

# Many random walkers: rare events and long-range correlations

**David P. Sanders**

Departamento de Física  
Facultad de Ciencias

Universidad Nacional Autónoma de México  
(UNAM)



**Hernán Larralde**

Instituto de Ciencias Físicas, UNAM

<http://sistemas.fciencias.unam.mx/~dsanders>

[dps@fciencias.unam.mx](mailto:dps@fciencias.unam.mx)

1. Random walks and diffusive rare events
2. Results on first-passage times
3. Energetic random walkers
4. Long-range correlations

Diffusive rare events

First-passage times

Energetic walks

Long-range energy  
correlations

# Random walks and diffusive rare events

## Diffusive rare events

- Diffusive
- Random walk model
- First passage

## First-passage times

## Energetic walks

## Long-range energy correlations

- ❑ **Diffusive rare event:** accumulation of diffusing particles
- ❑ No activation energy
- ❑ **Glassy behaviour**
  - hard disc fluid
  - Ritort backgammon model
- ❑ Blockage of membrane pores (Weiss & Argyrakis, 2006)
- ❑ General question:

How long until large density fluctuation occurs?

## Diffusive rare events

- Diffusive

- Random walk model

- First passage

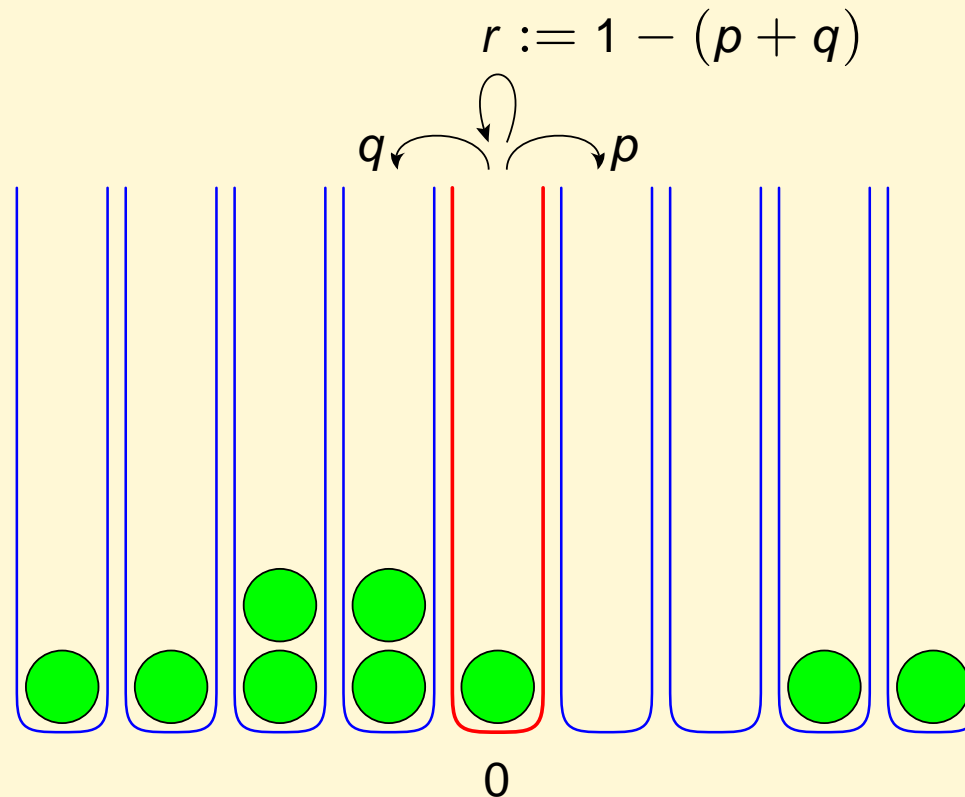
## First-passage times

## Energetic walks

## Long-range energy correlations

# Random walk model

- $N$  independent random walkers; discrete time



- Configurations:  $\mathbf{s} = (s_1, \dots, s_N) \in \{1, \dots, V\}^N$
- Density  $\rho := N/V$

## Diffusive rare events

- Diffusive
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## First-passage times

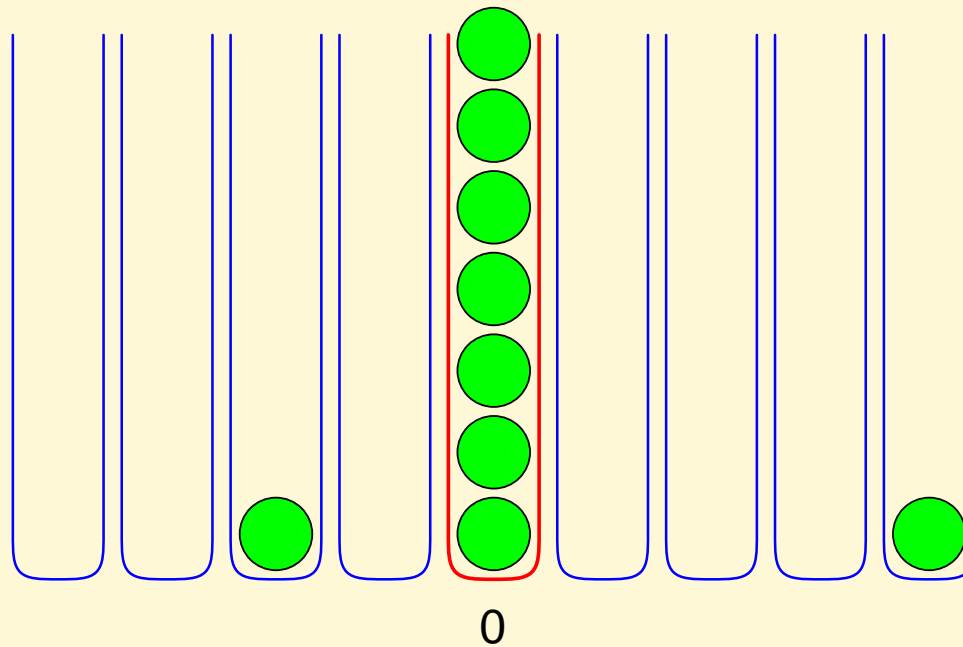
## Energetic walks

## Long-range energy correlations

# First-passage times

- Event with  $k$  walkers at distinguished site 0:

$$S_k := \left\{ \mathbf{s} : \sum_i \delta(s_i, 0) = k \right\} = \{k \text{ walkers at site } 0\}$$



