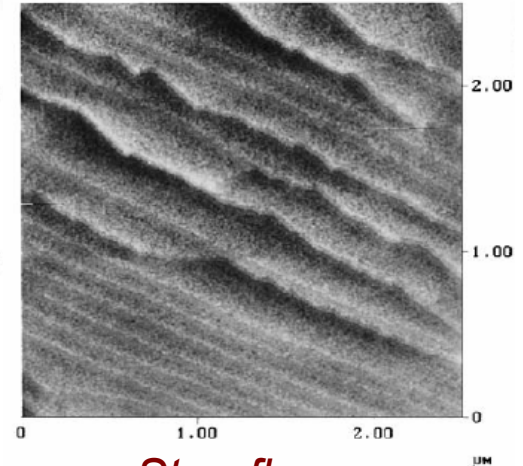
$\phi$  is the *misorientation angle*, fixed  
 Mean step spacing  $\langle \ell \rangle \propto 1 / \tan(\phi)$   
 Slope  $m = \tan(\phi)$  is a thermodynamic density

# Vicinals as growth templates: controlled unidirectional defects in step-flow growth (vs. nucleation on flat)

*Competition of characteristic lengths for diffusion, nucleation, distance to step*



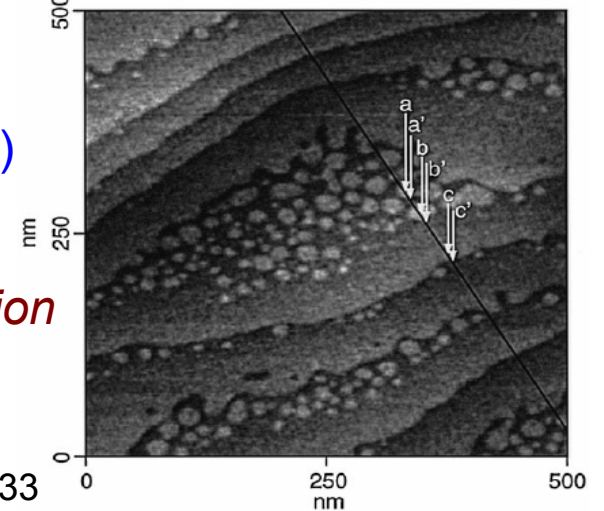
*Nucleation on flat*  
Irregular borders locked in by 1 ML

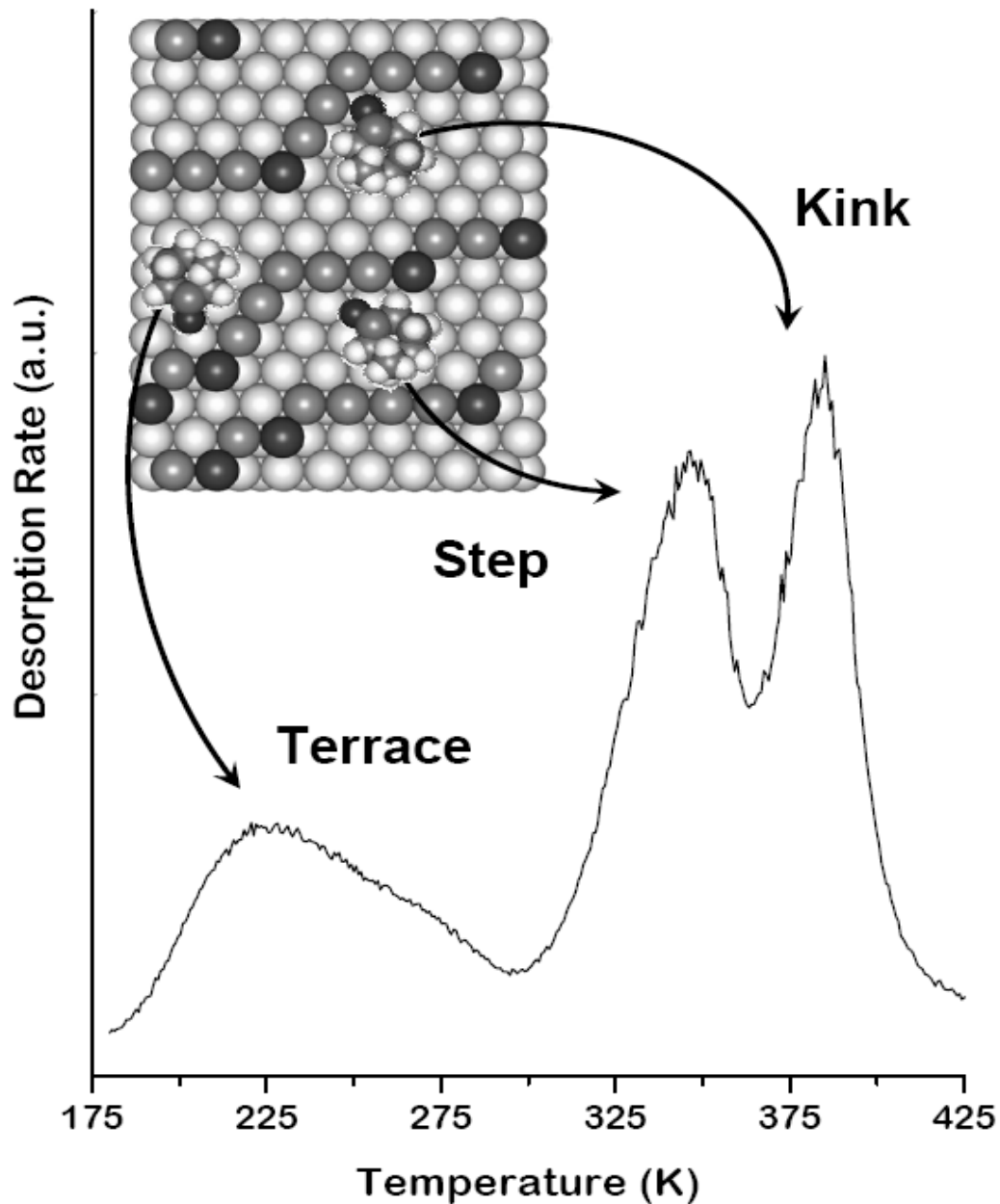


*Step flow*  
Step pattern persists

AFM of SrTiO<sub>3</sub>(001)

*Competition*





Steps & kinks  
can alter  
chemical activity  $\Rightarrow$   
applications in  
*catalysis*

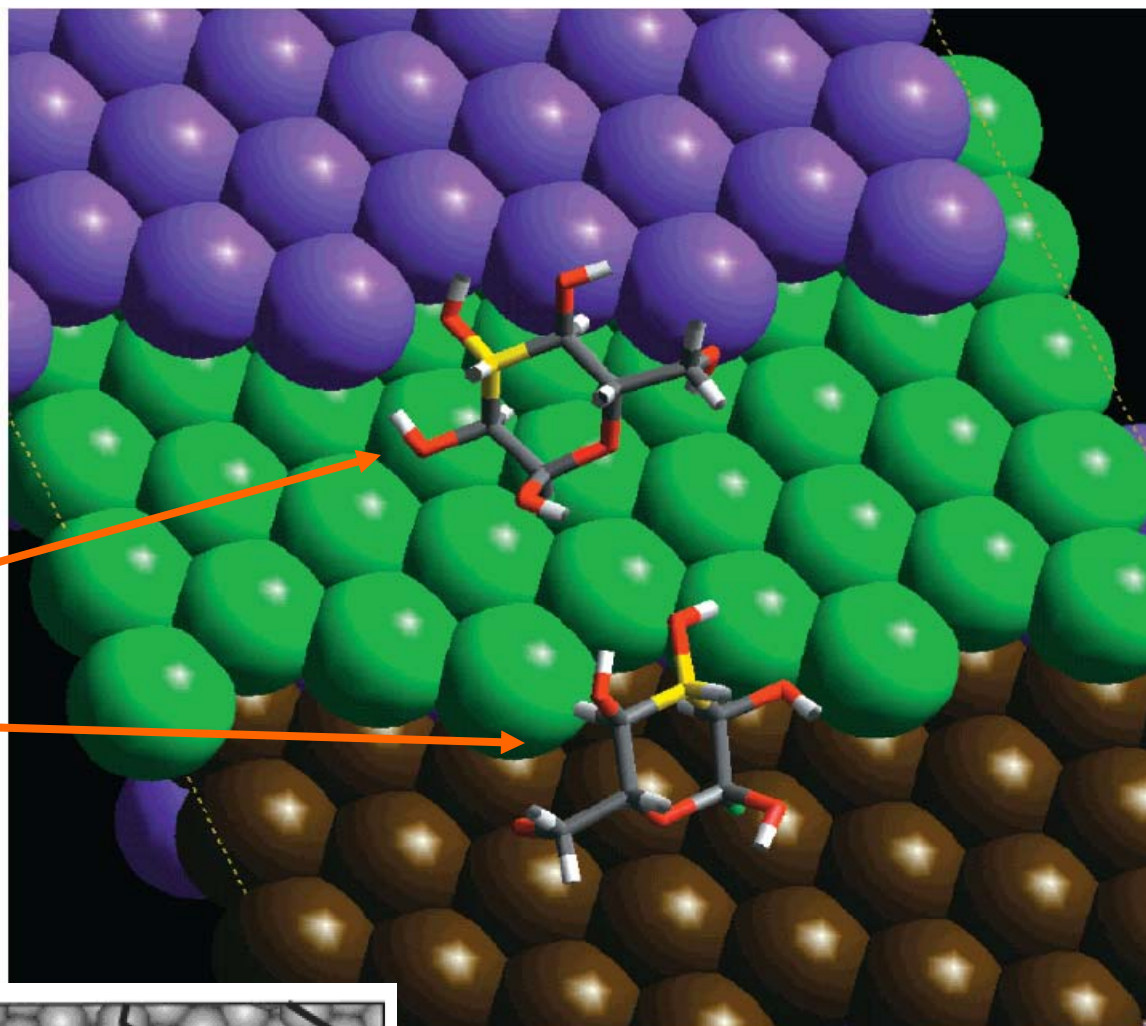
R-3-MCHO molecules  
on roughened Cu(643)

Horvath & Gellman,  
Topics in Catalysis 25 ('03)

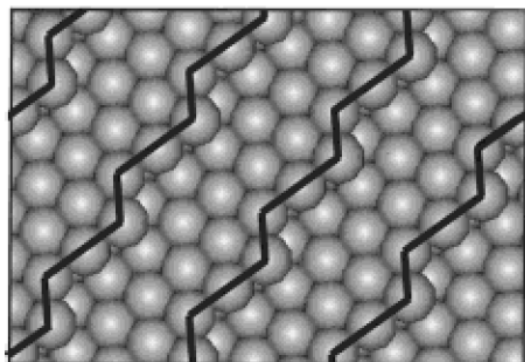
# Enantio-selectivity at chiral metal surfaces

D-glucose

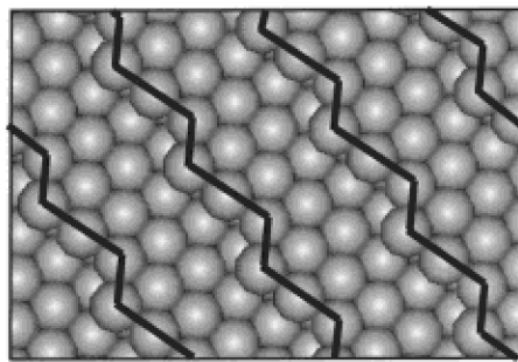
L-glucose



*Chiral Pt (643)*



fcc(643)

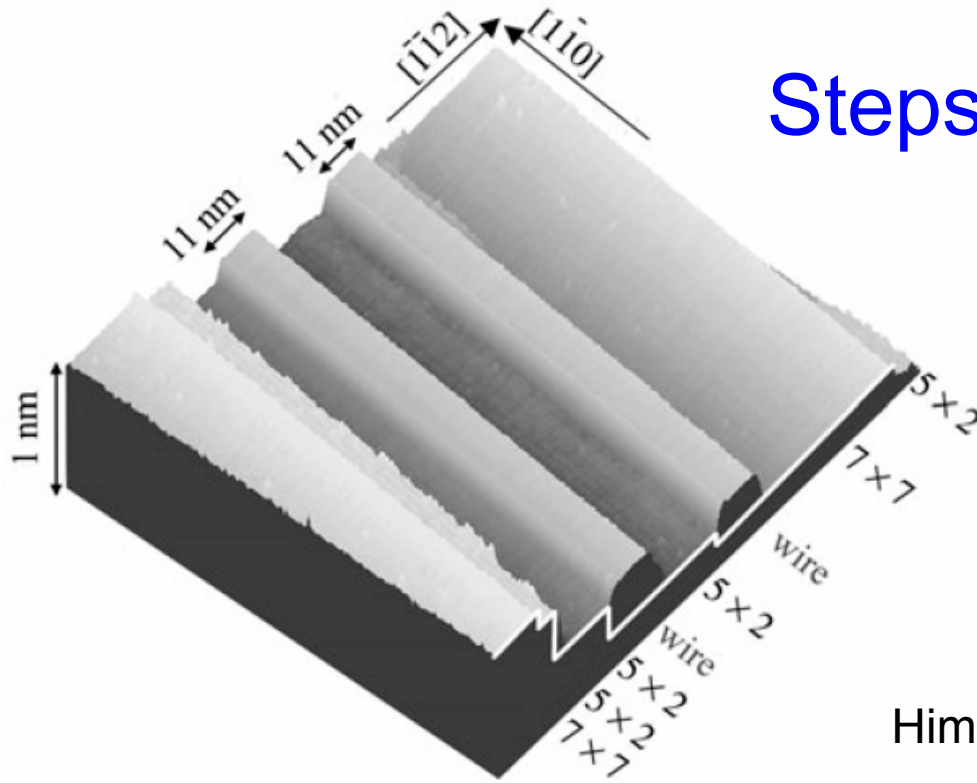


fcc( $\bar{6}4\bar{3}$ )

Attard, J. Phys Chem B 105 ('01) 3158

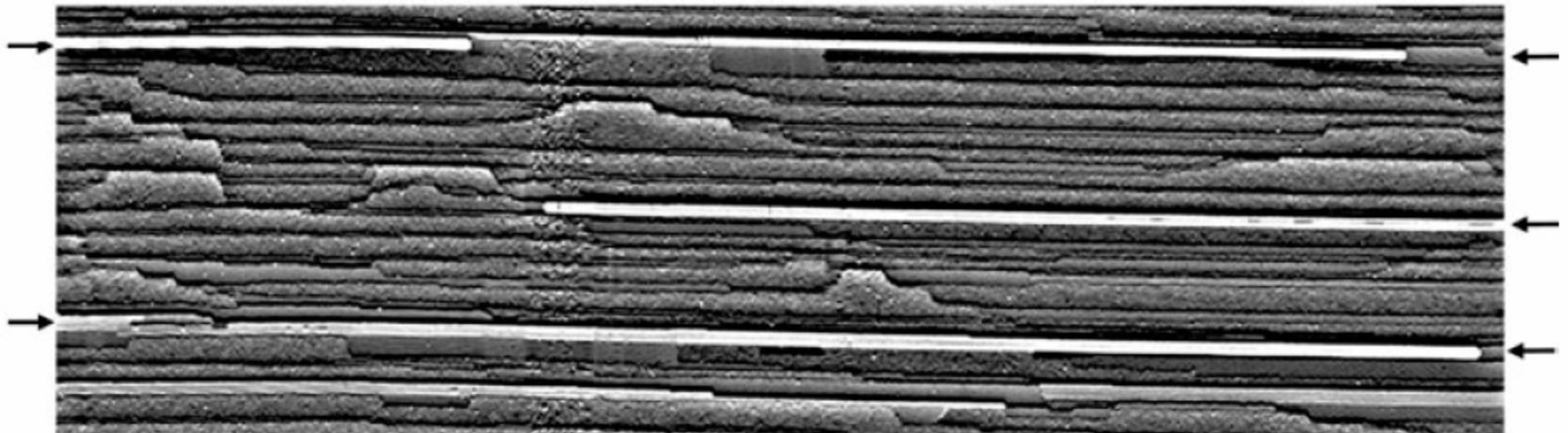
Sholl et al., J. Phys Chem B 105 ('01) 4771

# Steps as Growth Template for Nanowires



Gd disilicide nanowires on Si(111)  
11 nm wide  
straight, limited by kinks on steps

Himpsel group, Nanotechnology 13 ('02) 545



200nm

# Steps as polymers in 2D $\Rightarrow$ non-crossing

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## Soluble Model for Fibrous Structures with Steric Constraints

P.-G. DE GENNES

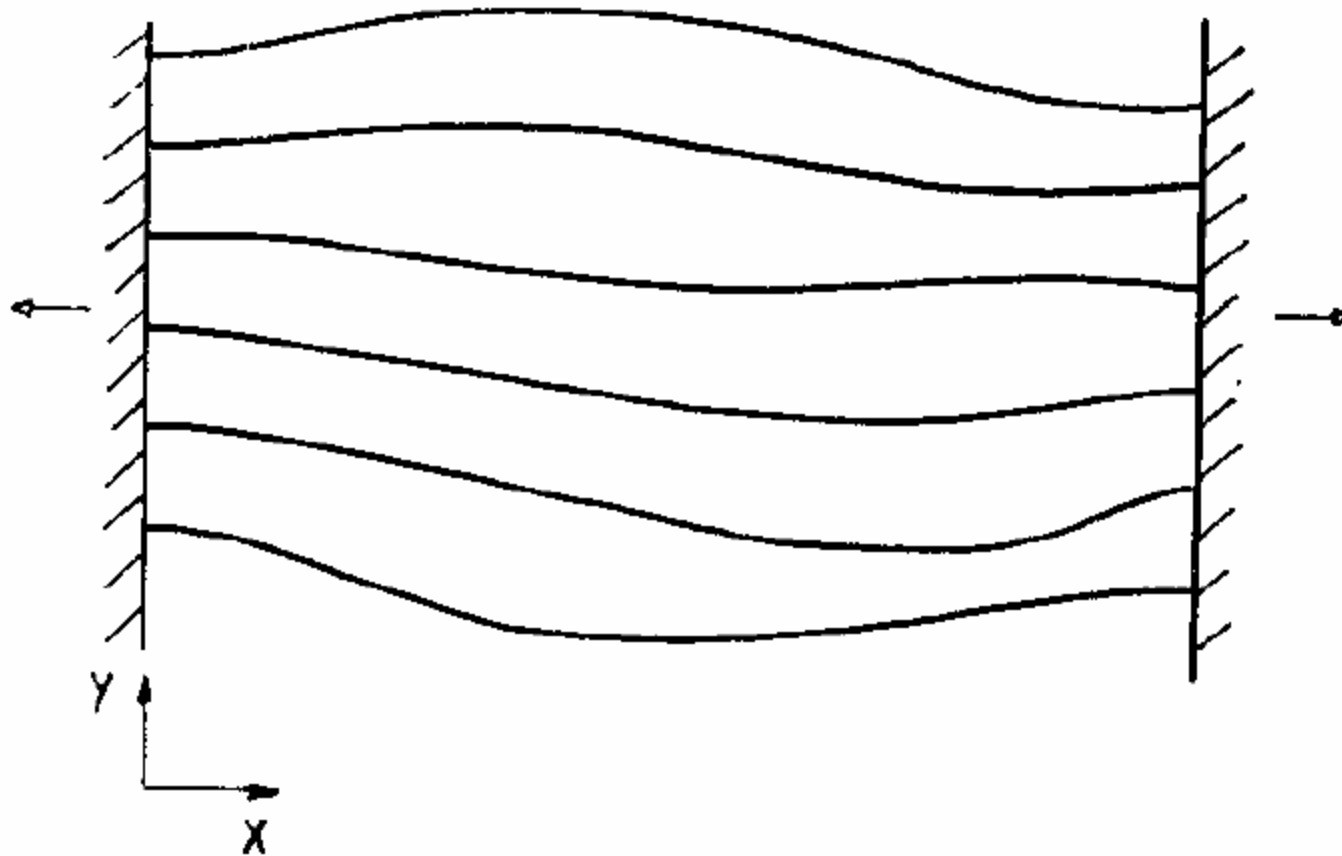
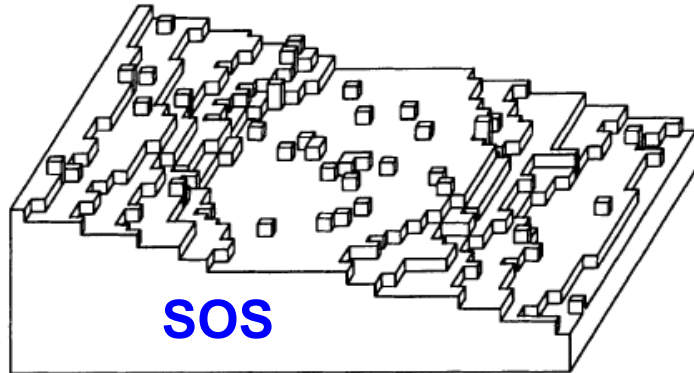


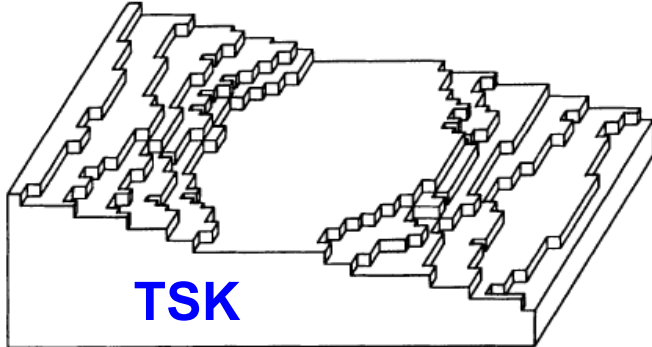
FIG. 1. Model for a two-dimensional fiber structure.

