

**Continuous Path Brownian Trajectories for Diffusion
Monte Carlo via First- and Last-Passage Distributions**

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Research supported by DOE/ASCI, ARO, and NSF

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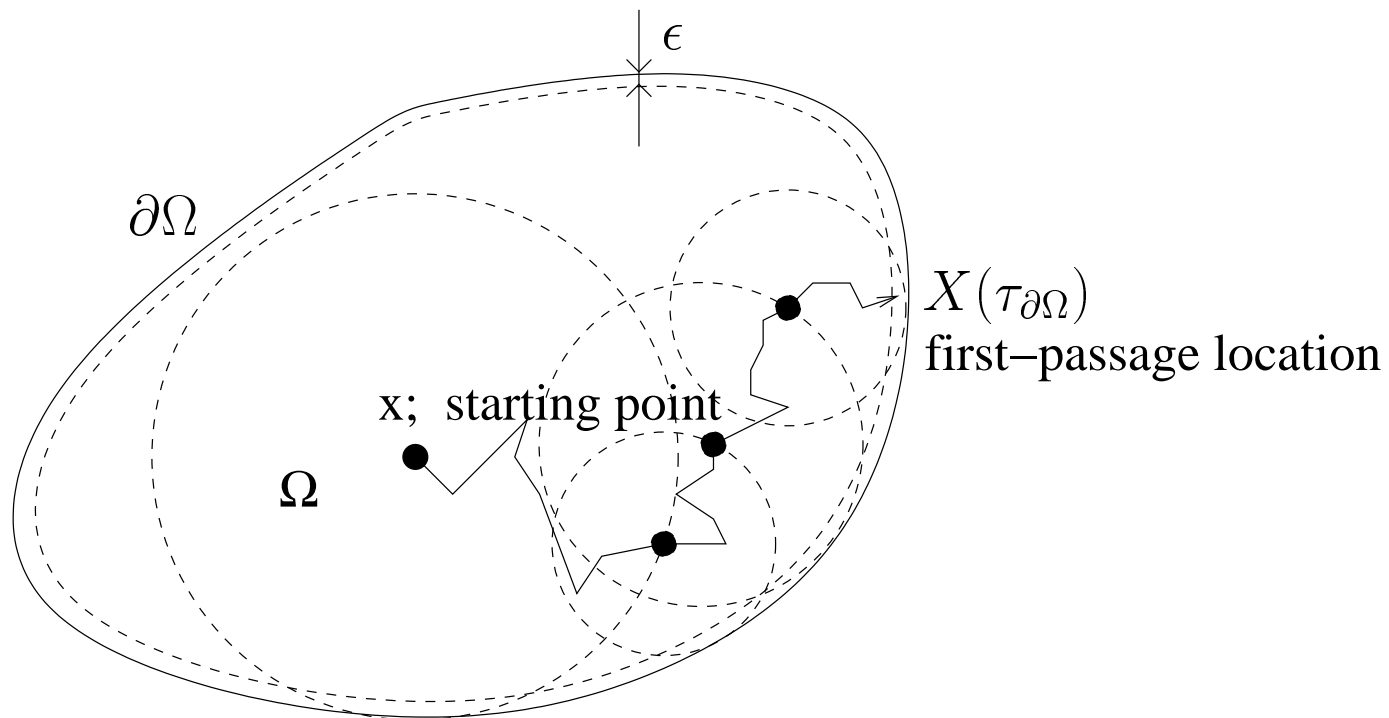
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- Approach from Outside
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Future Work

Dirichlet problem for Laplace Equation



First Passage Algorithms

$$\Delta u(\mathbf{x}) = -q(\mathbf{x}), \quad \mathbf{x} \in \Omega \quad (1)$$

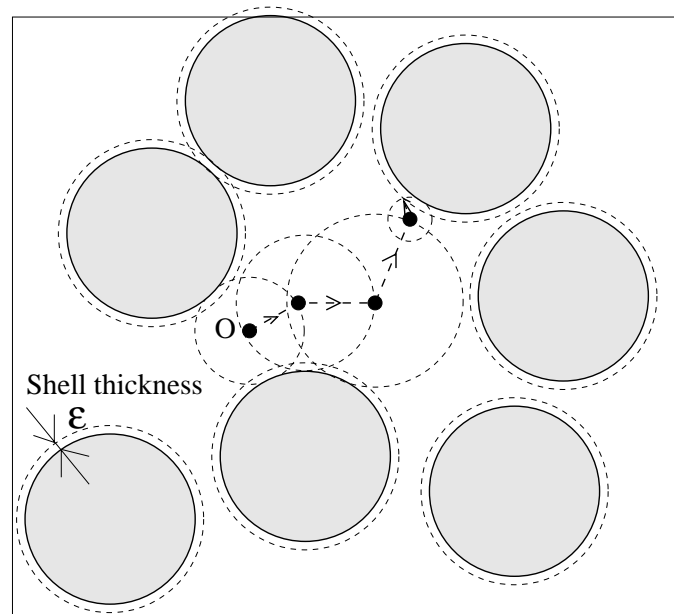
$$u(\mathbf{x}) = f(\mathbf{x}), \quad \mathbf{x} \in \partial\Omega. \quad (2)$$

$$u(\mathbf{x}) = - \int_s \frac{\partial G(x, y)}{\partial n_y} f(y) dS_y + \int G(x, y) q(y) dy \quad (3)$$

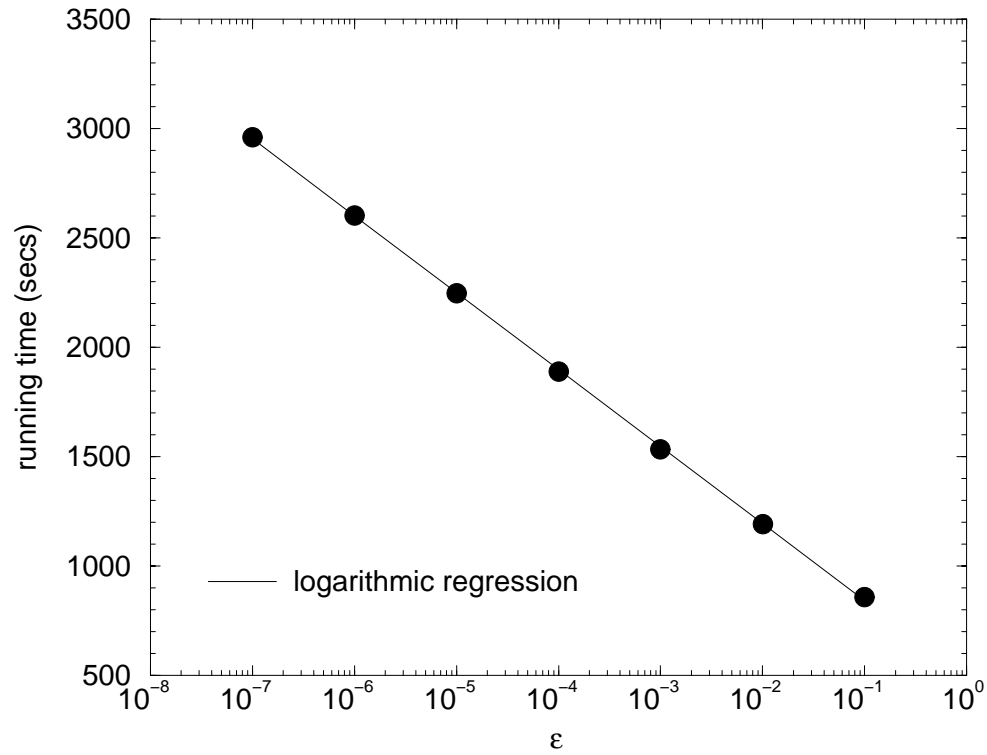
- Isomorphism: First passage probability is exactly the Laplacian surface Green's function for the boundary value problem for the given geometry.
- Electrostatic charge density on a conducting first-passage surface induced by a charge to first-passage probability density on the absorbing first-passage surface surrounding the diffusing particle.

