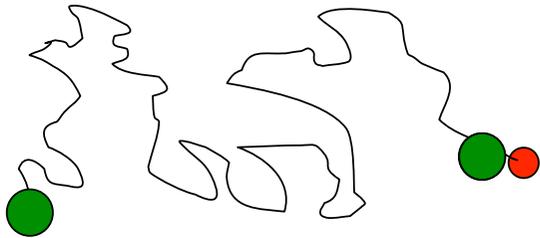


# First-passage times and reaction kinetics in confined media

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# First-passage statistics : First definitions



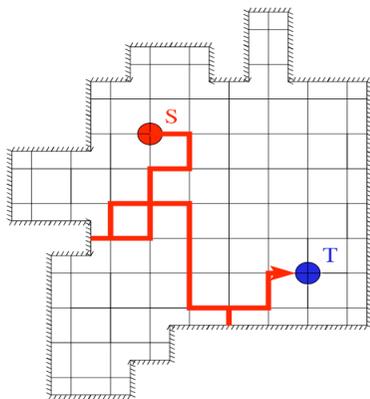
How long does it take a **random walker** to reach a **target site** ?

➔ **First-passage time**

Many physical processes are controlled by **first-encounter** properties :

- Microscopic scale: diffusion limited reactions
- Macroscopic scale: search processes (animals looking for food ...)

$\langle T \rangle$  : mean first-passage time (MFPT) of a **symmetric** random walker



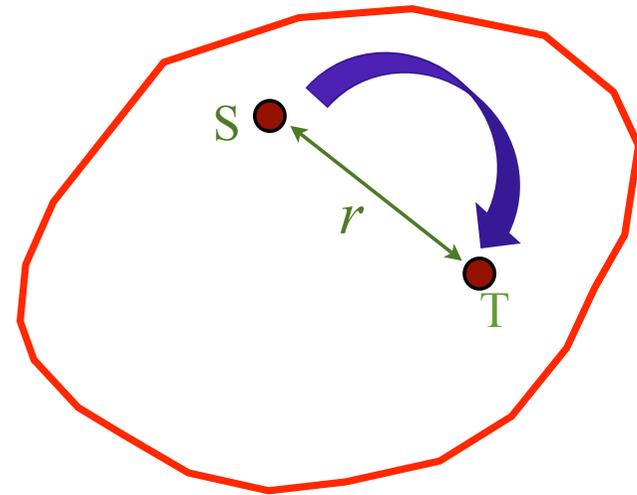
- In absence of confinement :  $\langle T \rangle = \infty$
- In presence of confinement :  $\langle T \rangle < \infty$

**How does  $\langle T \rangle$  depend on the confinement and on the transport process?**

# Experimental context :

## Reactivity in confined media

Example : biomolecules (DNA-binding protein) reacting at a **specific location (specific gene)** in a cell



How  $\langle \mathbf{T} \rangle$  depends on

1. the **confining volume  $N$**  ?

$$\lim_{N \rightarrow \infty} \langle \mathbf{T} \rangle = \infty, \text{ but how } \langle \mathbf{T} \rangle \text{ grows with } N ?$$

2. the **distance  $r$**  between S and T ?

Is the **initial position** of the reactant an **important parameter** of the **kinetics** ?

3. the **transport process** ?

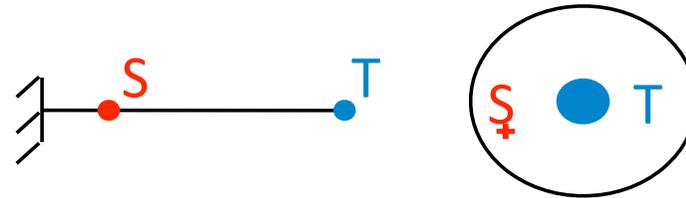
Effects of crowding, anomalous diffusion...

# Theoretical context:

[highly non-exhaustive biblio...]

(quasi) 1D geometries

[Redner...]



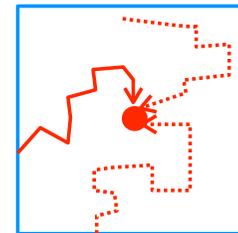
Main ingredient : backward equation.

$$\Delta_S \langle \mathbf{T} \rangle_S = -1 \quad \text{with} \quad \langle \mathbf{T} \rangle_{S=T} = 0; \quad \partial_S \langle \mathbf{T} \rangle_{S \in \text{bound.}} = 0$$

follows from  $\langle \mathbf{T} \rangle_S = 1 + \frac{1}{2} (\langle \mathbf{T} \rangle_{S-1} + \langle \mathbf{T} \rangle_{S+1})$

Averages over starting point

[Montroll...]