# Models & Key Energies

Discrete/atomistic  $\rightarrow$  Step Continuum

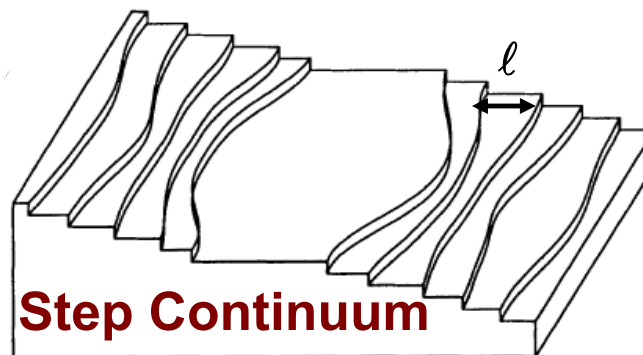


$\epsilon$  energy of unit height difference between NN sites  
+ hopping barriers, attach/detach rates



$\epsilon$

kink energy



$\tilde{\beta}$  step stiffness  $\beta(\theta) + \beta''(\theta)$ : inertial "mass" of step

$A$  strength of step-step repulsion  $A/\ell^2$

$\Gamma$  rate parameter, dependent on microscopic transport mechanism

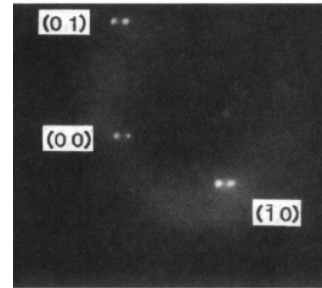
*Main test: Self-consistency of these 3 parameters to explain many phenomena*  
*Coarse-grain: Relation of 3 nano/mesoscale parameters to atomistic energies??*



# Experimental Probes of Vicinals

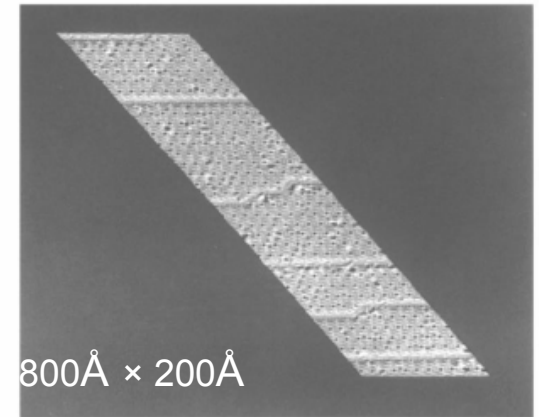
- Diffraction of electrons or atoms

k-space, sensitive to order



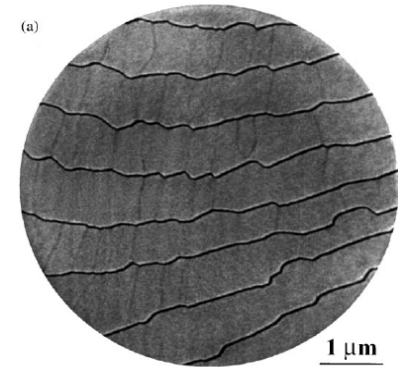
- STM (scanning tunneling microscope)

atomic resolution, but scanning



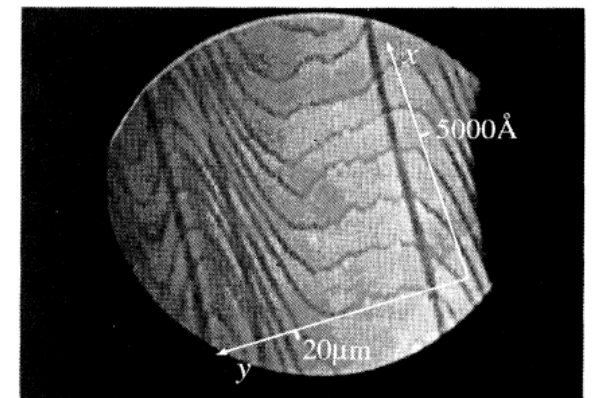
- LEEM (low-energy electron microscope)

nanoscale resolution, real-time image, expensive



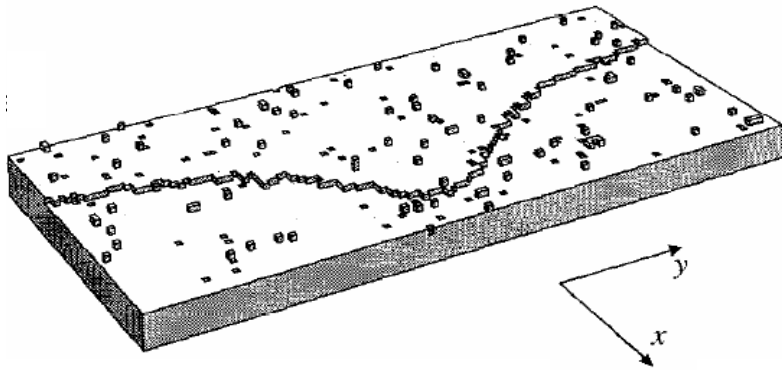
- REM (reflection electron microscopy)

nanoscale resolution in 1 direction, real-time image



*All photos are of Si (111)*

# Steps as Brownian strings: *Langevin* "capillary wave" approach



$$\frac{\partial x(y, t)}{\partial t} = -\text{restoring "force"} + \text{noise}(y, t)$$

e.g. heal curvature

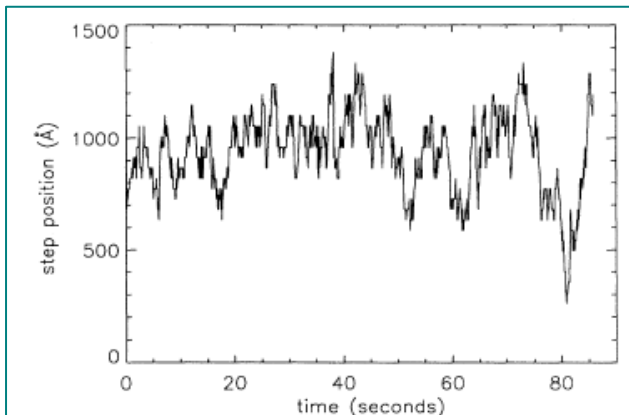
$$x(y, t) = \sum_q e^{iqy} x_q(t) \text{ to deal with } \nabla y$$

$$\frac{\partial x_q(t)}{\partial t} = -\frac{x_q(t)}{\tau_q} + \text{noise}(q, t)$$

$$G_q(t-t') \equiv \langle |x_q(t) - x_q(t')|^2 \rangle = \frac{2k_B T}{\tilde{\beta} q^2 L_y} \left( 1 - e^{-|t-t'|/\tau_q} \right)$$

saturation  $G_q \Rightarrow$  stiffness

Single value of  $y$



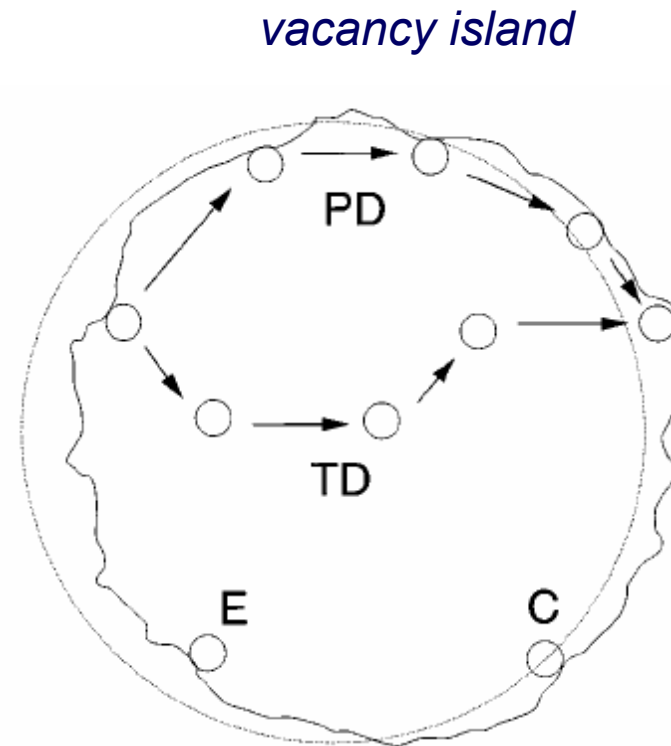
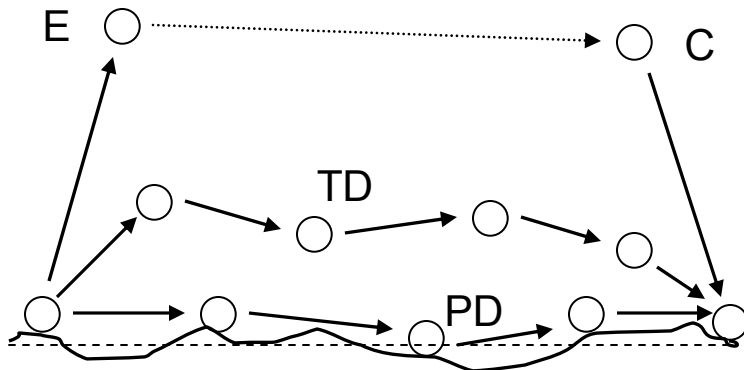
$$\tau_q^{-1} = \frac{\tilde{\beta}}{k_B T} \times \begin{cases} \Gamma_{\text{attach}} q^2 & \text{EC/AD : curvature-driven} \\ 2\Gamma_{\text{diffu}} |q|^3 & \text{TD} \\ \Gamma_{\text{edge}} q^4 & \text{PD/SED : } -\nabla^2 \text{curvature} \end{cases}$$

$\tau_q^{-1} \Rightarrow$  transport mode & associated  $\Gamma$

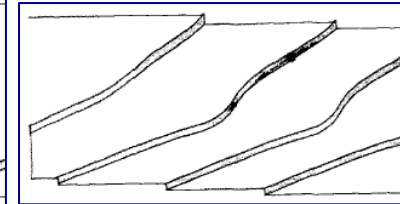
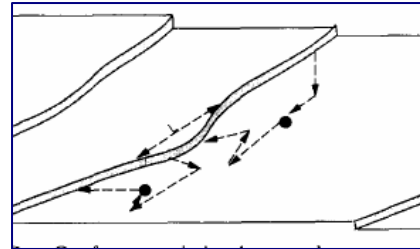
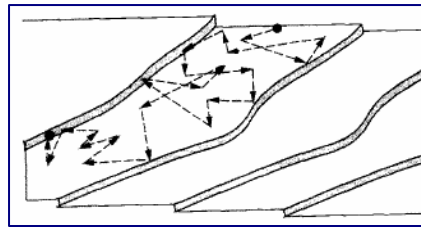
or early-time exponent  $\Rightarrow$  " & "

$$G(t) \equiv \langle [x(t_0+t) - x(t_0)]^2 \rangle_{y_0, t_0} \propto \begin{cases} t^{1/2} \\ t^{1/3} \\ t^{1/4} \end{cases}$$

# Island – Adatom or Vacancy – Defined by Nearly Circular Step!



# Isolated Step Fluctuations: Signatures of Dominant Mass Transport Mechanism



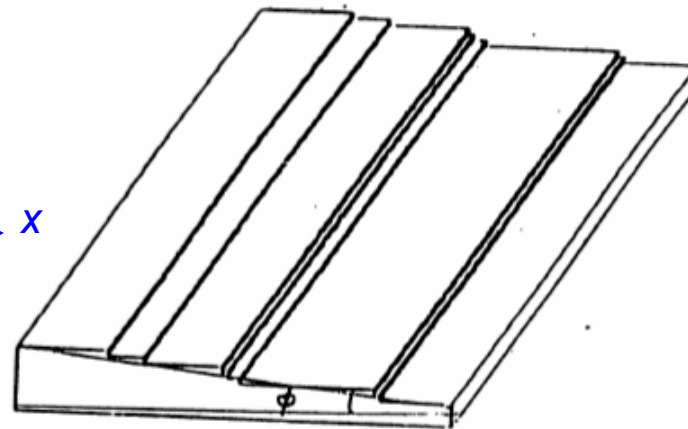
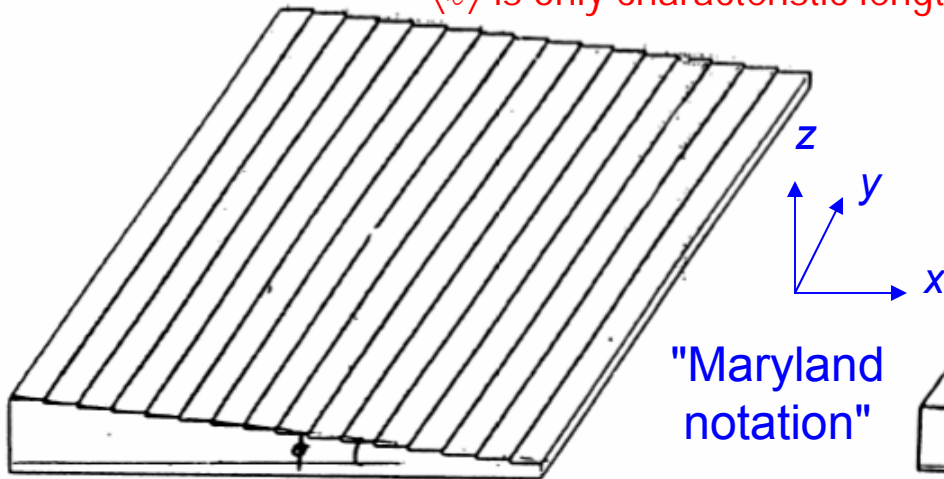
	<b>EC or AD (ADL)</b>	<b>TD (DL)</b>	<b>PD</b>
Limited by	At/de/tach at step	Terrace diffu'n	<b>Step-edge diffu'n</b>
Fluctuation healing time--width $y$	$y^2$	$y^3$	$y^4$
Size dep. of island diffu'n, $R \propto \sqrt{\text{area}}$	$R^{-1}$	$R^{-2}$	$R^{-3}$
$w^2(t)$	$t^{1/2}$	$t^{1/3}$	$t^{1/4}$
Island area decay	$t^1$	$t^{2/3}$	N/A
Evolution of atom/vacancy island	Shrink to round point ( <i>Grayson's Thm</i> )		Wormlike, pinch-off
Height decay of cone ["facet"]	$t^{1/4}$	$t^{1/4}$	N/A
Height decay of paraboloid [rough]	$t^{1/3}$	$t^{2/5}$	N/A

# Terrace-Width Distribution $P(s)$ for Special Cases

"Perfect Staircase"  $l = \langle l \rangle \equiv 1/\tan \phi$   $s \equiv l / \langle l \rangle$

$\langle l \rangle$  is only characteristic length in  $x$

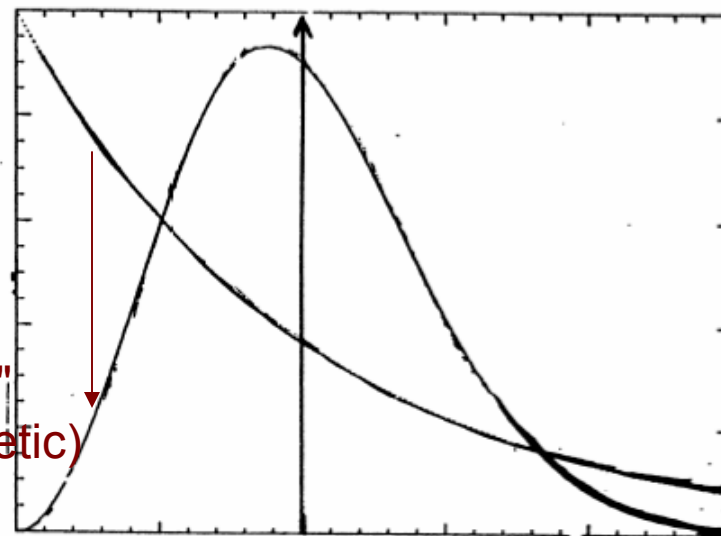
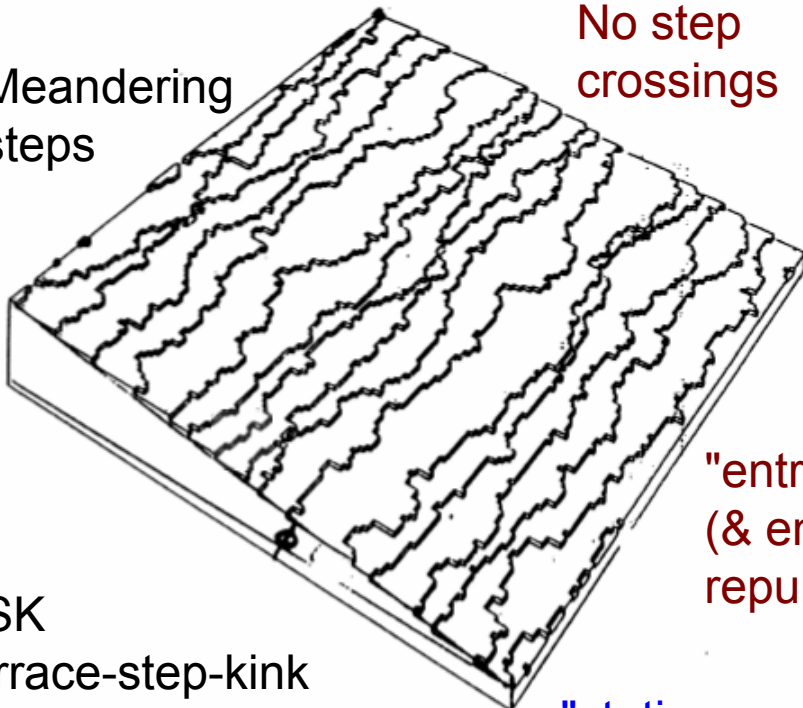
Straight steps, randomly placed  
Geometric distribution:  $P(s) = e^{-s}$



