

# Branching random walks and Gaussian fields

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Weizmann Institute  
and  
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## Lectures I,II - Branching random walks in $Z$ - maximal displacement

- Model
- Law of large numbers: comparison with independent walks, first and second moments.
- The Dekking-Host argument and tightness.
- Logarithmic corrections for the mean - the lower bound.

## Lecture III - Maximal displacement - ct'd

- Logarithmic corrections - upper bound.
- Time varying profiles. Phase transitions and non-logarithmic corrections.

## Lectures IV,V - the 2D Gaussian free field

- Model and Markov property; maxima.
- Basic inequalities: Slepian, Borell-Tsirelson, Sudakov-Fernique.
- LLN for maxima - upper bound and approximate tree structure.
- The Dekking-Host argument adapted.
- Expectation of maximum: comparison and modified BRW.
- Analysis of MBRW

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# Branching Random Walks

$\mathcal{T}$  - tree rooted at  $o$ .

$|v|$  - distance of  $v$  from root.  $d_v$  - degree of  $v$ .

$D_n := \{v \in V : |v| = n\}$  ( $n$ th generation).

$o \leftrightarrow v$  - vertices/edges on geodesic connecting  $o$  and  $v$ .

BRW model

$\{X_e\}_{e \in E}$  i.i.d., law  $\mu$ .

$S_v = \sum_{e \in o \leftrightarrow v} X_e$  sum along geodesic (BRW).

Maximal displacement:

$$M_n = \max_{v \in D_n} S_v.$$

Assumptions (for these lectures):

$\mu$  possesses super-exponential tails:

$$E_\mu(e^{\lambda X_e}) =: e^{\Lambda(\lambda)} < \infty, \quad \lambda \in \mathbb{R}.$$

The tree  $\mathcal{T}$  is a  $k$ -ary tree, with  $k \geq 2$ :  $d_v = k + 1_{v \neq o}$ .

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