- When **first** arrive at  $S_k$ ? mean **first-passage** time  $\tau_k^{\text{FP}}$
- **Random** initial conditions outside  $S_k$

## Diffusive rare events

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## First-passage times

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# First-passage times: results

Diffusive rare events

## First-passage times

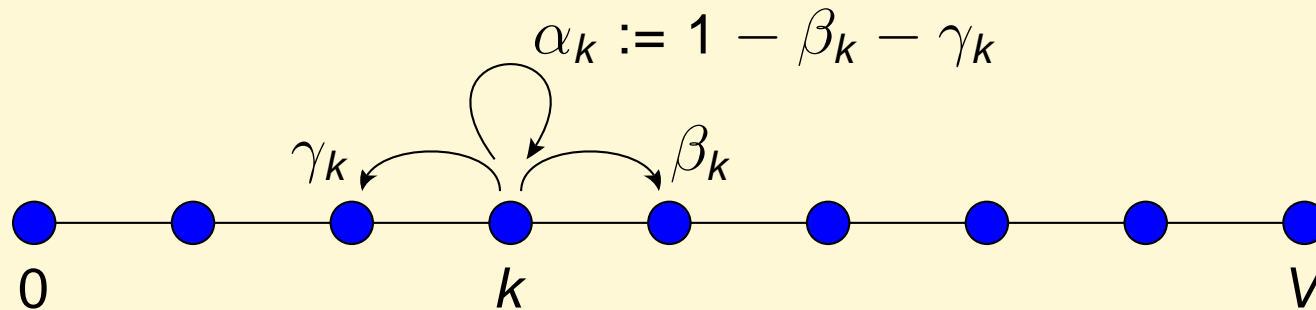
- Mean field
- Recurrence
- Asymptotics
- Comparison
- Anywhere
- Summary

Energetic walks

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# Exact results: mean-field

- Walkers jump to **any** site: Ehrenfest urn model
- Dynamics of  $n_0$  is Markov chain:



$$\gamma_k = \frac{k}{N}; \quad \beta_k = \frac{N-k}{N} \frac{1}{V-1}$$

- Conditioning gives **recurrence relation**:

$$\tau_k^+ = \alpha_k(1 + \tau_k^+) + \beta_k(1 + \tau_{k+1 \rightarrow k+1}) + \gamma_k(1 + \tau_{k-1 \rightarrow k+1})$$

$$\tau_k^+ = \frac{1}{\beta_k} + \frac{\gamma_k}{\beta_k} \tau_{k-1}^+$$

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# First-passage and recurrence

□ **Recurrence time**  $\tau_A^{\text{rec}}$  = time from  $A \rightarrow A$

□ From  $S_k$  almost certainly drop to  $S_{k-1}$

□ Reach “random” condition, then **first-passage** process:

$$\begin{aligned}\tau_k^{\text{rec}} &\simeq [1 \times \mathbb{P}(\text{stay})] + [\tau_k^{\text{FP}} \times \mathbb{P}(\text{leave})] \\ &\simeq 1 + \gamma_k(\tau_k^{\text{FP}} - 1)\end{aligned}$$

□ **Exact relation** for mean-field:

$$\tau_k^{\text{rec}} = 1 + \beta_k \tau_{k+1}^- + \gamma_k \tau_{k-1}^+$$

□ Approx:

$$\tau_k^{\text{FP}} \simeq \frac{\tau_k^{\text{rec}}}{\gamma_k}$$

## Diffusive rare events

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- Kac recurrence theorem:

$$\tau_A^{\text{rec}} = \frac{1}{\mathbb{P}(A)}$$

- Apply to  $S_k$ :

$$\tau_k^{\text{rec}} = \frac{1}{|S_k| / |\Omega|} = \frac{V^N}{\binom{N}{k} (V-1)^{N-k}}$$

- **Asymptotics:** large  $N, V$ ; fixed  $\rho = N/V$ ; fixed  $\rho \ll k \ll N$

$$\tau_k^{\text{rec}} \sim k! \rho^{-k} \exp(\rho)$$

- First-passage asymptotics:

$$\frac{1}{N} \tau_k^{\text{FP}} \simeq (k-1)! \rho^{-k} \exp(\rho)$$

Diffusive rare events

First-passage times

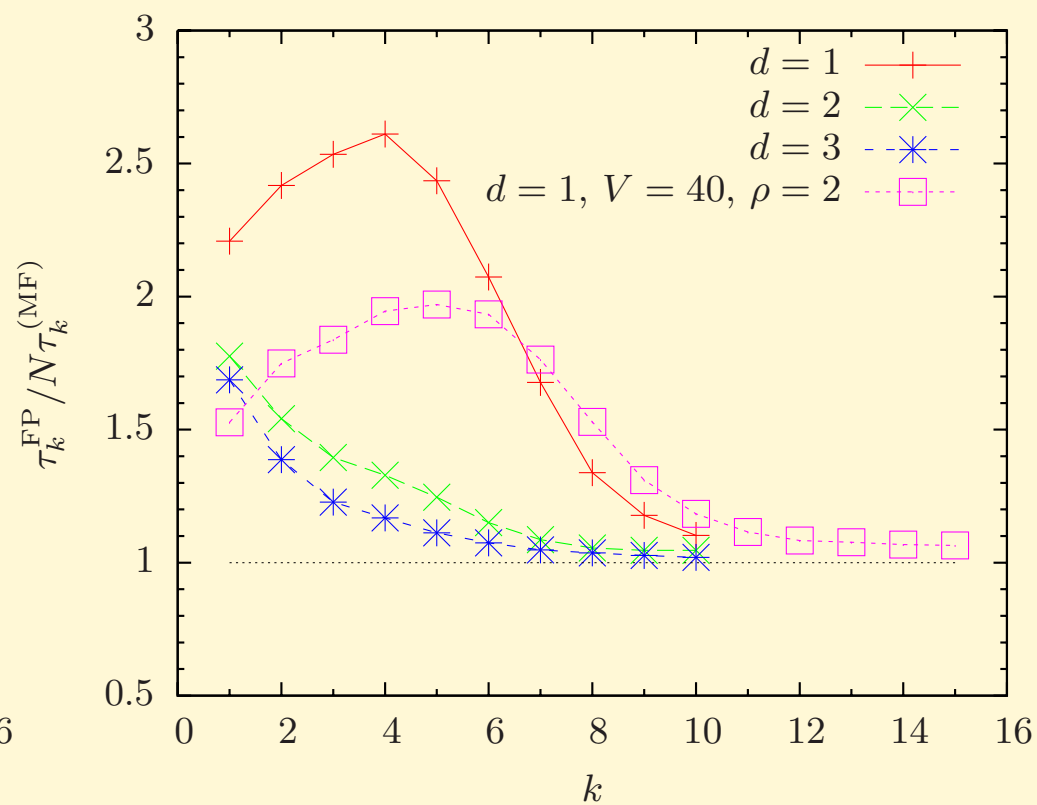
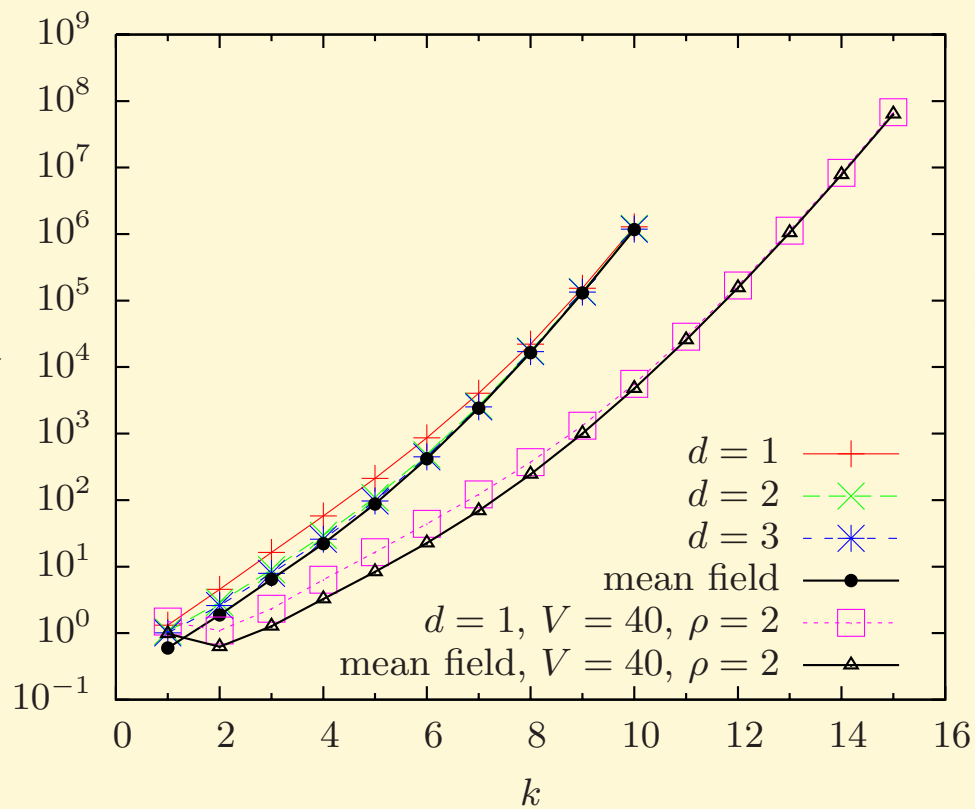
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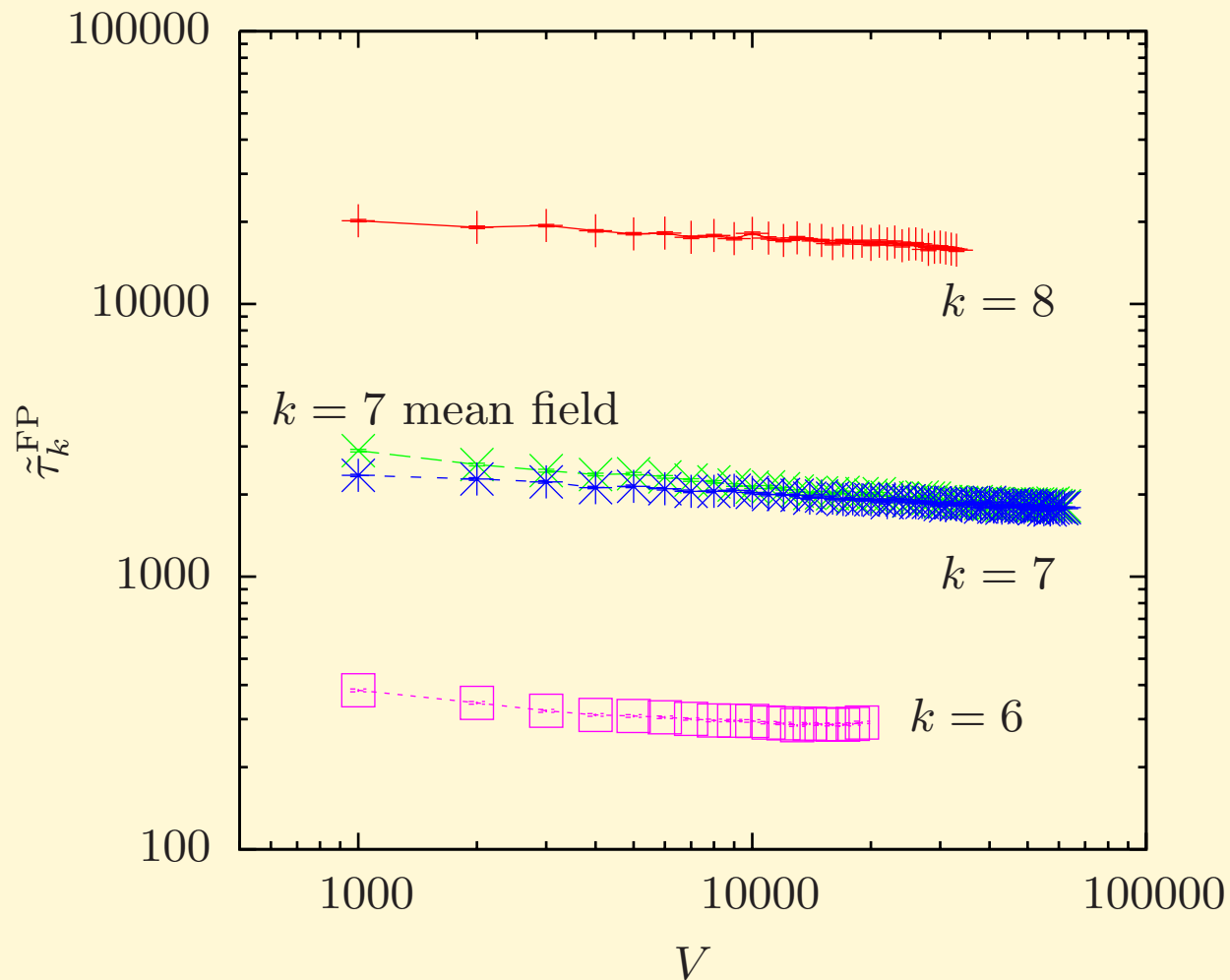
Energetic walks

