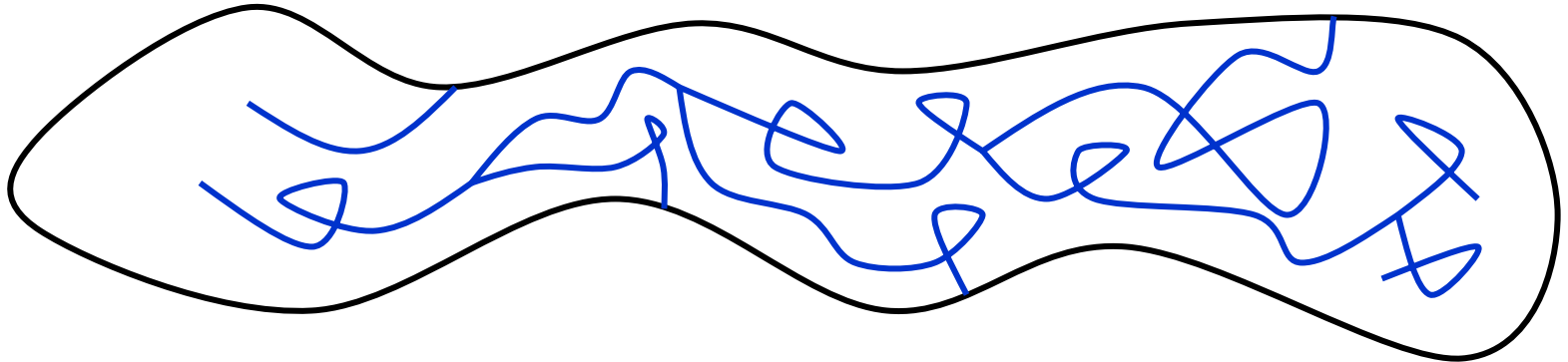


# **A particle representation for the heat equation solution**

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# Fleming-Viot model



$N$  = population size (constant in time )  
= ecological niche carrying capacity

Let  $N$  go to infinity.

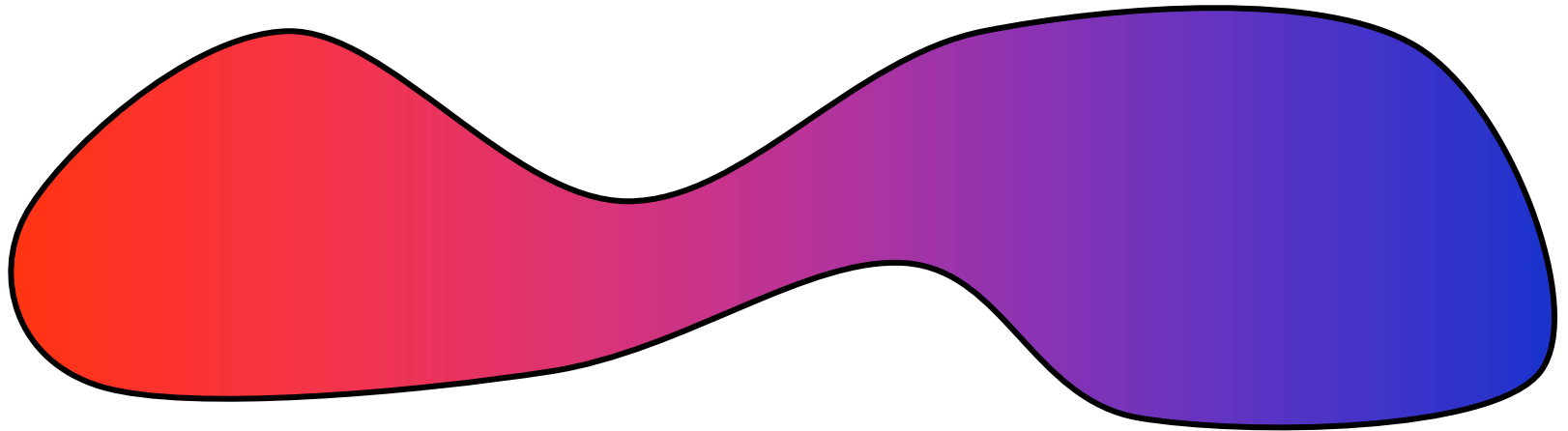
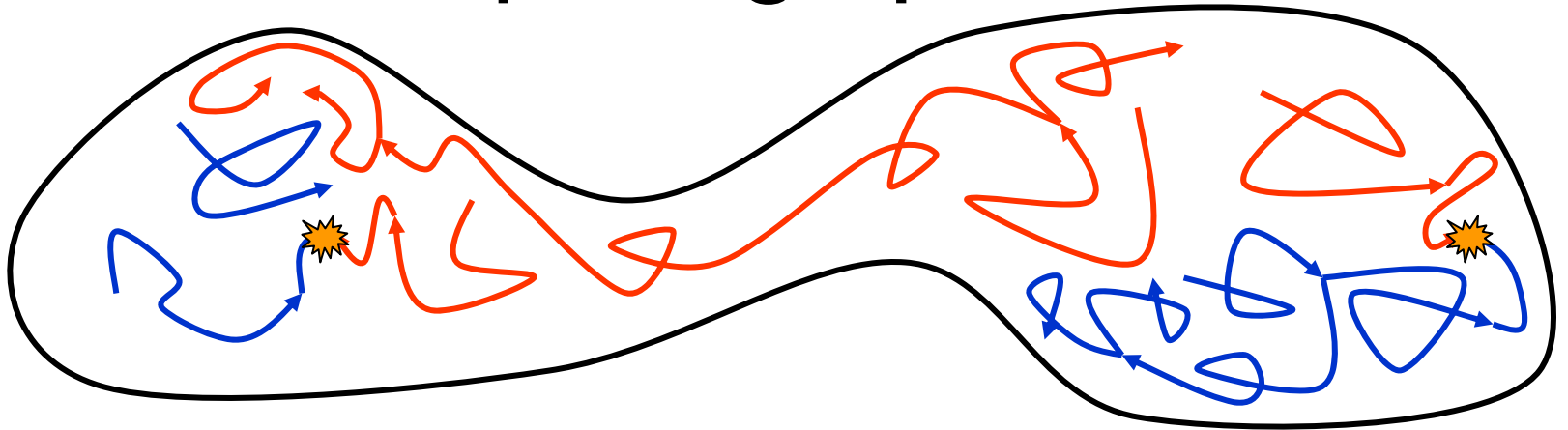
→ **Free space**