“Walk on Spheres” (WOS) and Green’s Function First Passage (GFFP) Algorithms

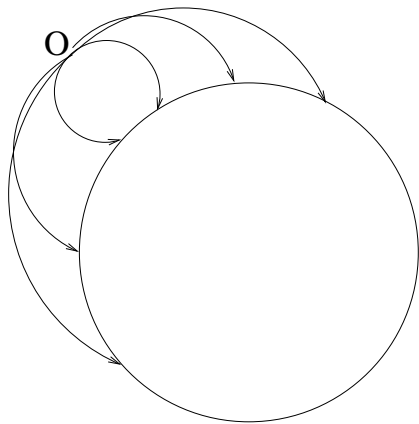
WOS:



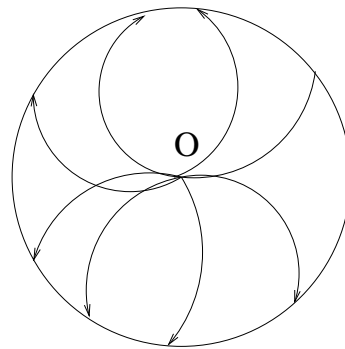
Timing with WOS:



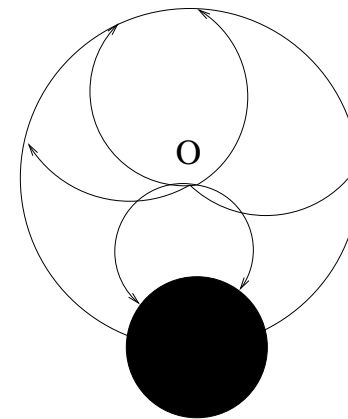
Green's Functions



(a) Putting back

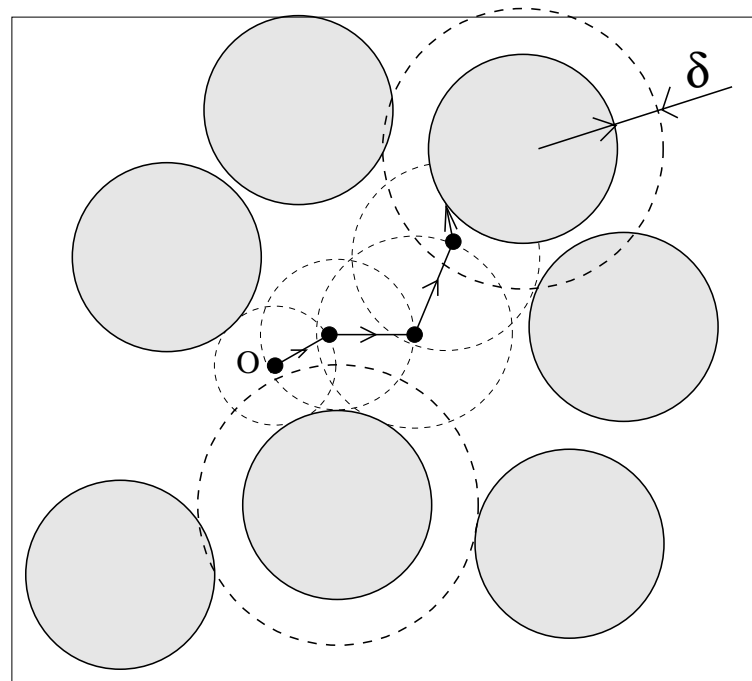


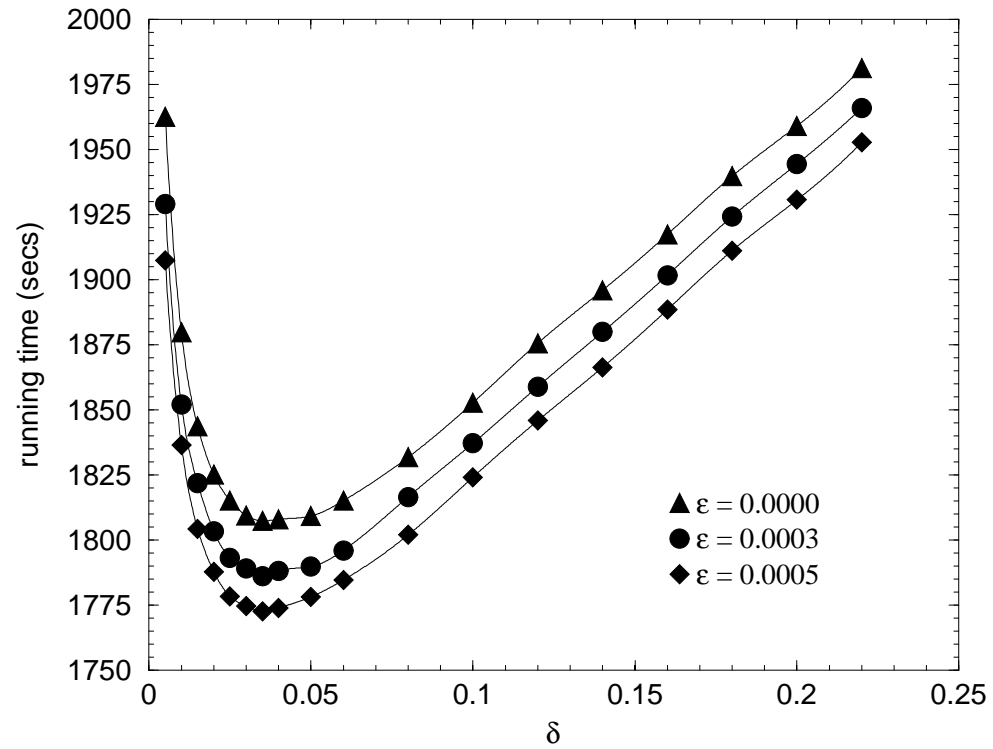
(b) Void space



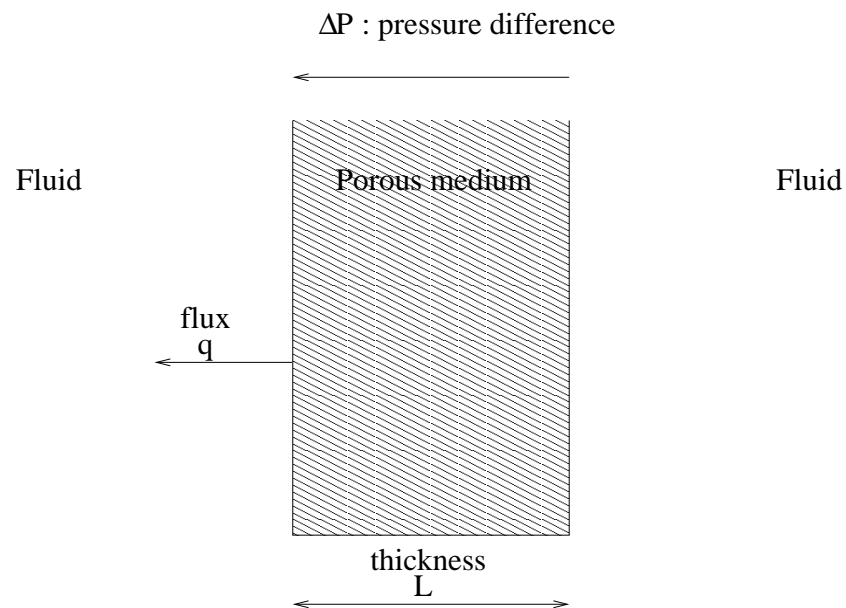
(c) Intersecting

GFFP:





Darcy's Law



$$q = \frac{k \Delta P}{\eta L}$$

η : dynamic viscosity

Darcy's Law

$$q = \frac{k\Delta P}{\eta L} \quad (4)$$

- A slow steady flow of a single Newtonian fluid through a stationary, inert and isotropic porous medium
- k : Fluid permeability
- ΔP : applied pressure difference
- L : thickness of the porous sample
- η : dynamic viscosity
- q : volumetric flow per unit cross-sectional area (Flux)

Hubbard-Douglas TFC for an Arbitrary Nonskew Object

- Using angle averaging, Hubbard and Douglas derived: vector or tensor Laplace equations to scalar Laplace equations

$$f = 6\pi\eta C \quad (5)$$

- f : translational friction coefficient
- η : dynamic viscosity
- C : electrical capacitance

Felderhof's TFC for a Macromolecule

- From the Debye-Brinkman equation for porous flow under pressure:

$$\nabla P = \eta \nabla^2 \mathbf{V} - \frac{\eta}{k} \mathbf{V}, \quad (6)$$

we get:

$$f = 6\pi\eta R G_0(\sigma) \left\{ 1 + \frac{3}{2\sigma^2} G_0(\sigma) \right\}^{-1} \quad (7)$$

- f : translational friction coefficient
- η : dynamic viscosity
- R : macromolecular radius

Felderhof's TFC for a Macromolecule

with:

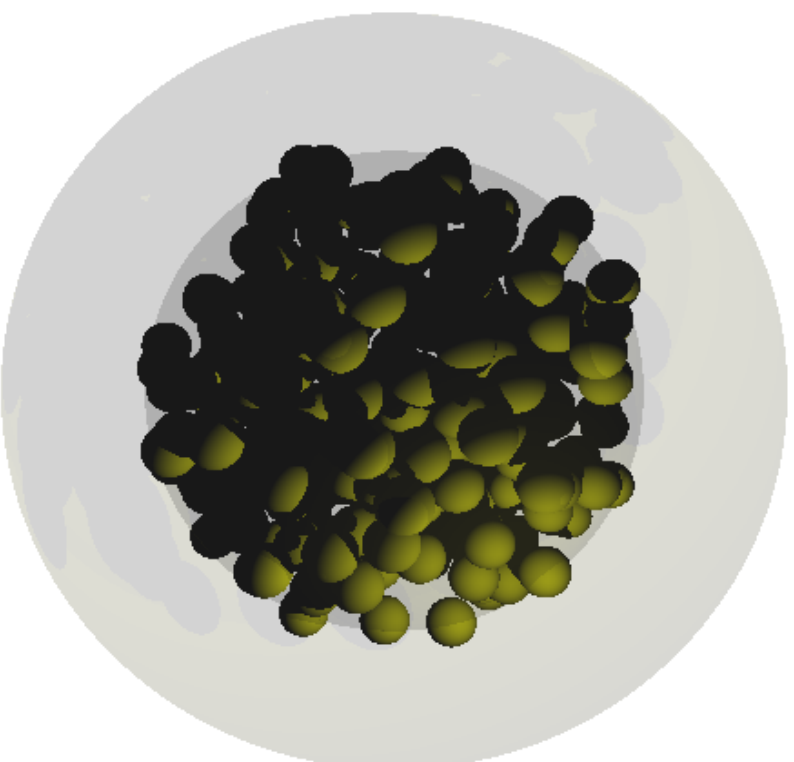
$$G_0(\sigma) = 1 - \frac{1}{\sigma} \tanh \sigma \quad (8)$$

dimensionless quantity:

$$\sigma = \frac{R}{\sqrt{k}} \quad (9)$$

k : Fluid permeability

Porous Media



Unit Capacitance Method

- Combining two previous equations

$$\frac{C}{R} = G_0(\sigma) \left\{ 1 + \frac{3}{2\sigma^2} G_0(\sigma) \right\}^{-1} \quad (10)$$

- Getting C/R gives us σ

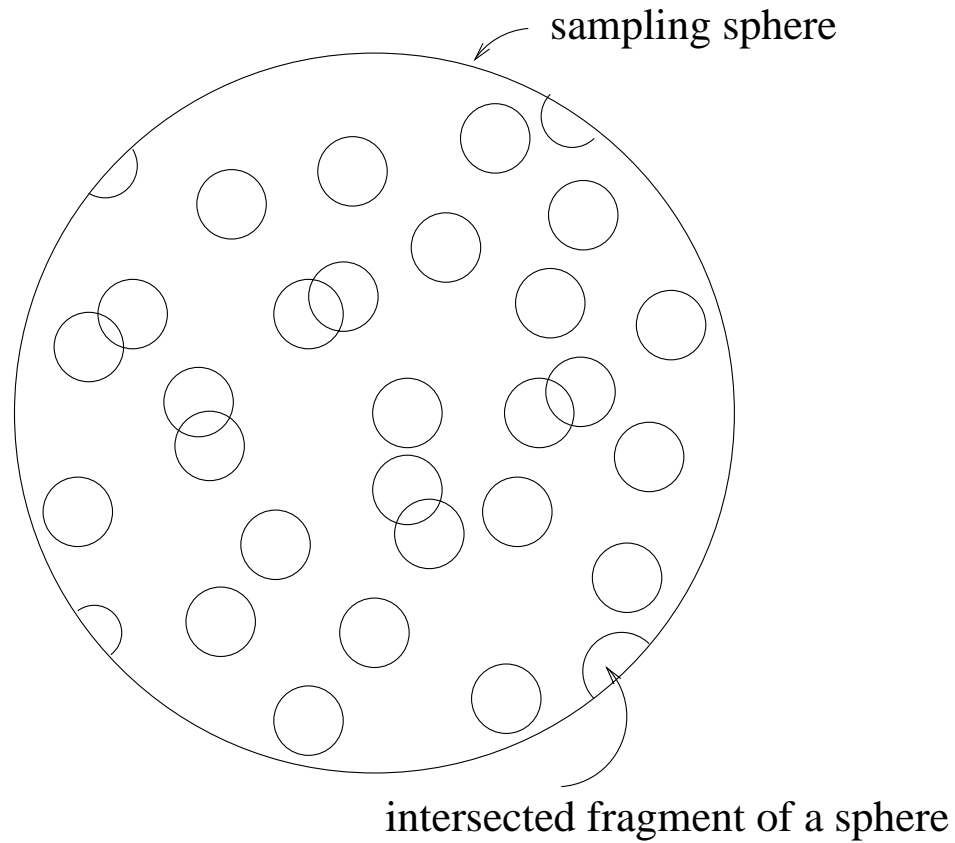
- From:

$$\sigma = \frac{R}{\sqrt{k}} \quad (11)$$

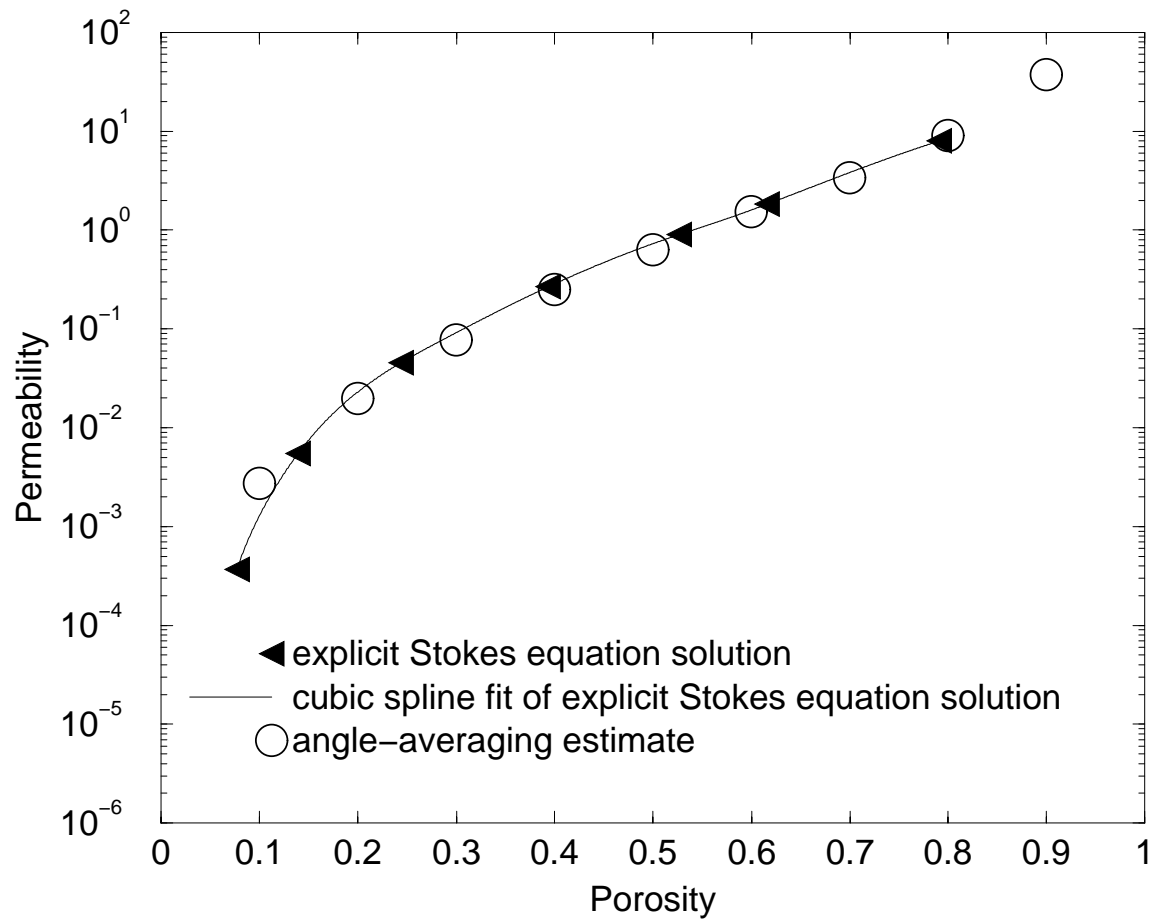
we get permeability

Sampling Methods

Sharp Boundary Method



Polydispersed Spheres

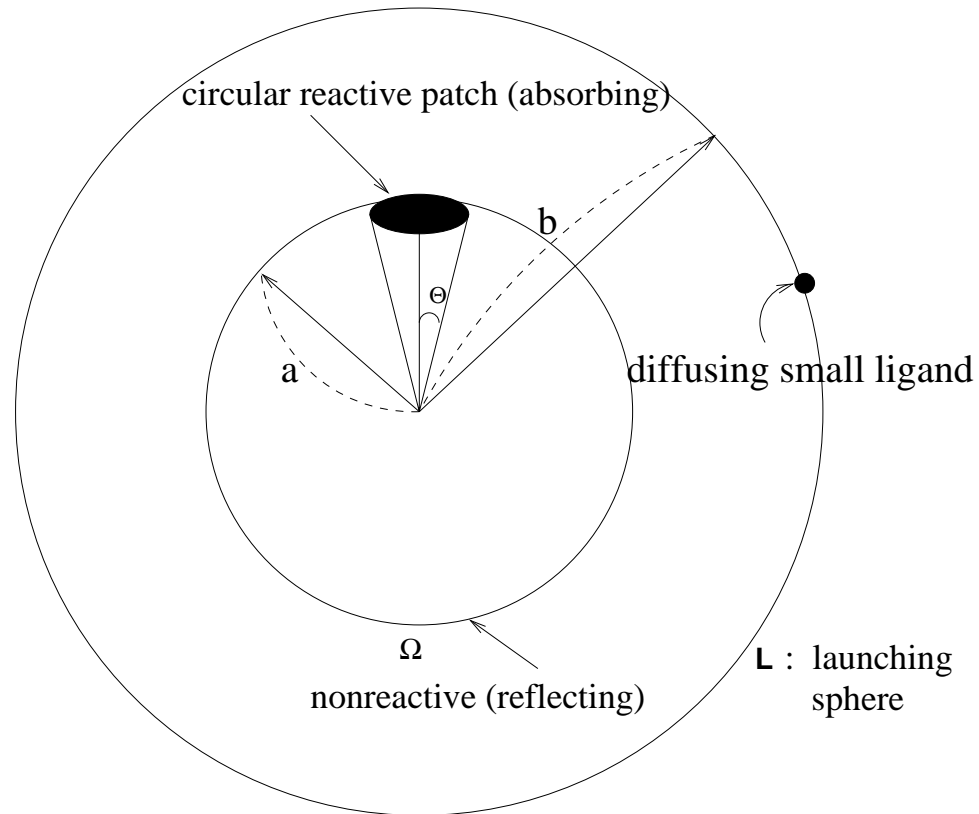


Summary and Conclusions for Permeability

- The two methods with sharp boundary sampling agree well with each other except at very low porosities.
- For overlapping sphere beds, the new estimate is good except at very low porosities ($\phi_0 < 0.2$).
- Each data point used 10^5 trajectories and consumed approximately one minute of 233 Mhz PII CPU time (very fast).
- The actual data set of mono-sized and polydispersed overlapping spheres beds from N. S. Marty's agrees well with the sharp boundary simulation data.
- The methods will work for general homogeneous and isotropic porous media.
- Applying the new permeability estimation methods to more realistic porous media models

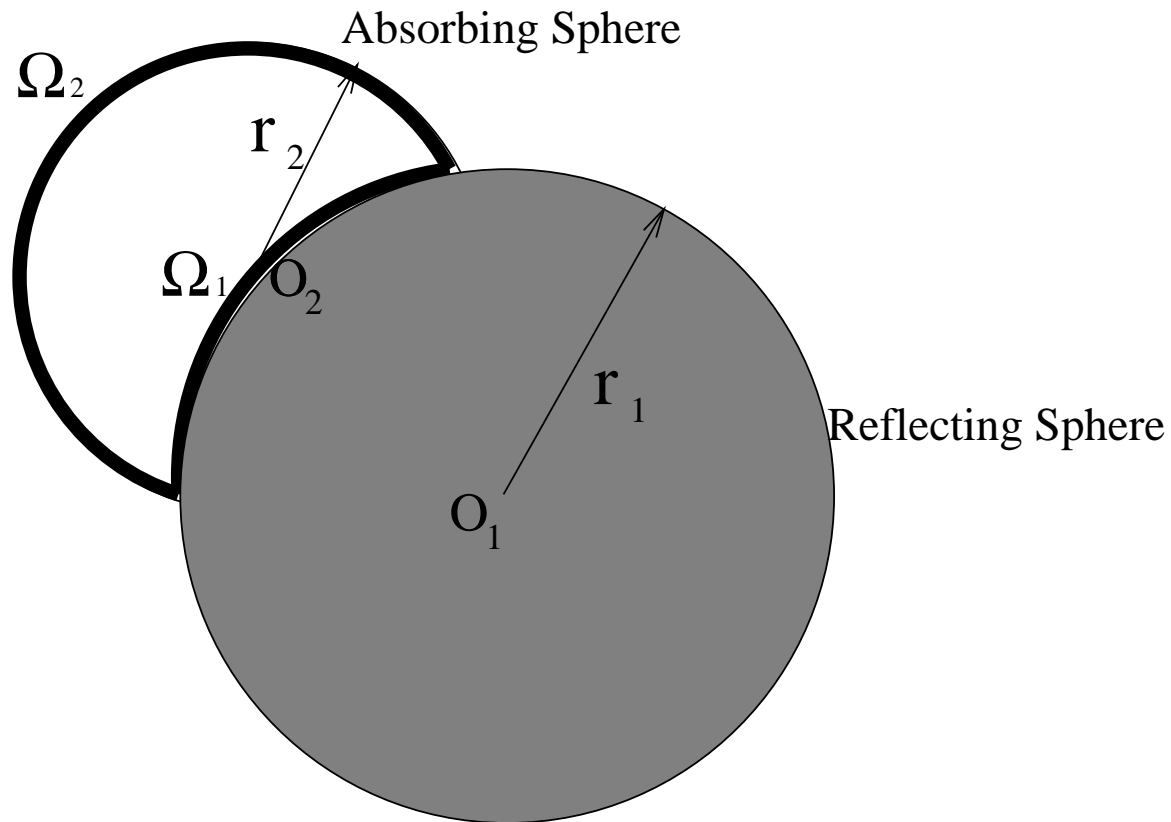
Solc-Stockmayer Model without Potential

Basic model for diffusion-limited protein-ligand binding

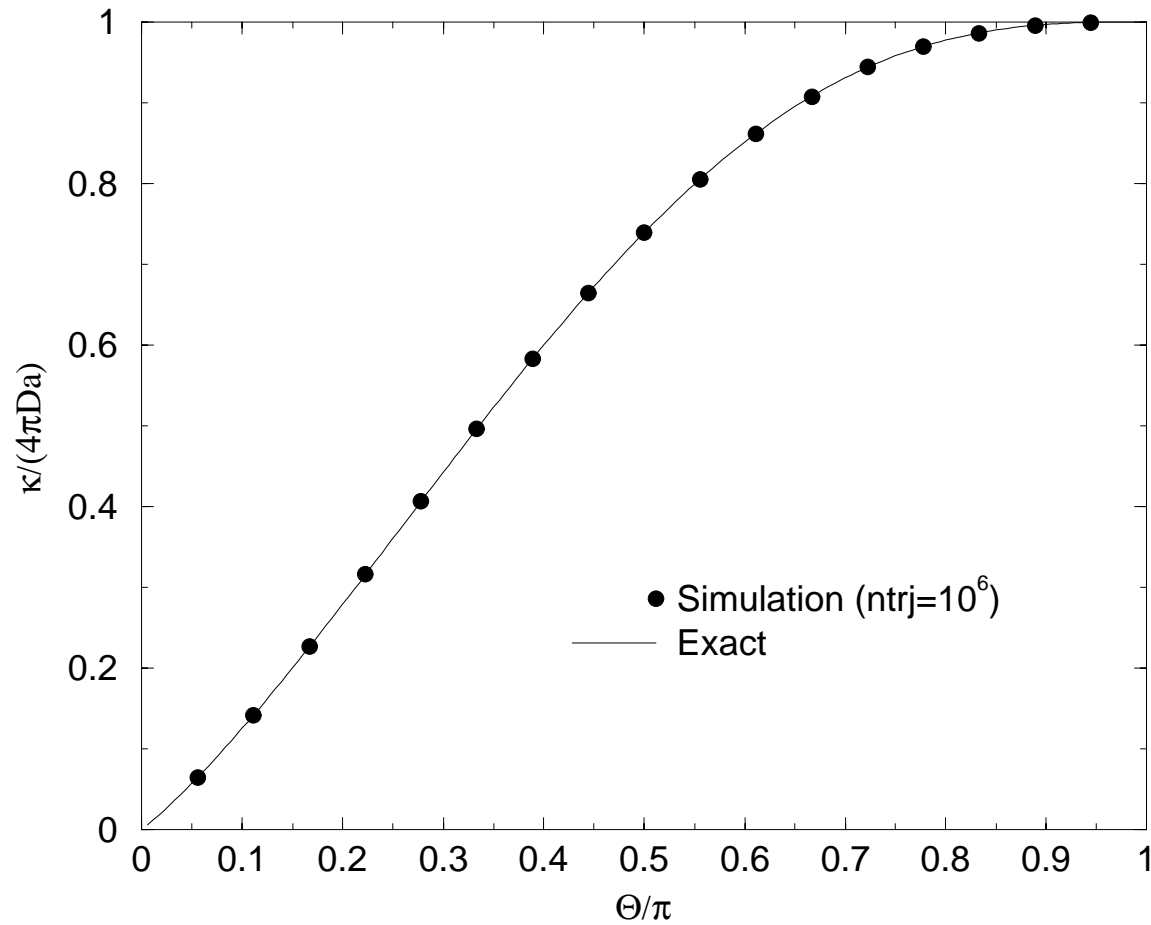


Simulation-Tabulation Method

- Green's function for the non-intersected surface of a sphere located on the surface of a reflecting sphere