Meandering steps

No step crossings

Scaled TWD:  $P(s)$  indep. of  $\langle l \rangle$



"entropic" (& energetic) repulsion

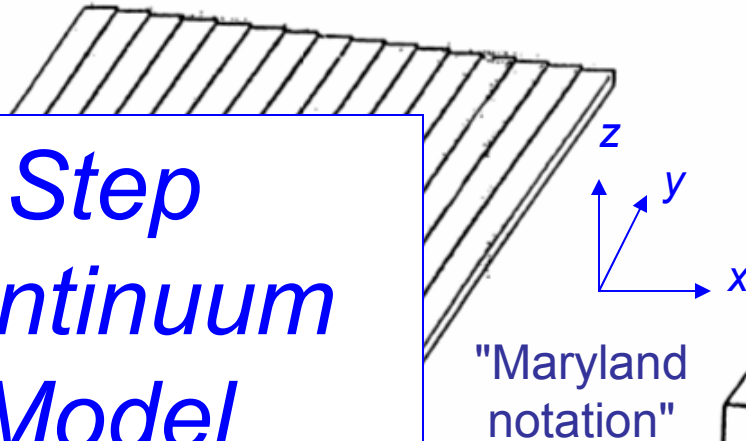
TSK  
terrace-step-kink  
kink energy  $\epsilon$

"static correlation"  $\langle x_n(y) - x_{n-1}(y) - \langle l \rangle \rangle_{y,n}$

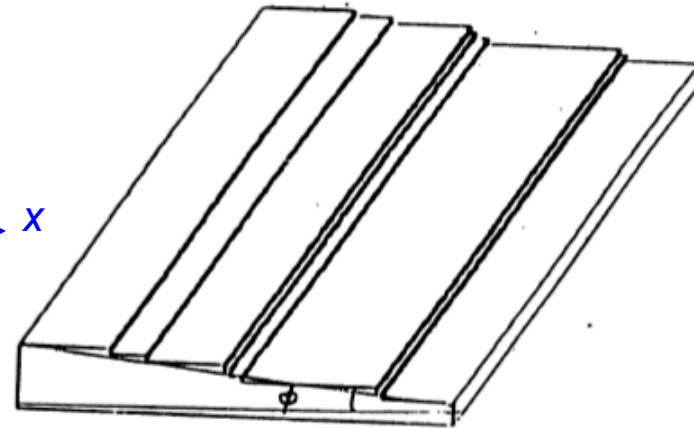
# Terrace-Width Distribution $P(s)$ for Special Cases

"Perfect Staircase"  $\ell = \langle \ell \rangle \equiv 1/\tan \phi$   $s \equiv \ell / \langle \ell \rangle$

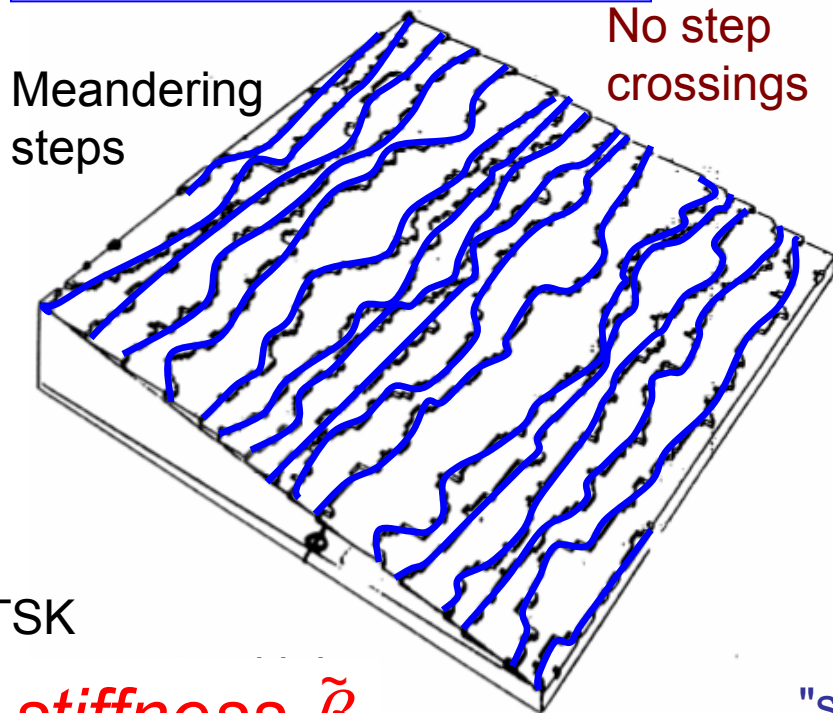
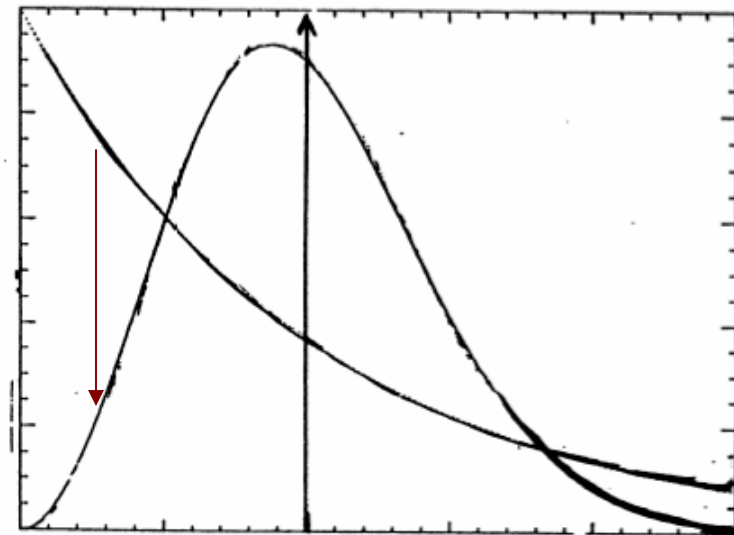
**Step  
Continuum  
Model**



Straight steps, randomly placed  
Geometric distribution:  $P(s) = e^{-s}$



Scaled TWD:  $P(s)$  indep. of  $\langle \ell \rangle$



TSK

**stiffness  $\tilde{\beta}$**

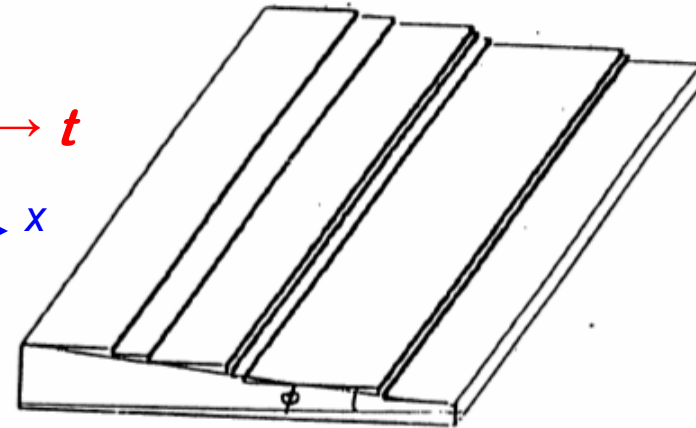
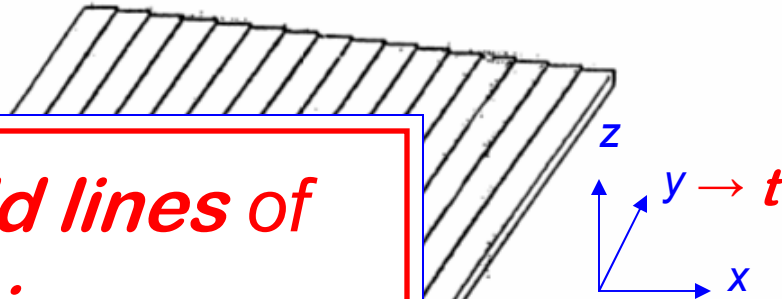
"static correlation"  $\langle x_n(y) - x_{n-1}(y) \rangle_{y,n}^2 / \langle \ell \rangle^2$

# Terrace-Width Distribution $P(s)$ for Special Cases

"Perfect Staircase"  $\ell = \langle \ell \rangle \equiv 1/\tan \phi$   $s \equiv \ell / \langle \ell \rangle$

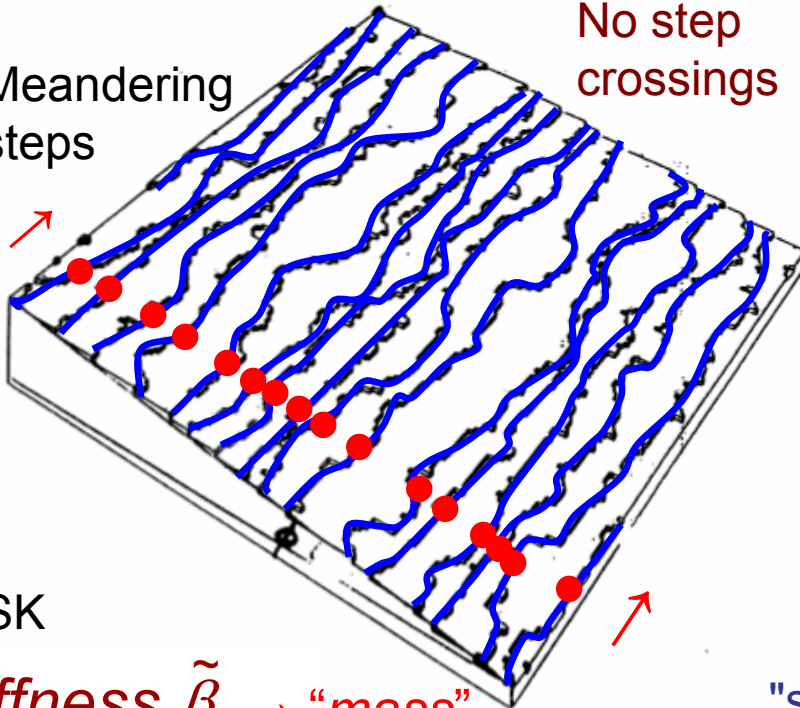
Straight steps, randomly placed  
Geometric distribution:  $P(s) = e^{-s}$

*World lines of fermions evolving in 1D*

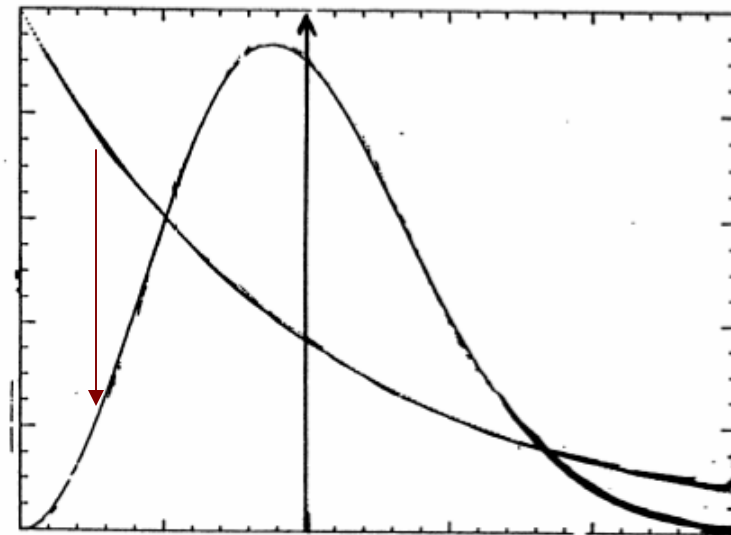


Meandering steps

No step crossings



Scaled TWD:  $P(s)$  indep. of  $\langle \ell \rangle$



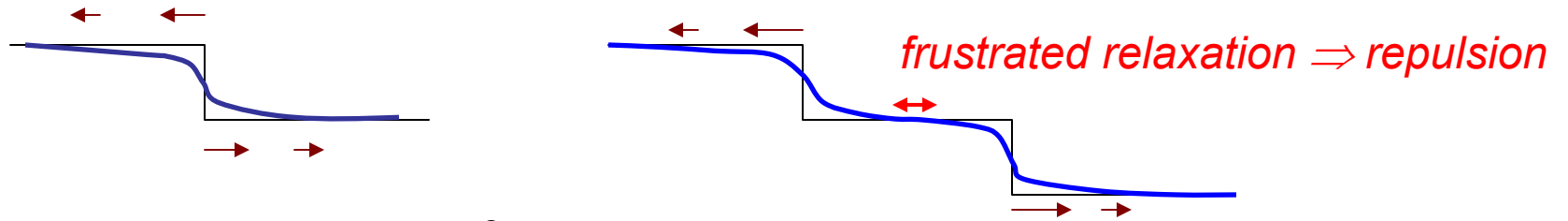
TSK

stiffness  $\tilde{\beta} \rightarrow$  "mass"

"static correlation"  $\langle x_n(y) - x_{n-1}(y) \rangle_{y,n}^2$

# Origin of elastic (dipolar) step repulsions

- Frustration of relaxation of terrace atoms between steps



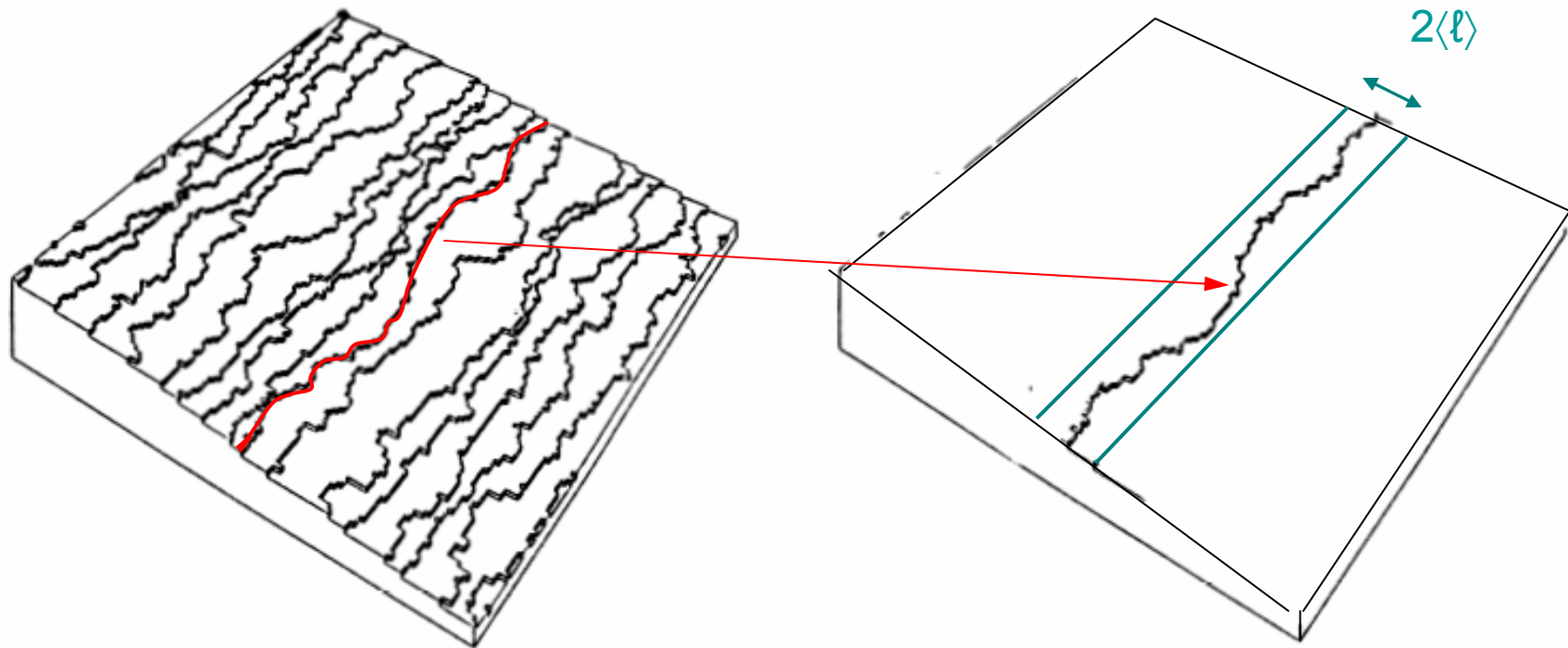
- Energy/length:  $U(\ell) = A/\ell^2$  (Same  $y$  for points on two interacting steps separated by  $\ell$  along  $x \Rightarrow$  "instantaneous")
- Metallic surface states  $\Rightarrow$  additional oscillatory term in  $U$

## Importance of step repulsions

- 1 of 3 parameters of continuum step model of vicinals
- Determine 2D pressure
- Determine morphology: e.g. bunch or pair
- Drives kinetic evolution in decay
- Elastic and entropic repulsions  $\propto \ell^{-2}$ 
  - $\Rightarrow$  universality of  $\langle \ell \rangle^{-1} P(\ell)$  vs.  $s \equiv \ell / \langle \ell \rangle$  so  $P(s; \langle \ell \rangle) \rightarrow P(s)$  *scaling*



# Essence of Gruber-Mullins (MF)



*Single active step meanders between 2 steps separated by twice mean spacing.*

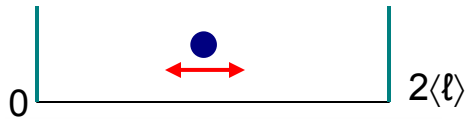
*Fermion evolves in 1D between 2 fixed infinite barriers  $2\langle \ell \rangle$  apart.*

# Particle in 1D Box vs. Exact

$$E = \int \beta \sqrt{1+x'^2} dy \sim \text{const.} + \int \frac{\tilde{\beta} x'^2}{2} \quad x'^2 \rightarrow \dot{x}^2$$

1-D Schrödinger eqn  $\frac{\hbar^2}{2m} \rightarrow \frac{(k_B T)^2}{2\tilde{\beta}}$

