

Time correlation properties of KPZ fluctuations: from experimental perspectives

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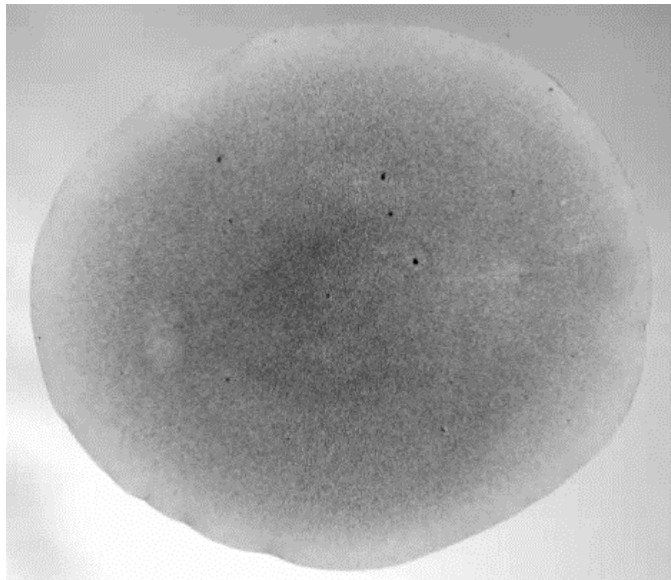
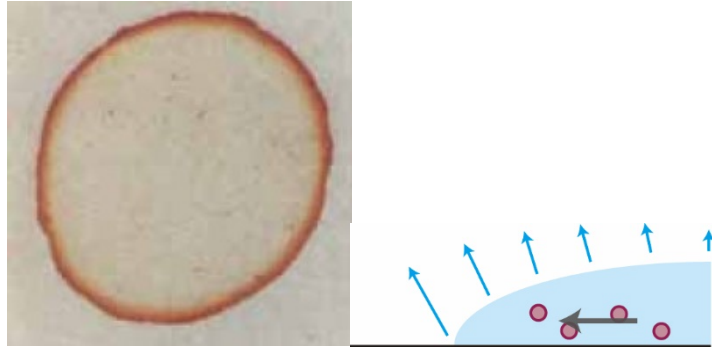
(Tokyo Tech.)

Acknowledgment

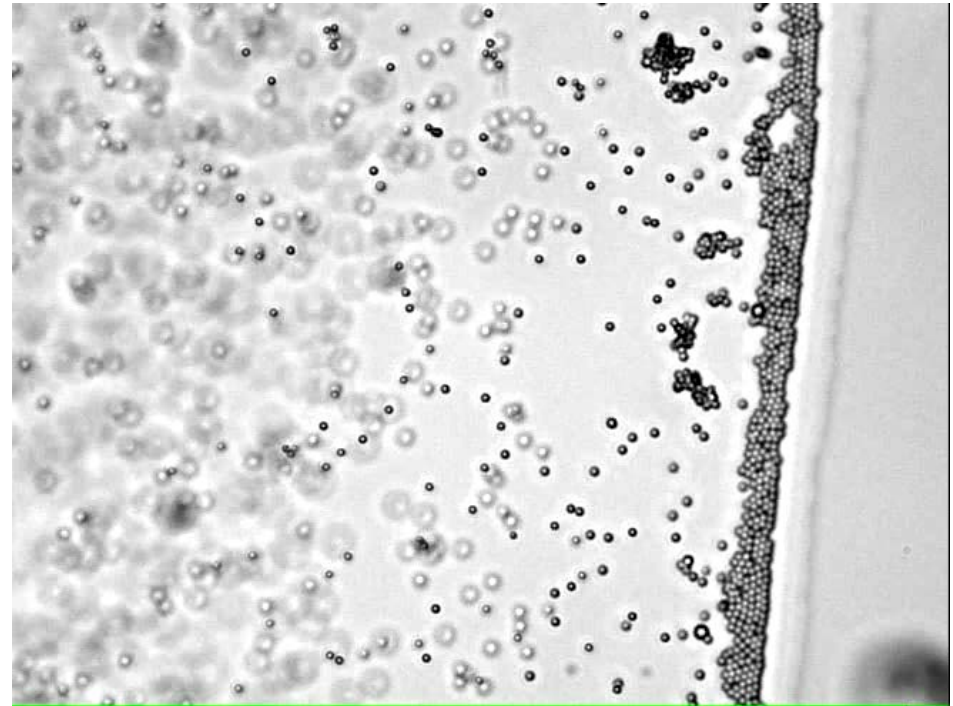
- Masaki Sano (Univ. Tokyo) – experiment
- Takuma Akimoto (Keio Univ.) – sign renewals analysis
- Patrik L. Ferrari & Herbert Spohn – two-time correlation

Growing Interfaces

Example I: particle deposition (a familiar instance: the coffee-ring effect)



Experiment using polystyrene beads

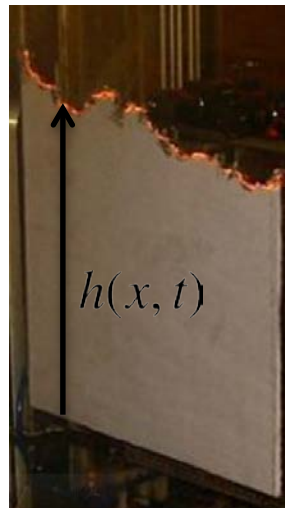
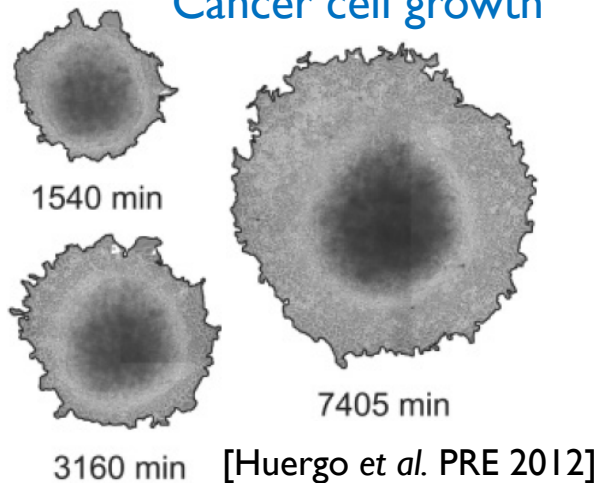


[Yunker et al. Nature 2011, PRL 2013]

Growing Interfaces

Other examples: (random growth processes with short-range interactions)

Cancer cell growth



Paper combustion [Maunuksela et al. 1997-] (cf. forest fire)



Random growth processes produce rough interfaces

scale invariant

→ universal scaling laws

Kardar-Parisi-Zhang (KPZ) universality class

- KPZ equation: $\frac{\partial}{\partial t} h(x, t) = v \nabla^2 h + \frac{\lambda}{2} (\nabla h)^2 + \sqrt{D}(\text{noise})$



$$\delta h \sim t^\beta \text{ or } L^\alpha$$

$$\alpha = \frac{1}{2}, \beta = \frac{1}{3} \text{ in 1d}$$

- In 1d, many properties are solved exactly, despite being out of equilibrium. Deep connection to random matrix theory / combinatorics / integrable systems.
- We study experimentally, using liquid-crystal turbulence.

KPZ vs non-KPZ in Real World

Theoretically, KPZ is expected under very generic situations
with short-range interactions, no conservation, no quench disorder...

However, in reality...

paper combustion



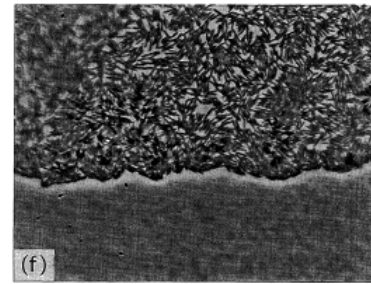
Maunuksela et al. 1997- Zhang et al. 1992

→ KPZ

→ not KPZ
($\alpha \approx 0.70$)

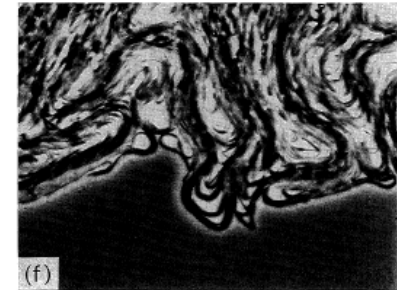
cell colony growth

Wakita et al. 1997



mutant bacteria

→ KPZ



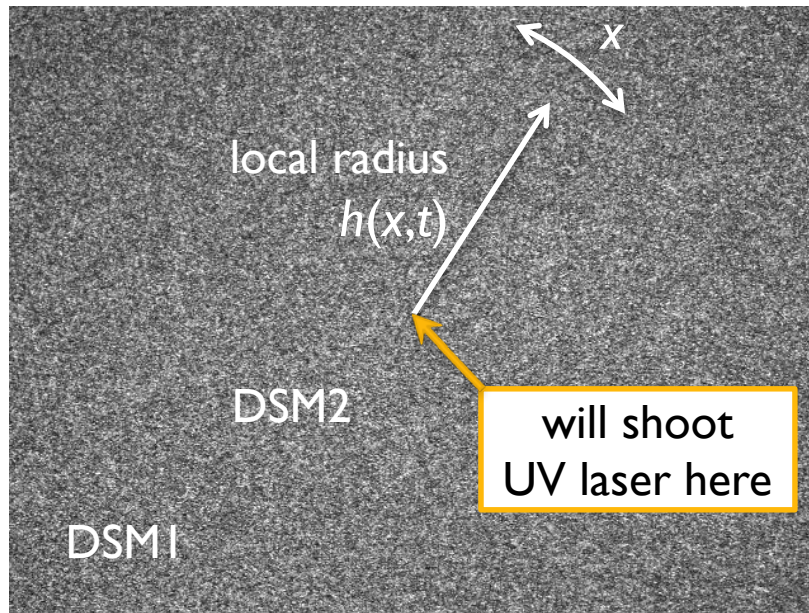
wild-type bacteria

→ not KPZ
($\alpha \approx 0.78$)