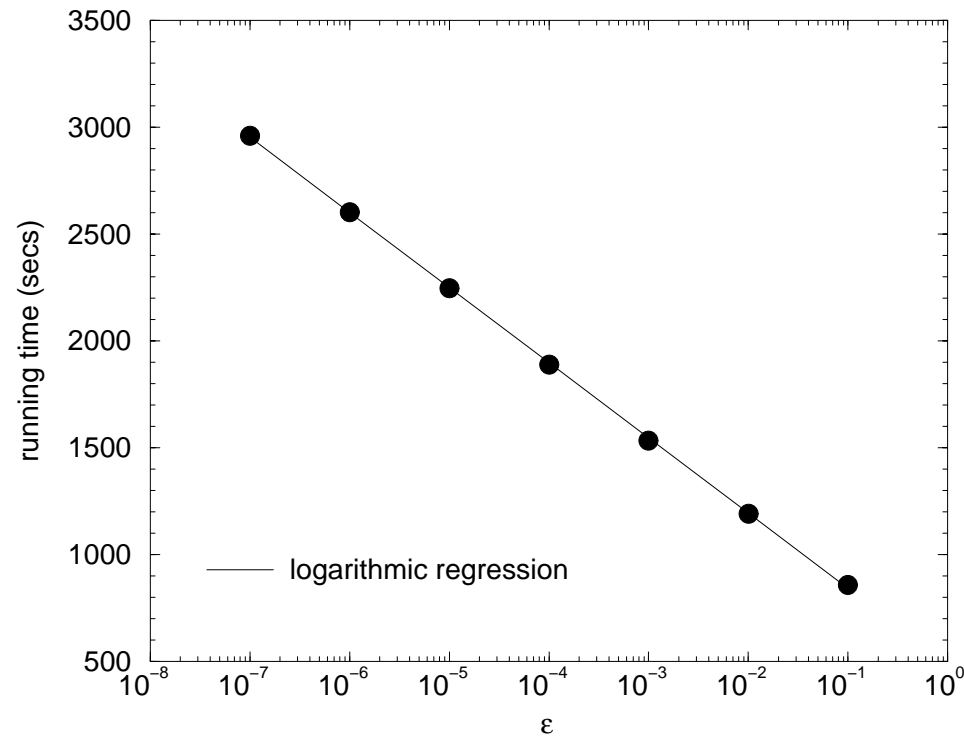


Solc-Stockmayer Model without Potential



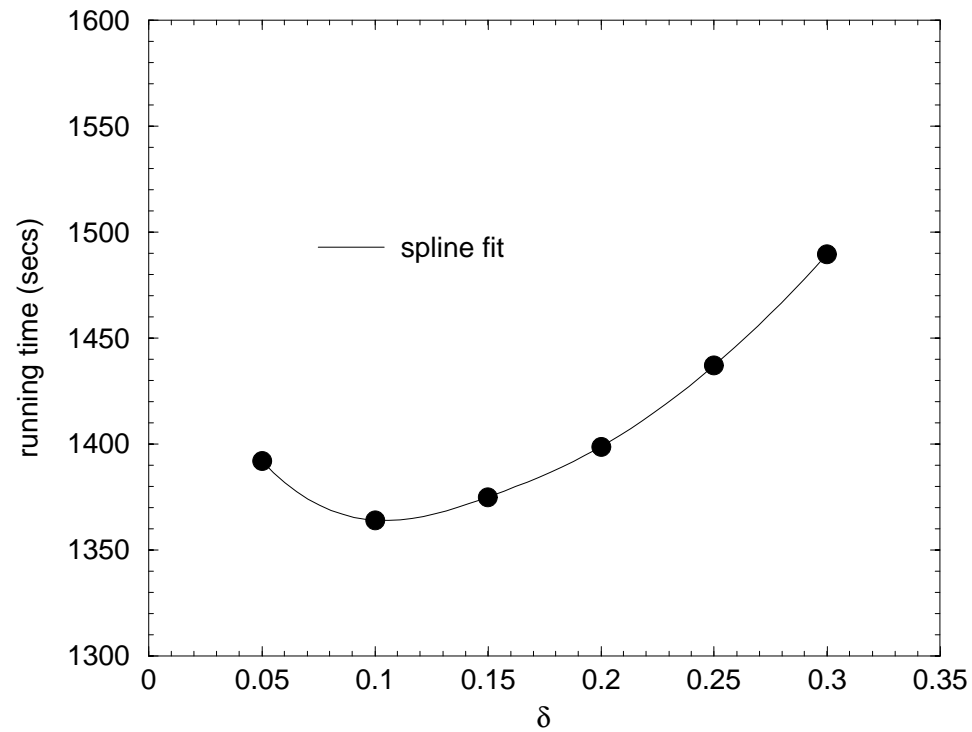
Solc-Stockmayer Model without Potential

Timing with WOS :



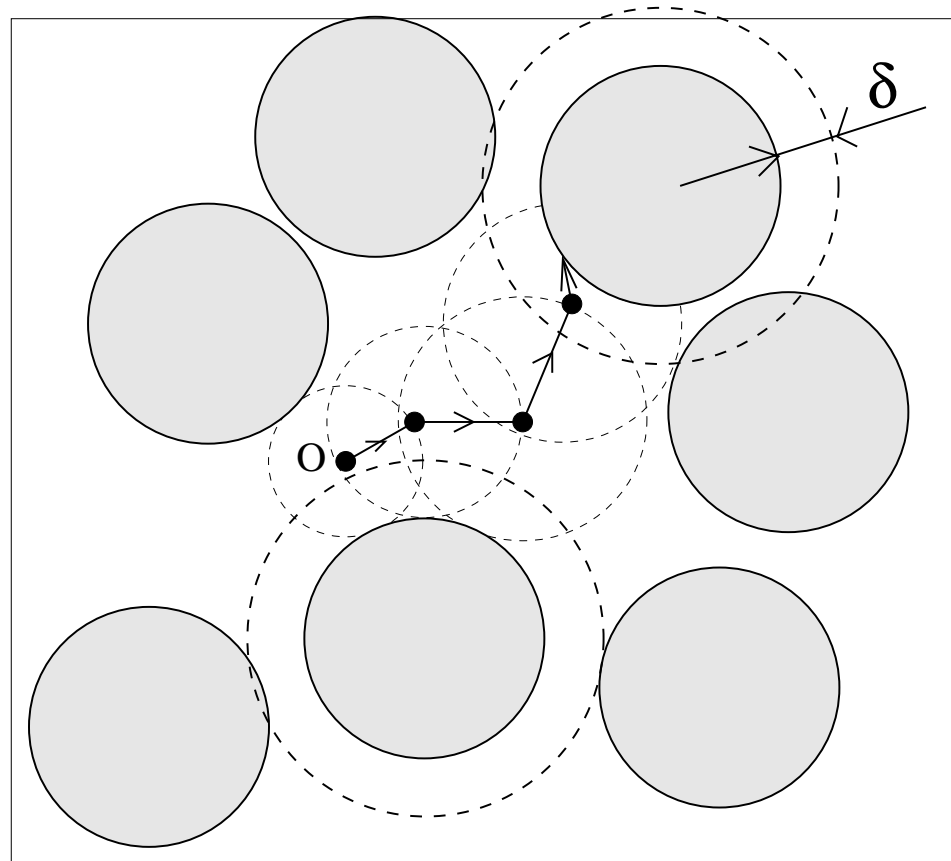
Solc-Stockmayer Model without Potential

Timing with GFFPA :



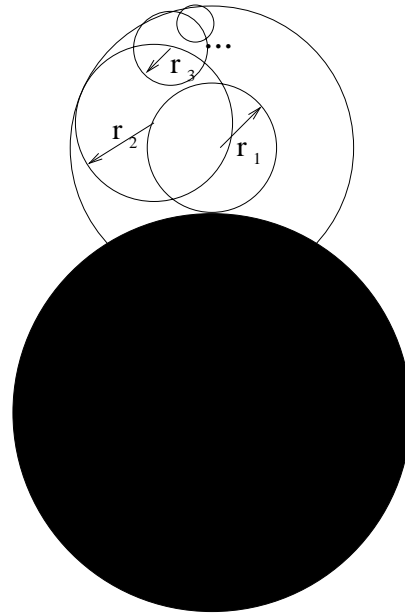
Mean Trapping Rate

In a domain of nonoverlapping spherical traps :