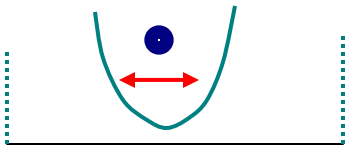
- Free fermions: repulsion just entropic



$$\psi_0 = \frac{1}{\langle \ell \rangle} \sin\left(\frac{\pi x}{2\langle \ell \rangle}\right)$$

$$E_0 = \frac{(k_B T)^2 \pi^2}{8\tilde{\beta} \langle \ell \rangle^2}$$

- $U(\ell) = A/\ell^2$ , large  $A$



$$\psi_0 \propto e^{-x^2/4w^2}$$

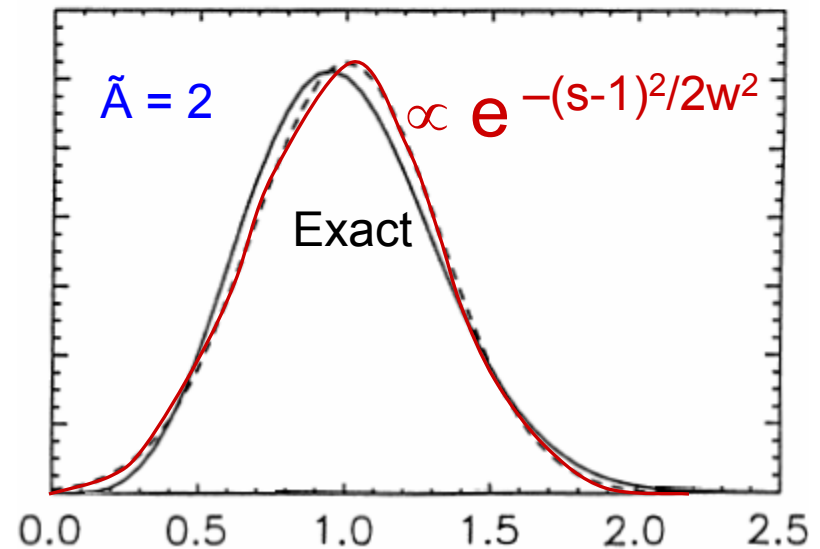
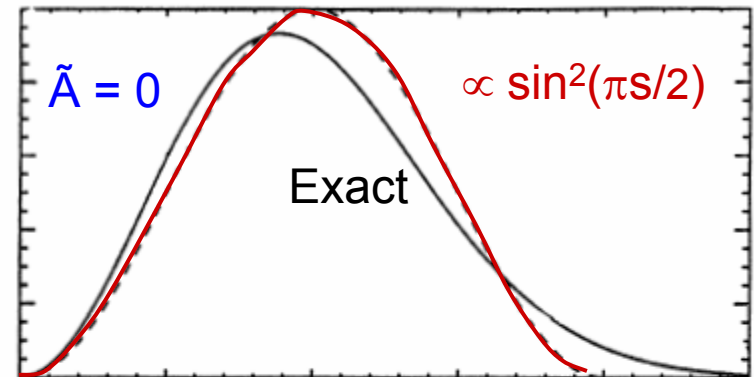
$$w^4 = \frac{(k_B T)^2}{8\tilde{\beta} U''(\langle \ell \rangle)}$$

$$w = \text{const.} \tilde{A}^{-1/4} \langle \ell \rangle$$

$A$  enters only as  $\tilde{A}$ :

$$\tilde{A} \equiv \frac{\tilde{\beta} A}{(k_B T)^2}$$

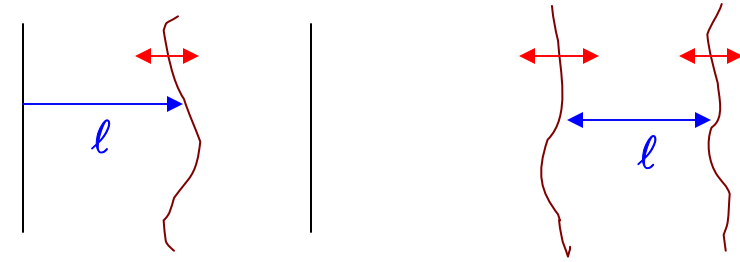
const. changes with approximation



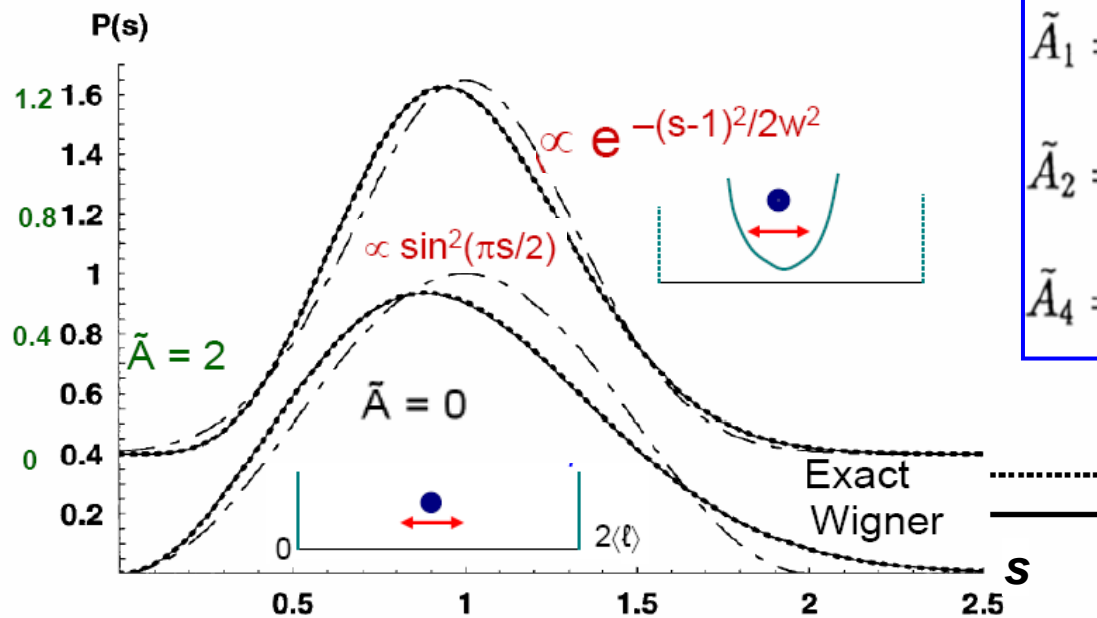
# Steps in 2D $\rightarrow$ fermion worldlines in 1D

- Step non-crossing  $\Rightarrow$  fermions or hard bosons
- Energy  $\propto$  path-length  $\times$  free energy/length  $\beta$ , expand  $\Rightarrow$  1D Schrödinger eqn.,  $m \rightarrow$  stiffness  $\beta$
- Analogous to polymers in 2D (deGennes, JCP '68)
- Only dependence on  $A$  via  $\tilde{A} \equiv \tilde{\beta} A / (k_B T)^2$
- Mean-field (Gruber-Mullins): 1 active step,  $0 \leq s \leq 2$ 
  - $\tilde{A} = 0$ : particle in box,  $P(s) = \Psi_0^2 \propto \sin^2(\pi s/2)$ ,  $\varepsilon_0 \propto T^2 / \tilde{\beta} \langle \ell \rangle^2 \rightarrow$  *entropic repulsion*
  - $\tilde{A} \geq 1\frac{1}{2}$ : parabolic well,  $P(s) \propto \exp[-(s-1)^2/2W_M^2]$ ,  $W_M \propto \tilde{A}^{-1/4} \langle \ell \rangle$
- $\tilde{A} \rightarrow \infty$ : "phonons", variance of  $P(s)$  is  $2W_M^2$ , not  $W_M^2$

$\ell / \langle \ell \rangle$



# Wigner Surmise (WS) for TWD (terrace-width distribution)



$\tilde{A}_1 = -1/4 :$	$P_1(s) = \frac{\pi}{2} s \exp\left(-\frac{\pi}{4} s^2\right)$
$\tilde{A}_2 = 0 :$	$P_2(s) = \frac{32}{\pi^2} s^2 \exp\left(-\frac{4}{\pi} s^2\right)$
$\tilde{A}_4 = 2 :$	$P_4(s) = \left(\frac{64}{9\pi}\right)^3 s^4 \exp\left(-\frac{64}{9\pi} s^2\right)$

$$U(\ell) = A/\ell^2$$

$$\tilde{A} \equiv \frac{\tilde{\beta} A}{(k_B T)^2}$$

Generalizing from the special cases:

**WS → GWS**

- The three special cases correspond to  $\varrho = 1, 2,$  and  $4$ .

- $\tilde{A}$  and  $\varrho$  are related by:  $\tilde{A} = (\varrho - 2)\varrho/4$ ;  $\varrho = 1 + \sqrt{1 + 4\tilde{A}}$

- Simplest interpolation expression:  $P_\varrho(s) = a_\varrho s^\varrho \exp(-b_\varrho s^2)$

- Two conditions on  $P_\varrho(s)$ : normalization & unit mean  
 $\Rightarrow$  values of  $a_\varrho, b_\varrho$  (in terms of  $\Gamma$  functions),

## Physical Ideas Behind Application of Random Matrices

cf. T. Guhr, A. Müller-Groeling, H. A. Weidenmüller, Phys. Reports 299 ('98) 189 [cond-mat/97073]

Standard stat mech: ensemble of identical physical systems with same Hamiltonian but different initial conditions; Wigner: ensemble of dynamical systems governed by different H's with some common symmetry property, seeking generic properties of ensemble due to symmetry.

Dyson, using group-theory results from Wigner, showed 3 generic ensembles:

1) time-reversal invariant with rotational symmetry:

$$H_{mn} = H_{nm} = H^*_{mn} \text{ (orthogonal)}$$

2) time reversal violated (e.g. electron in fixed  $\mathbf{B}$ )

$$H_{mn} = H^\dagger_{mn} \text{ (unitary)}$$

3) time-reversal invariant with 1/2-integer spin & broken rotational symmetry;

$$H^{(0)}_{mn} \mathbf{I} - i \sum_j H^{(j)}_{mn} \sigma_j \text{ (symplectic)}$$

$\sigma_j$ : Pauli spin matrices,  $j=1,2,3$ ;  $\mathbf{I}$ :  $2 \times 2$  unit matrix;  $H^{(0)}$  all real,  $H^{(0)}$  sym, others asym

Wigner: for convenience, Gaussian weights  $P(H) \propto \exp[-(\beta N/\lambda^2) \text{tr } H^2]$

Gaussian Orthogonal Ensemble:  $\beta=1$     Gaussian Unitary Ensemble:  $\beta=2$     Gaussian Symplectic Ensemble:  $\beta=4$

GRMT useless for average quantities, but fluctuations for large number of levels becomes independent of the form of the level spectrum and of the Gaussian weight factors, and attains

1957: Wigner surmise for  $\beta=1$ :  $p_1(s) = a_1 s^1 \exp(-b_1 s^2)$ , where  $p$  is the distribution function of nearest-neighbor energy levels, with  $s$  the real spacing over the [local] mean

1960-62: Dyson: circular ensembles: CircularOE, CUE, CSE; NN unitary matrices, eigenvalues  $\exp[i\theta_\mu]$ ,  $\mu=1,\dots,N$

N-particle Coulomb gas on a circle (i.e. in 1D), with [shifted] inverse temperature  $\beta$

Major ingredient: von Neumann–Wigner level repulsion: 2 states connected by a non-vanishing matrix element repel each other—degree of repulsion is determined by symmetry of Hamiltonian—"A simple counting argument leads directly to the exponent  $\beta = 1, 2, 4$  in the typical factor  $|E_\mu - E_\nu|^\beta$  in the Vandermonde determinant."

Sutherland Hamiltonian for N particles (spinless fermions) on a circle:

$$-\frac{\hbar^2}{2m} \left[ \sum_{i=1}^N \frac{\partial^2}{\partial \lambda_i^2} - \frac{\beta}{2} (\beta - 2) \left( \frac{\pi}{N} \right)^2 \sum_{i < j} \frac{1}{\sin^2 \left\{ \pi (\lambda_i - \lambda_j) / N \right\}} \right]$$

Application to specific step system: M. Lässig, "Vicinal Surfaces and the Calogero–Sutherland Model," Phys. Rev. Lett. 77 ('96) 526, for Song & Mochrie's observation of tricritical behavior on vicinal Si (113)

#### OTHER APPLICATIONS of RMT

Localization theory--ensemble of impurity potentials

Clarifies various regimes in mesoscopic physics: clean, ballistic, ergodic, diffusive, critical, localized

Transport in quasi-1D wires

Fluctuations of persistent currents (esp. for non-interacting electrons)

Level spectra of small metallic particles & their response to EM field

Atomic nuclei, atoms and molecules

Classical chaos (e.g. Bunimovich stadium, Sinai billiard)

QCD, supersymmetry 2D quantum gravity

## Examples of NN spacing distributions with GOE ( $\rho = 1$ )

Fig. 1. Nearest-neighbor spacing distribution for the “Nuclear Data Ensemble” comprising 1726 spacings (histogram) versus  $s = S/D$  with  $D$  the mean level spacing and  $S$  the actual spacing. For comparison, the RMT prediction labelled GOE and the result for a Poisson distribution are also shown as solid lines. Taken from Ref. [1].

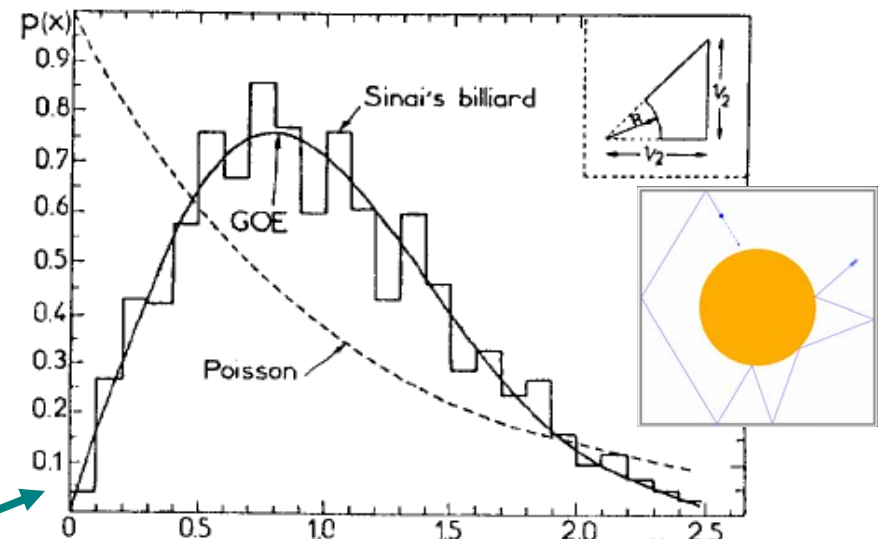
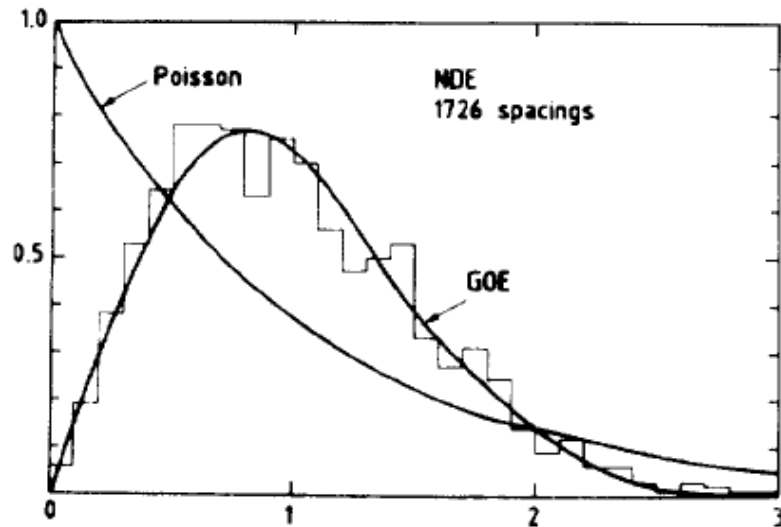


Fig. 4. The nearest-neighbor spacing distribution versus  $s$  (defined as in Fig. 1) for the Sinai's billiard. The histogram comprises about 1000 consecutive eigenvalues. Taken from Ref. [5].

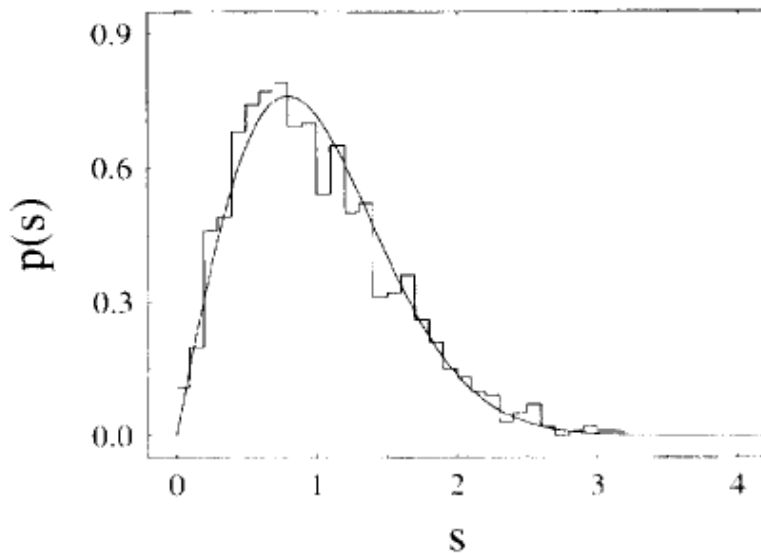
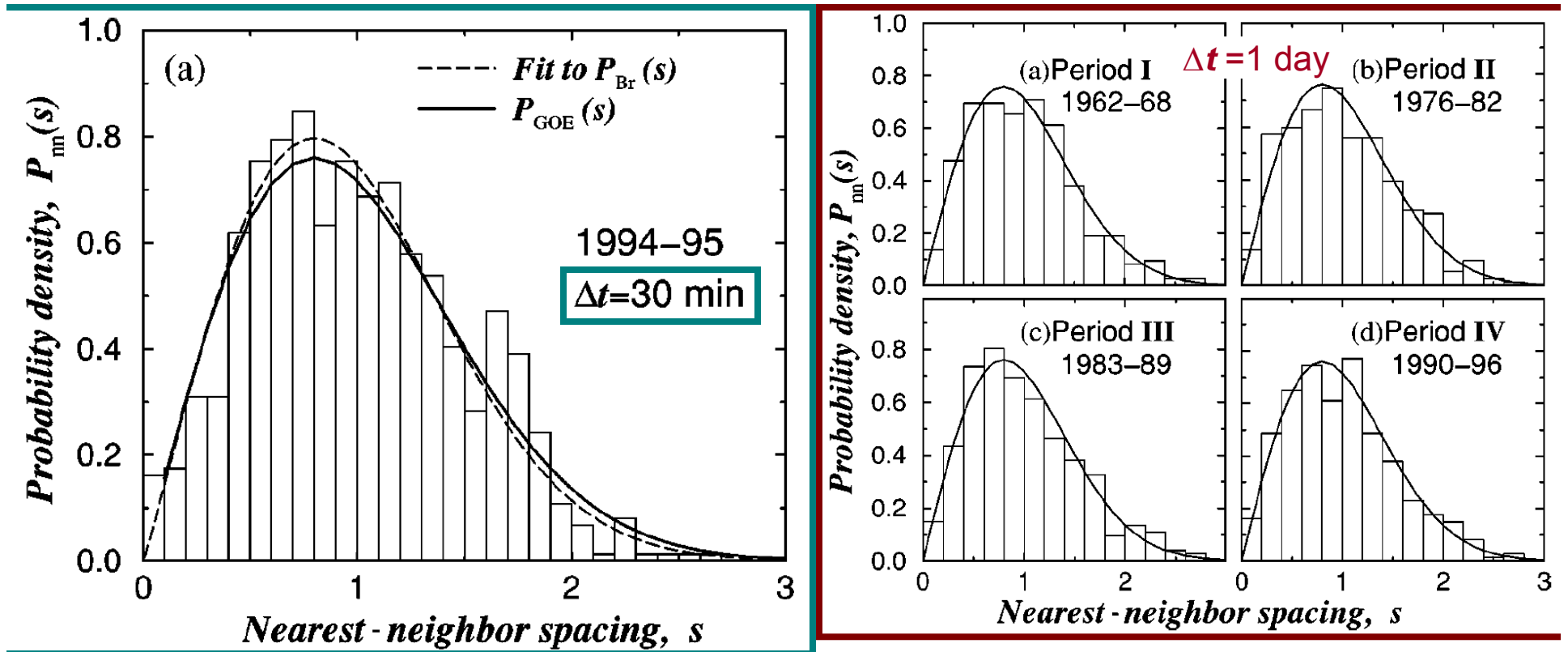


Fig. 6. Nearest-neighbor spacing distribution for elastomechanical modes in an irregularly shaped quartz crystal.