Long-range energy correlations



# Rare events anywhere in system

- ❑ What if fluctuation can occur **anywhere** in system?
- ❑ Set  $\tilde{S}_k$  roughly  $V$  times larger



Diffusive rare events

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Energetic walks

Long-range energy correlations

- ❑ Asymptotic first-passage time to density fluctuations
- ❑ Mean-field and spatial cases similar
- ❑ Fluctuations anywhere in system
  
- ❑ **Open questions**
  - Good algorithm for diffusive rare events
  - Exact results for fluctuations anywhere in system

## Diffusive rare events

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## Energetic walks

### Long-range energy correlations

# Energetic random walks

Diffusive rare events

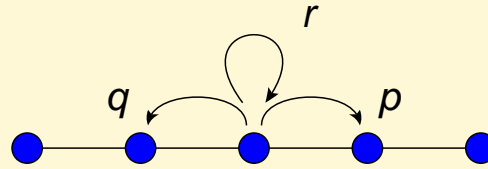
First-passage times

**Energetic walks**

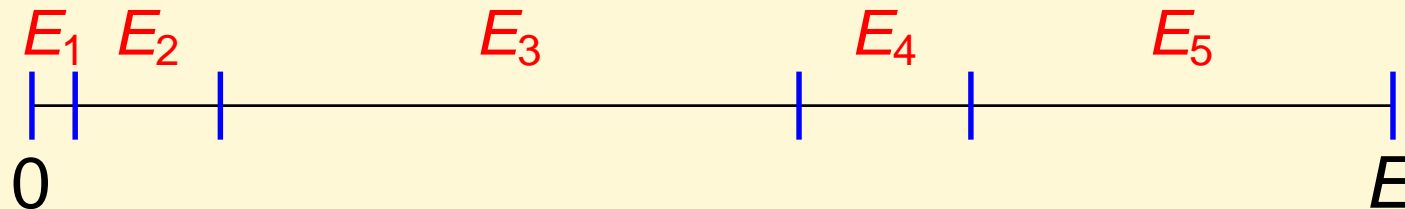
- Walkers with energy
- Reservoirs
- Equilibrium
- Profiles

Long-range energy correlations

# Random walkers with energy



- ❑ Particles: random walks
- ❑ Carry continuous “energy”; motion unaffected by energy
- ❑ Related to **random-halves** model (Eckmann, Young, Lin)
- ❑ Energy  $E$  redistributed **microcanonically** among  $n$  particles:
- ❑ Insert  $n - 1$  partitions randomly