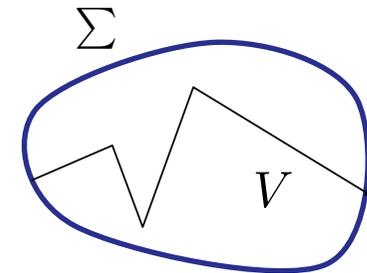


# Mean *return* times

Blanco, Fournier (2003), Mazzolo (2004) :

Pearson walk of velocity  $v$ , and reorientation rate  $\lambda$

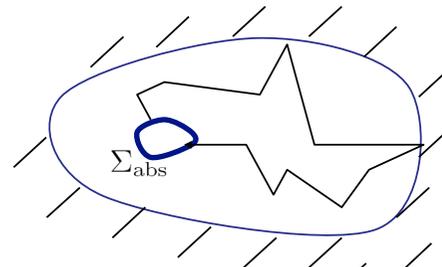
$$\langle t_1 \rangle_{\Sigma} = \frac{\eta_d V}{v \Sigma} \longrightarrow \text{Independent of } \lambda !$$



Generalizations using **Backward Chapman-Kolmogorov equation**

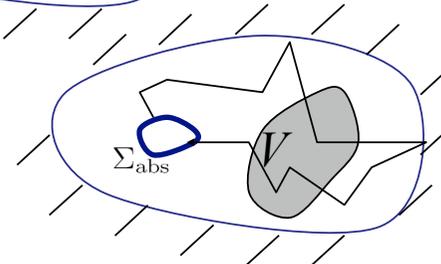
- **General boundary conditions**

$$\langle t_1 \rangle_{\Sigma_{\text{abs}}} = \frac{\eta_d V}{v \Sigma_{\text{abs}}}$$



- **Residence time in a subdomain  $V'$**

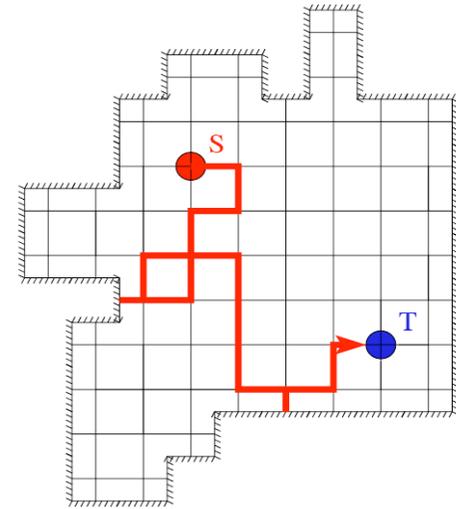
$$\langle \tau_1 \rangle_{\Sigma_{\text{abs}}} = \frac{\eta_d V'}{v \Sigma_{\text{abs}}}$$



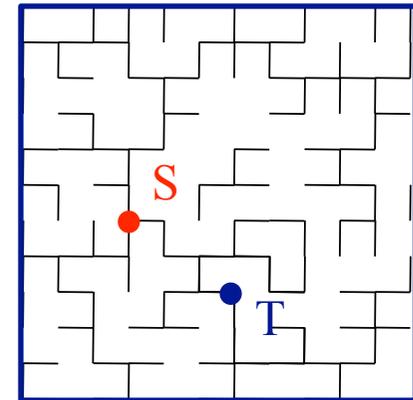
Discrete case : **KAC formula (1947)**  $\langle \mathbf{T} \rangle_{\text{return}} = 1/P_{\text{stat}} = N$

# Outline

I MFPTs of **simple** random walks



II MFPTs in **complex** scale-invariant systems



# An exact formula for MFPTs

“Renewal equation” : relates

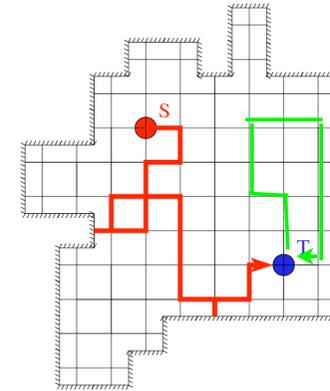
the propagator  $W(\mathbf{r}, t|\mathbf{r}')$

the first-passage time density  $P(\mathbf{r}, t|\mathbf{r}')$

$$W(\mathbf{r}_T, t|\mathbf{r}_S) = \int_0^t P(\mathbf{r}_T, t'|\mathbf{r}_S) W(\mathbf{r}_T, t - t'|\mathbf{r}_T) dt'$$

↑  
first visit of T at  $t'$

←  
return at T in  $t-t'$



$$\langle \mathbf{T} \rangle = N(H(\mathbf{r}_T|\mathbf{r}_T) - H(\mathbf{r}_T|\mathbf{r}_S)) \quad [\text{Noh \& Rieger (PRL 2004)}]$$

where  $H(\mathbf{r}|\mathbf{r}') = \int_0^\infty (W(\mathbf{r}, t|\mathbf{r}') - 1/N) dt$   $\longrightarrow$  Exact, but **formal** expression of the MFPT