*T. Guhr et al. / Physics Reports 299 (1998) 189*

# RMT & financial data: Cross-correlations of price fluctuations of different stocks, using $P_1(s)$

V. Plerou, ..., T. Guhr, and H. E. Stanley, PRE 66 ('02) 066126



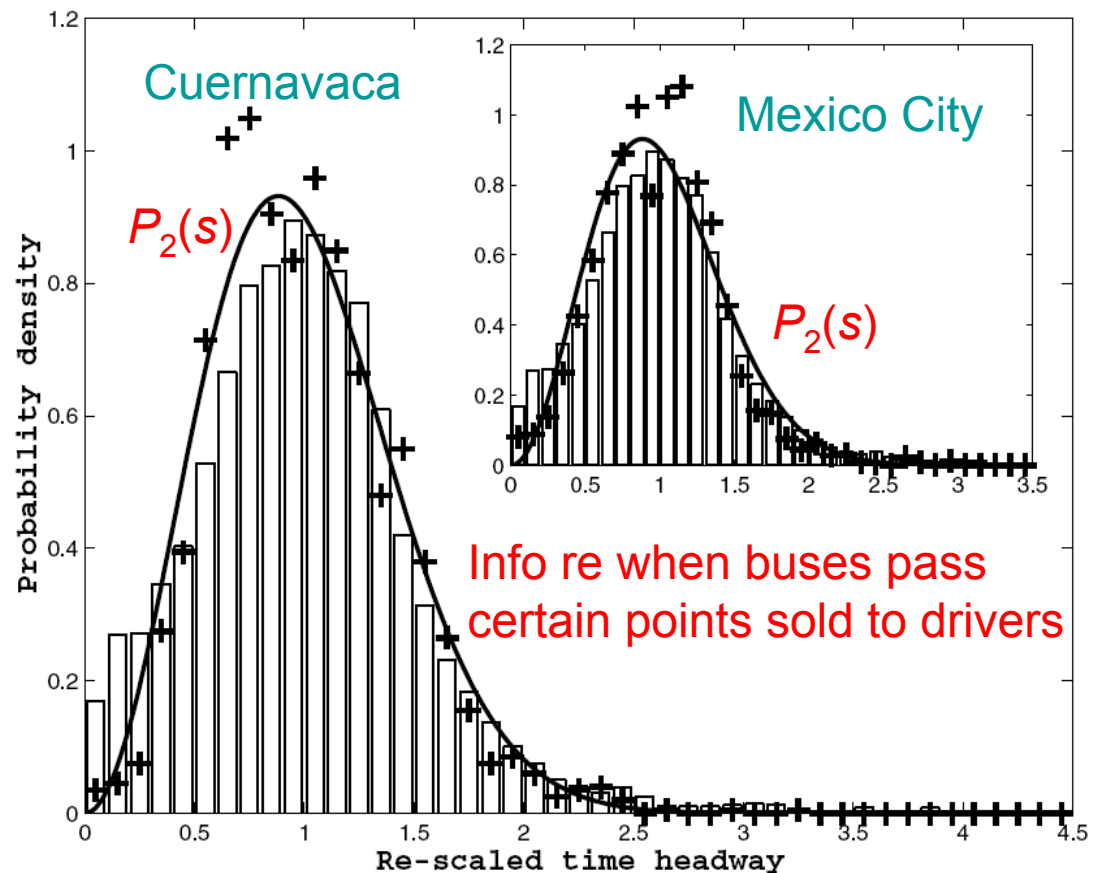
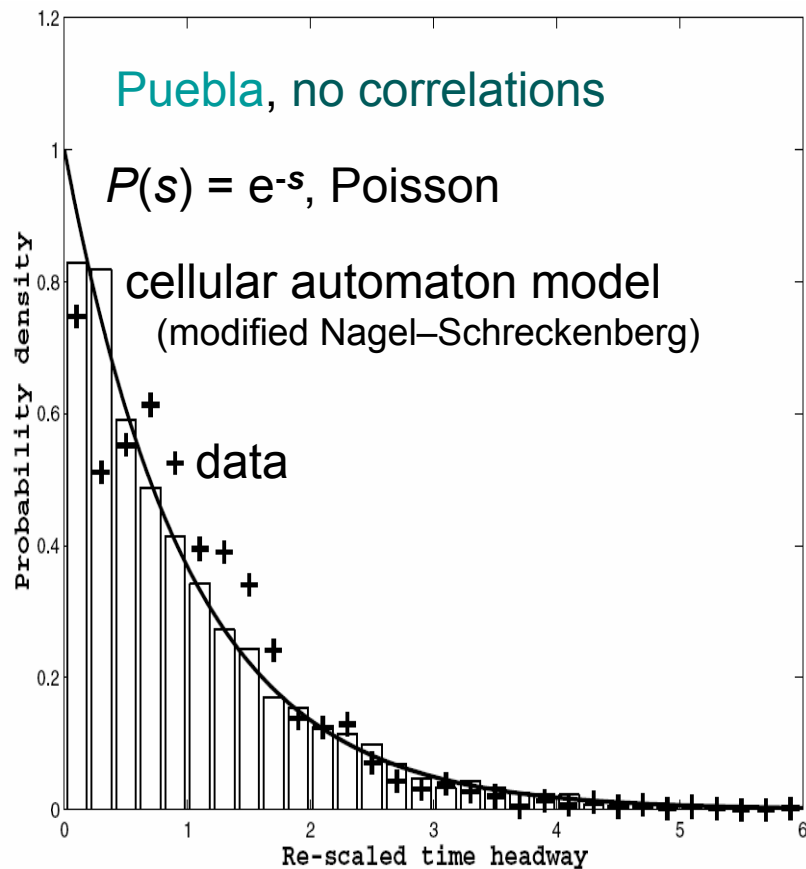


# Headway statistics of buses in Mexican cities, using $P_2(s)$

M. Krbálek & P. Šeba, J. Phys. A **36** ('03) L7; **33** ('00) L229

Headway: time interval  $\Delta t$  between bus and next bus passing the same point

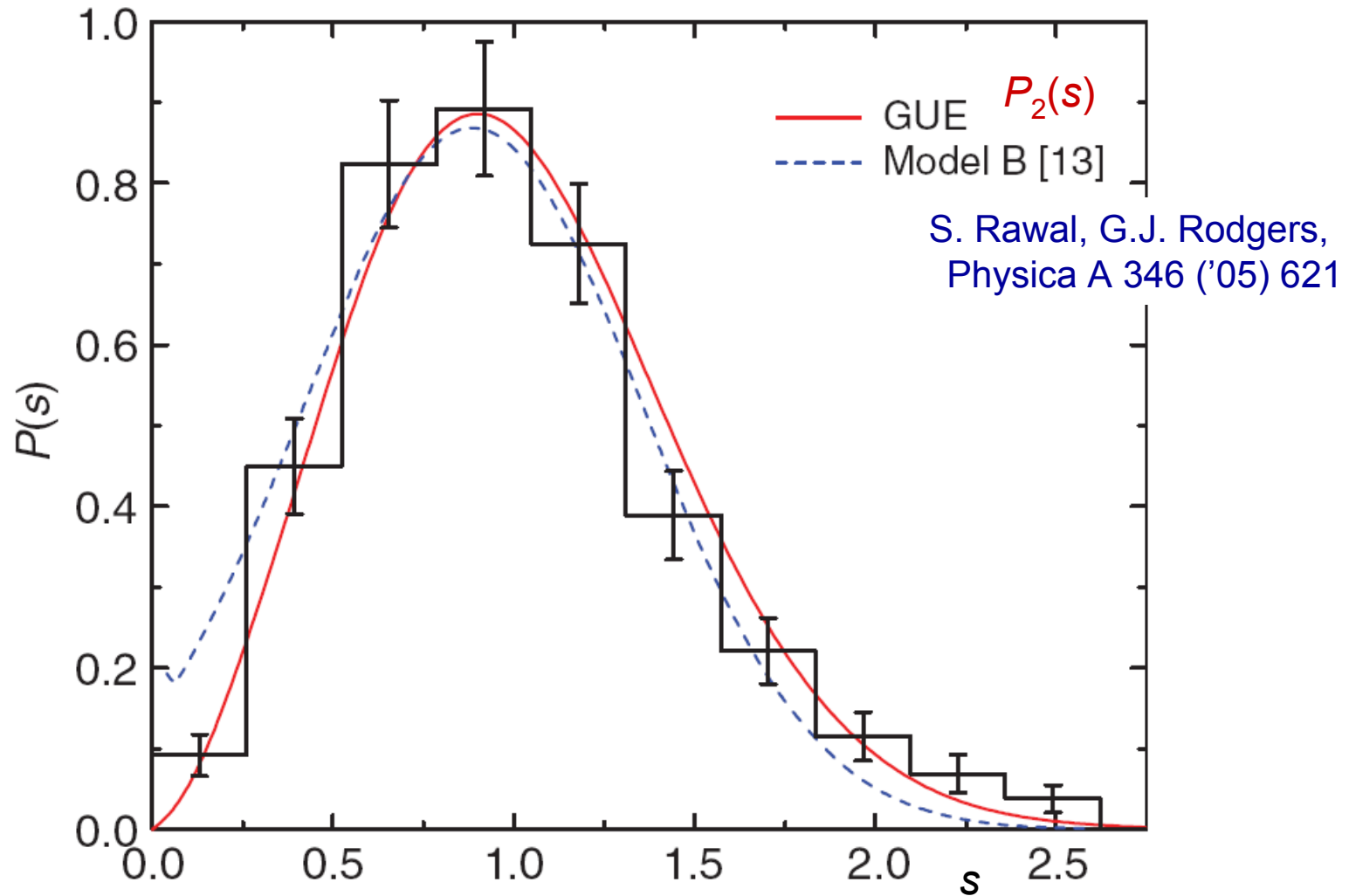
No timetable for buses in Mexico; independent drivers seek to optimize # riders/fares



WS  $P_2(s)$  better than CA because in CA, correlations only between NNs

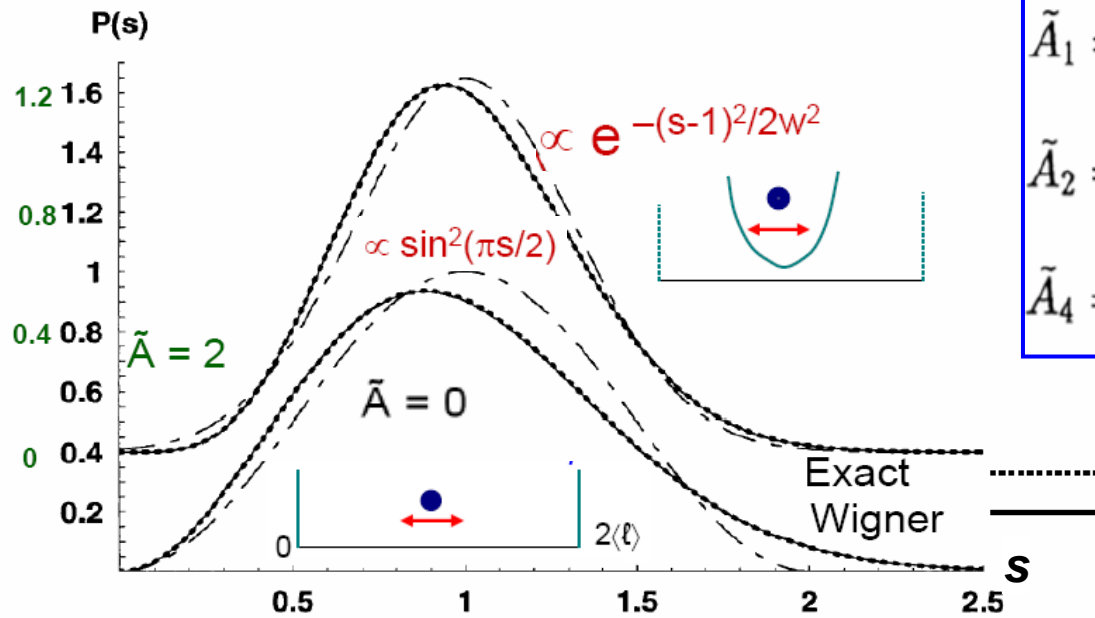
# Modelling gap-size distribution of parked cars using RMT

*A.Y. Abul-Magd*, Physica A 368 ('06) 536



Unlike random sequential process, Coulomb gas extends repulsion beyond geometric size.

# Wigner Surmise (WS) for TWD (terrace-width distribution)



$$\begin{aligned} \tilde{A}_1 = -1/4 : & \quad P_1(s) = \frac{\pi}{2} s \exp\left(-\frac{\pi}{4} s^2\right) \\ \tilde{A}_2 = 0 : & \quad P_2(s) = \frac{32}{\pi^2} s^2 \exp\left(-\frac{4}{\pi} s^2\right) \\ \tilde{A}_4 = 2 : & \quad P_4(s) = \left(\frac{64}{9\pi}\right)^3 s^4 \exp\left(-\frac{64}{9\pi} s^2\right) \end{aligned}$$

$$U(\ell) = A/\ell^2$$

$$\tilde{A} \equiv \frac{\tilde{\beta} A}{(k_B T)^2}$$

Generalizing from the special cases:

**WS → GWS**

- The three special cases correspond to  $\varrho = 1, 2,$  and  $4$ .

- $\tilde{A}$  and  $\varrho$  are related by:  $\tilde{A} = (\varrho - 2)\varrho/4$ ;  $\varrho = 1 + \sqrt{1 + 4\tilde{A}}$

- Simplest interpolation expression:  $P_\varrho(s) = a_\varrho s^\varrho \exp(-b_\varrho s^2)$

- Two conditions on  $P_\varrho(s)$ : normalization & unit mean  
 $\Rightarrow$  values of  $a_\varrho, b_\varrho$  (in terms of  $\Gamma$  functions),

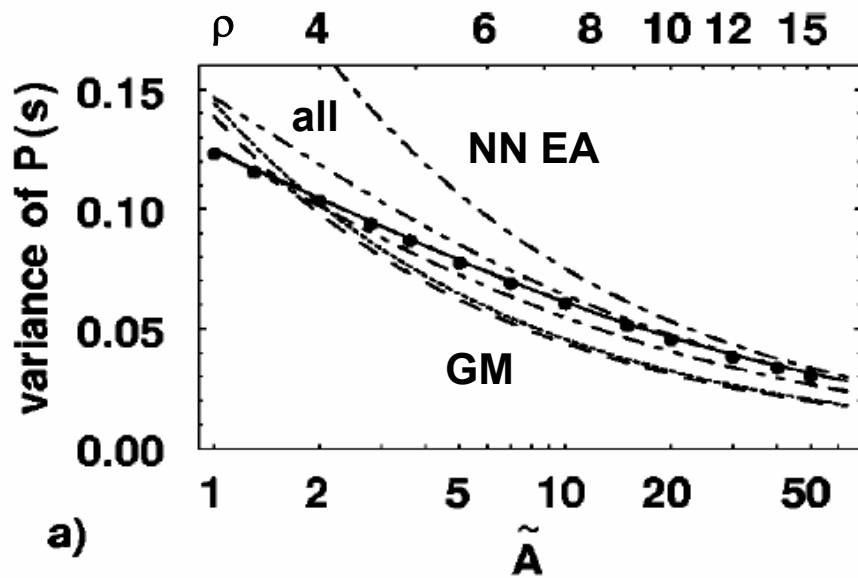
Comparison of variance of  $P(s)$  vs.  $\bar{A}$  computed with Monte Carlo:  
**GWS** does **better**, quantitatively & conceptually, than any other approximation

Hailu Gebremariam et al., Phys. Rev. B 69 ('04)125404

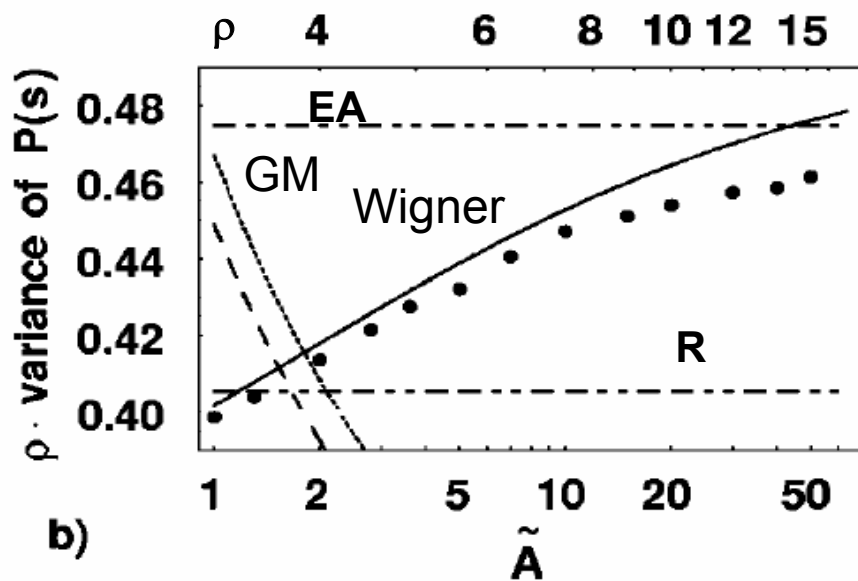
## Experiments measuring variances of TWDs