- ❑ Particle energy distribution:

$$\mathbb{P}(E_1 > e) = \left( \frac{E - e}{E} \right)^{n-1}$$

Diffusive rare events

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- ❑ Reservoirs with densities  $\rho_0, \rho_{L+1}$ ; temperatures  $T_0, T_{L+1}$
- ❑ Number of particles visible in reservoir with density  $\rho$ :

$$\mathbb{P}(n) = \exp(-\rho) \frac{\rho^n}{n!}$$

- ❑ Energy of particles from reservoir at temperature  $T$ :

$$\mathbb{P}(E) = \frac{1}{T} e^{-E/T}$$

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- Equilibrium conditions:  $\rho_0 = \rho_{L+1}; \quad T_0 = T_{L+1}$
- In equilibrium, whole joint distribution **factorises**:

$$P(\mathbf{E}; \mathbf{n}) = \prod_{i=1}^L P(n_i)P(E_i|n_i)$$

- Energy distribution: sum of independent random variables:

$$P(E|n) = \frac{\beta^n E^{n-1} e^{-\beta E}}{\Gamma(n)}$$

Diffusive rare events

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# Density and energy profiles

□ Density profile:  $\rho_i := \langle n_i \rangle$

$$\rho_i^{t+1} = p\rho_{i-1}^t + r\rho_i^t + q\rho_{i+1}^t$$

□ Energy profile:

$$\langle E_i \rangle_{t+1} = p \langle E_{i-1} \rangle_t + r \langle E_i \rangle_t + q \langle E_{i+1} \rangle_t$$

□ Non-equilibrium **steady state**:  $\langle E_i \rangle =: \rho_i T_i$

$$p\rho_{i-1} T_{i-1} + r\rho_i T_i + q\rho_{i+1} T_{i+1} = \rho_i T_i$$

□ Non-equilibrium joint distribution  $P(\mathbf{E}; \mathbf{n})$  **does not factorise**

Diffusive rare events

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# Long-range energy correlations

Diffusive rare events

First-passage times

Energetic walks

**Long-range energy correlations**

- Previous work
- Correlations
- Correlations II
- Local equilibrium
- Numerics
- Comparison
- Scaling
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- ❑ Fluctuating hydrodynamics, experiments (Dorfman, Kirkpatrick, Sengers  $\sim$  1980)
- ❑ Mode-coupling theory
- ❑ Oscillator chain (Kipnis et al., 1982)
- ❑ Stochastic lattice gas (Spohn, 1983)
- ❑ Lattice-gas cellular automaton (Boon et al., 1996)
- ❑ Random-halves model (Lin & Young, 2007)

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# Spatial correlations of energy

## □ Spatial correlations

$$C_{i,j} := \langle E_i E_j \rangle - \langle E_i \rangle \langle E_j \rangle$$

## □ Notation:

$$(\Delta_1 C)_{i,j} := pC_{i-1,j} + rC_{i,j} + qC_{i+1,j}$$

## □ Find in **steady state**

$$\langle E_i \rangle = \Delta_1 \langle E_i \rangle$$

$$\langle E_i \rangle \langle E_j \rangle = \Delta_1 \Delta_2 [\langle E_i \rangle \langle E_j \rangle]$$

## □ From site $i$ , energy $s_i^+$ , $s_i^-$ and $l_i^+$ , $l_i^-$ particles move right, left

$$\begin{aligned} \langle E_i E_j \rangle = & \left\langle \left[ E_i + (s_{i-1}^+ + s_{i+1}^-) - (s_i^+ + s_i^-) \right] \right. \\ & \left. \times \left[ E_j + (s_{j-1}^+ + s_{j+1}^-) - (s_j^+ + s_j^-) \right] \right\rangle \end{aligned}$$

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- Evaluate products:

$$\langle s_{i-1}^+ s_{j+1}^+ \rangle = \langle s_{i-1}^+ \rangle \langle s_{j+1}^+ \rangle \quad \text{provided} \quad i - 1 \neq j + 1$$

$$\langle s_i^+ | E_i, l_i^+, n_i \rangle = \frac{l_i^+}{m_i} E_i; \quad \langle s_i^{+2} | E_i, l_i^+, n_i \rangle = \frac{l_i^+ (l_i^+ + 1) E_i^2}{n_i (n_i + 1)}$$

- Finally obtain:

$$C_{i,j} = \Delta_1 \Delta_2 C_{i,j} + 2\nu_{ij}$$

- Define **long-range** part

$$g_{i,j} := C_{i,j} - 2\kappa_i \delta_{ij}$$

- Then

$$g_{i,j} = \Delta_1 \Delta_2 g_{i,j} + 2\mu_i \delta_{ij}$$

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- Source of long-range correlations:

$$\mu_i := p\kappa_{i-1} + q\kappa_{i+1} + (r - 1)\kappa_i$$

with

$$\kappa_i := \left\langle \frac{E_i^2}{n_i + 1} \right\rangle$$

- Assume **local equilibrium** for marginal distribution at site  $i$  (Ravishankar & Young, 2007)

$$\kappa_i = \rho_i T_i^2 = \frac{\rho_i}{\beta_i^2}$$

- Source  $\mu_i$  assuming local equilibrium:

$$\mu_i \simeq 2D\rho(x)[\nabla T(x)]^2$$

Diffusive rare events

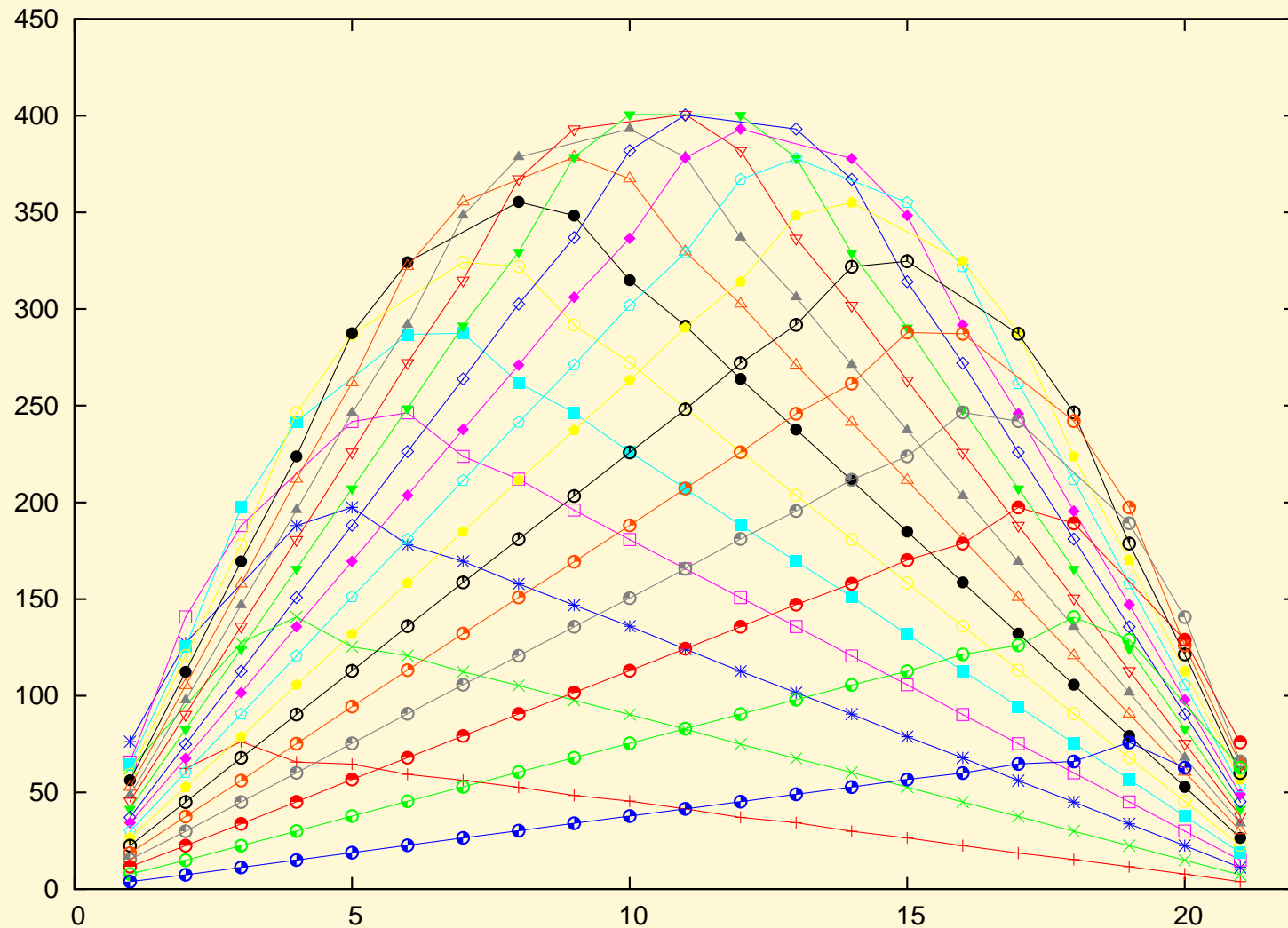
First-passage times

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# Numerical: $L = 21$ , no density gradient



Diffusive rare events

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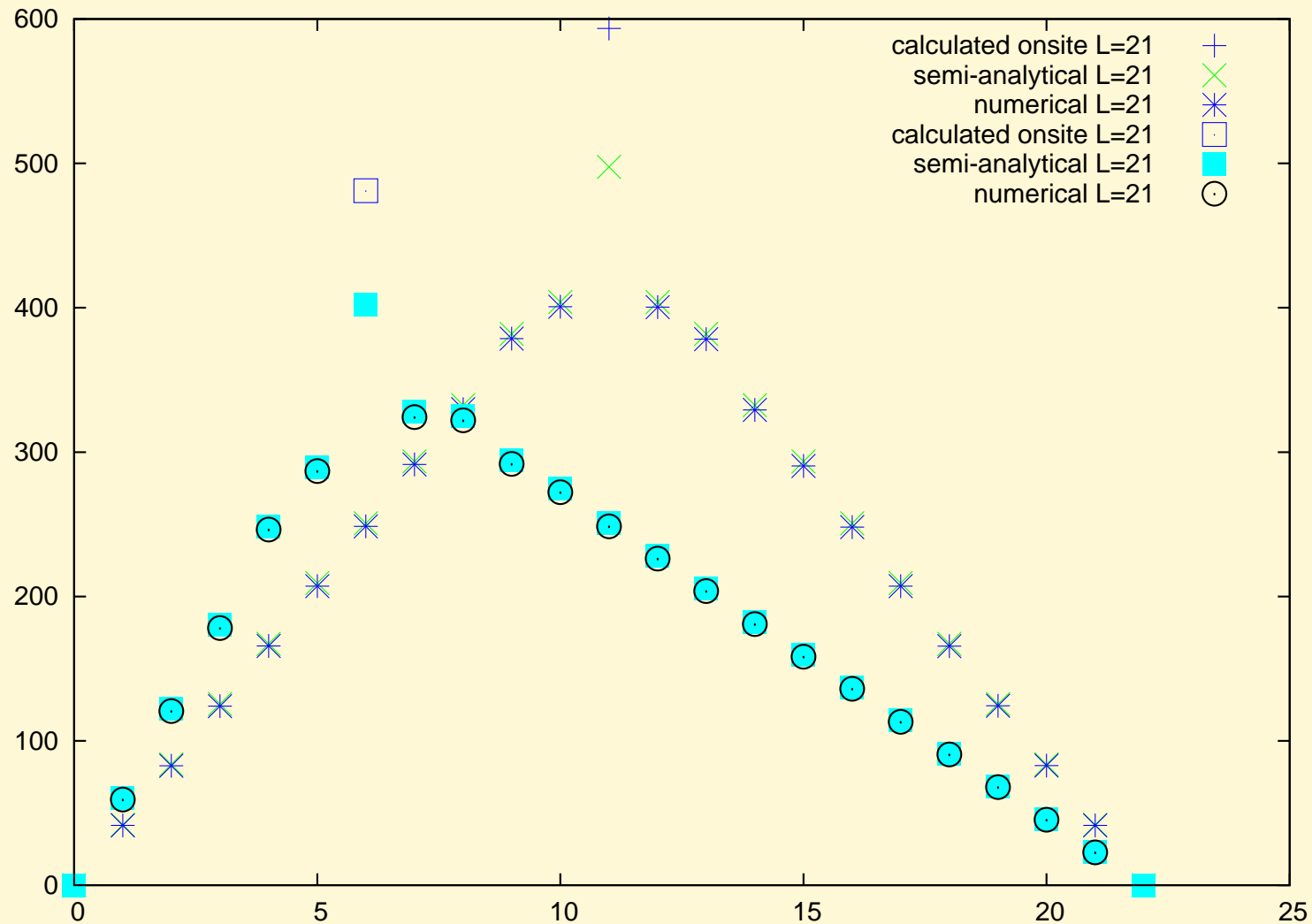
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# Comparison of numerics with analytical