$\longrightarrow$  **How to go further ???**

# Large volume asymptotics

$$\lim_{N \rightarrow \infty} \langle \mathbf{T} \rangle / N = \lim_{N \rightarrow \infty} (H(\mathbf{r}_T | \mathbf{r}_T) - H(\mathbf{r}_T | \mathbf{r}_S))$$

with  $\lim_{N \rightarrow \infty} H(\mathbf{r}_T | \mathbf{r}') = \int_0^\infty W_0(\mathbf{r}, t | \mathbf{r}') dt = \text{infinite-space Green function}$

$$\longrightarrow \langle \mathbf{T} \rangle \simeq N(G_0(0) - G_0(r))$$

$\longrightarrow \langle \mathbf{T} \rangle$  is **proportional to the confining volume  $N$**

(This is not a severe infinite-space approximation of the MFPT !)

$\longrightarrow$  **Explicit dependence in the source-target distance  $r$**

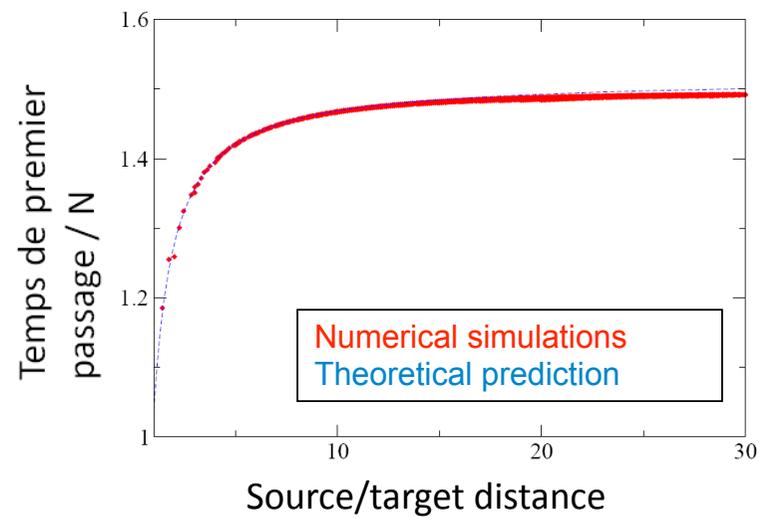
If  $d=3$ ,  $\langle \mathbf{T} \rangle \simeq N \left( G(0) - \frac{3}{2\pi r} \right)$  with  $G(0) = 1.516386\dots$

If  $d=2$ ,  $\langle \mathbf{T} \rangle \simeq N \left( \frac{3}{\pi} \ln 2 + \frac{2\gamma}{\pi} + \frac{2}{\pi} \ln r \right)$

# 3D Lattice Random Walks

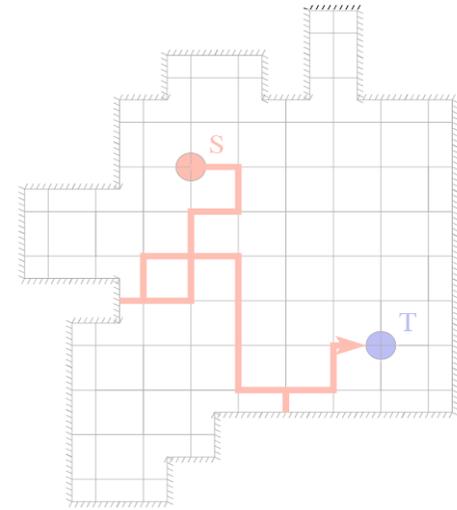
[Condamin et al. PRL (2005)]

$$\langle \mathbf{T} \rangle \simeq N \left( G_0(0) - \frac{3}{2\pi r} \right)$$

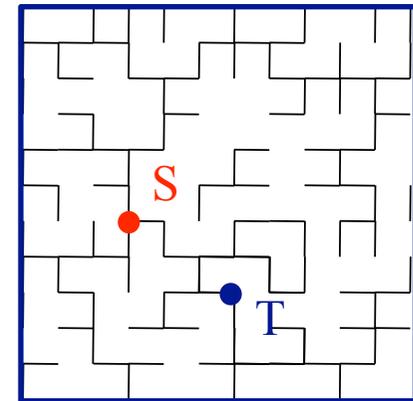


# Outline

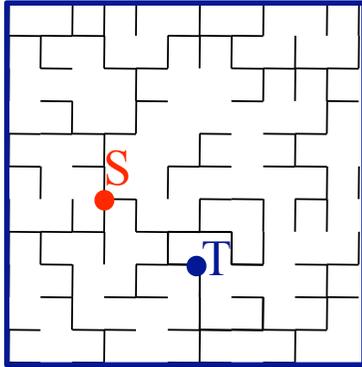
I MFPTs of **simple** random walks



II MFPTs in **complex** scale-invariant systems



# Other transport mechanisms ?



Example of a **percolation** cluster in **confinement**

→ MFPT to go from S to T ?