Vicinal	$T$ (K)	$\sigma^2$	$\varrho$	$\bar{A}$	$A_W/A_G$	$A_W$ (eV Å)	Experimenters
Pt(1 1 0)-(1 × 2)	298		2.2	0.13	–	$\bar{\beta} = ?$	Swamy, Bertel [36]
Cu(19, 17, 17)	353	0.122	4.1	2.2	0.77	0.005	Geisen [5,54]
Si(1 1 1)	1173	0.11	3.8	1.7	0.96	0.4	Bermond, Métois [55]
Cu(1, 1, 13)	348	0.091	4.8	3.0	1.27	0.007	Giesen [5,56]
Cu(11,7,7)	306	0.085	5.1	4	1.37	0.004	Geisen [5,54]
Cu(1 1 1)	313	0.084	5.0	3.6	1.39	0.004	Geisen [5,54]
Cu(1 1 1)	301	0.073	6.0	6.0	1.58	0.006	Geisen [5,54]
Ag(1 0 0)	300	0.073	6.4	6.9	1.58	$\bar{\beta} = ?$	P. Wang...Williams
Cu(1, 1, 19)	320	0.070	6.7	7.9	1.64	0.012	Geisen [5,56]
Si(1 1 1)-(7 × 7)	1100	0.068	6.4	7.0	1.67	0.7	Williams [57]
Si(1 1 1)-(1 × 1)Br	853	0.068	6.4	7.0	1.67	0.1	X.-S. Wang, Williams [58]
Si(1 1 1)-Ga	823	0.068	6.6	7.6	1.67	1.8	Fujita...Ichikawa [59]
Si(1 1 1)-Al $\sqrt{3}$	1040	0.058	7.6	10.5	1.85	2.2	Schwennicke...Williams [60]
Cu(1, 1, 11)	300	0.053	8.7	15	1.95	0.02	Barbier et al. [21]
Cu(1, 1, 13)	285	0.044	10	20	2.12	0.02	Geisen [5,56]
Pt(1 1 1)	900	0.020	24	135	2.59	6	Hahn...Kern [61]
Si(1 1 3) rotated	1200	0.004	124	$3.8 \times 10^3$	2.92	$(27 \pm 5) \times 10^2$	van Dijken, Zandvliet, Poel-sema [9]

# Monte Carlo data confronts approximations



Dots: MC data  
 Line: Wigner  
 Dashes: Gruber-Mullins (mean field)  
 Long-short [-short]: Grenoble  
 (no entropic int'n, EA)  
 Long-long-short-short: Saclay  
 (continuum roughening, R)



Lower plot highlights differences:  
 remove  $\rho^{-1}$  asymptotic decay  
 Wigner is best, quantitatively  
 and conceptually

Hailu Gebremariam et al.,  
 Phys. Rev. B 69 ('04)125404

# Why Look for Fokker-Planck Equation for TWD?

- Justification/derivation of generalized continuum Wigner surmise (beyond  $H_{\text{eff}}$  of Richards et al.) since no symmetry basis for  $\varrho \neq 1, 2, \text{ or } 4$
- Dynamics: how non-equilibrium TWD (e.g. step bunch) evolves toward equilibrium
- Quench or upquench: sudden change of  $T$  does not change  $A$  much but changes  $\tilde{A}$  (and so  $\varrho$ ) considerably
- Connections with other problems, e.g. capture zone distribution (& Heston model of econophysics)

## Derivation of Fokker-Planck for TWD

- Start with Dyson Coulomb gas/Brownian motion model: repulsions  $\propto 1/(\text{separation})$  & parabolic well

$$\dot{x}_i = -\gamma x_i + \sum_{i \neq j} \frac{\hat{q}}{x_i - x_j} + \sqrt{\Gamma} \eta$$

- Assume steps beyond nearest neighbors are at integer times mean spacing (cf. Gruber-Mullins)

$$\dot{s} = -\kappa s + \rho/s + \text{noise}$$

*Noise sets time scale.*

$$\tilde{t} \equiv t \Gamma / \langle \ell \rangle^2 \quad \boxed{1/\tau}$$

- Demand self-consistency for width of parabolic confining well:  $\kappa \rightarrow 2b_\rho$

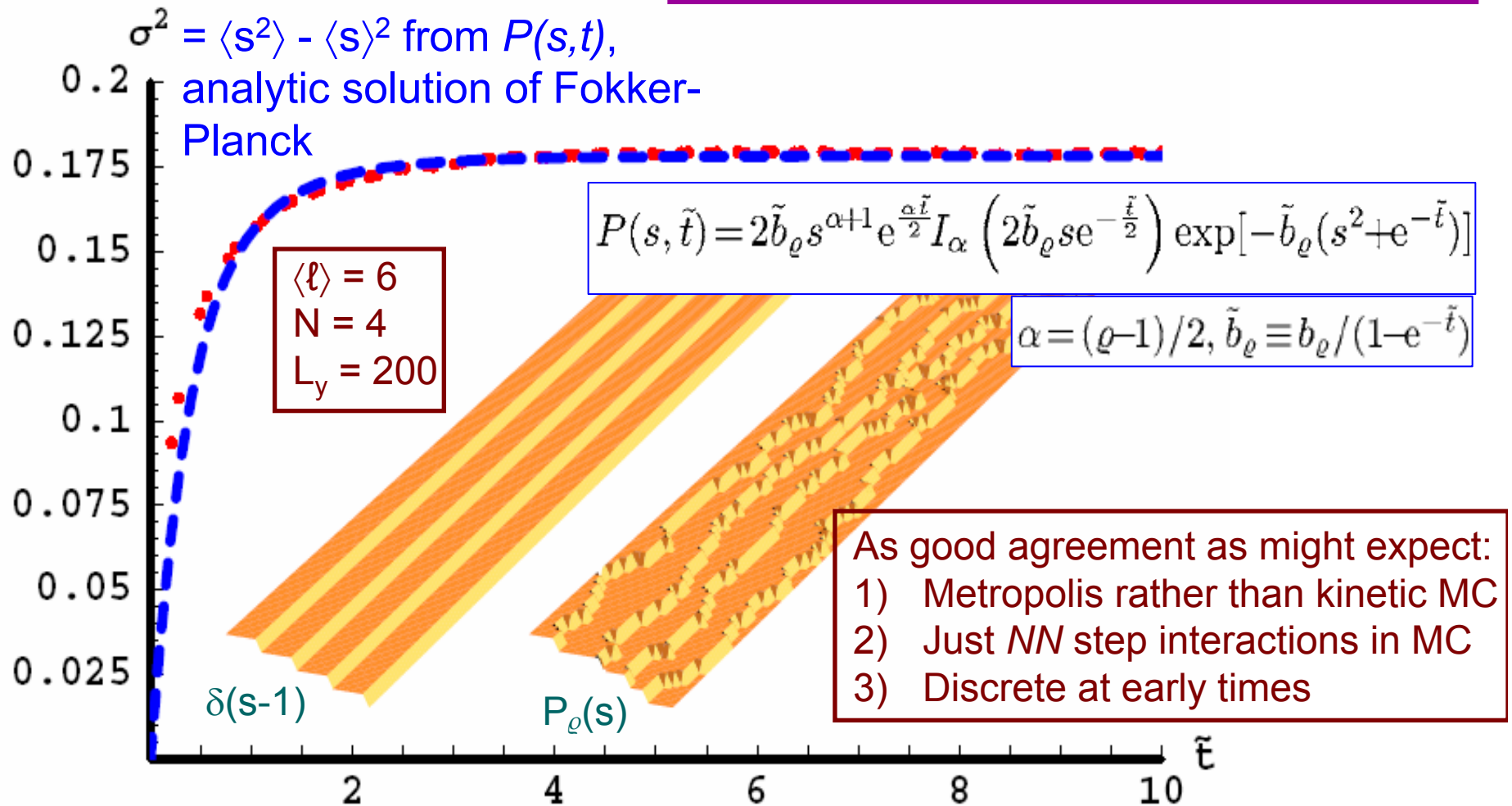
$$\frac{\partial P(s, \tilde{t})}{\partial \tilde{t}} = \frac{\partial}{\partial s} \left[ \left( 2b_\rho s - \frac{\rho}{s} \right) P(s, \tilde{t}) \right] + \frac{\partial^2}{\partial s^2} [P(s, \tilde{t})] \rightarrow P_\rho(s)$$

# Check of Fokker-Planck with Monte Carlo

cleaved  $\rightarrow$  equilibrium

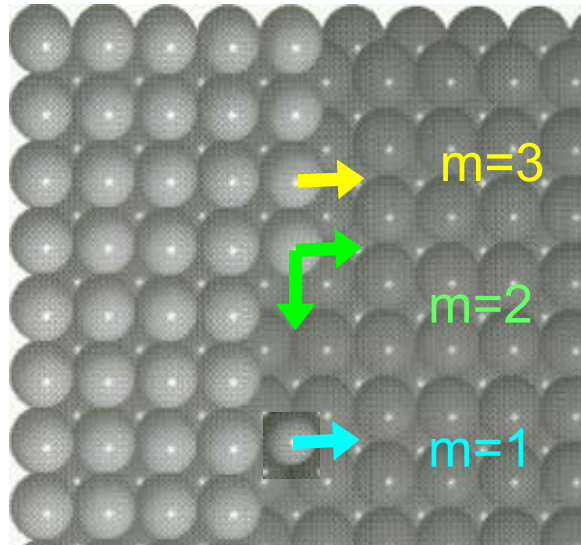
TSK model (no adatom carriers)

Best match for 1.4 FP time units =  $10^3$  MCS





# Improved tests: Kinetic MC & SOS model

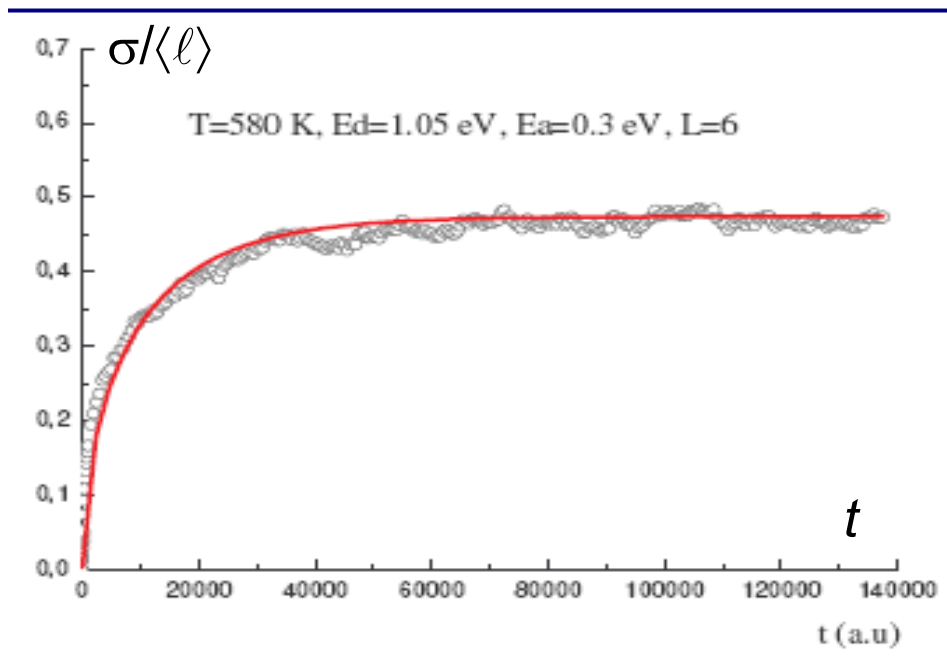


$$E_{\text{barrier}} = E_d + m E_a \quad \text{breaking } m \text{ bonds}$$

$$E_d = 0.9 - 1.1 \text{ eV}; E_a = 0.3 - 0.4 \text{ eV}$$

$$T = 520 - 580 \text{ K}$$

$$\langle \ell \rangle = 4-15, 5 \text{ steps}, 10000 \times L_x$$



Fit:

$$\sigma(t) = \sigma_{\text{sat}} \sqrt{1 - \exp(-t / \tau)}$$

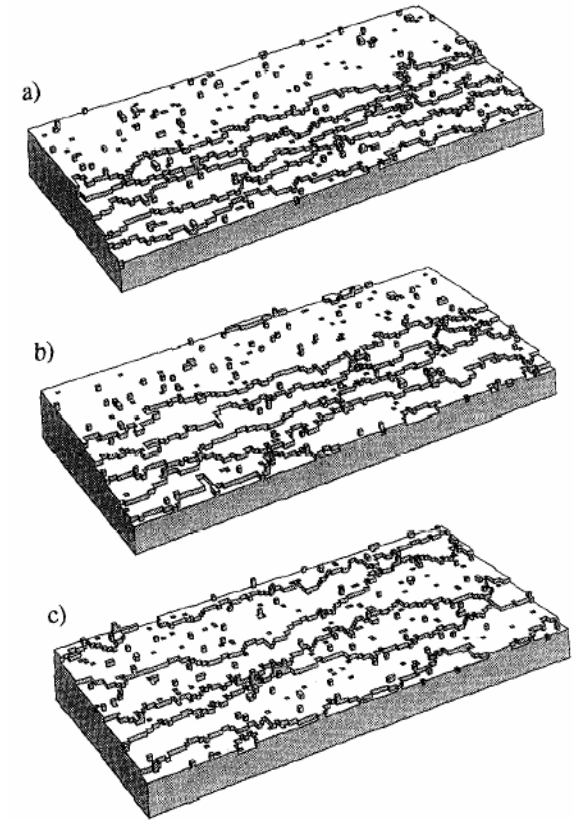
Expect  $\tau \propto \exp(E_{\text{barrier}} / k_B T)$

$$\text{Find } E_{\text{barrier}} \approx 1 E_d + 3 E_a$$

## 2 other situations of interest

**Step Bunch:** initially a delta function

$$P(s, \tilde{t}) \rightarrow \frac{a_\varrho s^\varrho}{(1 - e^{-\tilde{t}})^{(\varrho+1)/2}} \exp[-s^2 b_\varrho / (1 - e^{-\tilde{t}})]$$



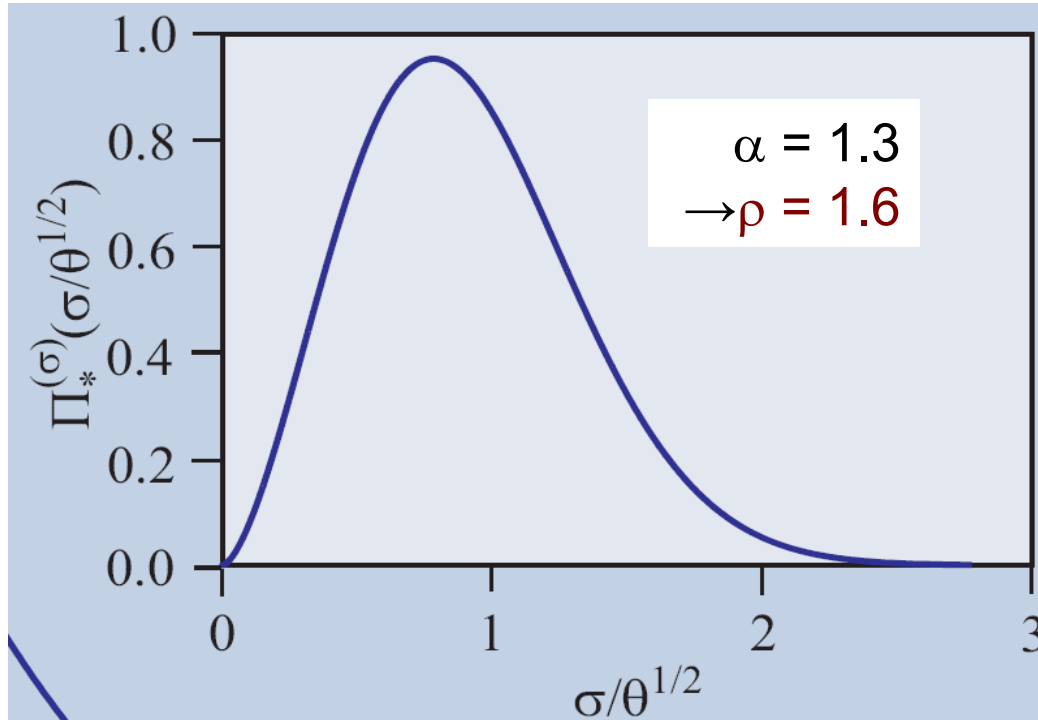
**Quench or upquench:** change from initial  $\rho_0$  to  $\rho$ , e.g. change in temperature

$$P(s, \tilde{t}) = a_\varrho s^\varrho e^{-\tilde{b}_\varrho s^2} \frac{(1 - e^{-\tilde{t}})^{\frac{\varrho_0 - \varrho}{2}}}{(1 - e^{-\tilde{t}}(1 - b_\varrho/b_{\varrho_0}))^{\frac{\varrho_0 + 1}{2}}} {}_1F_1 \left( \frac{\varrho_0 + 1}{2}, \frac{\varrho + 1}{2}, \frac{\tilde{b}_\varrho s^2}{1 + (b_{\varrho_0}/b_\varrho)(e^{\tilde{t}} - 1)} \right)$$

Final

# Analogies in Econophysics

A Dragulescu & V M Yakovenko: “Probability distribution of returns in the Heston model with stochastic volatility”, Quant. Finance 2, 443 ('02)



Consider a stock whose price  $S_t$  obeys the stochastic differential equation of Brownian motion.

Volatility  $\rightarrow$  stochastic variance obeys a mean-reverting stochastic DE.