Simulation-Tabulation Method

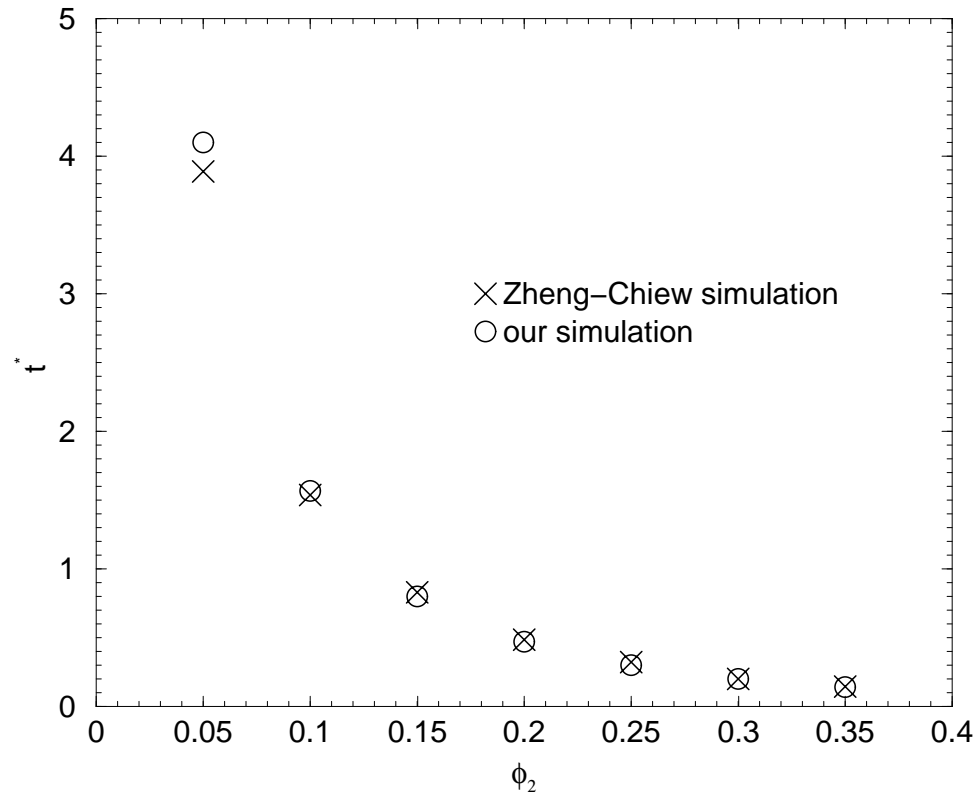
- Average First-passage time



$$\bar{\tau} = \overline{\sum \tau_i} = \overline{\sum \frac{r_i^2}{6}}$$

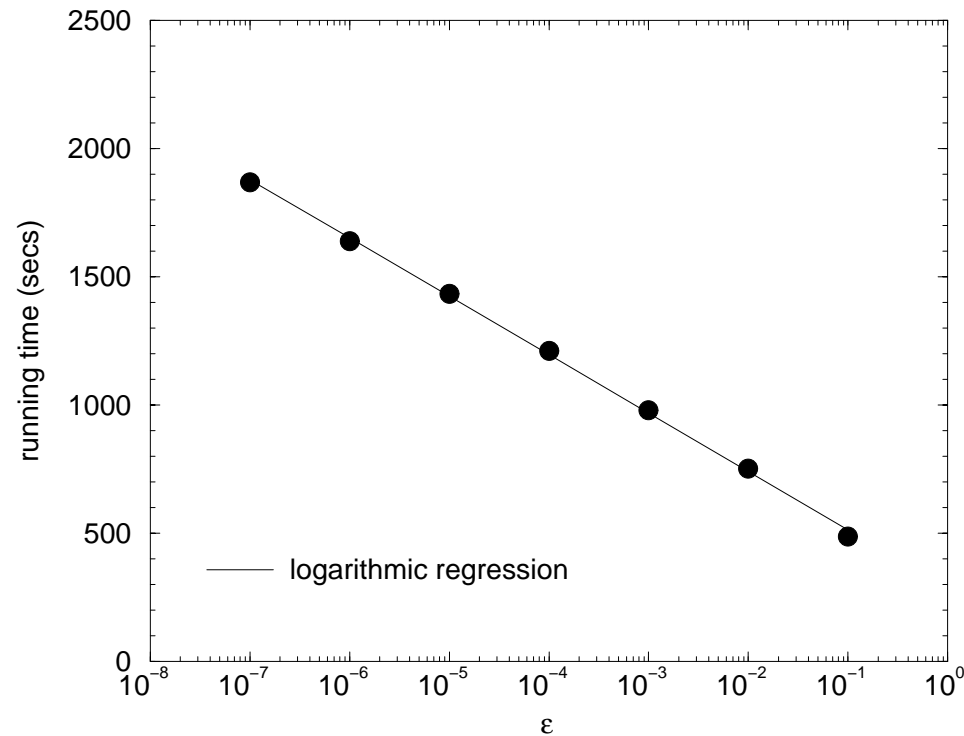
Mean Trapping Rate

In a domain of nonoverlapping spherical traps :



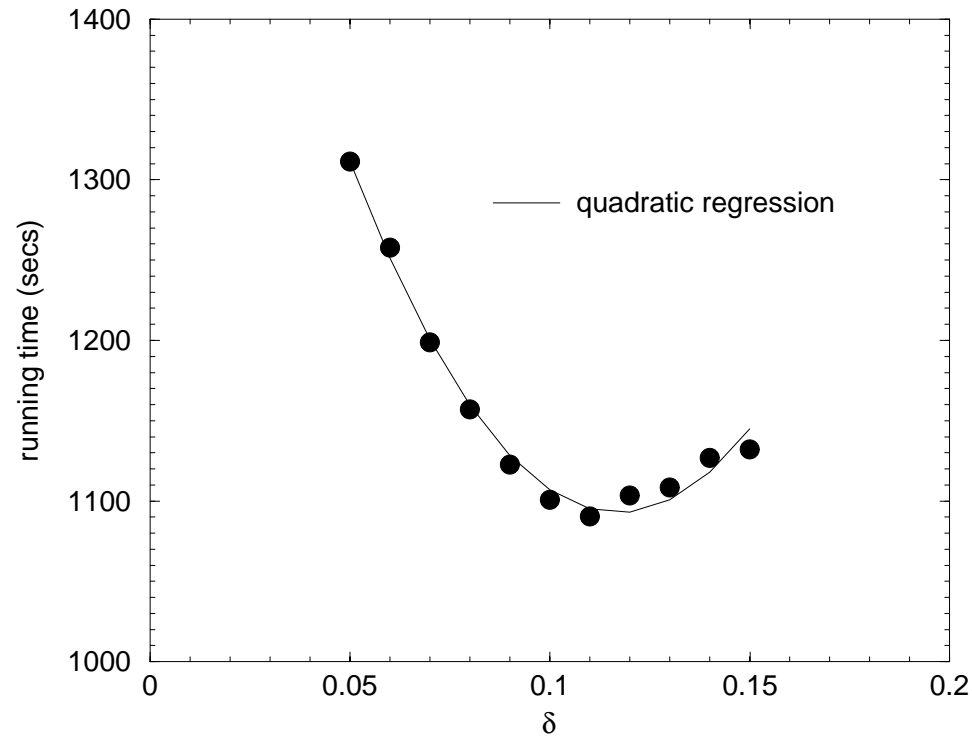
Mean Trapping Rate

In a domain of nonoverlapping spherical traps : Timing with WOS



Mean Trapping Rate

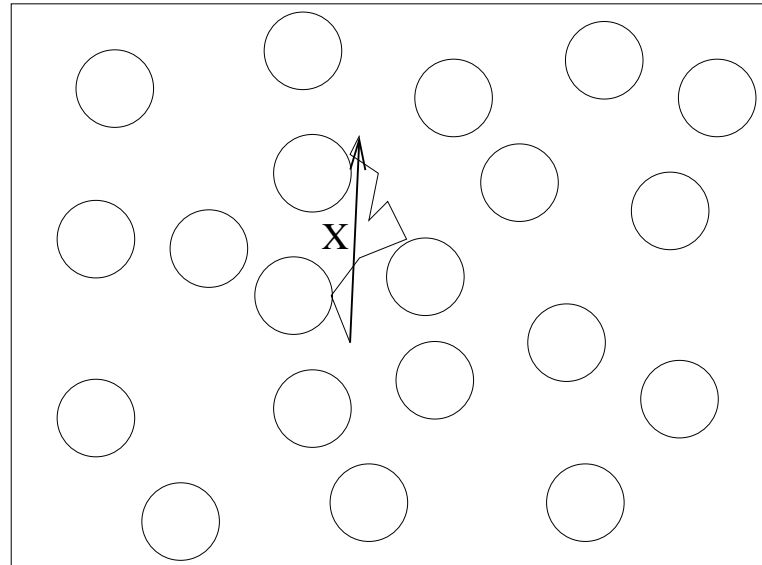
In a domain of nonoverlapping spherical traps : Timing with GFFPA