- **Renewal equation**

$$\langle \mathbf{T} \rangle = N(H(\mathbf{r}_T|\mathbf{r}_T) - H(\mathbf{r}_T|\mathbf{r}_S)) \quad \text{where} \quad H(\mathbf{r}|\mathbf{r}') = \int_0^\infty (W(\mathbf{r}, t|\mathbf{r}') - 1/N) dt$$

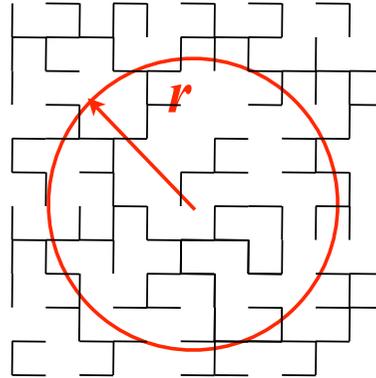
- **Large volume asymptotics of the MFPT**

$$\lim_{N \rightarrow \infty} \frac{\langle \mathbf{T} \rangle}{N} = G(0) - G(r) \quad \text{where} \quad G(|\mathbf{r} - \mathbf{r}'|) \equiv \int_0^\infty W_\infty(\mathbf{r}, t|\mathbf{r}') dt$$

to go further,

**assumptions** on the **infinite-space** propagator  $W_\infty(\mathbf{r}, t|\mathbf{r}')$  needed

# Assumptions on the infinite-space problem



- number of sites enclosed in a **circle of radius  $r$**  :  $M_r \propto r^{d_f}$   
where  $d_f$  is the **fractal dimension** of the medium
- time taken to a random walker to exit a **circle of radius  $r$**  :  $T_r \propto r^{d_w}$   
where  $d_w$  is the **dimension of the walk**
- standard **scaling assumption of the infinite-space propagator** :

$$W_\infty(\mathbf{r}, t | \mathbf{r}') \sim t^{-d_f/d_w} \Pi \left( \frac{|\mathbf{r} - \mathbf{r}'|}{t^{1/d_w}} \right)$$

[ben-Avraham and Havlin, (2000)]

# General scaling of the MFPT

[Condamin et al. Nature (2007)]

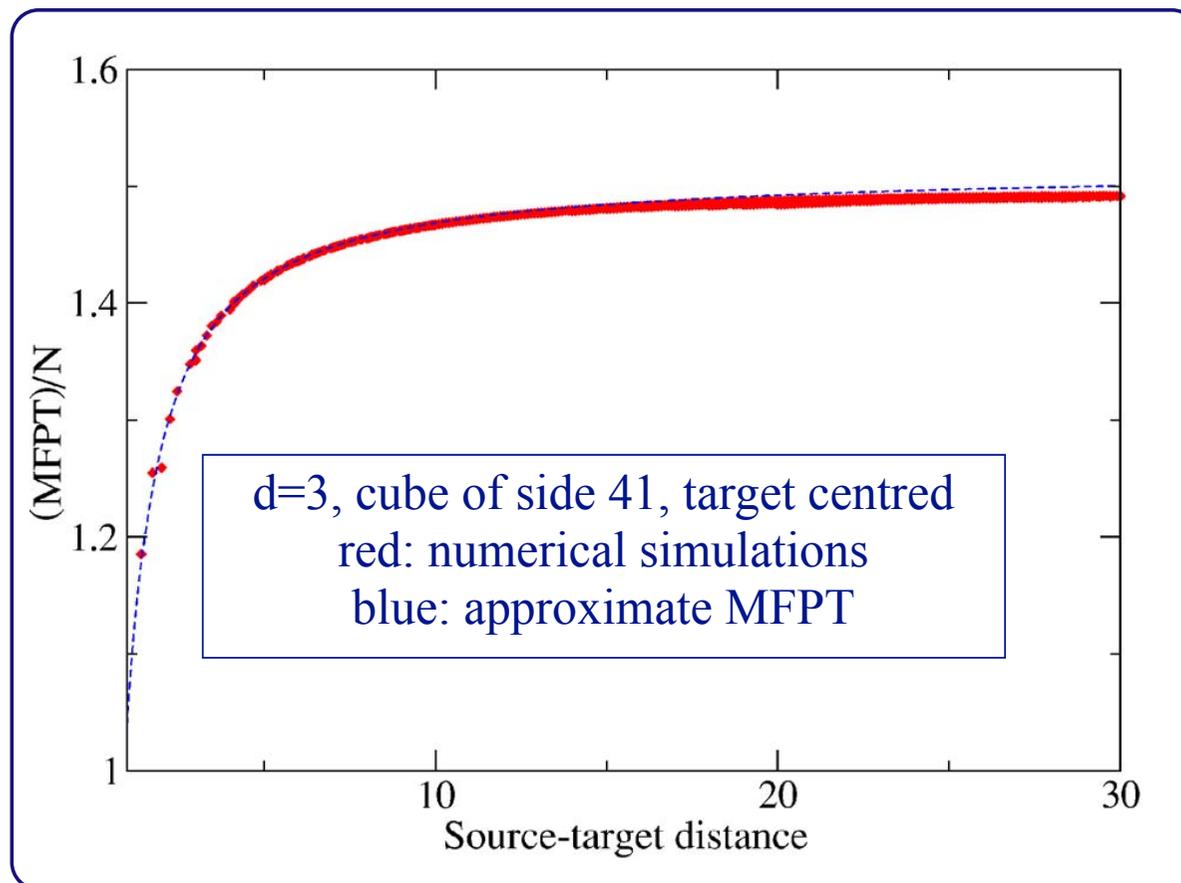
$$\langle \mathbf{T} \rangle \sim \begin{cases} N(A - Br^{d_w - d_f}) & \text{for } d_w < d_f \\ N(A + B \ln r) & \text{for } d_w = d_f \\ N(A + Br^{d_w - d_f}) & \text{for } d_w > d_f \end{cases}$$