Diffusive rare events

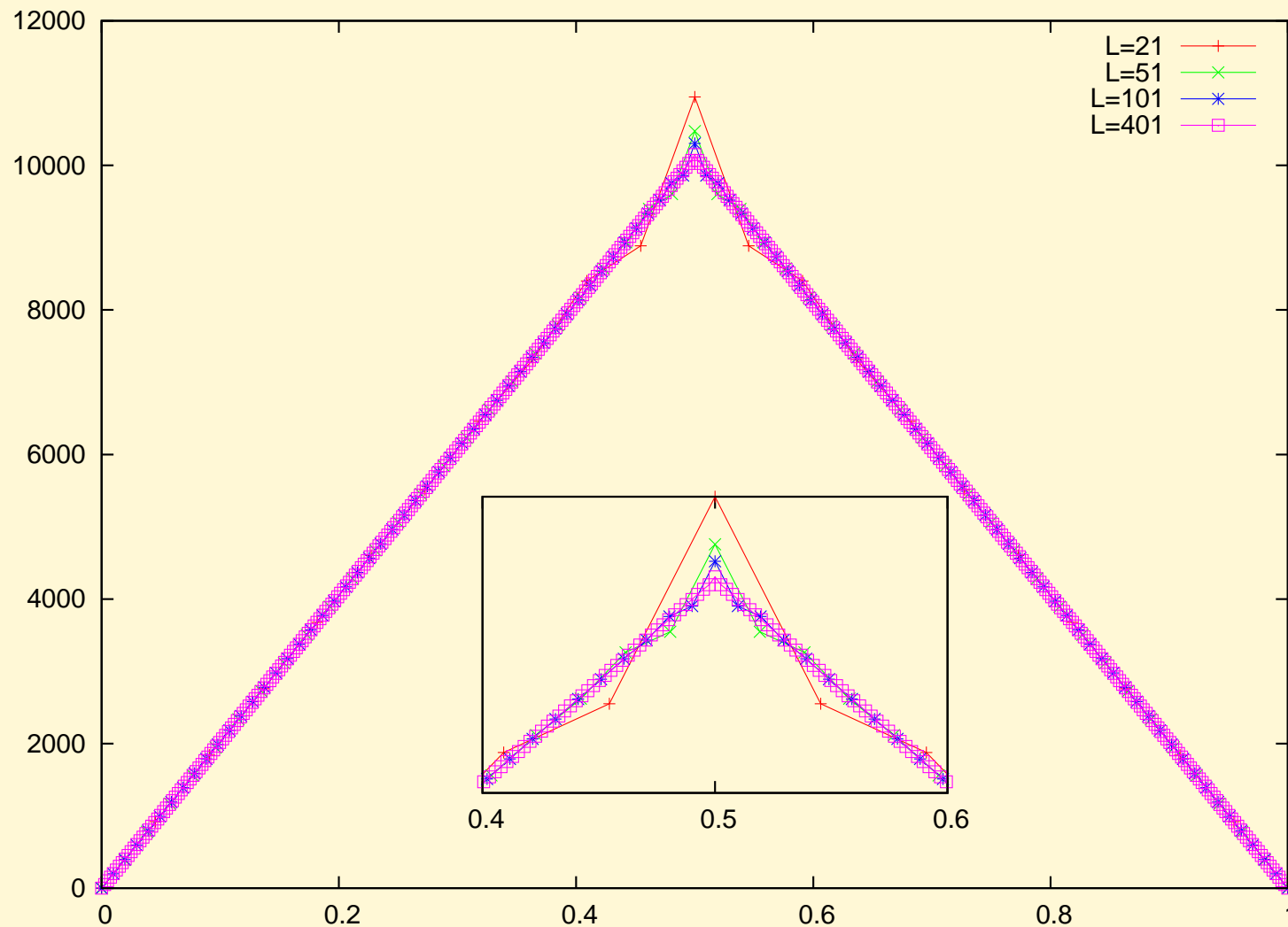
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# Scaling with system size (semi-analytical)



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● **Scaling**

● Summary

- ❑ Exact equation for spatial energy correlations
- ❑ Local equilibrium assumption agrees with numerics
- ❑ **Open questions:**
  - Exact solution of correlation equation
  - Case where dynamics depends on energy
- ❑ **Money:**
  - PROFIP programme  
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# Appendix