Effective Conductivity

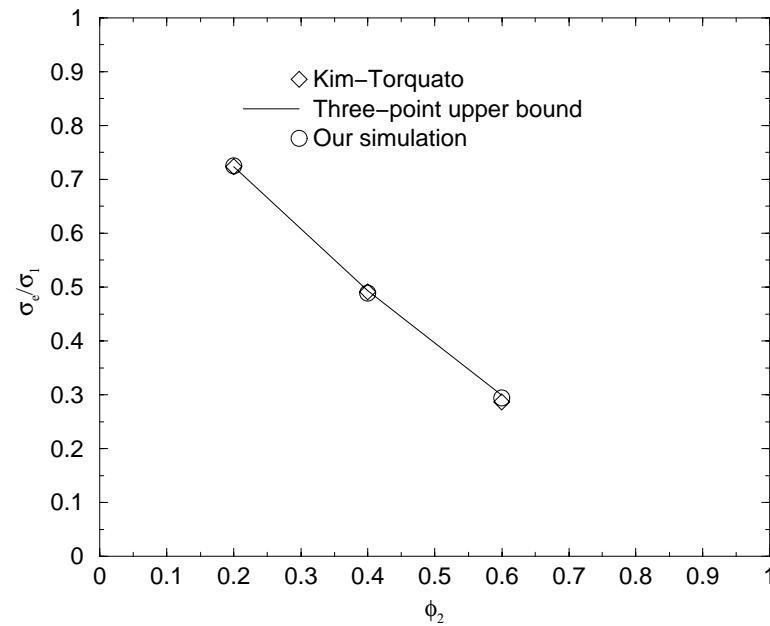
Perfectly insulating, nonoverlapping spherical inclusions :

$$\sigma_e = \frac{\overline{X^2}}{6\tau_c(X)}$$



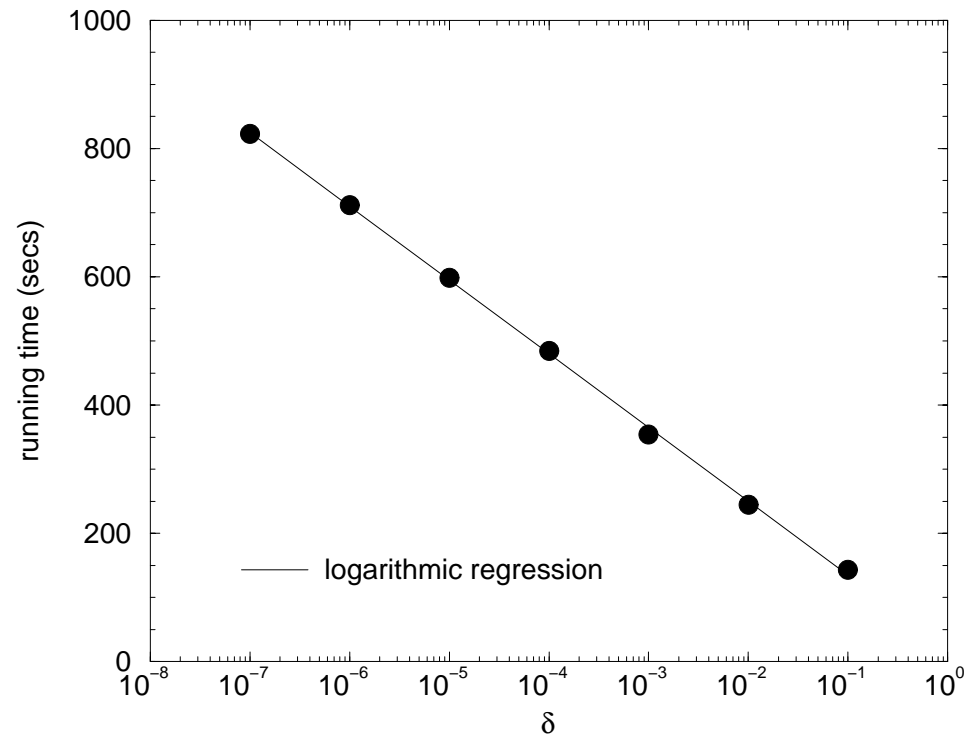
Effective Conductivity

Perfectly insulating, nonoverlapping spherical inclusions :



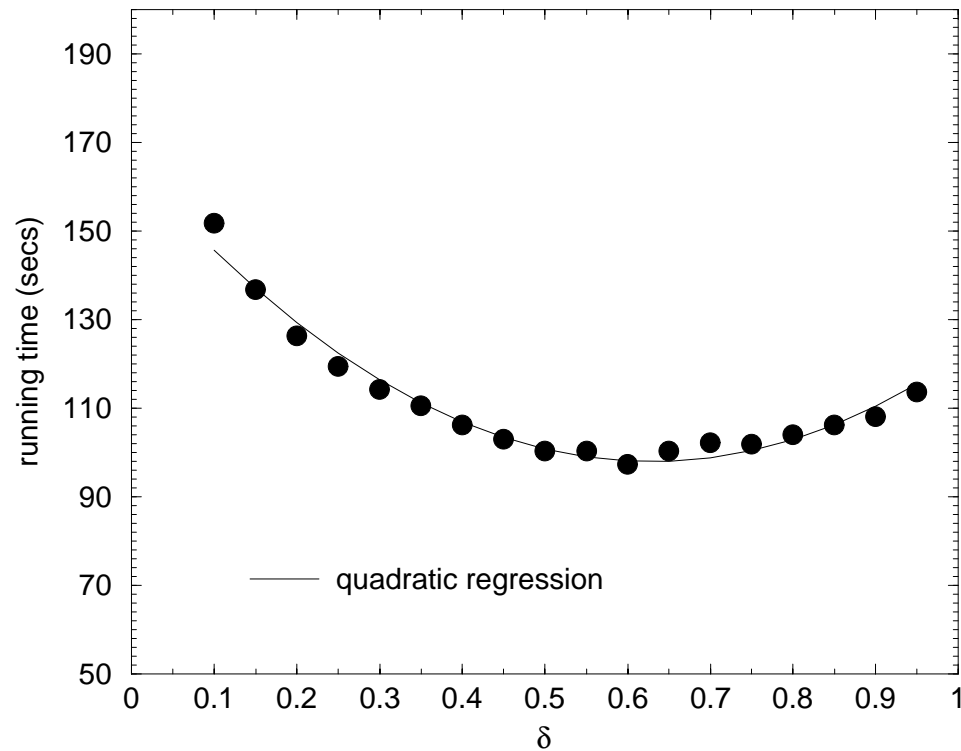
Effective Conductivity

Perfectly insulating, nonoverlapping spherical inclusions : Timing with WOS



Effective Conductivity

Perfectly insulating, nonoverlapping spherical inclusions : Timing with GFFPA



Feynman-Kac Formula

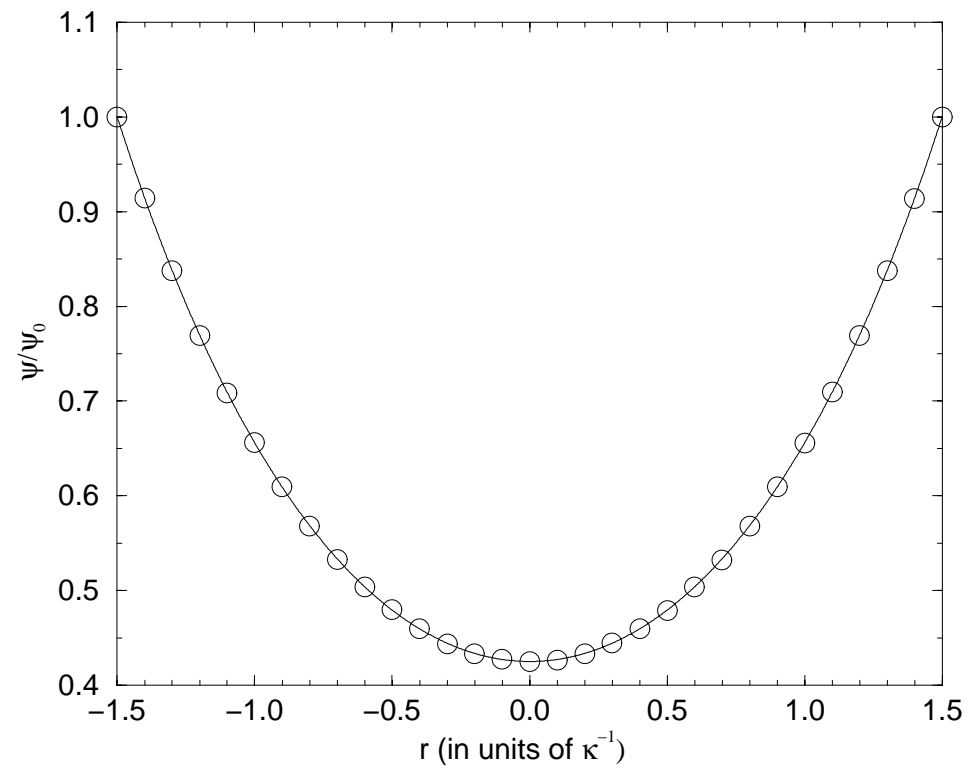
Linearized Poisson-Boltzmann Equation:

$$\Delta \Psi - \kappa^2 \Psi = 0, \quad \mathbf{x} \in \Omega \quad (12)$$

$$\Psi(\mathbf{x}) = \Psi_0(\mathbf{x}), \quad \mathbf{x} \in \partial\Omega \quad (13)$$

$$\Psi(\mathbf{x}) = E[\Psi_0(X_{\tau_D}^{\mathbf{x}}) \exp\{-\int_0^{\tau_D} \kappa^2 dt\}], \quad (14)$$