- $A$  and  $B$  depend **only** on the infinite-space scaling function  $\Pi$
- **Linear dependence on the volume  $N$**
- **non-compact** exploration (  $d_w < d_f$  ): memory of the initial position **lost**
- **compact** exploration (  $d_w \geq d_f$  ): the **initial** position **always matters**

# 3D Lattice Random Walks

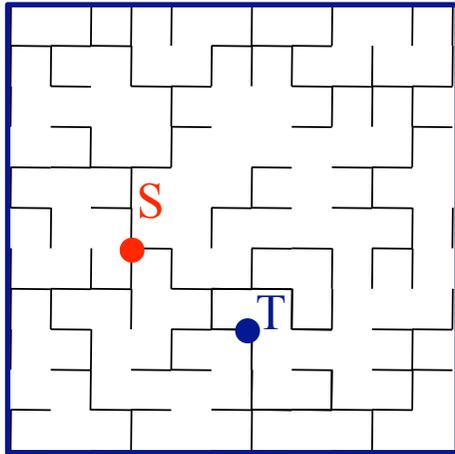
$$2 = d_w < d_f = 3$$

**Non compact exploration**



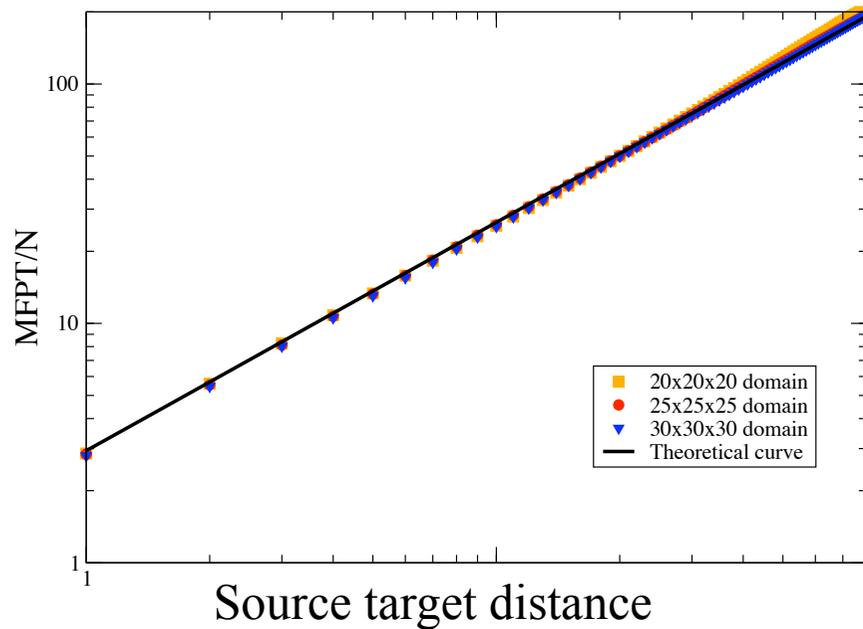
# Critical percolation clusters

[Condamin et al, PNAS (2008)]