Population distribution  
converges to a fractal structure

→ **Bounded domain**

Population distribution converges to a density  
= heat equation solution

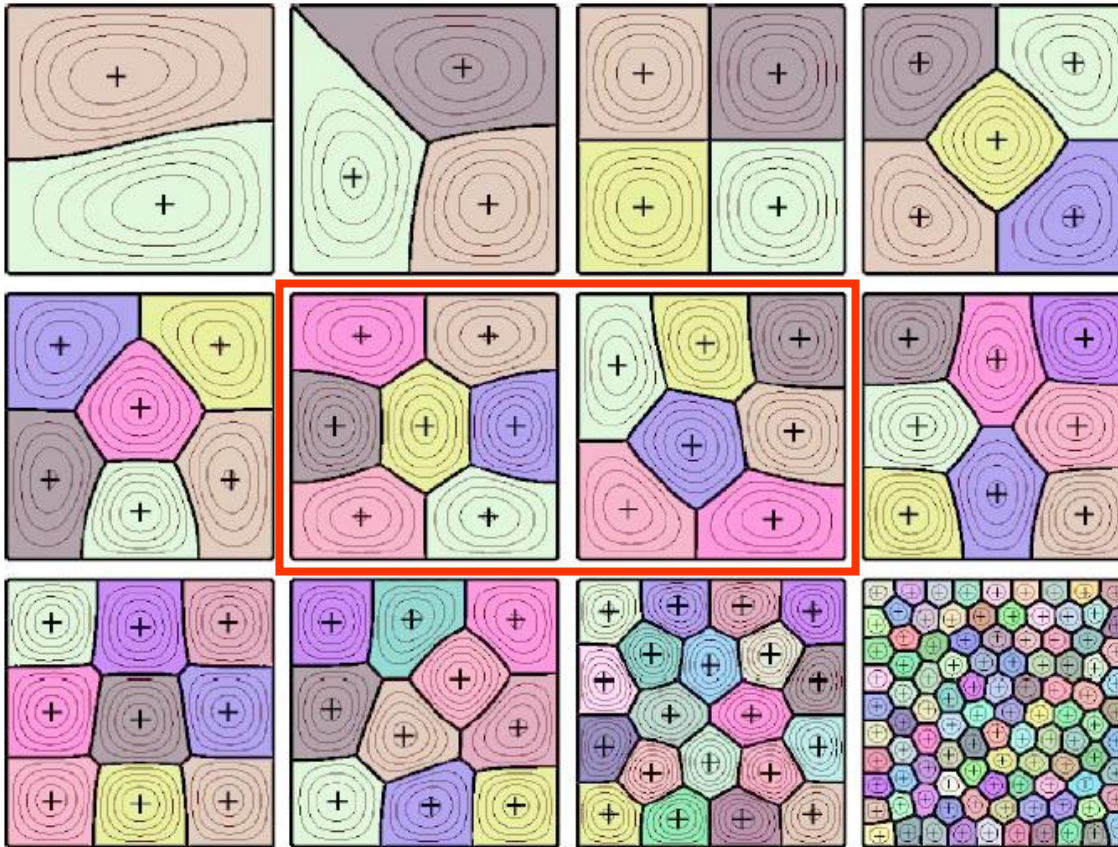
# Competing species



# Selected references

- B, Holyst, Ingerman, March (1996)
- B, Holyst, March (2000)
- B, Quastel (2007)
- Grigorescu, Kang (2004, 2006, 2006)

# Multiple populations



“Minimization of the Renyi entropy production in the space-partitioning process”  
**Cybulski, Babin, and Holyst**, Phys. Rev. E 71, 046130 (2005)