The stationary PDF of volatility  $\sigma$  is

$$\Pi_*^{(\sigma)}(\sigma) = \frac{2\alpha^\alpha}{\Gamma(\alpha)} \frac{\sigma^{2\alpha-1}}{\theta^\alpha} e^{-\alpha\sigma^2/\theta}$$

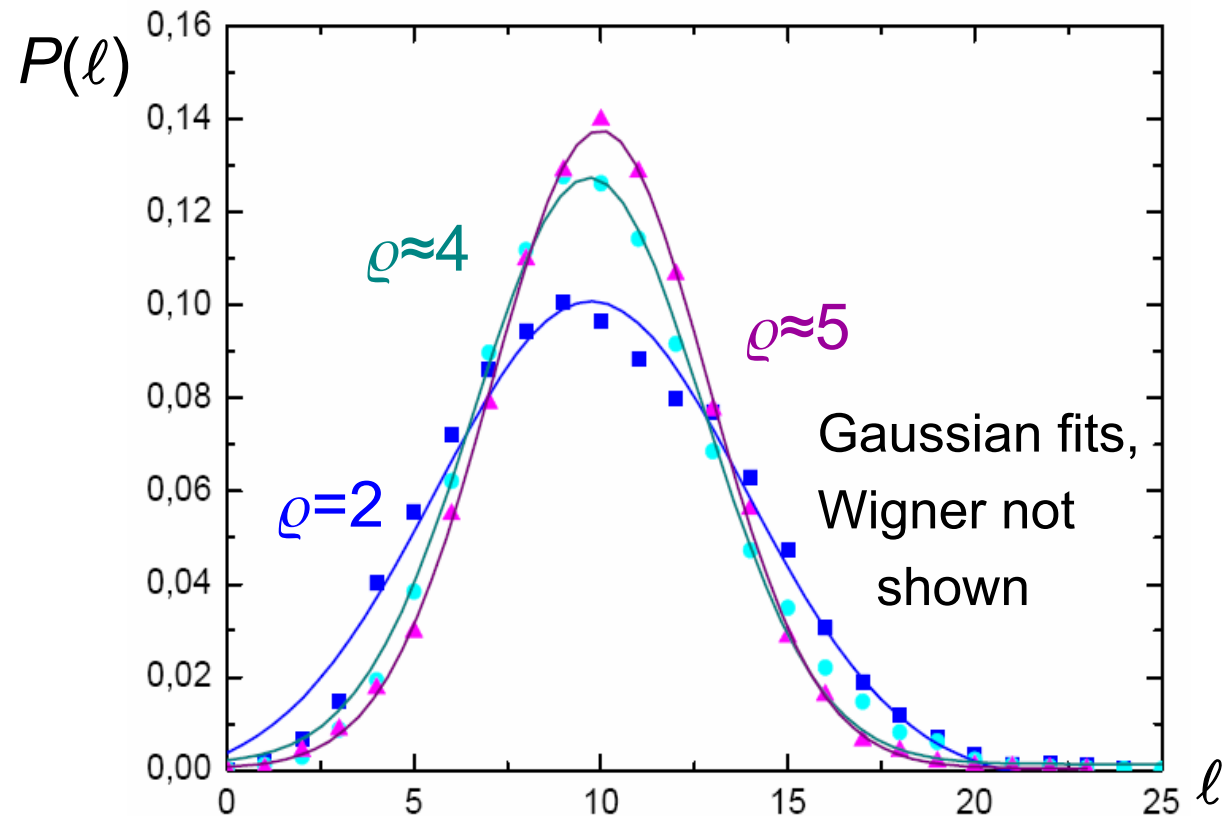
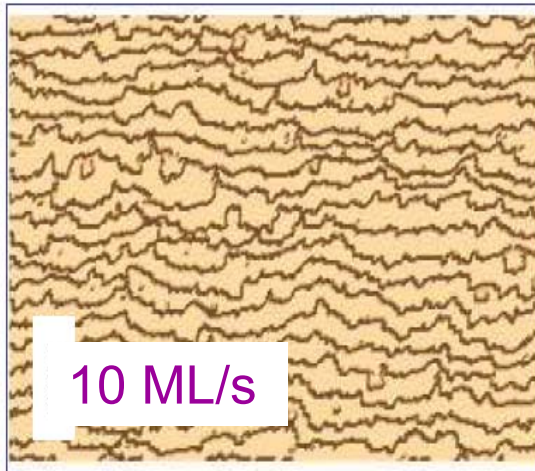
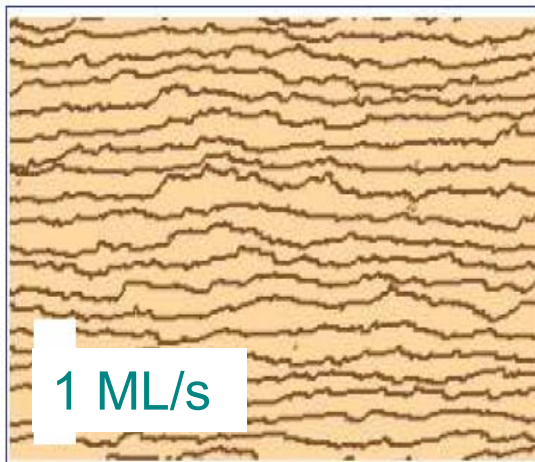
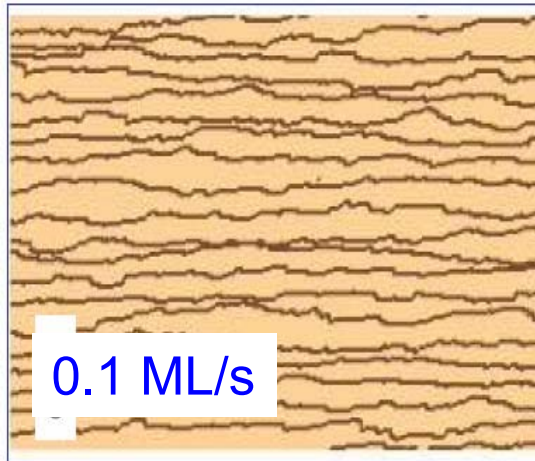
$$\rightarrow s \sqrt{\frac{b_\rho}{\frac{\rho}{2}-1}}$$

$$2\alpha-1 \rightarrow \varrho$$

$$\theta \rightarrow \langle \ell^2 \rangle$$

# Does growth flux (step motion) alter TWD?

Test: *no energetic interaction* ( $\varrho=2$ ), 150 ML

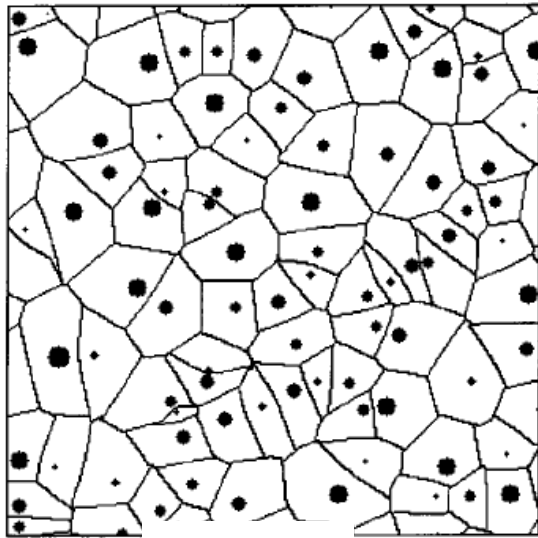


- Narrower  $\Rightarrow$  *effective* repulsion that rises with flux, higher  $\varrho$ , more Gaussian-like
- Decreased apparent stiffness  $\tilde{\beta}$

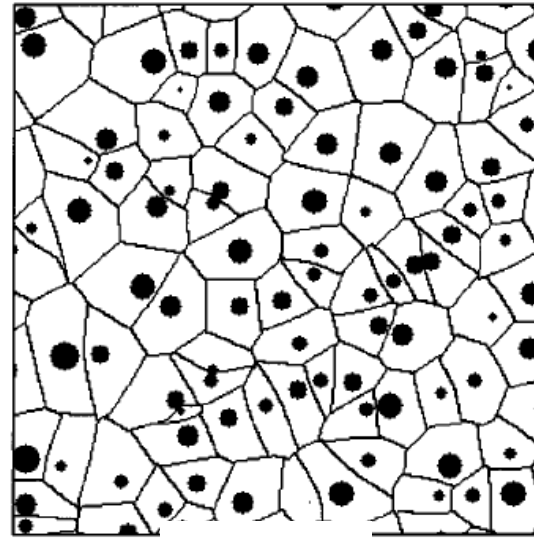
20 steps, 1000x200,  $T=723\text{K}$ ,  $E_d=1.0\text{eV}$ ,  $E_a=0.3\text{eV}$

# Evolution of Island Structures: Simulations of $i=1$

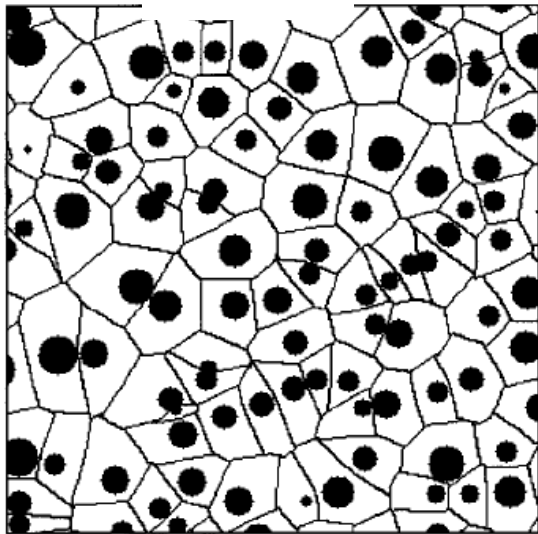
## *Circular Islands* Mulheran & Blackman, PRB 53 (96) 10261



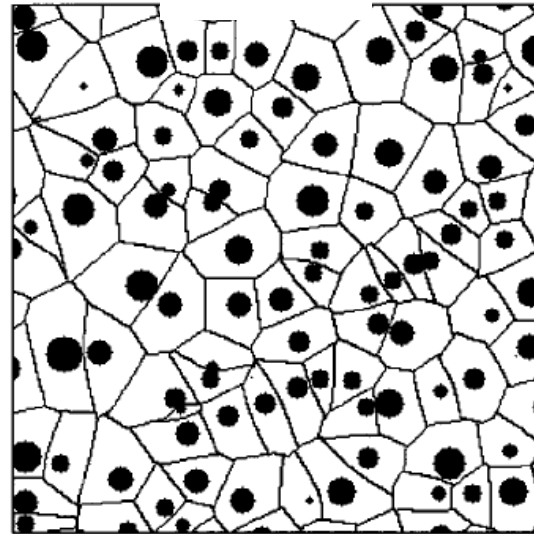
0.05 ML



0.10 ML

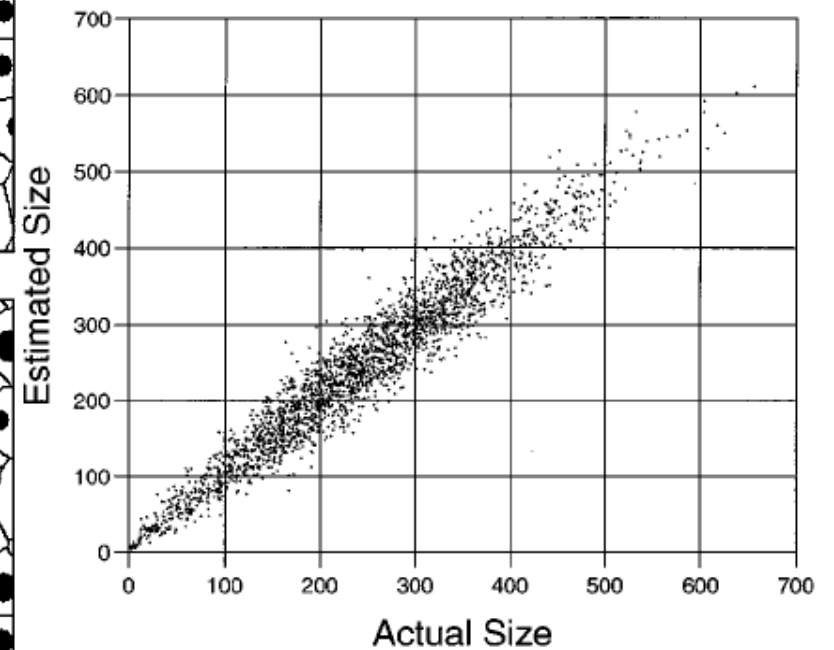


0.15 ML



0.20 ML

Estimated size of island based on Voronoi polygon  $CZ \propto$  actual size of island



# Island Size Scaling, stable config $i$

Amar & Family, PRL 74 (95) 2066

## Dynamic scaling assumption

$$N_s(\theta) = \theta S^{-2} f_i(s/S)$$

Bartelt  
& Evans

$$f_i(u) = C_i u^i e^{-ia_i u^{1/a_i}}$$

$$\frac{\Gamma[(i+2)a_i]}{\Gamma[(i+1)a_i]} = (ia_i)^{a_i}, \quad C_i = \frac{(ia_i)^{(i+1)a_i}}{a_i \Gamma[(i+1)a_i]}$$

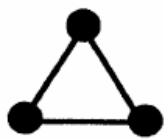
**$i+1$  atoms: smallest stable island  
critical nucleus**



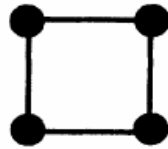
$i=0$



$i=1$



$i=2$

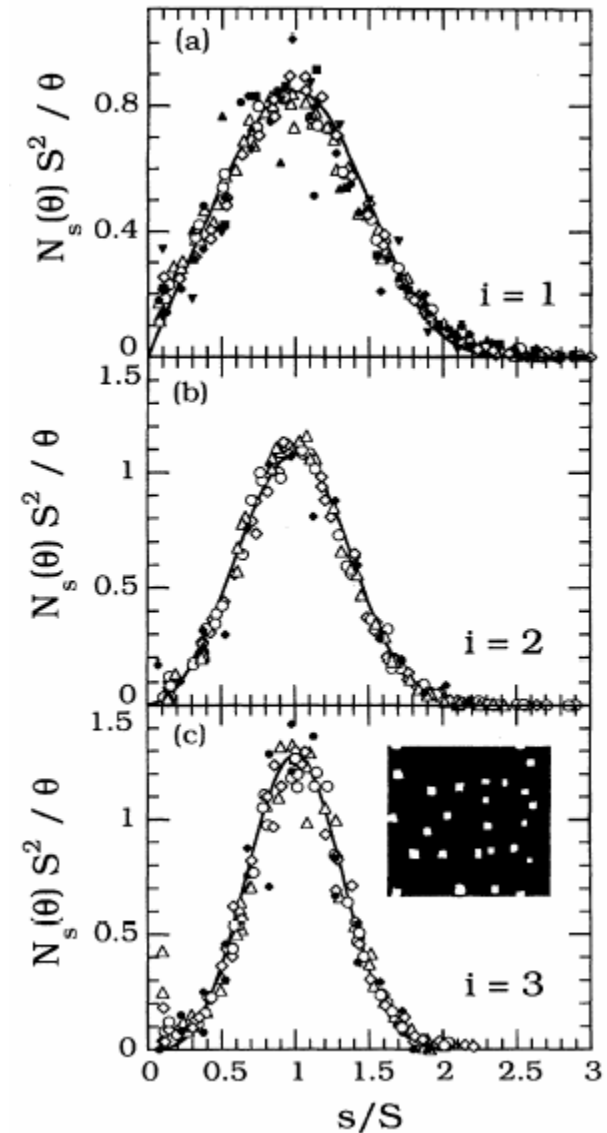


$i=3$

In contrast to Point-Island Rate Eqn for large  $D/F$

$$f_i(u) = \frac{1}{i+2} \left(1 - \frac{i+1}{i+2} u\right)^{-\frac{i}{i+1}}; \quad 0 \leq u \leq \frac{i+2}{i+1}$$

$$f_i(u) = 0; \quad u > \frac{i+2}{i+1}$$



# Scaling During Growth in 1D: Going Beyond Mean-Field Rate Eqns.

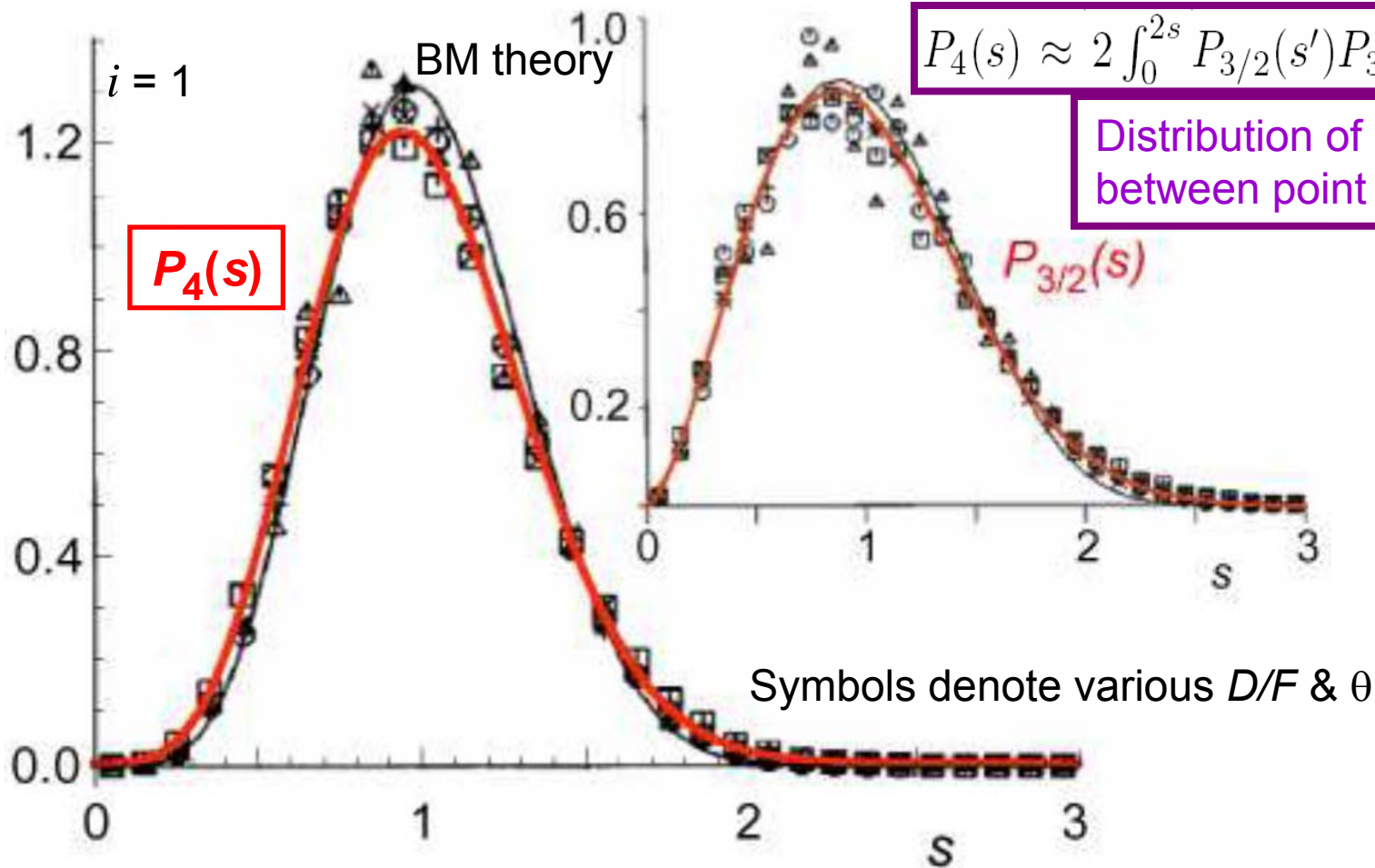
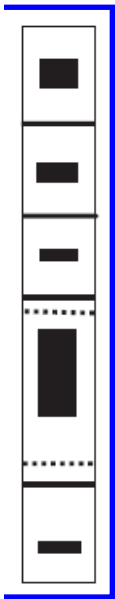
Blackman & Mulheran, PRB 54 (96) 11681