$$d_w > d_f$$

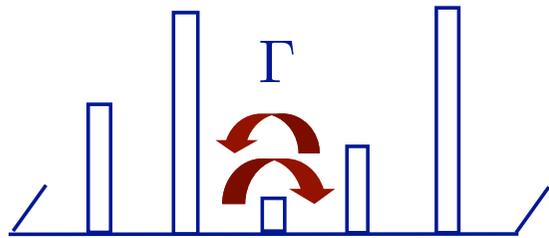
**Compact exploration**



$$\langle \mathbf{T} \rangle / N \sim A + Br^{d_w - d_f}$$

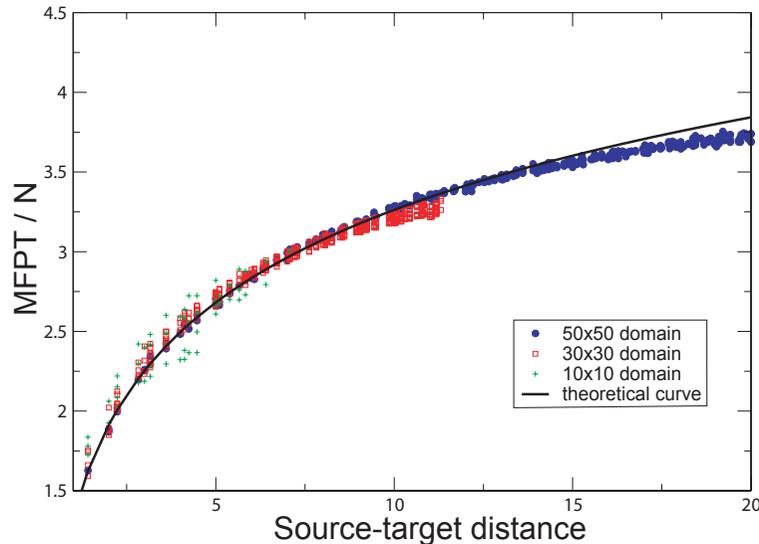
- data for different sizes collapse
- good agreement with the theoretical curve

# 2D Random barrier model



inhomogeneous  
transition rates  $\Gamma$   
(quenched disorder)

- power law distribution of transition rates:  $\rho(\Gamma) = (\alpha/\Gamma)(\Gamma/\Gamma_0)^\alpha$
- regular diffusion ( $d_w = 2$ ) in dimension 2 ( $d_f = 2$ )  
with  $D_{\text{eff}}$  given by the effective medium approximation



$$\langle \mathbf{T} \rangle / N \sim \left( A + \frac{1}{2\pi D_{\text{eff}}} \ln r \right)$$

## More about A and B:

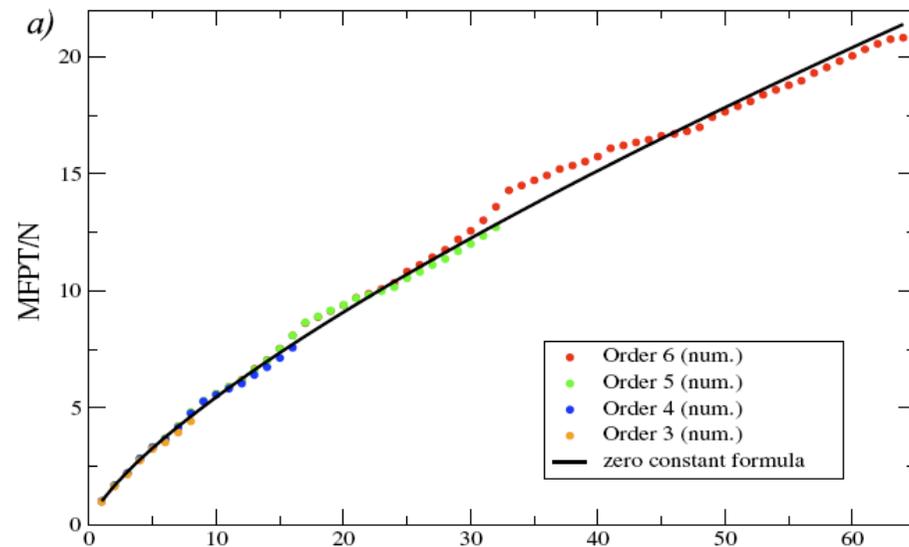
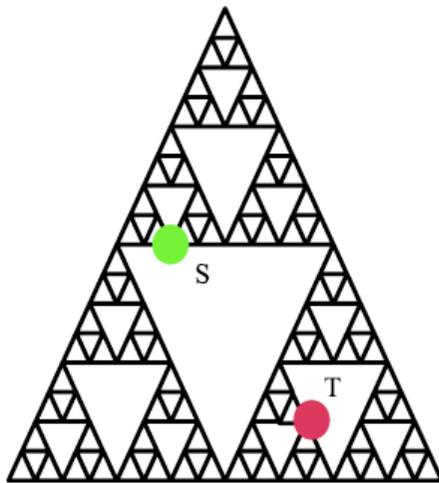
### “Zero” constant formula (compact case)

[Benichou et al. prl (2008)]

$$\langle \mathbf{T} \rangle / N \sim A + Br^{d_w - d_f} \quad \text{for } d_w > d_f$$