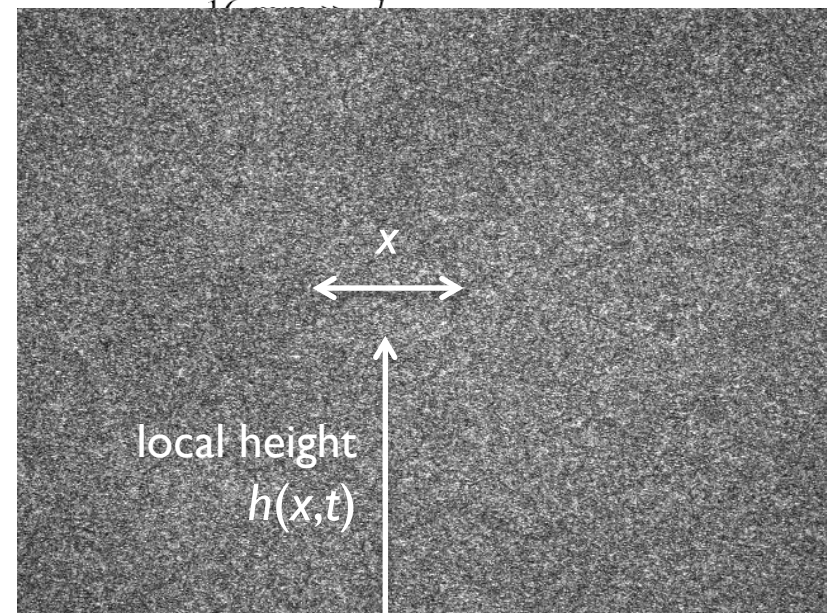
There are a great many other examples of non-KPZ interfaces,
but only few experiments showed KPZ (6 examples for 1d KPZ).

Growing Interfaces in Liquid-Crystal Turbulence

- Apply an ac electric field to nematic liquid crystal (here MBBA)
- Convection driven by anisotropic electric properties (Carr-Helfrich instability)
- DSM1 = defect-less turbulence : metastable at large enough V
- DSM2 = defect-filled turbulence : stable



26V, 250Hz Speed x2, — 200 μ m



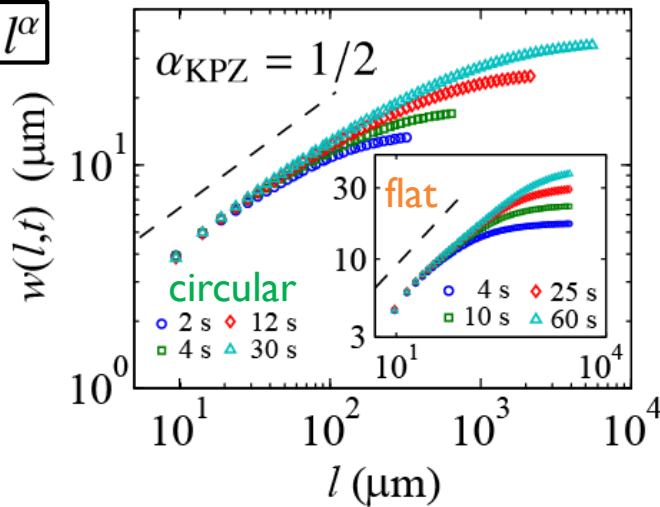
Speed x5

Basic Results

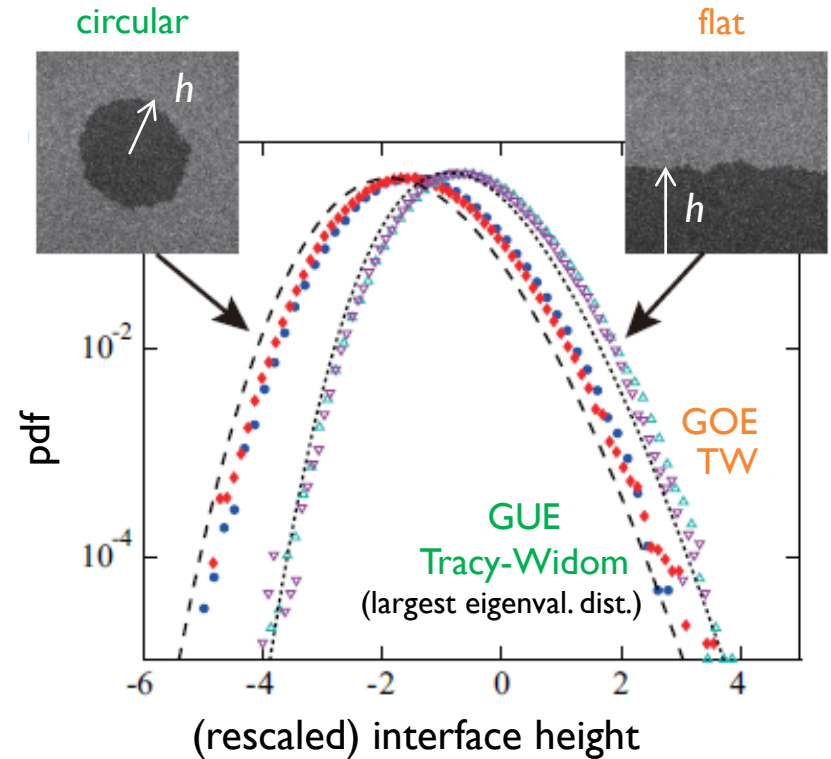
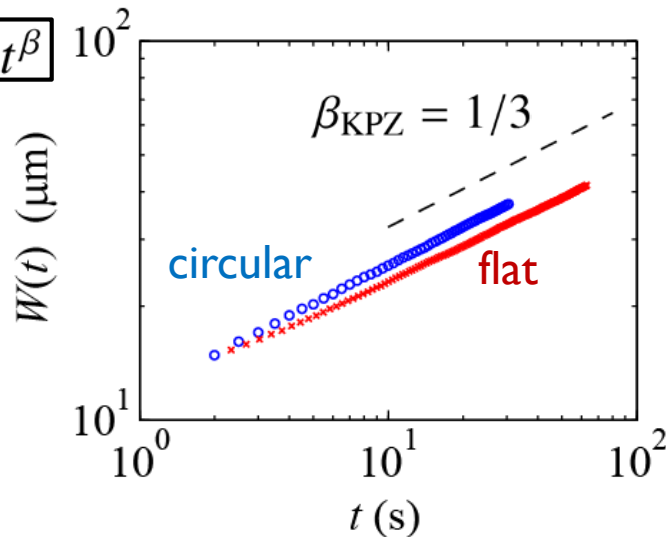
[KaT & Sano, PRL 104, 230601 (2010); J. Stat. Phys. 147, 853 (2012)]

Scaling exponents

$$w \sim l^\alpha$$



$$W \sim t^\beta$$



$$\begin{aligned} \text{circular : } h(t) &\simeq v_\infty t + (\Gamma t)^{1/3} \chi_{\text{GUE}} \\ \text{flat : } h(t) &\simeq v_\infty t + (\Gamma t)^{1/3} \chi_{\text{GOE}} \end{aligned}$$

- Both cases show the KPZ exponents.
- Yet, circular and flat interfaces show different distributions, both developed in random matrix theory.

Spatial Correlation

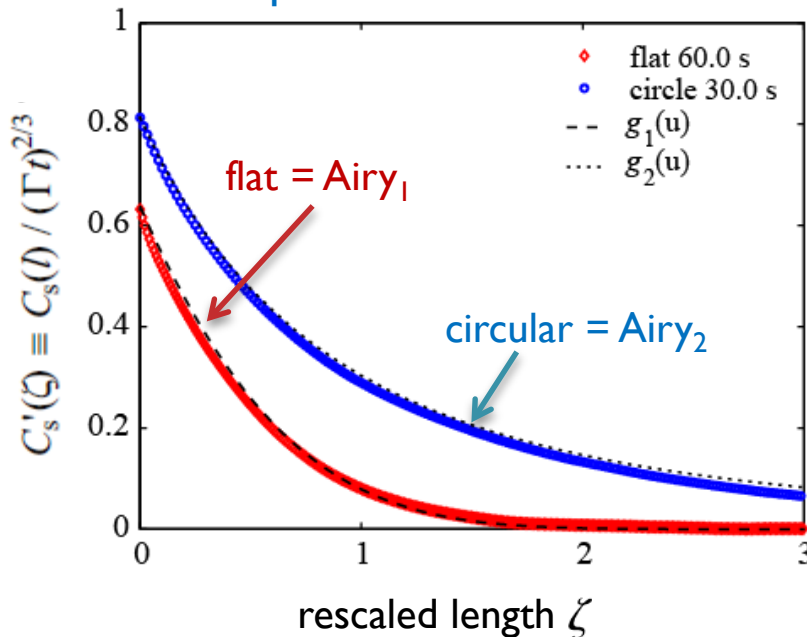
[KaT & Sano, J. Stat. Phys. 147, 853 (2012)]

KPZ spatial profile is described by certain stochastic processes (Airy process)

- flat \Rightarrow Airy₁ process (lpt dist = GOE Tracy-Widom)
- circular \Rightarrow Airy₂ process (lpt dist = GUE Tracy-Widom)

(cf. Airy₂ = largest-eigenvalue dynamics of Dyson's Brownian motion for GUE, but no such relation between Airy₁ and GOE)

Two-point correlation function



$$C_s(l, t) \equiv \langle h(x+l, t)h(x, t) \rangle - \langle h \rangle^2$$

color symbols = experiments
 dashed/dotted lines = Airy correlations
 in good agreement!