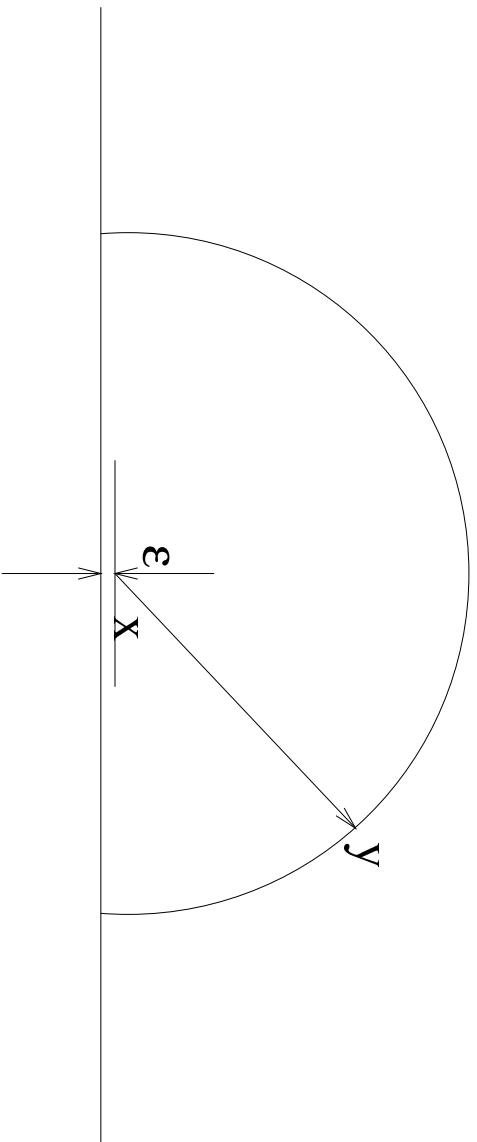
$$E[\exp(-\kappa^2 t)] = \frac{d\kappa}{\sinh d\kappa} \quad (15)$$



Last Passage Algorithms

- Charge distribution on a conducting object with edges and corners.
- Problems in which a large fraction of the absorption takes place on a very small fraction of the surface.
- Problems in which more than one conducting object is present, at close proximity, and at different voltages.

Approach from Outside



Approach from Outside

- probability of diffusing to infinity of a diffusing particle initiated at x ϵ -distant (very near) to the lower FP surface

$$P(x) = \int d^2y g(x, y, \epsilon) p(y, \infty) \quad (16)$$

$$\sigma(x) = -\frac{1}{4\pi} \frac{d}{d\epsilon} \bigg|_{\epsilon=0} \phi(x) = \frac{1}{4\pi} \frac{d}{d\epsilon} \bigg|_{\epsilon=0} P(x) \quad (17)$$

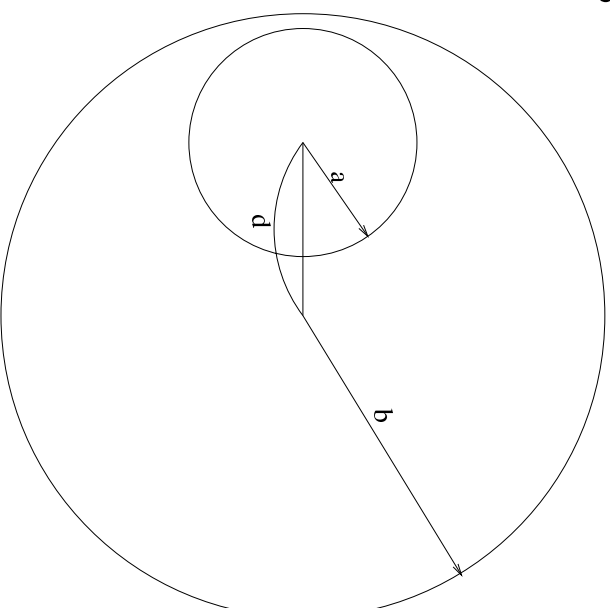
$$\sigma(x) = \frac{1}{4\pi} \int d^2y \bar{g}(x, y) p(y, \infty), \quad (18)$$

where

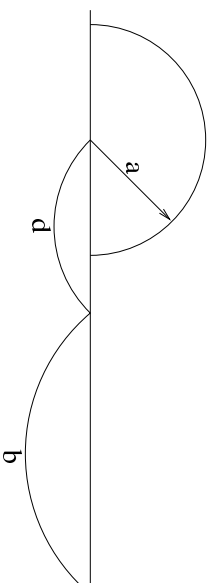
$$\bar{g}(x, y) = \frac{d}{d\epsilon} \bigg|_{\epsilon=0} g(x, y, \epsilon) \quad (19)$$

Charge Density on a Circular Disk

From the top



From the side



Charge Density on a Circular Disk

$$\bar{q} = \frac{3 \cos \theta}{4 a^3} \quad (20)$$

$$\sigma(x) = \frac{3}{16\pi} \oint dS \frac{\cos \theta}{a^3} p(\mathbf{r}, \infty), \quad (21)$$

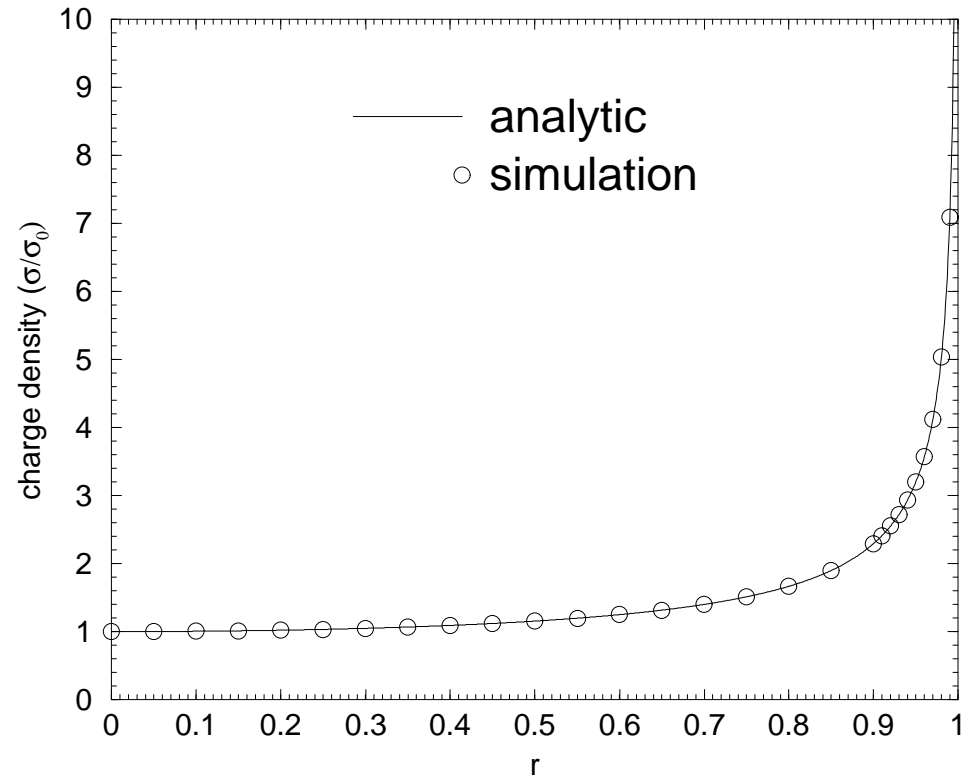
where

$$p(\mathbf{r}, \infty) = 1 - \frac{2}{\pi} \arctan \left(\frac{\sqrt{2b}}{\sqrt{\sqrt{r^2 - b^2} + \sqrt{(r^2 - b^2)^2 + 4b^2 x^2}}} \right), \quad (22)$$

where $r^2 = x^2 + y^2 + z^2$

Charge Density on a Circular Disk

charge density on a circular disk



Future Work

- Extension of the Green's function library
 - Using analytic solutions
 - Sampling new Green's functions
- Extension of these methods to other PDEs
 - Poisson equation
 - Linearized Poisson Boltzmann equation
 - Time-independent Schrödinger equation
- More applications such as biological problems
 - Material Science
 - Biomolecular Science
- Quasirandom walks