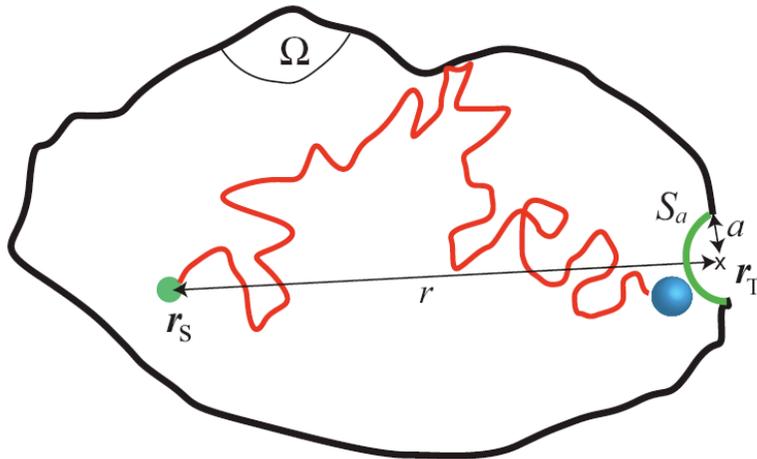
- Continuous space limit gives  $\langle \mathbf{T} \rangle(r \rightarrow 0) = 0$  and therefore  $A = 0$
- Kac formula gives  $\langle \mathbf{T} \rangle(r = 1) = N$  and therefore  $B = 1$

$$\text{Then } \langle \mathbf{T} \rangle / N \sim r^{d_w - d_f}$$



# Extension (i) : narrow escape time

[PRL 2008]



**Mean time to exit a bounded domain through a narrow aperture:**

$$\lim_{V \rightarrow \infty} \langle \mathbf{T} \rangle / V = \begin{cases} \alpha(a^{d_w - d_f} - r^{d_w - d_f}) & \text{for } d_w < d_f \\ \alpha \ln(r/a) & \text{for } d_w = d_f \\ \alpha(r^{d_w - d_f} - a^{d_w - d_f}) & \text{for } d_w > d_f \end{cases}$$

**Compact**  
exploration

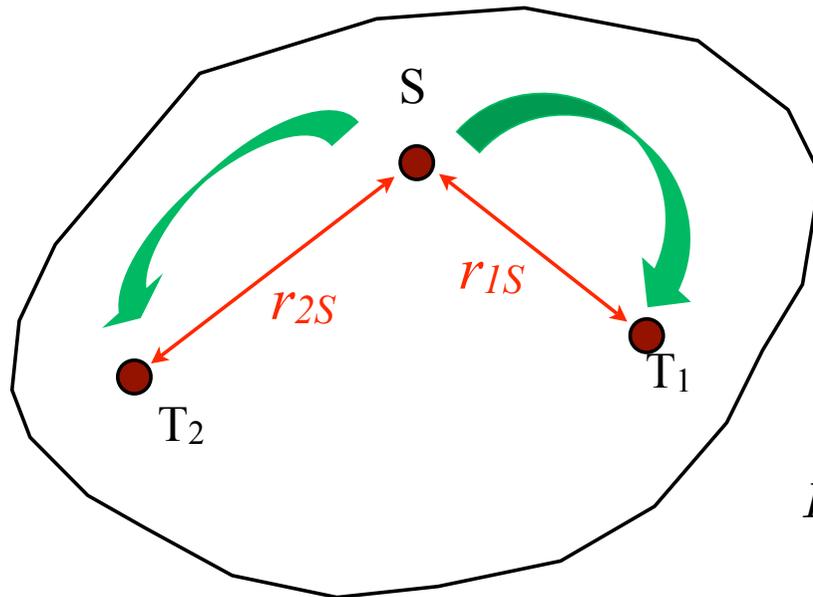
the starting point is important

**Non-compact**  
exploration

weak dependence on the starting  
point

# Extension (ii) : case of competitive reactions

[PNAS 2008]



**Splitting probability  $P_1$  :**  
probability to reach the target 1  
before the target 2 ?

$$P_1 \sim \frac{A + B(r_{2S}^{d_w - d_f} + r_{12}^{d_w - d_f} - r_{1S}^{d_w - d_f})}{2(A + Br_{12}^{d_w - d_f})}$$

**Compact**  
exploration

the **furthest** target is  
**almost never reached first**

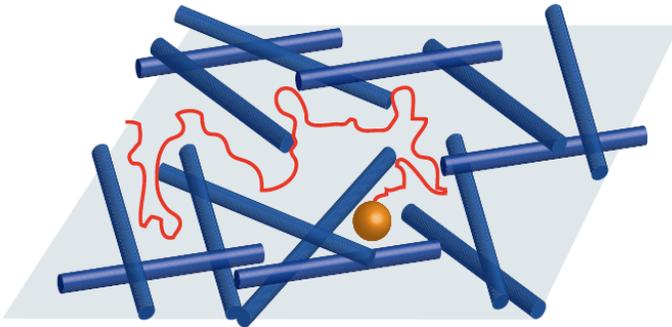
**Non-compact**  
exploration

the **furthest** target has a **finite**  
**probability to be reached first**

# FPTs and subdiffusion

[PNAS 2008]