Qualitatively different decay


- Airy₂ corr. (circular) $\sim l^{-2}$
- Airy₁ corr. (flat) decays faster than exp.

“KPZ Universality Subclasses”


[See review by I. Corwin,
Rand. Mat.Theor.Appl. 1, 1130001]

Distribution and spatial correlation had been derived exactly for each subclass (2000~)

Circular (curved) interfaces

- Init. cond. : point / curved / wedge line • 
- Asymptotics : GUE Tracy-Widom distribution, Airy_2 correlation in space
- Shown for : TASEP [Johansson CMP 2000], PNG, PASEP [Tracy & Widom CMP 2009], KPZ eq. [Sasamoto & Spohn 2010, Amir *et al.* 2011, etc.] ... (list is not complete)

Flat interfaces

- Init. cond. : straight line 
- Asymptotics : GOE Tracy-Widom distribution, Airy_1 correlation in space
- Shown for : PNG [Prähofer-Spohn PRL 2000], TASEP, KPZ eq. [Calabrese-Le Doussal PRL 2011] ..

Stationary interfaces

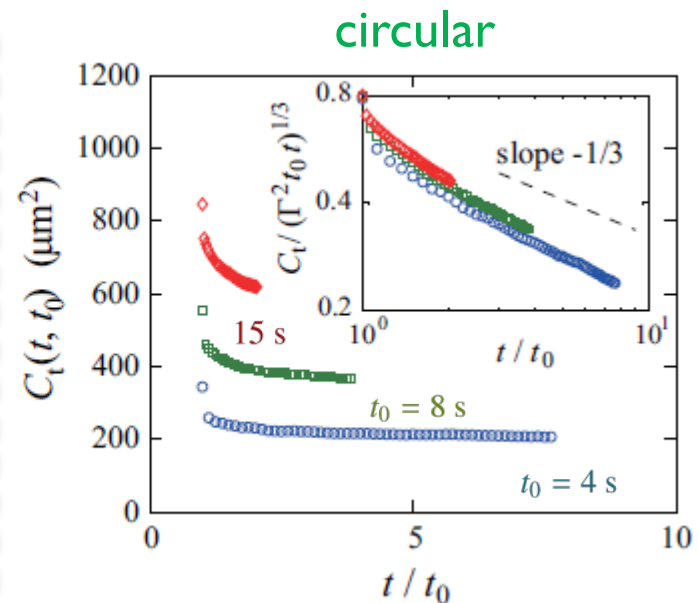
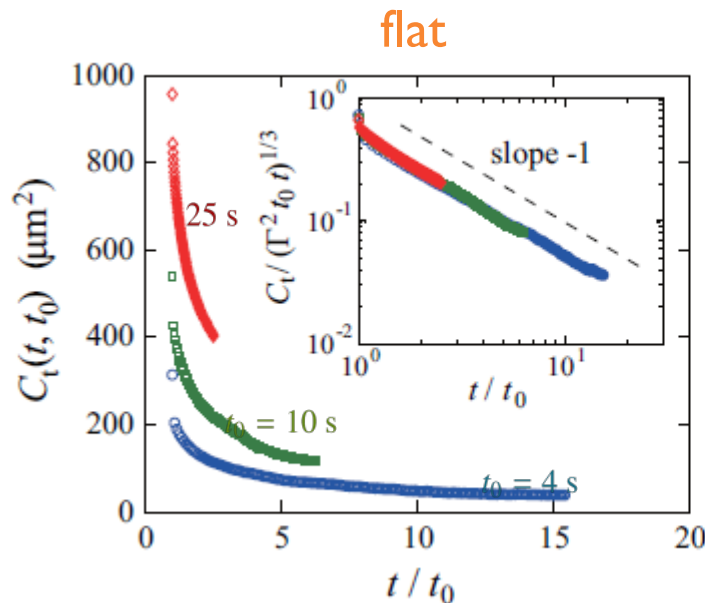
- Init. cond. : stationary interface (1d-Brownian motion) 
- Asymptotics : Baik-Rains F_0 distribution, $\text{Airy}_{\text{stat}}$ correlation in space
- Shown for : PNG [Baik-Rains JSP 2000], TASEP, KPZ eq. [Imamura-Sasamoto 2012, Borodin *et al.* 2014] ..

Note1) Other subclasses exist.

Note2) far less is known about time correlation!

Two-Time Correlation Function

$$C_t(t, t_0) \equiv \text{Cov}[h(x, t), h(x, t_0)] \equiv \langle h(x, t)h(x, t_0) \rangle - \langle h(x, t) \rangle \langle h(x, t_0) \rangle$$



- Natural scaling ansatz works

$$C_t(t, t_0) \simeq (\Gamma^2 t_0 t)^{1/3} F_t(t/t_0)$$

(recall: $h \simeq v_\infty t + (\Gamma t)^{1/3} \chi$)

- Long-time asymptotics

$$F_t(t/t_0) \sim (t/t_0)^{-\bar{\lambda}} \text{ with } \bar{\lambda} = 1$$

$$C_t(t, t_0) \sim t^{1/3} F_t(t/t_0) \rightarrow 0 \quad (t \rightarrow \infty)$$

- Stronger finite-time correction to the scaling ansatz.

$$F_t(t/t_0) \sim (t/t_0)^{-\bar{\lambda}} \text{ with } \bar{\lambda} = 1/3$$

then, $C_t(t, t_0) \sim t^{1/3} F_t > 0 \quad (t \rightarrow \infty)$ (!)

Correlation remains! Local ergodicity breaking?

Ferrari & Spohn, arXiv:1602.00486

- Ferrari & Spohn considered **two-time correlation function for TASEP**

$$\boxed{
 \begin{aligned}
 C(\alpha) &\equiv \text{Cov}[\mathcal{X}(\alpha), \mathcal{X}(1)] && \text{with } \mathcal{X}(\alpha) \equiv \lim_{t \rightarrow \infty} -t^{-1/3} \left[h(0, \alpha t) - \frac{1}{4} \alpha t \right] \\
 &= \alpha^{1/3} F_t(1/\alpha) && \text{where } \alpha = (t/t_0)^{-1} \text{ in our notation. } (0 \leq \alpha \leq 1)
 \end{aligned}
 }$$

- For the stationary subclass, $C(\alpha)$ becomes the covariance of the fractional Brownian motion with Hurst exponent 1/3.

$$\boxed{
 C(\alpha) = \langle \chi_0^2 \rangle_c \frac{1}{2} \left[1 + \alpha^{2/3} - (1 - \alpha)^{2/3} \right]
 }$$

- For the flat and circular subclasses, they obtained asymptotics for $\alpha \rightarrow 0, 1$:

(1) circular subclass

$$\begin{aligned}
 C(\alpha) &= O(\alpha^{2/3}) && \text{for } \alpha \rightarrow 0 \quad \Rightarrow \quad F_t(\tau) \sim \tau^{-1/3} \\
 C(\alpha) &= \langle \chi_{\text{GUE}}^2 \rangle_c - O((1 - \alpha)^{2/3}) && \text{for } \alpha \rightarrow 1 \quad \Rightarrow \quad \therefore C_t(t, t_0) > 0 \quad (t \rightarrow \infty)
 \end{aligned}$$

in agreement with experiment

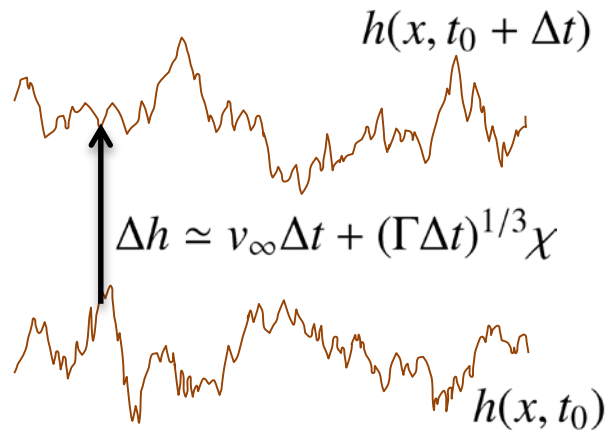
(2) flat subclass

$$\begin{aligned}
 C(\alpha) &= O(\alpha^{4/3}) && \text{for } \alpha \rightarrow 0 \quad \Rightarrow \quad F_t(\tau) \sim \tau^{-1} \\
 C(\alpha) &= \langle \chi_{\text{GOE}}^2 \rangle_c - O((1 - \alpha)^{2/3}) && \text{for } \alpha \rightarrow 1
 \end{aligned}$$