$P_4(s)$  fits numerical data at least as well as B&M's complicated theory expression (not expressible succinctly)

$$d = 1 \Rightarrow \rho = 2(i + 1)$$

$$P_4(s) \approx 2 \int_0^{2s} P_{3/2}(s') P_{3/2}(2s - s') ds'$$

Distribution of gaps between point islands

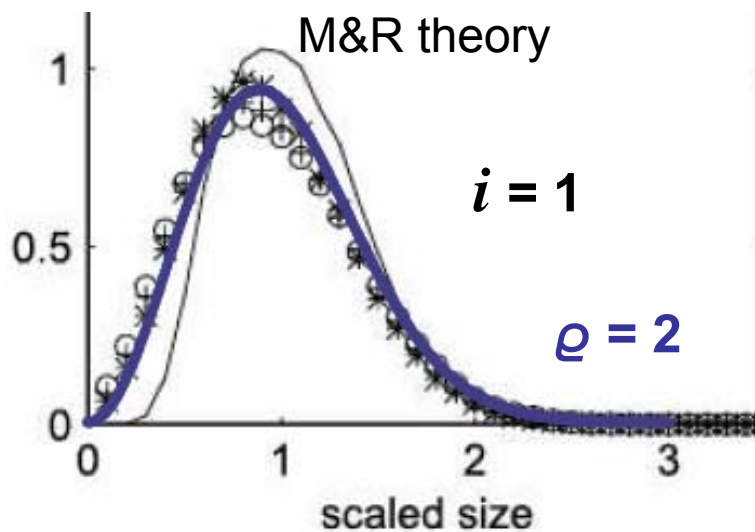
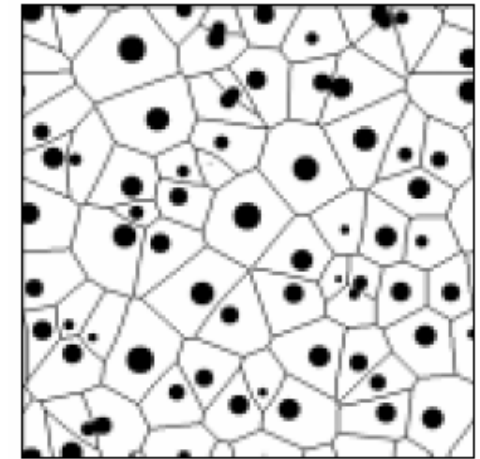
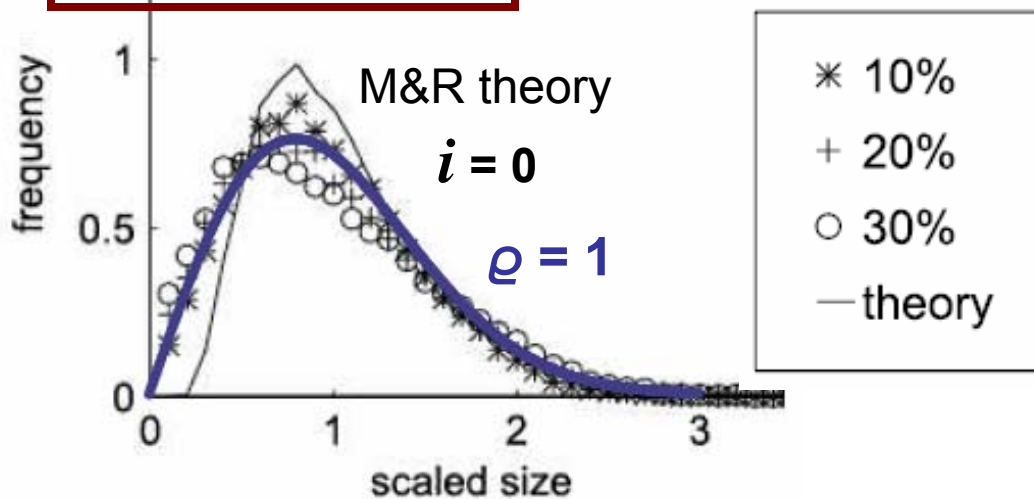


Symbols denote various  $D/F$  &  $\theta$

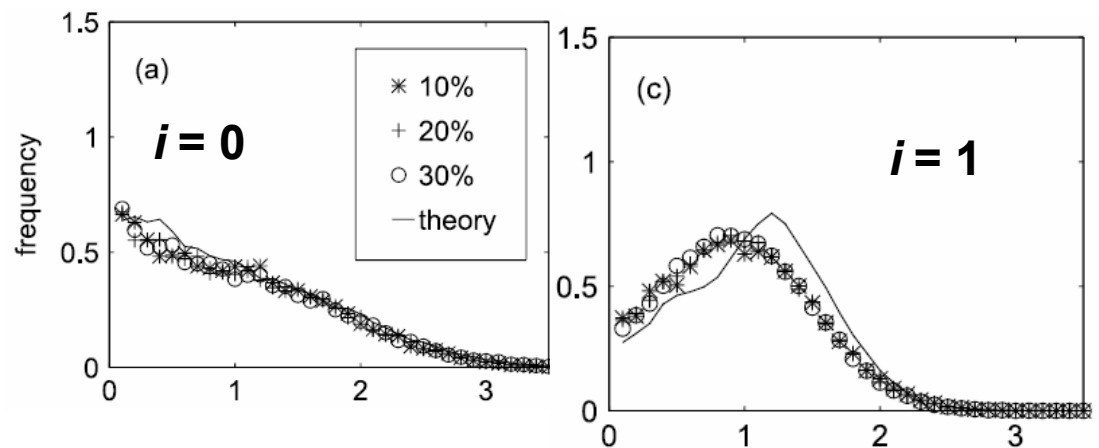
Theory of CZ size distributions in growth, *Mulheran & Robbie*, EPL 49(00)617

$$d = 2 \Rightarrow \rho = i + 1$$

Wigner distribution  $P_\rho(s)$  fits much better than M&R theory



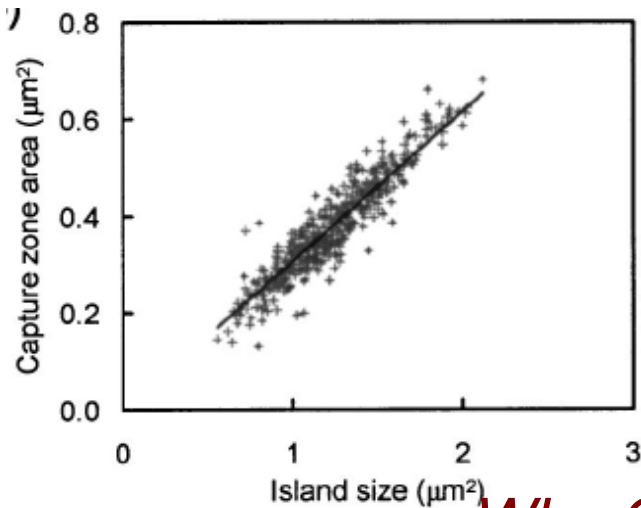
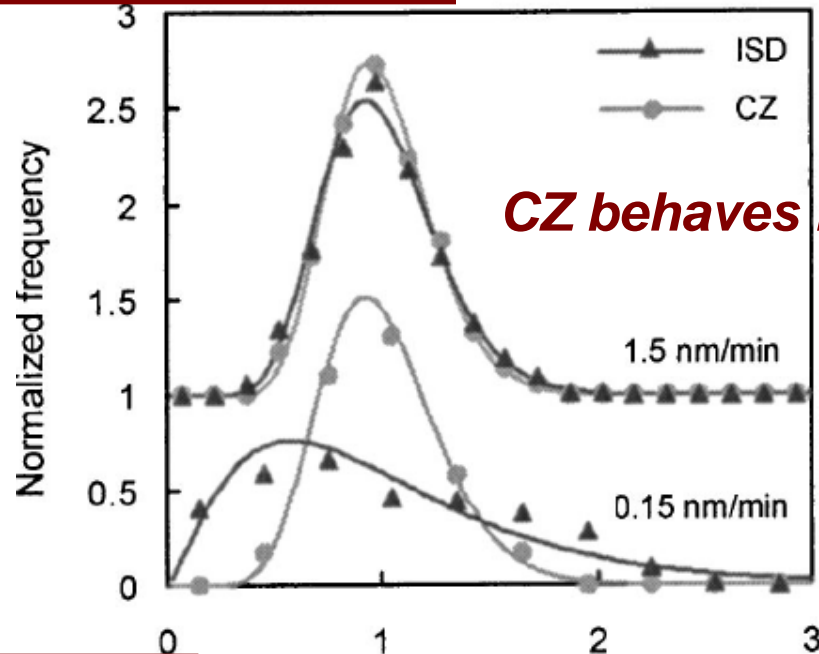
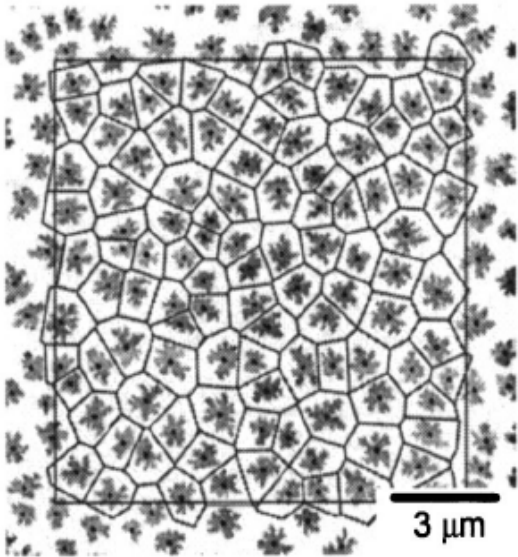
*Island size distribution not so informative*





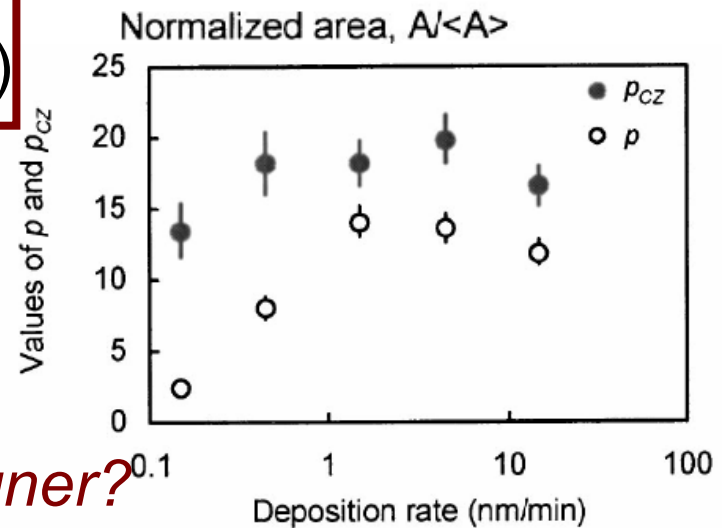
# Exp't: Pentacene/SiO<sub>2</sub> Praton et al., PRB 69 (04) 165201

Gamma func'n  $\Pi_\alpha(x) = [\alpha^\alpha / \Gamma(\alpha)] x^{\alpha-1} \exp(-\alpha x)$



$\Pi_{2\varrho+\alpha_0}(s) \approx P_\varrho(s)$

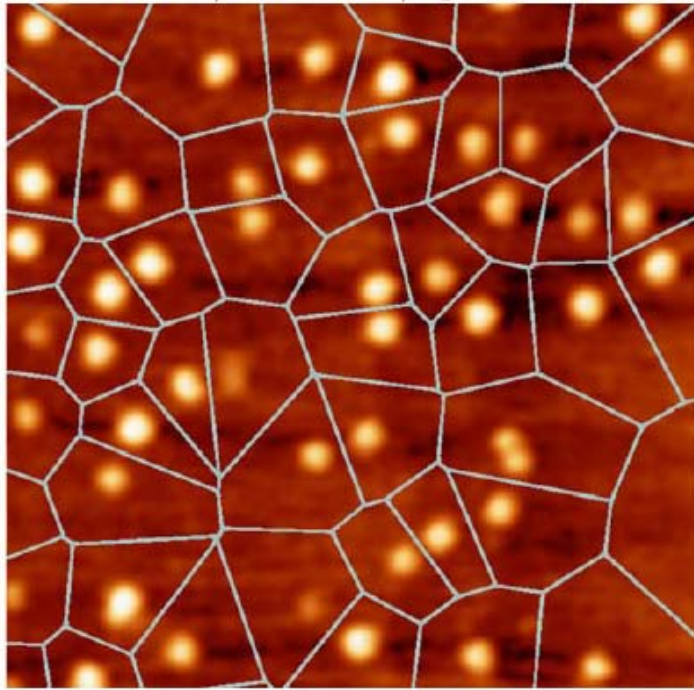
but  $\Pi$  more skewed



*Why Gamma, not Wigner?*

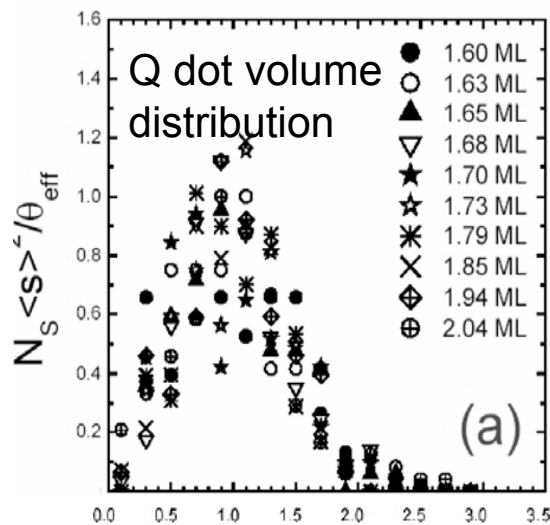
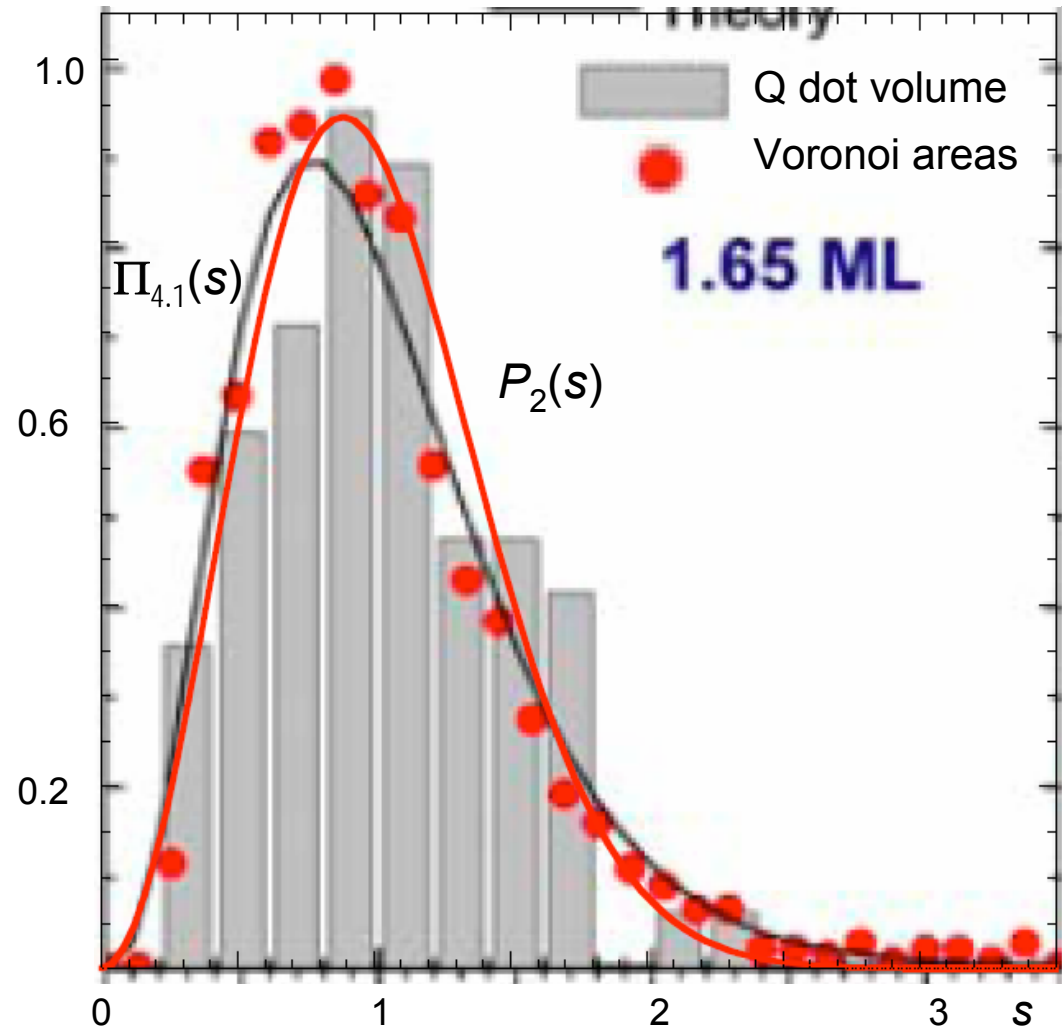
# Scale invariance in thin film growth: InAs *quantum dots* on GaAs(001)

M. Fanfoni *et al.*, PRB **75** ('07) xxx



AFM, 1.68 ML, 350x350nm<sup>2</sup>, 500°C

$\Theta$ (ML)	1.65	1.68	1.70	1.73	1.79	1.85
$\alpha$	4.1	4.6	4.5	4.7	4.5	4.6



# Why it works: Phenomenological theory

CZ does “random walk” with 2 competing effects on  $ds/dt$ :

1] Neighboring CZs hinder growth  $\Rightarrow$  external pressure, repulsion  $B$  leads to force  $-KBs$  Also noise  $\eta$

2] Non-symmetric confining potential, new island nucleated with large size so force stops fluctuations of CZ to tiny values  
In Dyson model, logarithmic interaction, so  $+K(\ )/s$

3] Can argue in 2D that  $(\ )$  is  $i + 1$   
using critical density  $\propto s^i$ , # sites visited in lifetime  $\propto s^1$   
entropy  $\propto$  - product  $s^{i+1}$ , & force  $-\partial(\text{entropy}) / \partial s$   
[Also  $i + 1$  in 3D & 4D; but  $2(i + 1)$  in 1D]

$$\begin{aligned} \dot{N} &= \sigma n N_i = \sigma n^{i+1} \\ \sigma &= D / \ell^{2-d} \quad s \equiv \ell^d \\ n &\propto \ell^2 \approx s^{2/d} \\ \text{prod} &\propto s^{(2/d)(i+1)} \end{aligned}$$

4] Combine  $\Rightarrow$  Langevin eq.  $ds/dt = K [(2/d)(i + 1)/s - Bs] + \eta$  [ $d=1,2$ ]

5] Leads to Fokker-Planck eq. with stationary sol'n  $P_{\ominus}(s)$   
*cf.* AP, HG, & TLE, Phys. Rev. Lett. **95** (05) 246101

# Summary (see <http://www2.physics.umd.edu/~einstein>)

- Steps are **useful** for many applications, bear on many problems of current interest, and embody **fascinating physics**
- Sophisticated experiments, with powerful theoretical and computational calculations, allow for **quantitative** measurements that yield numerical assessment of key parameters and allow prediction of associated phenomena
- TWD of vicinals provides physical entrée to intriguing **1D fermion models** & RMT, can connect to many other current physics issues --- universality in fluctuations --- Wigner surmise for 3 special cases based on explicit or implicit symmetry
- Generalized Wigner surmise  $P_\rho(s) = a s^\rho e^{-bs^2}$  easy to use & describes universal fluctuations  $\Rightarrow$  broad applications
- For TWD width  $\rho \Rightarrow$  strength of elastic repulsion
- Fokker-Planck "derivation" & application to relaxation of steps from arbitrary initial configurations
- Focus on **distribution of areas of capture zones**, rather than island sizes;  
 $\rho \Rightarrow$  critical nucleus size  $i$  and spatial dimension of host lattice