# The stationary distribution



$\lambda_k$  - first Dirichlet eigenvalue in k-th region

**Conjecture 1:** The stationary distribution minimizes

$$\lambda_1 + \lambda_2 + \dots + \lambda_n \stackrel{df}{=} \lambda^*$$

**Bucur, Buttazzo and Henrot** “Existence results for some optimal partition problems”

Adv. Math. Sci. Appl. 8 (1998) 571—579

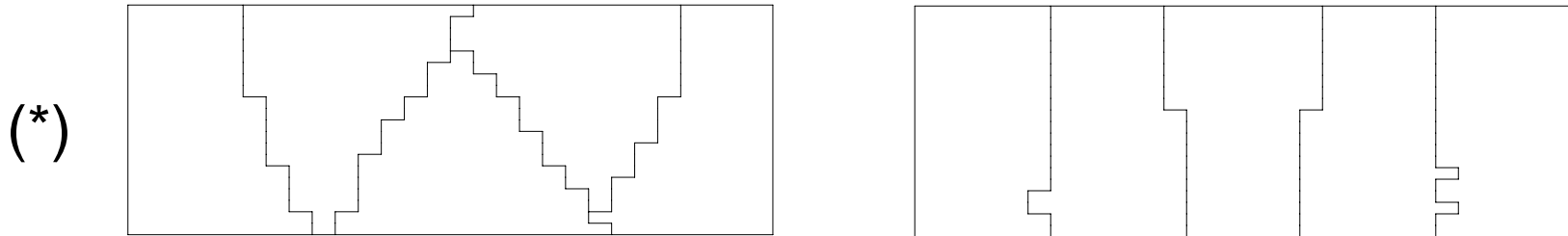
**Conti, Terracini and Verzini** “On a class of optimal partition problems

related to the Fucik spectrum and to the monotonicity formulae” Calc. Var. 22, 45–72 (2005)

**Conjecture 2:** The honeycomb pattern minimizes  $\lambda^*$

Special thanks to Luis Caffarelli!

# The stationary distribution (2)



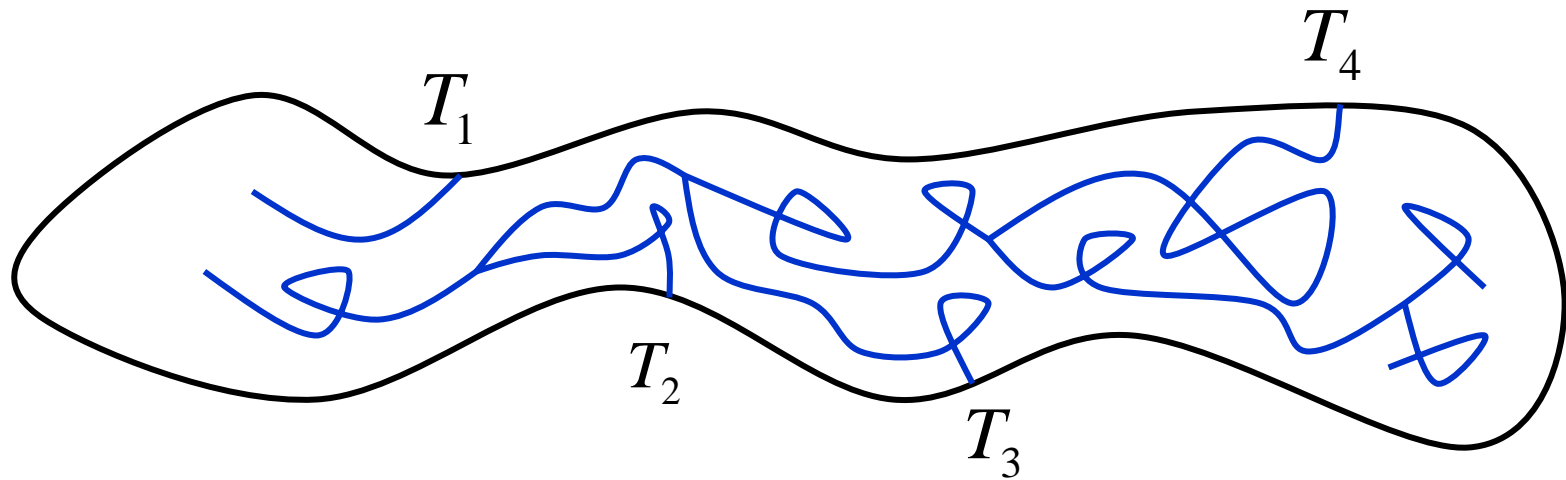
**B, Holyst, Ingeman and March** “Configurational transition in a Fleming-Viot-type model and probabilistic interpretation of Laplacian eigenfunctions” J. Phys. A 29, 1996, 2633-2642

$$\begin{array}{c}
 a \left\{ \begin{array}{|c|c|c|} \hline & & \\ \hline & & \\ \hline \end{array} \right. \\
 \underbrace{\hspace{2cm}} \\
 b
 \end{array}
 \quad
 \begin{array}{l}
 \lambda_{j,k} = (\pi / a)^2 (j^2 + (k / r)^2), \quad r = b / a \\
 \lambda_{2,3} = (\pi / a)^2 (2^2 + (3 / r)^2)
 \end{array}$$