Flat-Stationary Crossover

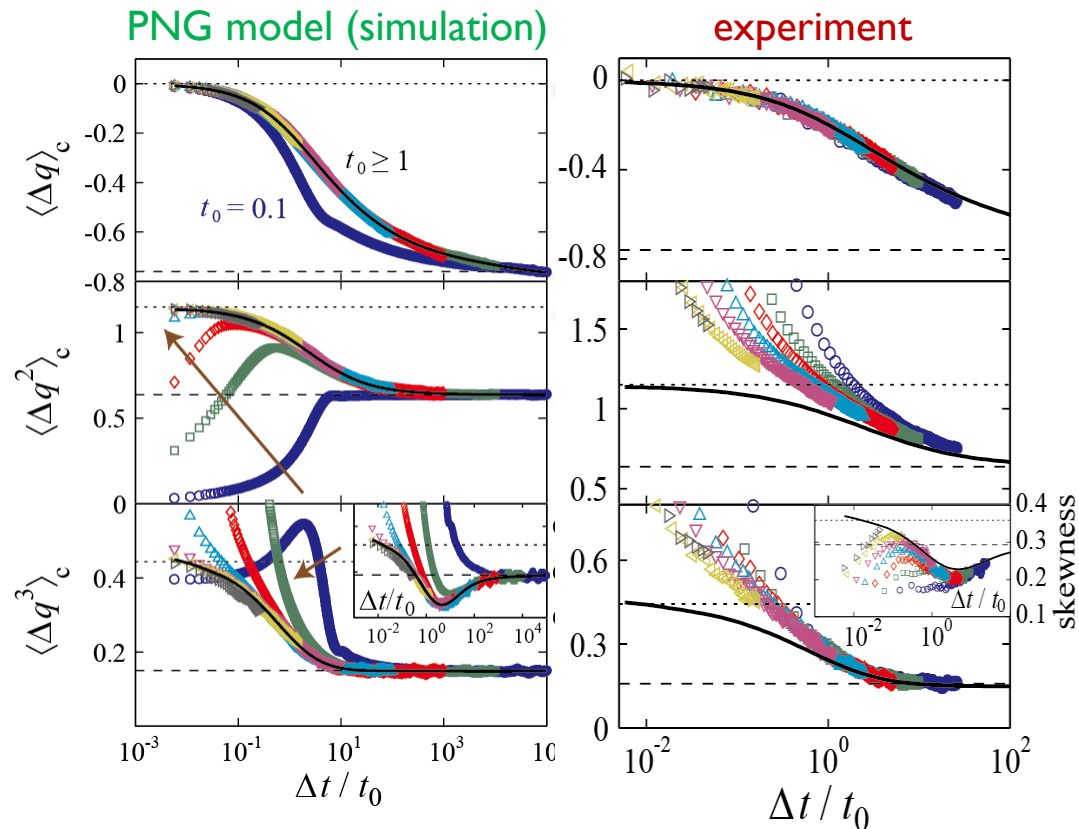
[KaT, PRL 110, 210604 (2013)]

Stationary subclass is theoretically established, but it is never reached in practice. However, crossover to the stationary subclass can be studied.



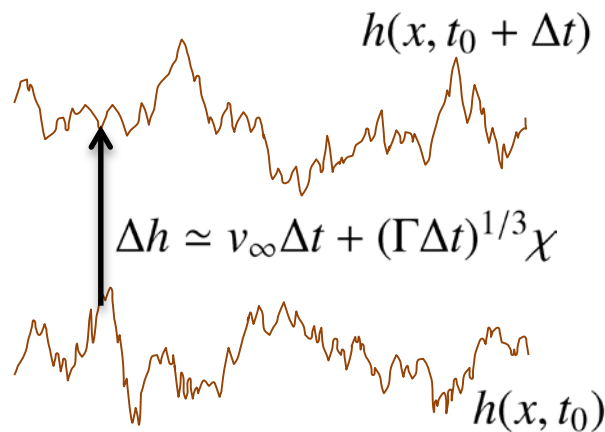
rescaled height difference

$$\Delta q \equiv \frac{\Delta h - v_\infty \Delta t}{(\Gamma \Delta t)^{1/3}} \approx \chi$$



- Scaling functions $\langle \Delta q^n \rangle_c \approx \Delta Q_n(\Delta t / t_0)$ describing flat-stationary crossover are found.
- Experiment seems to indicate the same scaling functions, so they are universal.

Relation to Two-Time Correlation



rescaled height difference

$$\Delta q \equiv \frac{\Delta h - v_\infty \Delta t}{(\Gamma \Delta t)^{1/3}} \simeq \frac{\mathcal{X}(1) - \alpha^{1/3} \mathcal{X}(\alpha)}{(1 - \alpha)^{1/3}}$$

$$\Delta Q_n(\tau) \equiv \langle \Delta q^n \rangle_c \quad \text{with} \quad \tau \equiv \Delta t / t_0 = \alpha^{-1} - 1$$

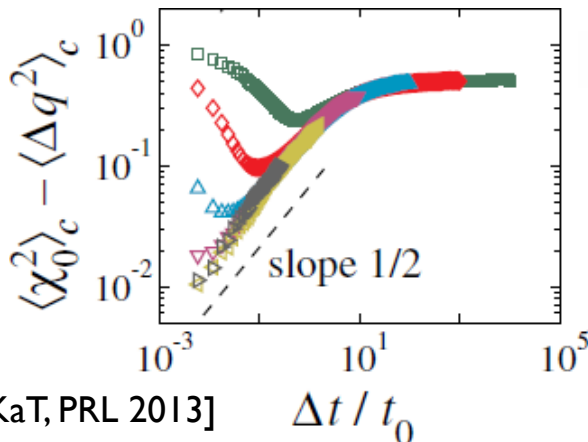
in particular,

$$\Delta Q_2(\tau) = \frac{(1 + \alpha^{2/3}) \langle \chi_{\text{GOE}}^2 \rangle_c - 2\alpha^{1/3} C(\alpha)}{(1 - \alpha)^{2/3}}$$

For the stationary limit ($t_0 \rightarrow \infty$, hence $\tau \rightarrow 0$, $\alpha \rightarrow 1$)

Numerics showed

$$\Delta Q_2(\tau) \rightarrow \langle \chi_0^2 \rangle_c - \mathcal{O}(\tau^{1/2})$$



Theoretically,

$$\Delta Q_2(\tau) \simeq 2\beta^{-2/3} \left[\langle \chi_{\text{GOE}}^2 \rangle_c - C(\alpha) \right] \quad \text{with} \quad \beta \equiv 1 - \alpha$$

and Ferrari & Spohn tell us

$$C(\alpha) = \langle \chi_{\text{GOE}}^2 \rangle_c - \mathcal{O}(\beta^{2/3})$$

Prediction from numerics is

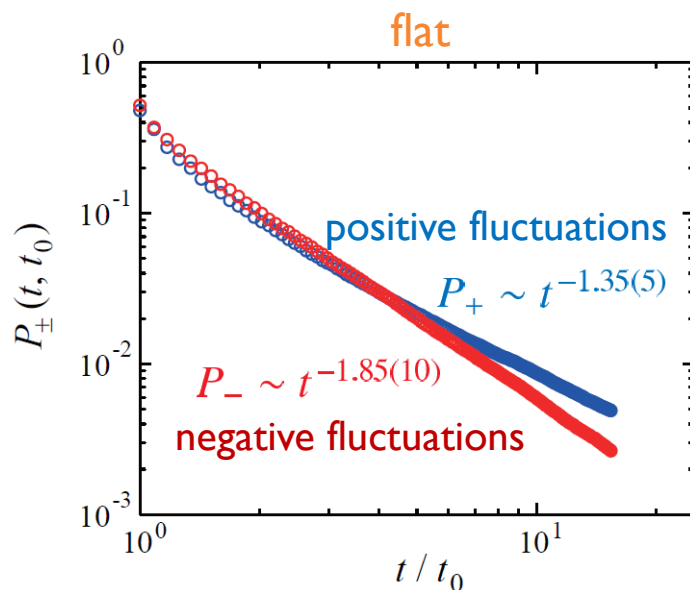
$$C(\alpha) = \langle \chi_{\text{GOE}}^2 \rangle_c - \frac{1}{2} \langle \chi_0^2 \rangle_c \beta^{2/3} + \mathcal{O}(\beta^{7/6})$$

Persistence [KaT & Sano, J. Stat. Phys. 147, 853 (2012)]

typically, $P_{\pm}(t, t_0) \sim t^{-\theta_{\pm}^{(p)}}$

Persistence probability $P_{\pm}(t, t_0)$

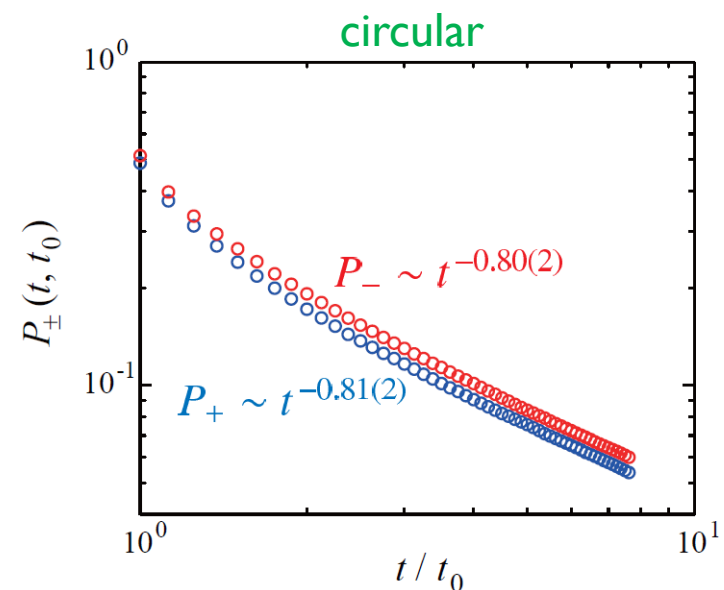
= joint probability that $\delta h \equiv h(x, t) - \langle h \rangle$ at a fixed position x is positive (negative) at time t_0 and keeps the same sign until time t



$$\theta_+^{(p)} = 1.35(5), \quad \theta_-^{(p)} = 1.85(10)$$

- $\theta_+^{(p)} < \theta_-^{(p)}$ due to the KPZ nonlinearity

$$\frac{\partial h}{\partial t} = \nu \nabla^2 h + \frac{\lambda}{2} (\nabla h)^2 + \eta$$



$$\theta_+^{(p)} = 0.80(2), \quad \theta_-^{(p)} = 0.81(2)$$

- Asymmetry cancelled! $\theta_+^{(p)} = \theta_-^{(p)}$
- $\theta_{\pm}^{(p)} < 1$ implies local ergodicity breaking (\because mean persistence time $\int P_{\pm} dt = \infty$)

Ergodicity Breaking?