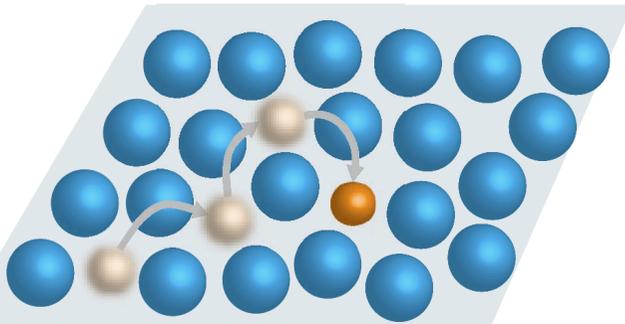
$$\langle \Delta \mathbf{r}^2 \rangle \sim t^\beta \text{ with } \beta < 1$$



**“Fractal” static medium**

$$\langle \mathbf{T} \rangle / N \sim r^{d_w - d_f}$$

$$\text{where } d_w = 2/\beta$$



**“Dynamic” crowded medium**

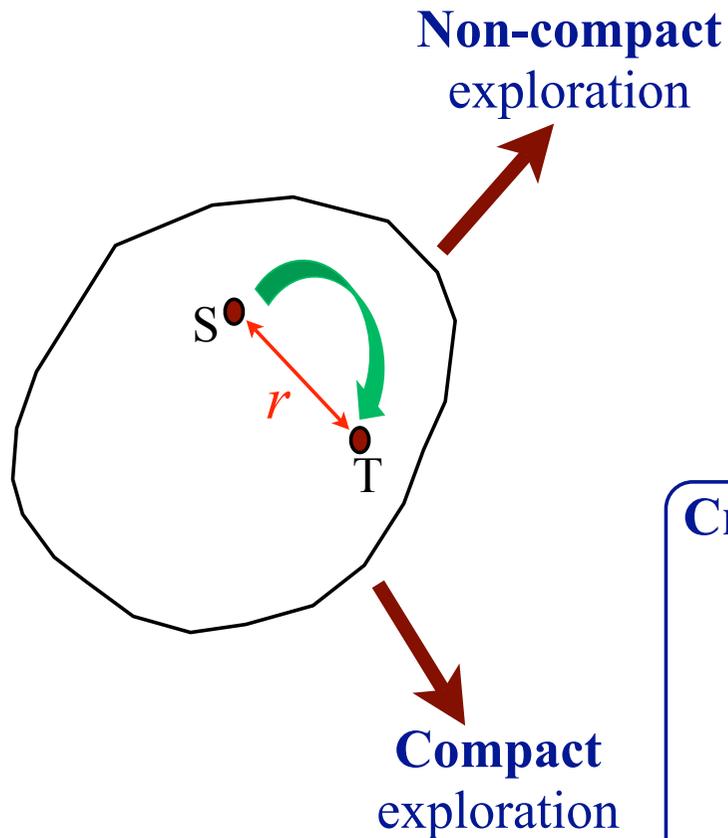
$$\text{Continuous Time RW } \psi(t) \sim C/t^{1+\beta}$$

$$\text{Prob.}(\mathbf{T} = t) \sim C \langle n \rangle / t^{1+\beta}$$

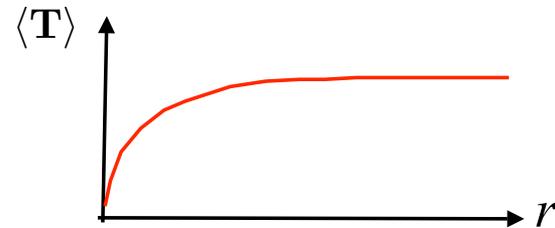
$$\text{where } \langle n \rangle \sim N(A - B/r) \quad (d = 3)$$

**Very different dependence on geometry**

# Concluding remarks: reactivity in confined media like cells?

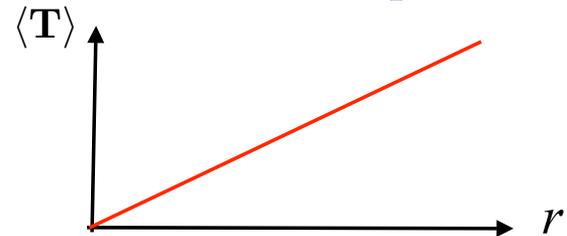


**Dilute medium (3d regular diffusion)**



**the initial position doesn't matter**

**Crowded medium (3d percolation cluster)**



**the initial position is a key parameter**

**→ spatial organization is crucial**

# Thanks

O. Benichou, M. Moreau, J. Klafter  
S. Condamin, V. Tejedor, B. Meyer, C. Chevalier