**Conjecture 3:** The critical ratio  $r$  for (\*) and  $m$  populations satisfies

$$\lambda_{1,m} = \lambda_{2,1}$$

# Rigorous results – one population



**Theorem** (B, Holyst, March, 2000) Suppose that the individual trajectories are independent Brownian motions. Then

$$T_n \xrightarrow{n \rightarrow \infty} \infty, \quad a.s.$$



# Idea of the proof

A parabolic function (harmonic in space-time):

$$h(t, x) = P(X_s \in D, s \in [t, 1] | X_t = x)$$

A martingale plus a process with positive jumps:

$$M_t = \sum_{k=1}^N h(t, X_t^k)$$

# One population – convergence to the heat equation solution

$N$  - population size

$1/N$  - individual particle mass

$Q_N(t)$  - empirical density at time  $t$

- individual trajectories follow Brownian motions

**Theorem** (B, Holyst, March, 2000) If

$$Q_N(0)(dx) \xrightarrow{N \rightarrow \infty} u_0(x)dx$$

then

$$Q_N(t)(dx) \xrightarrow{N \rightarrow \infty} u(t, x)dx, \quad t > 0$$

where  $u(t, x)$  is the normalized heat equation solution with

$$u(0, x) = u_0(x)$$

# One population – convergence of stationary distributions

$N$  - population size

$1/N$  - individual particle mass

$Q_N(t)$  - empirical density at time  $t$

- individual trajectories follow Brownian motions

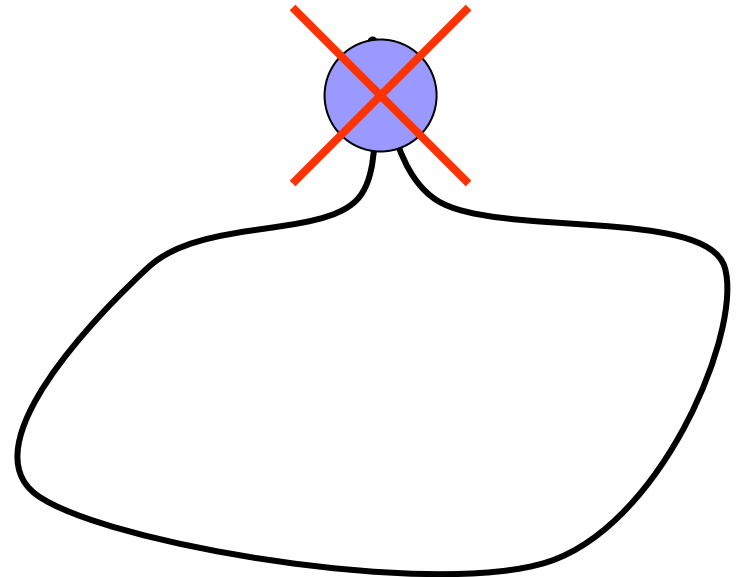
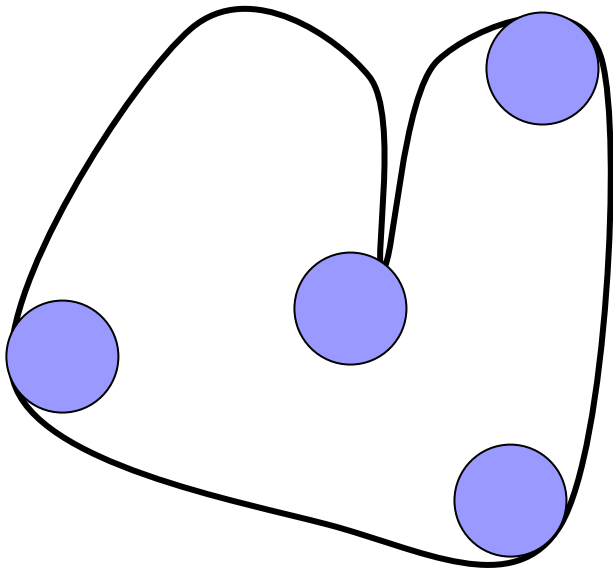
**Theorem** (B, Holyst, March, 2000) The process  $Q_N(t)$  has a stationary distribution  $\Lambda_N$ . Moreover,

$$\Lambda_N(dx) \xrightarrow{N \rightarrow \infty} \varphi(x) dx$$

where  $\varphi(x)$  is the first Dirichlet eigenfunction.

# One population – convergence of stationary distributions – assumptions

**Assumption:** The uniform internal ball condition



# Two populations – convergence to the heat equation solution

$N$  - population size (same for population I and II)

$1/N$  - individual particle mass (population I)

$-1/N$  - individual particle mass (population II)

$Q_N(t)$  - empirical density at time  $t$

- individual trajectories follow random walks

**Theorem** (B, Quastel, 2007) If


$$Q_N(0)(dx) \xrightarrow{N \rightarrow \infty} u_0(x)dx$$

then

$$Q_N(t)(dx) \xrightarrow{N \rightarrow \infty} u(t, x)dx, \quad t > 0$$

where  $u(t, x)$  is the normalized heat equation solution with

$$u(0, x) = u_0(x)$$



# Two populations – convergence to the heat equation solution – assumptions

- (i) Trajectories – simple random walks
- (ii) Trajectories reflect at the domain boundary
- (iii) The two populations have equal sizes
- (iv) The domain has an analytic boundary