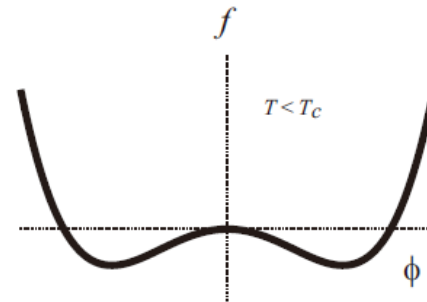
- Ergodicity : time average = ensemble average

- (Usual) ergodicity breaking :

Different equilibrium states (or attractors) coexist, so different results arise.

Examples

- Spontaneous symmetry breaking
- Systems with long-range interactions



- **Weak ergodicity breaking** : [J. P. Bouchaud 1992]

- Different results in a single state, due to long & random trapping of trajectories
- Time-averaged quantities remain stochastic,
described by well-defined distribution.

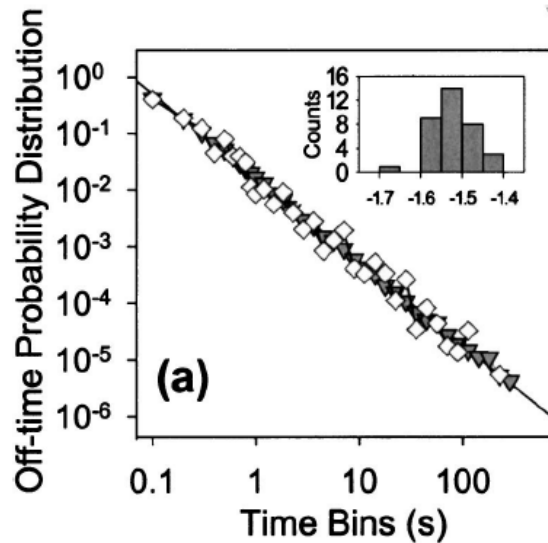
Examples

- experiments: cellular transports, quantum dots, etc.
- models: continuous-time random walk (CTRW), renewal process (RP), etc.

Weak Ergodicity Breaking in Quantum Dots

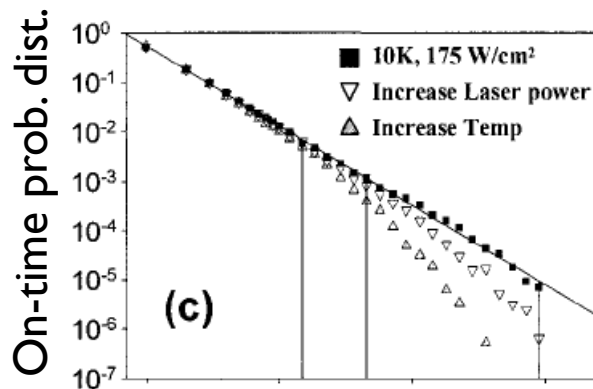
Blinking of fluorescence in CdSe nanocrystal (random on/off switching)

[Brokmann et al., PRL 2003]

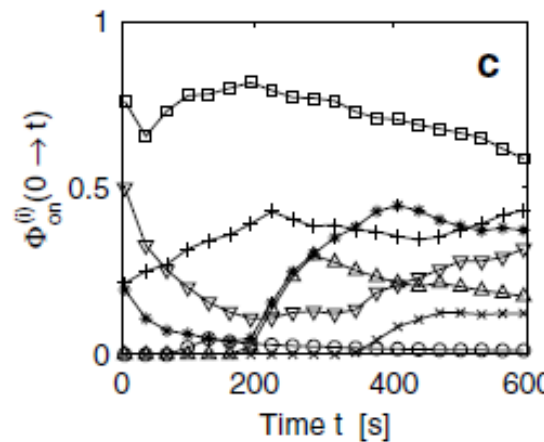


$$\text{Prob}[\text{waiting time} > \tau] \sim \begin{cases} \tau^{-0.58} & (\text{on}) \\ \tau^{-0.48} & (\text{off}) \end{cases}$$

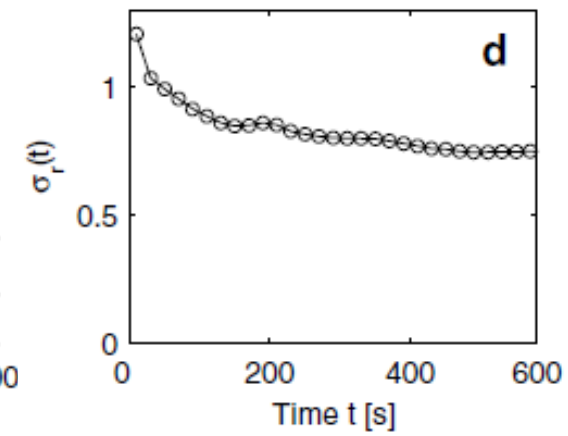
⇒ mean waiting time diverges



fraction of time of “on” state



standard deviation of Φ_{on}



Φ_{on} (time-avgd. quantity) seems to be stochastic even in $t \rightarrow \infty$ limit (weak ergodicity breaking)

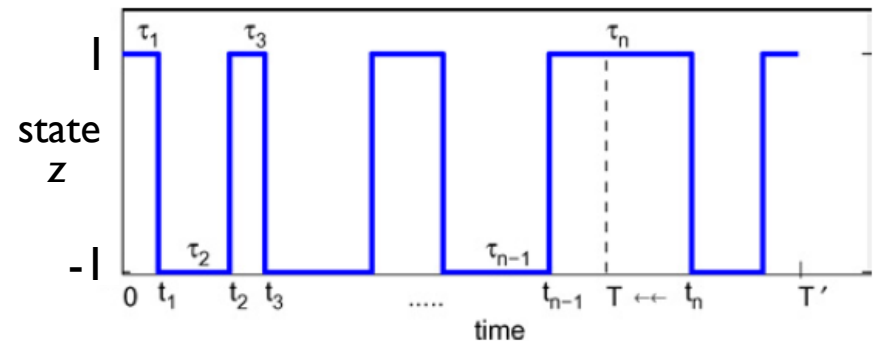
[figures from K.T. Shimizu et al., PRB 2001]

Simplest Model

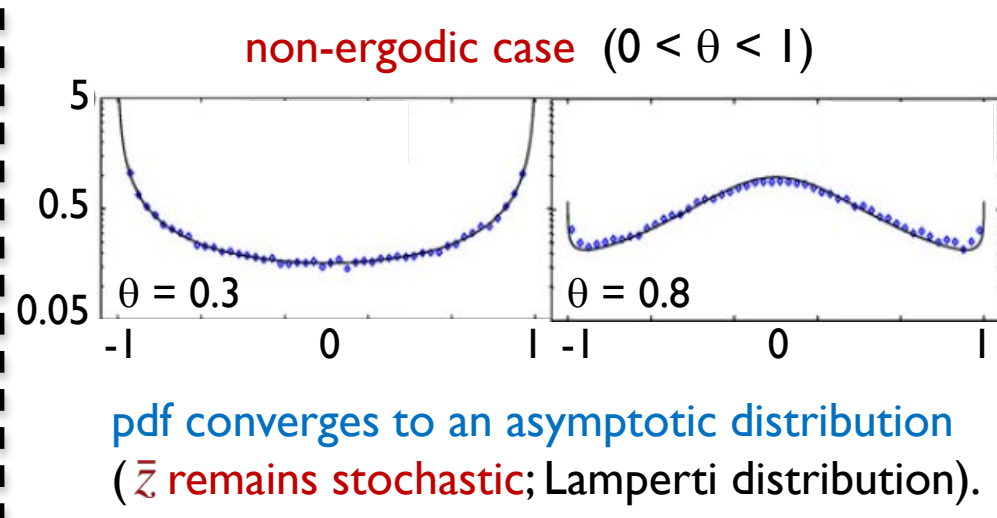
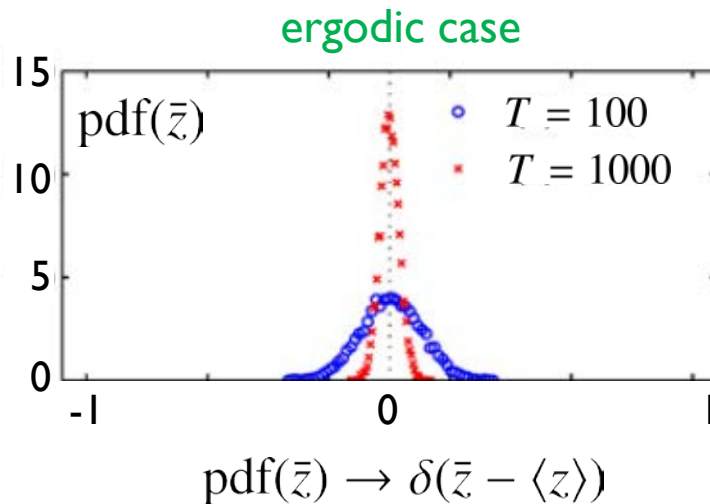
Renewal process (RP) [see, e.g., C. Godrèche & J. M. Luck, J. Stat. Phys. 104, 489 (2001)]