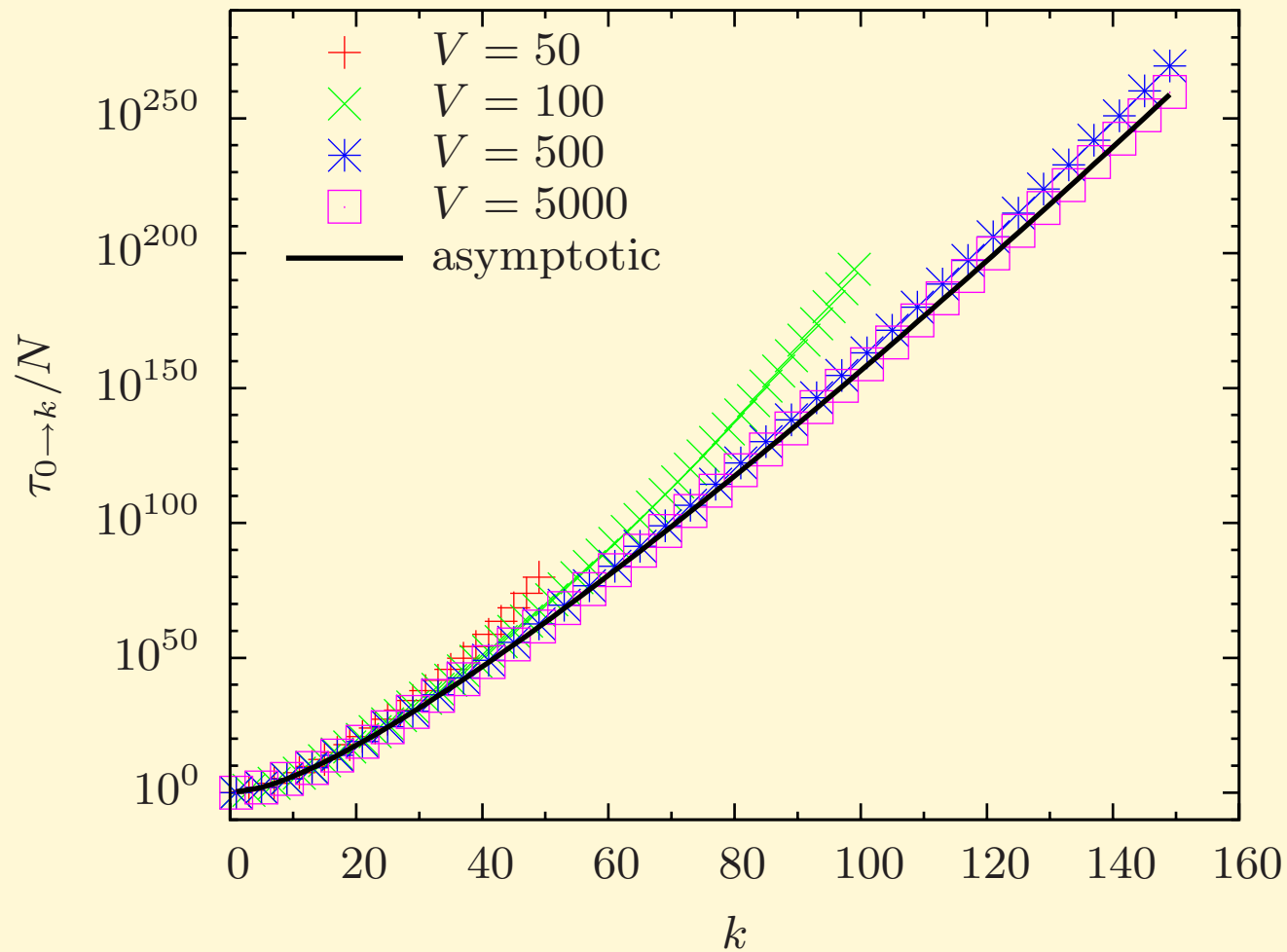
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# Exact mean-field and asymptotics



Diffusive rare events

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$$\begin{aligned}
 P_{t+1}(n_1, E_1; n_2, E_2; \dots; n_L, E_L) = & \\
 & \sum_{\{m_i\}} \sum_{\{l_i^\pm\}} \int_{\{e_i\}} d e_i \int_{\{s_i^\pm\}} d s_i^\pm P_t(m_1, e_1; m_2, e_2; \dots; m_L, e_L) \\
 & \times \prod_i \delta(n_i - [m_i + (l_{i-1}^+ + l_{i+1}^-) - (l_i^+ + l_i^-)]) \\
 & \times \prod_i \delta(E_i - [e_i + (s_{i-1}^+ + s_{i+1}^-) - (s_i^+ + s_i^-)]) \\
 & \times \prod_i \mathbb{P}(s_i^+, s_i^- | l_i^+, l_i^-, m_i, e_i) \times \prod_i \mathbb{P}(l_i^+, l_i^- | m_i)
 \end{aligned}$$

$$\mathbb{P}(l_i^+, l_i^- | m_i) := \binom{m_i}{l_i^+} \binom{m_i - l_i^+}{l_i^-} p^{l_i^+} q^{l_i^-} r^{m_i - l_i^+ - l_i^-}$$

$$\mathbb{P}(s_i^+, s_i^- | l_i^+, l_i^-, m_i, e_i) :=$$

$$\frac{\Gamma(m_i)}{\Gamma(l_i^+) \Gamma(l_i^-) \Gamma(m_i - l_i^+ - l_i^-)} (s_i^+)^{l_i^+ - 1} (s_i^-)^{l_i^- - 1} \frac{(e_i - s_i^+ - s_i^-)^{m_i - l_i^+ - l_i^- - 1}}{e_i^{m_i - 1}}$$

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