# Idea of the proof

$\varphi_n$  - n-th Neumann eigenfunction

$$\hat{u}_n(t) = \pm \frac{1}{N} \sum_{k=1}^N \varphi_n(X_t^k)$$

$$d\hat{u}_n(t) = \Delta \hat{u}_n(t) dt + M_t$$

Main technical challenge: bound the clock rate

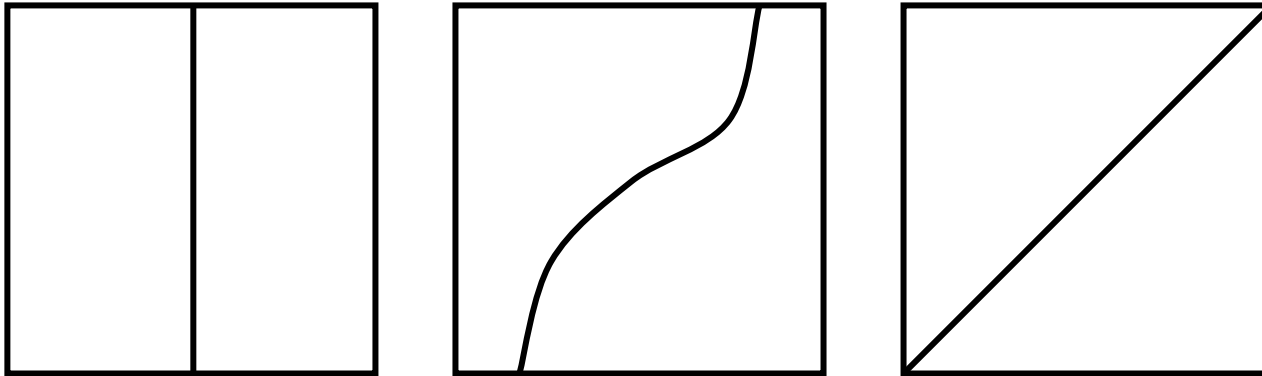
# Spectral representation and $L^1$

**Lemma.** Suppose that  $D$  is a domain with  $C^2$  smooth boundary,  $\varphi_n$  is the  $n$ -th eigenfunction for the Laplacian with Neumann boundary conditions and  $\mu$  is a signed measure with a finite total variation.

$$\forall n \quad \int \varphi_n(x) \mu(dx) = 0 \quad \Rightarrow \quad \mu \equiv 0$$



# Diffusion in eigenfunction space



**Open problem:** What is the speed of diffusion?

# Invariance principle for reflected random walks

**Theorem.** Reflected random walk converges to reflected Brownian motion.

- (i)  $C^2$ -domains, Stroock and Varadhan (1971)
- (ii) Uniform domains, B and Chen (2007)

**Example:** Von Koch snowflake is a uniform domain.

**Counterexample** (B and Chen, 2007): Reflected random walk does not converge to reflected Brownian motion in a planar fractal domain.

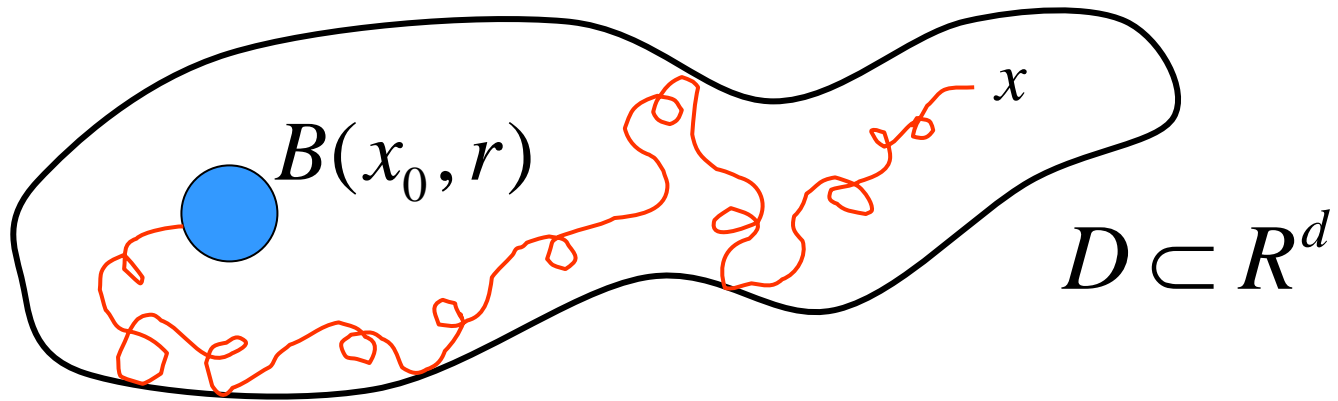
# Myopic conditioning

$D \subset R^d$  - open, connected, bounded set

$\{X_t^n, t \geq 0\}$  - Markov process

$\{X_t^n, t \in [k/n, (k+1)/n]\}$  - Brownian motion conditioned by  
 $\{X_t^n \in D, t \in [k/n, (k+1)/n]\}$

**Theorem** (B and Chen, 2007). When  $n \rightarrow \infty$ ,  
 $\{X_t^n, t \geq 0\}$  converge to reflected Brownian motion in  $D$ .