$$\text{Prob}[\text{waiting time} > \tau] \sim \tau^{-\theta}$$

$0 < \theta < 1$: weak ergodicity breaking



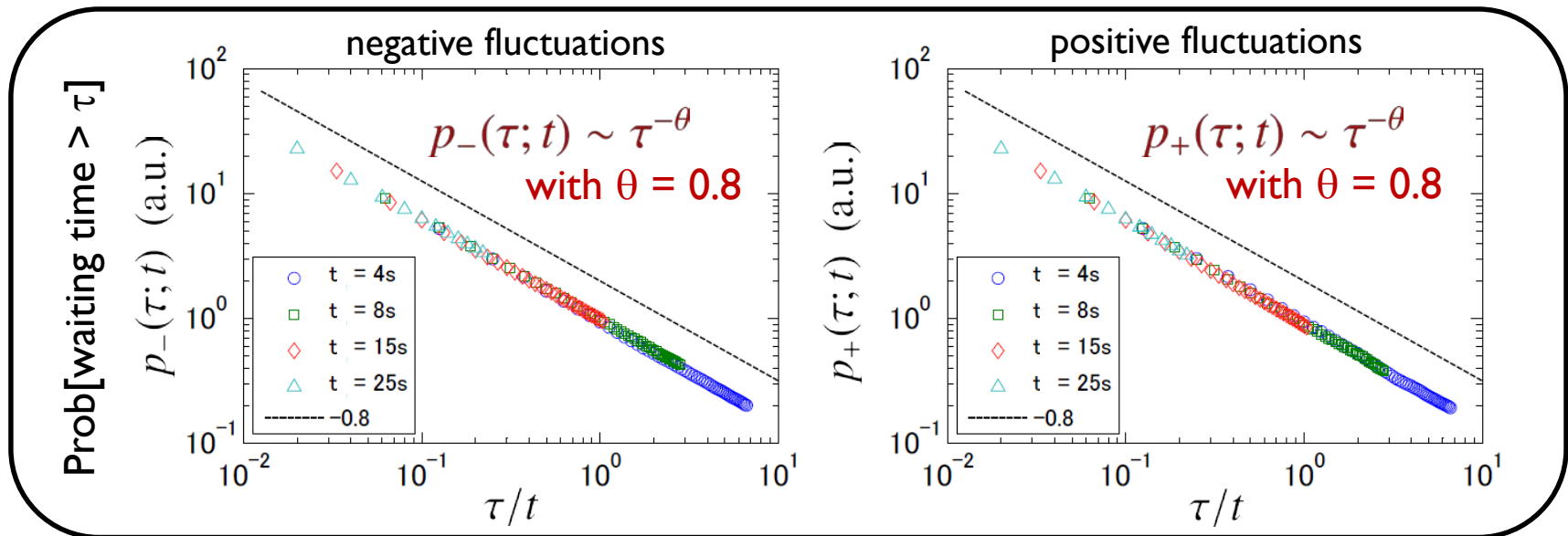
e.g.) time-avg. of z : $\bar{z}(T) = \frac{1}{T} \int z(t) dt$



KPZ Interfaces vs Renewal Process (RP)

- Renewal process (RP) is far too simple to describe KPZ.
two-state model, no space, uncorrelated waiting times...
- But, let's naively compare... one can regard δh 's sign as the state z .
First we measure **distribution of waiting time τ of sign renewed at t .**

circular interfaces



Circular case

Waiting times show clear power law with $\theta = \theta_{\pm}^{(p)} \approx 0.8$, similarly to RP!

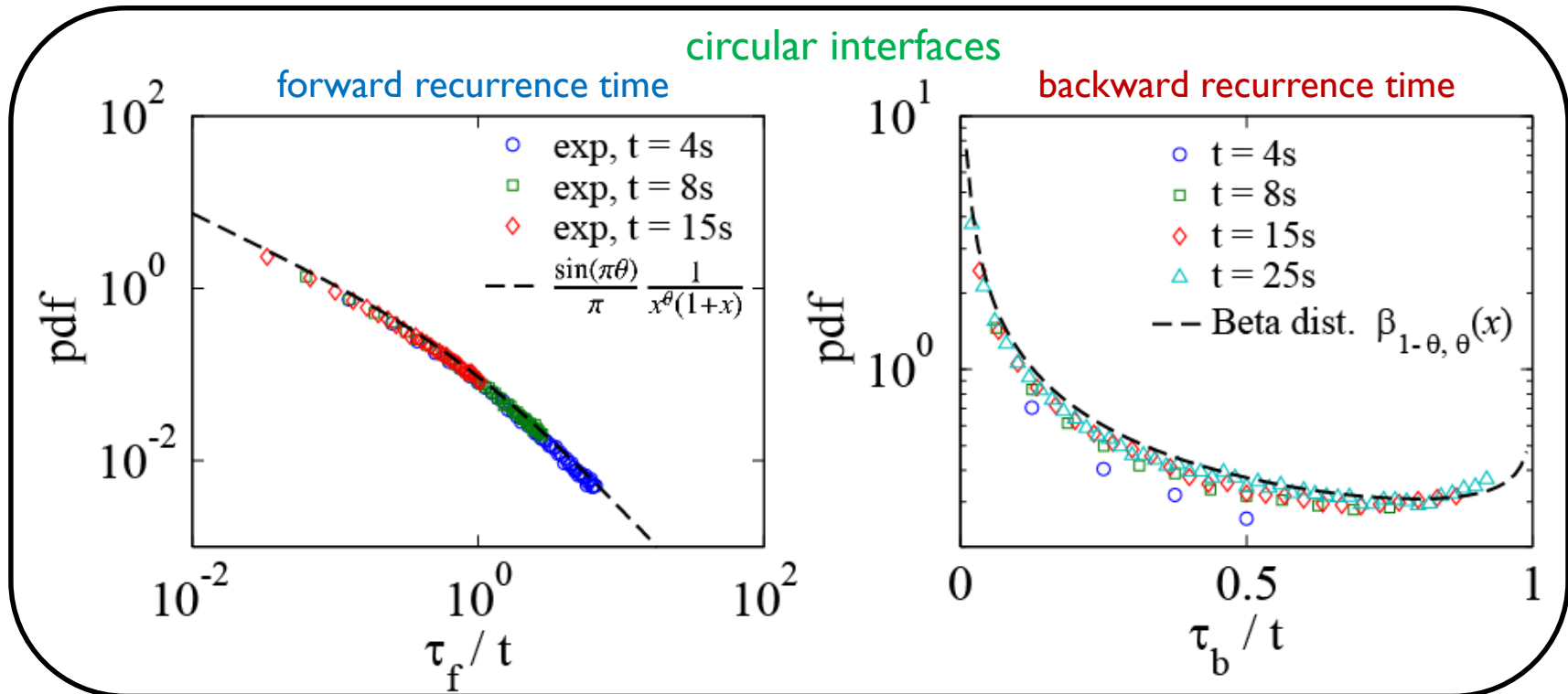
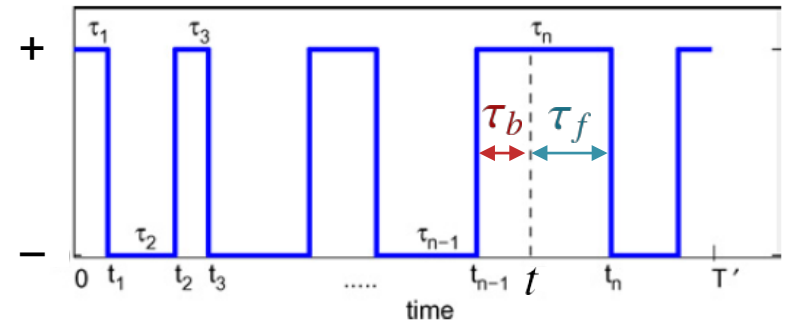
Recurrence Times

Other quantities of interest

Forward recurrence time $\tau_f(t)$

Backward recurrence time $\tau_b(t)$

Note) persistence prob. = $\int_{\tau}^{\infty} \text{pdf}(\tau_f) d\tau_f$



Circular Remarkable agreement with RP's exact results! (for RP, see Godrèche & Luck 2001)

Flat Case

Reminder about flat case:

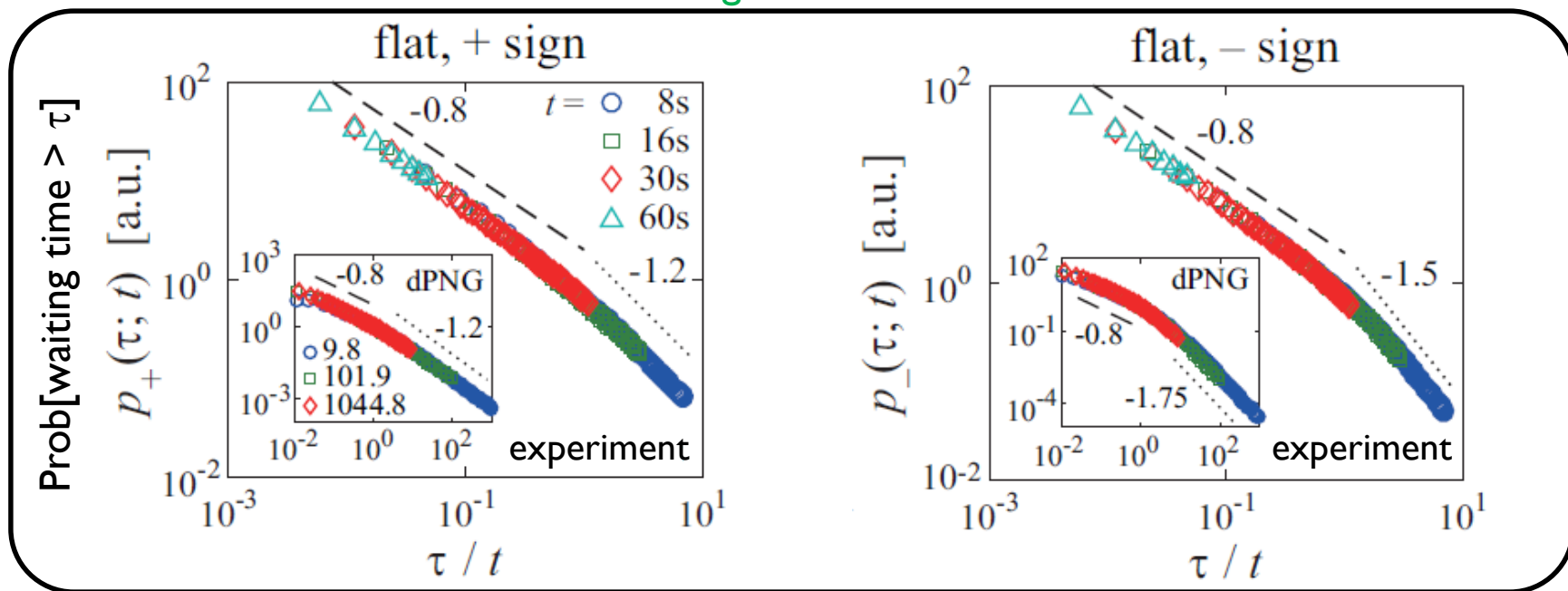
time correlation of h decays : $C_1(t, t_0) \rightarrow 0$

persistence exponent $\theta_{\pm}^{(p)} > 1$: $\theta_+^{(p)} \approx 1.35, \theta_-^{(p)} \approx 1.85$

⇒ No ergodicity breaking?

However, **dynamics is still scale-invariant**, unlike RP with $\theta > 1$. Let's have a look!

waiting-time distribution

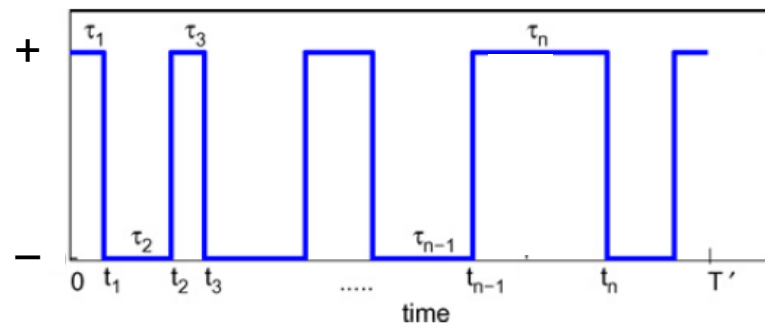


Waiting-time dist. shows crossover: $p_{\pm}(\tau; t) \sim \begin{cases} \tau^{-\theta} & (\tau \ll t) & (\theta \approx 0.8) \\ \tau^{-\theta_{\pm}} & (\tau \gg t) & (\theta_{\pm} > 1) \end{cases}$

“Renewal Process” for Flat Case

- Standard RP (compared to the circular case)

$$p_{\pm}(\tau) \equiv \text{Prob}[\text{waiting time} > \tau] \sim \tau^{-\theta}$$



- For the flat case, we introduce RP with two-step power-law waiting times:

$$p_{\pm}(\tau; t) \sim \begin{cases} \tau^{-\theta} & (\tau \leq t) \\ \tau^{-\theta'_{\pm}} & (\tau \geq t) \end{cases}$$

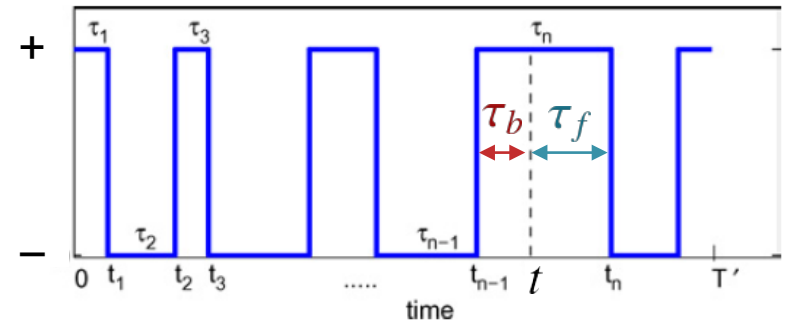
- Setting threshold $\sim t$ keeps dynamics scale-invariant.
- Here, we set $\theta = 0.8, \theta'_{+} = 1.2, \theta'_{-} = 1.5$ as observed experimentally.

Recurrence Time Statistics (Flat)

Forward recurrence time $\tau_f(t)$

Backward recurrence time $\tau_b(t)$

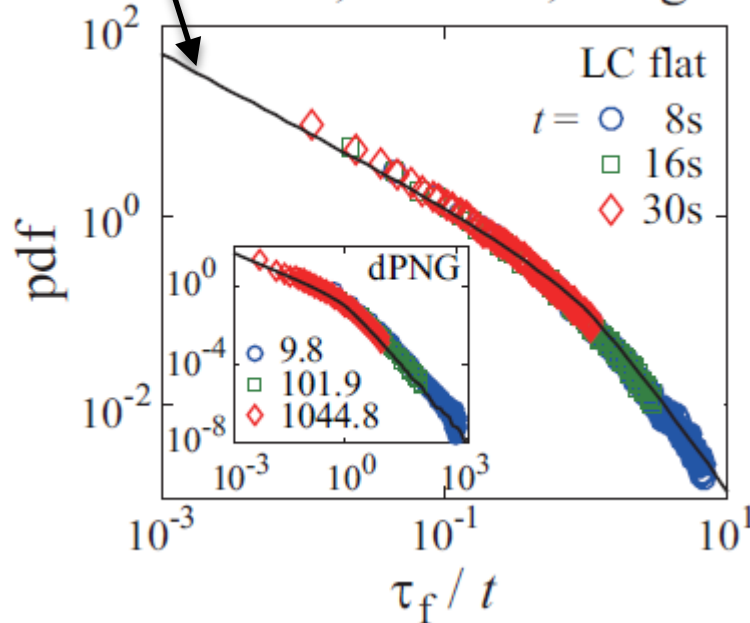
Note) persistence prob. = $\int_{\tau}^{\infty} \text{pdf}(\tau_f) d\tau_f$