$X_t$  - reflected Brownian motion in  $D$

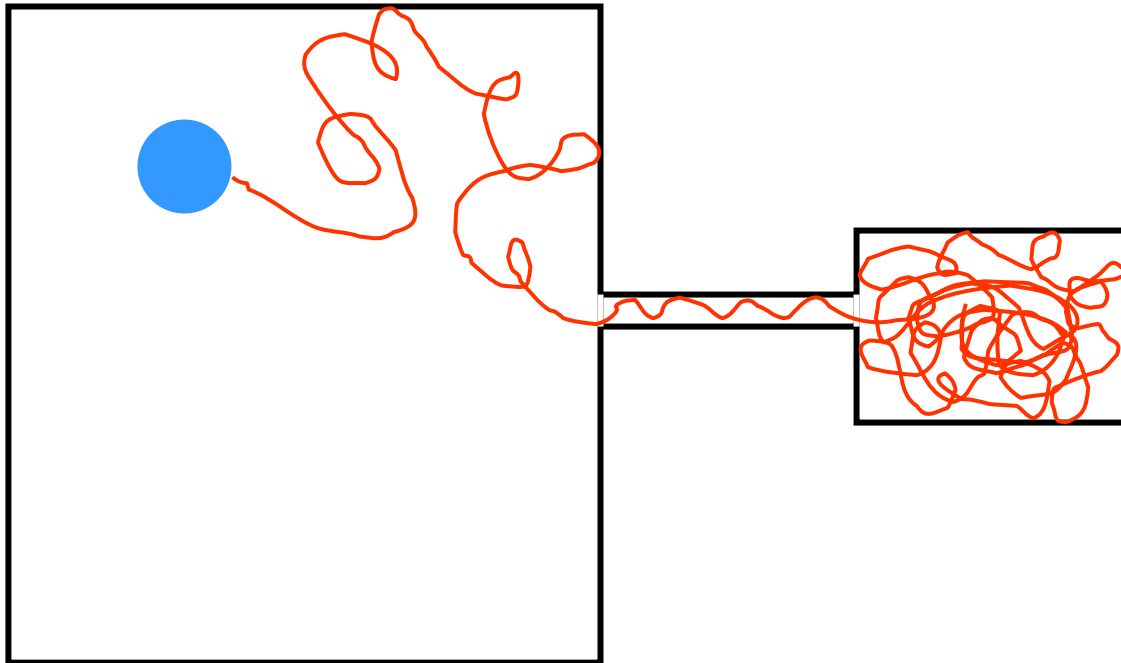
$T_B$  - hitting time of  $B(x_0, r)$

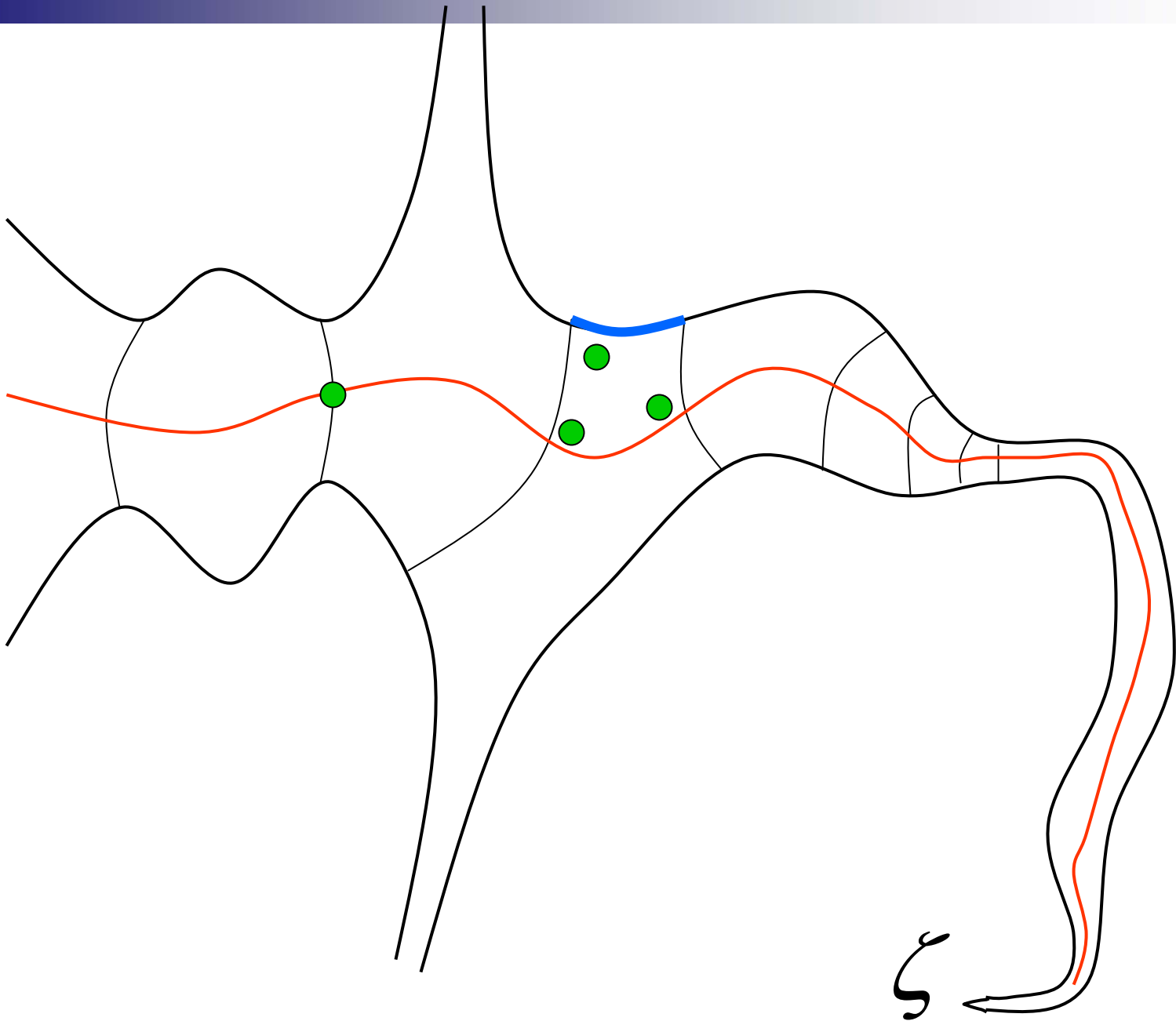
Problem:

$$\sup_{x \in D} E^x T_B < \infty ?$$

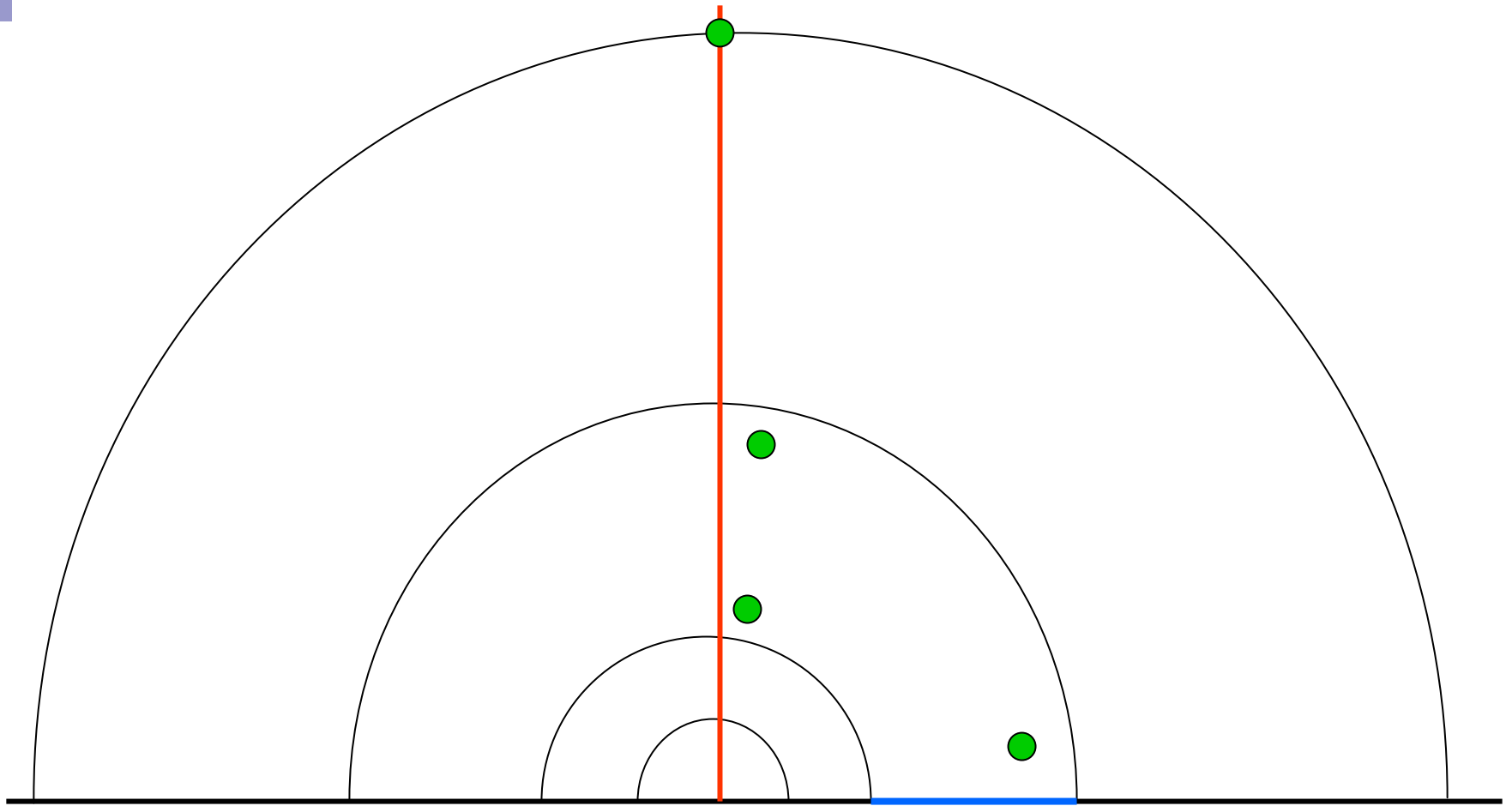
**Definition:** We will call a bounded set  $D$  a trap domain if

$$\sup_{x \in D} E^x T_B = \infty.$$



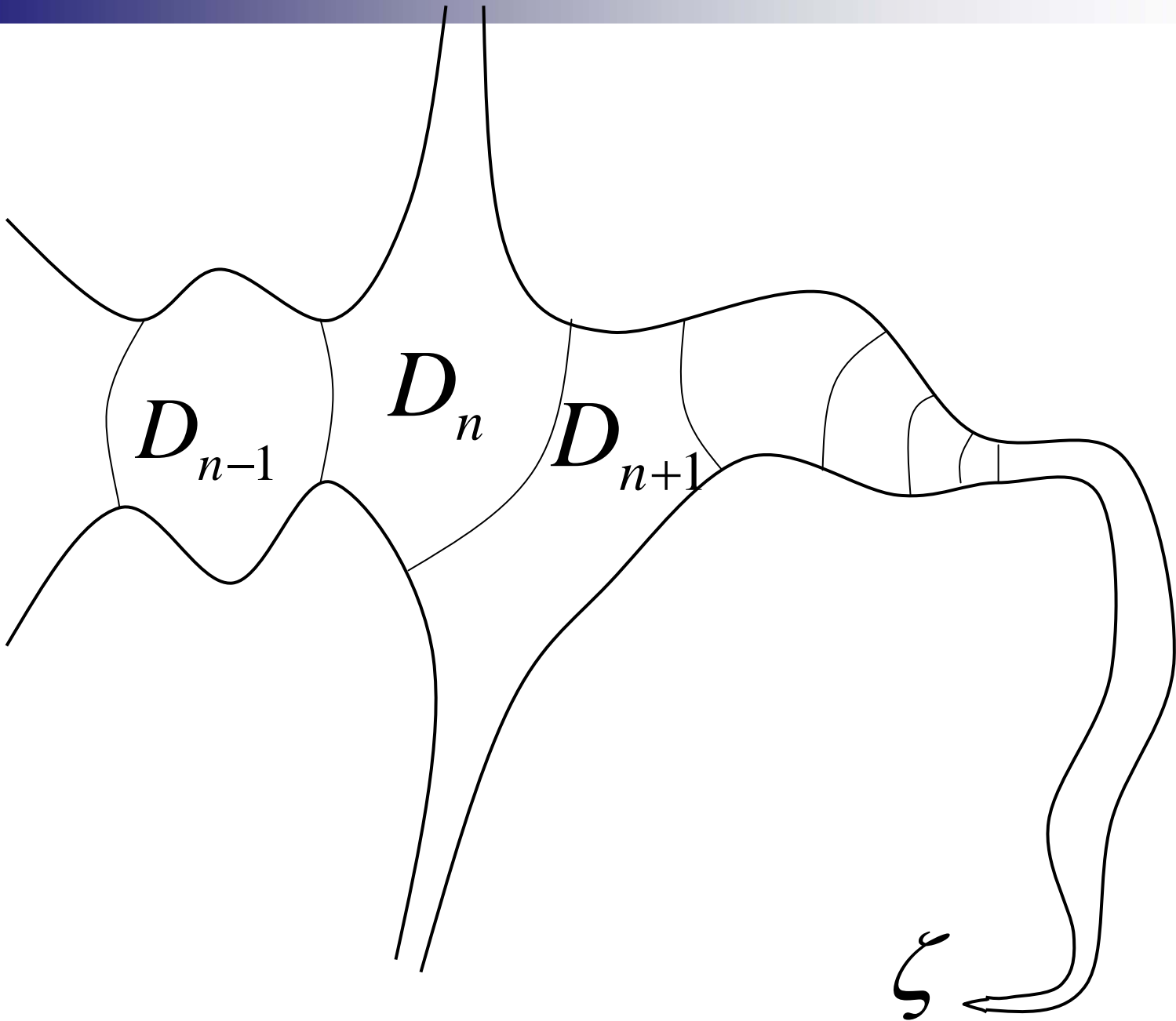


5



$$\varphi(\zeta)$$

Hyperbolic blocks

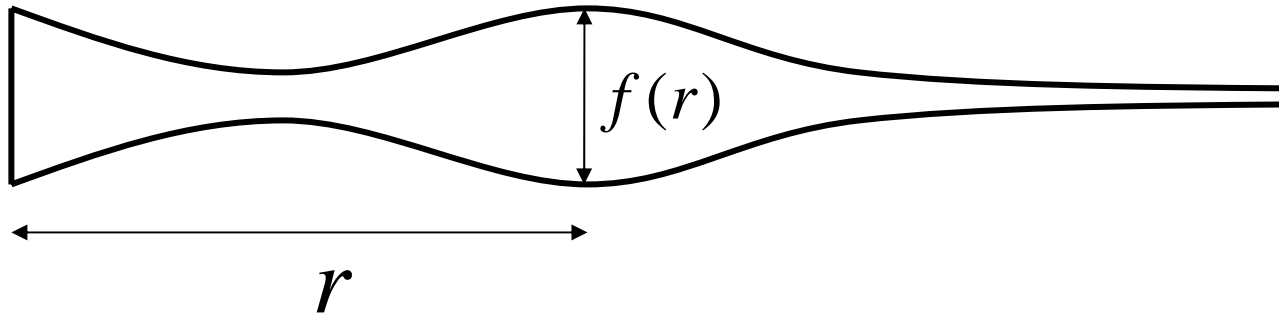




**Theorem** (B, Chen and Marshall, 2006): A simply connected planar domain  $D$  is a trap domain if and only if

$$\sup_{\zeta} \sum_{n \geq 1} n \cdot \text{Area}(D_n) = \infty.$$

Horn domain:



**Corollary:**  $D$  is a trap domain iff

$$\int_1^{\infty} \left( \int_1^x \frac{1}{f(z)} dz \right) f(x) dx = \infty.$$

**Example:**  $f(r) = \exp(-r^\alpha)$

Trap domain  $\Leftrightarrow \alpha \leq 2$