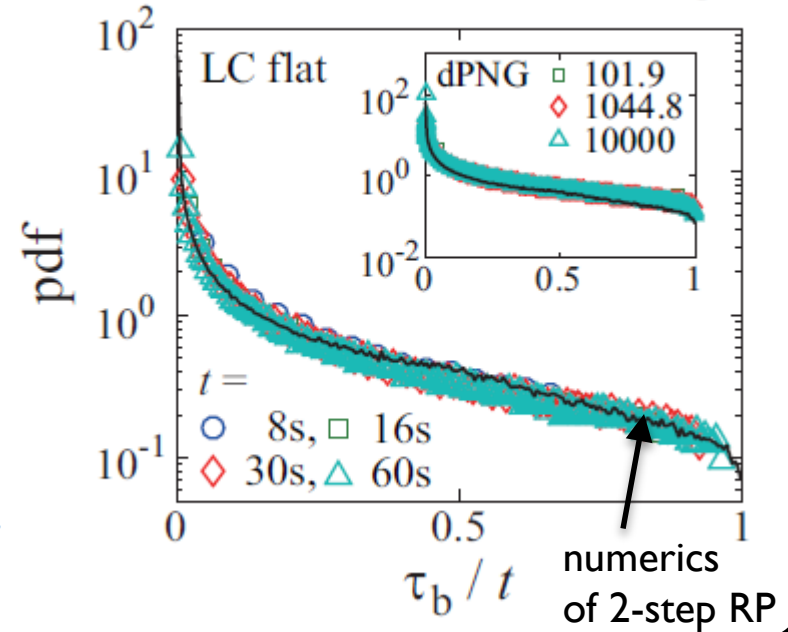
numerics
of 2-step RP

flat interfaces

flat, forward, + sign



flat, backward, + sign

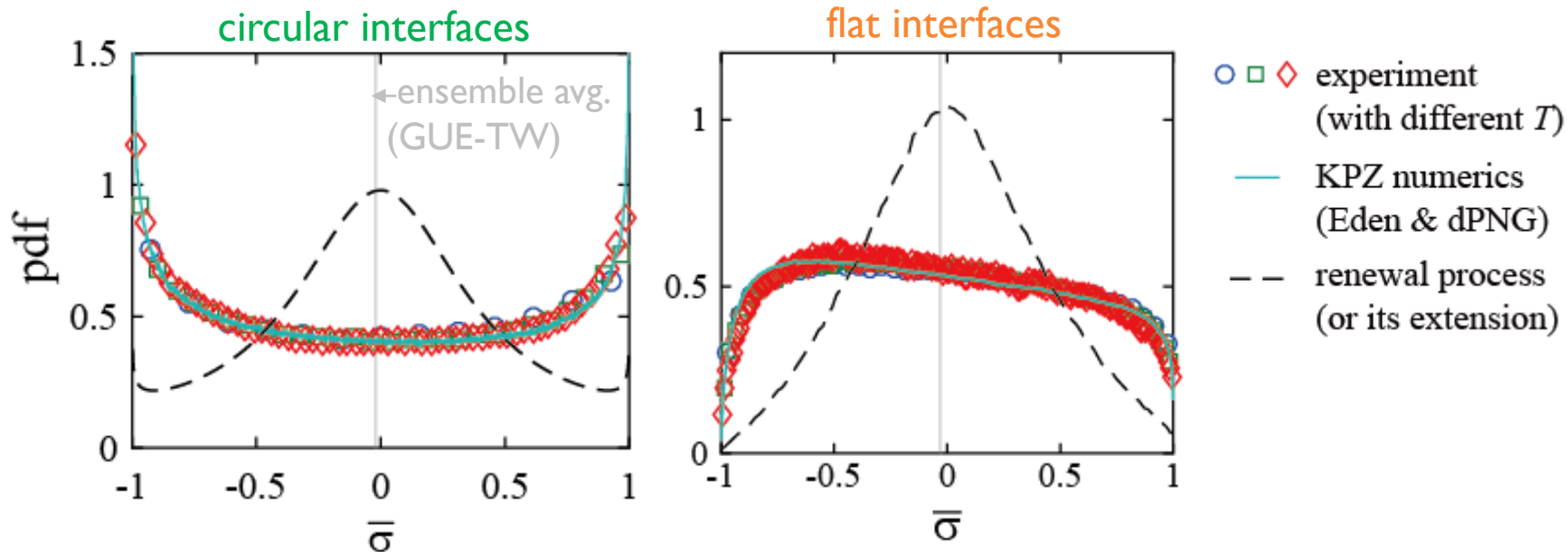


Good agreement with 2-step RP

Distribution of Time-Averaged Sign

$$\bar{\sigma}(x, T) = \frac{1}{T} \int_0^T \text{sign}[h(x, t) - \langle h(x, t) \rangle] dt$$

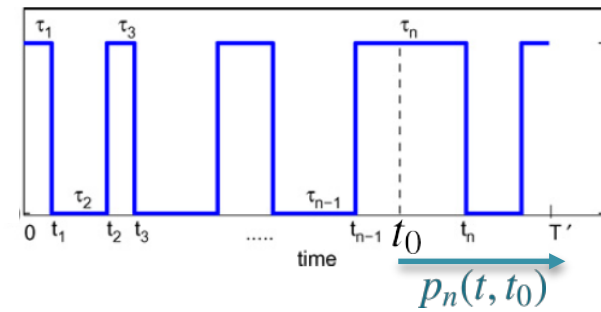
For RP, distribution is exactly known.
(Lamperti distribution)



- Pdf converges to a broad distribution. **Weak ergodicity breaking.**
- Time-avgd. sign distribution is *not* reproduced by RP.
Characteristic universal distribution for each KPZ subclass.

Difference from RP is presumably due to correlation between waiting times

Correlation Function of Signs



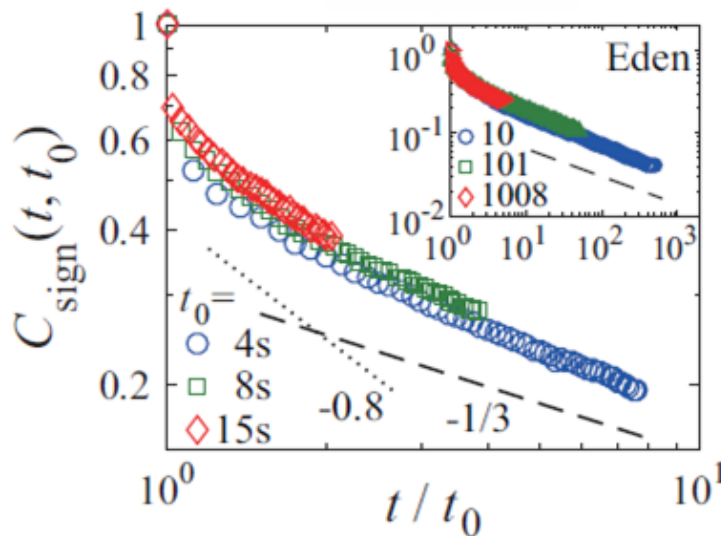
$$C_{\text{sign}}(t, t_0) \equiv \langle \sigma(x, t) \sigma(x, t_0) \rangle = \sum_{n=0}^{\infty} (-1)^n p_n(t, t_0)$$

$\text{sign}[h(x, t) - \langle h(x, t) \rangle]$
 $\text{prob. that sign flips } n \text{ times b/w } t_0 \text{ and } t.$
 (NB; $p_0(t, t_0)$ = persistence probability)

- For RP, one can show that the infinite sum $\sum_{n=1}^{\infty} (-1)^n p_n(t, t_0)$ does not contribute,

$$\therefore C_{\text{sign}}(t, t_0) \simeq p_0(t, t_0) \sim t^{-\theta} \text{ (RP)} \quad [\text{Godrèche \& Luck, JSP 2001}]$$

- For KPZ (circular), we find

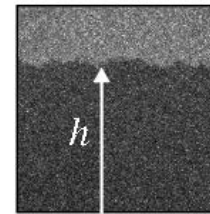
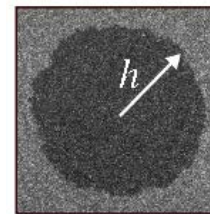


$$C_{\text{sign}}(t, t_0) \sim t^{-\bar{\lambda}} \text{ (KPZ)} \quad \text{not } t^{-\theta} \text{ like RP}$$

$\therefore C_{\text{sign}}$ decays like F_t (KPZ rescaled corr. func. without sign operation)

- KPZ time correlation is encoded in C_{sign}
- $C_{\text{sign}}^{(\text{KPZ})} \neq C_{\text{sign}}^{(\text{RP})}$ because of correlation between waiting times.
- Nevertheless, τ_f & τ_b agree with RP.

Summary



Time correlation properties of KPZ remain largely unexplored, while some experimental results are available.

Two-time correlation function

$$C_t(t, t_0) \equiv \text{Cov}[h(x, t), h(x, t_0)] \simeq (\Gamma^2 t_0 t)^{1/3} F_t(t/t_0)$$

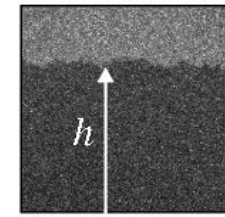
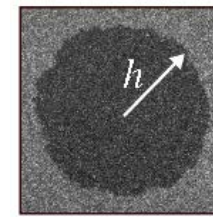
- Experiment:
 - $F_t(\tau) \sim \tau^{-1}$ (flat)
 - $F_t(\tau) \sim \tau^{-1/3}$ (circular) ← in particular, $C_t(t, t_0) > 0$ ($t \rightarrow \infty$)

[KaT & Sano, J. Stat. Phys. 147, 853 (2012)]
- Ferrari & Spohn's results for TASEP agree with this experiment, but full functional forms of $C_t(t, t_0)$ remain to be solved for the circular & flat cases. [Ferrari & Spohn, arXiv:1602.00486]
- $C_t(t, t_0)$ also controls the flat-stationary crossover [KaT, PRL 110, 210604 (2013)] : Information on Baik-Rains F_0 distribution is encoded in $C_t(t, t_0)$.

Prediction: (flat case, $\alpha \rightarrow 1$)

$$C(\alpha) \equiv \text{Cov}[\mathcal{X}(\alpha), \mathcal{X}(1)] = \langle \mathcal{X}_{\text{GOE}}^2 \rangle_c - \frac{1}{2} \langle \mathcal{X}_0^2 \rangle_c (1 - \alpha)^{2/3} + \mathcal{O}((1 - \alpha)^{7/6})$$

Summary



Time correlation properties of KPZ remain largely unexplored, while some experimental results are available.

Sign renewals of KPZ fluctuations

- Experimental result for persistence probability $P_{\pm}(t, t_0)$

$$\text{flat: } P_{\pm}(t, t_0) \sim \begin{cases} t^{-1.35} & (+ \text{ sign}) \\ t^{-1.85} & (- \text{ sign}) \end{cases}$$

$$\text{circular: } P_{\pm}(t, t_0) \sim t^{-0.8} \quad (+ \ \& \ -)$$

+/- asymmetry disappears for circular case! (no theory yet)

[KaT & Sano, J. Stat. Phys. 147, 853 (2012)]

- Waiting times (until next sign renewal) show clear power-law distribution.
Circular: single power law, similar to the renewal process (RP)
Flat: 2 power laws
- Some properties are reproduced by the renewal process (uncorrelated sign renewals)
- Weak ergodicity breaking, characteristic of KPZ.
(time-avgd. quantity remains stochastic) [KaT & Akimoto, arXiv:1509.03082]