Kinetics of Filtration and Clogging

work in collaboration with Somalee Datta

Flows and Networks in Complex Media IPAM, UCLA, April 27-May 1, 2009

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What is filtration? What is clogging?

Basic Approach:

minimalist modeling; probabilistic descriptions

Two Main Results:

density profiles of trapped & escaped particles

clogging time and its distribution

Summary & Outlook





What is filtration? What is clogging? $\bigvee \lor \lor \lor$ \bigvee \bigvee V 0/ \square σ பி 2 σ 0 2 filter ر لگا ပြ 5 ઉદ્ σ time O D G L σ [2]

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flow ⇔ geometry no steady state →clogging



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Types of filtration: cake



flow ⇔ geometry no steady state →clogging





flow ⇔ geometry no steady state → clogging



Mechanisms of depth filtration: hydrodynamic, gravitation electrochemical $1-10 \ \mu m$

Real Cake Filter Clogging: The Aftermath

Real Cake Filter Clogging: The AftermathAir conditioner filterDryer vent



Water filter





Fuel filter



I. Bubble model





2. Particle & pore characteristics



I. Bubble model







Poiseuille flow dynamically neutral particles

perfect mixing at junctions $p_i = \phi_i / \sum \phi_i$, with $\phi_r \propto r_i^4$



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4. Trapping mechanism:

particle > pore → *permanent, complete blockage*

I. Distribution of Trapped Particles S. Datta 8 PRE 58, F

S. Datta & SR, PRE **58**, R1203 (1998)

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assumptions:

critical clogging overlapping particle & pore sizes

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for particle of radius r:

 $p_{<} \equiv \text{prob. of getting stuck in a bubble}$ $= \int_{a}^{r} r'^{4} dr' / \int_{a}^{b} r'^{4} dr' = \frac{r^{5} - a^{5}}{b^{5} - a^{5}}$



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S. Datta & SR,

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$$\langle P_n \rangle = \int_a^b \left(1 - \frac{r^5 - a^5}{b^5 - a^5} \right)^{n-1} \frac{r^5 - a^5}{b^5 - a^5} \frac{dr}{b - a}$$



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average over particle radii

$$\simeq \begin{cases} \frac{b^5 - a^5}{5a^4(b - a)} n^{-2}, & a \neq 0; \\ 0.1836 \dots n^{-6/5} & a = 0. \end{cases}$$

b(r) p(r) (U[a,b]) a b r

S. Datta & SR,

PRE 58, R1203 (1998)

Trapped Particle Distributions



Large-w Approximation

prob. that particle of radius r is trapped in a bubble of w bonds:

$$p_{<} = w \int_{0}^{r} dr_{1} \int_{0}^{1} dr_{2} \dots \int_{0}^{1} \frac{r_{1}^{4} dr_{w}}{r_{1}^{4} + r_{2}^{4} + \dots + r_{w}^{4}} \qquad u_{i} = r_{i}/r_{1}$$
$$= w \int_{0}^{r} r_{1}^{w-1} dr_{1} \int_{0}^{1/r_{1}} du_{2} \dots \int_{0}^{1/r_{1}} \frac{du_{w}}{1 + u_{2}^{4} + \dots + u_{w}^{4}}$$
$$\sim w \int_{0}^{r} r_{1}^{w-1} dr_{1} \int_{0^{+}}^{1/r_{1}} \frac{u^{w-2}}{u^{4}} du$$

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$$\sim w \int_{0}^{r} r_{1}^{w-1} dr_{1} \int_{0^{+}}^{1/r_{1}} \frac{u^{w-2}}{u^{4}} du$$

$$p_{<} \propto \begin{cases} r^{w}, & w < 5; \\ r^{5} \ln r, & w = 5; \\ r^{5}, & w > 5. \end{cases}$$

2. Size Distribution of Escaping Particles

assume particle and pore sizes (U[0,1])

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$$\sum_{n'>n}^{\infty} P_{n'} = \sum_{n'>n}^{\infty} r^5 (1-r^5)^{n'-1}$$
$$\sim \exp(-nr^5)$$

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 $Q_n(r) \equiv \text{size distribution of escapees at } n \propto n^{1/5} \exp(-nr^5)$

Escapee Size Distribution

bubble model w=10



Escapee Size Distribution



Clogging Time and its Distribution S. Datta & SR PRL 84, 6018 (2000)

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Single bond clogging:

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assume $b(r) = 2\alpha r e^{-\alpha r^2} \rightarrow s = 1/\sqrt{\alpha}$ $p(r) = 2r e^{-r^2}$



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N-I get through Nth gets stuck

Clogging Time and its Distribution

Single bond clogging (cont):





$$Q_N(R) = \left[\int_0^R p(r) \, dr \right]^{N-1} \int_R^\infty p(r) \, dr$$

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$$\langle Q_N \rangle = \int_0^\infty Q_N(R) \ b(R) \, dR \ bond \\ average \\ \simeq \int_0^\infty (1 - e^{-R^2})^{N-1} e^{-R^2} \ 2\alpha R e^{-\alpha R^2} \, dR$$

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$$\simeq \int_{0}^{\infty} (1 - e^{-R^{2}})^{N-1} e^{-R^{2}} \ 2\alpha R e^{-\alpha R^{2}} dR$$

$$\sim \int e^{-Nx^{1/\alpha}} x^{1/\alpha} dx \ \sim N^{-(1+\alpha)} \qquad x = e^{-\alpha R^{2}}$$

$$\begin{aligned} Q_N(R) &= \left[\int_0^R p(r) \, dr \right]^{N-1} \int_R^\infty p(r) \, dr \\ & \text{N-1 get through} \quad \text{Nth gets stuck} \end{aligned}$$

$$\begin{aligned} \langle Q_N \rangle &= \int_0^\infty Q_N(R) \, b(R) \, dR \quad \begin{array}{l} \text{bond} & p(r) = 2r \, e^{-r^2} \\ b(r) = 2\alpha r \, e^{-\alpha r^2} \end{aligned}$$

$$&\simeq \int_0^\infty (1 - e^{-R^2})^{N-1} \, e^{-R^2} \, 2\alpha R e^{-\alpha R^2} \, dR \\ &\sim \int e^{-Nx^{1/\alpha}} x^{1/\alpha} \, dx \, \sim N^{-(1+\alpha)} \quad x = e^{-\alpha R^2} \end{aligned}$$

$$\langle N \rangle \sim \int_1^\infty \frac{N}{N^{1+\alpha}} dN \sim \begin{cases} \infty & \text{for } s = \frac{1}{\sqrt{\alpha}} \ge 1 \\ (1 - \alpha)^{-1} & \text{for } s = \frac{1}{\sqrt{\alpha}} \le 1 \end{cases}$$

Cartoon for Network Cloggingsize-ordered blocking (entrance prob. $r^4 \to r^\infty$)total flowt = 0Image: transform of the second s













size-ordered blocking: biggest first, smallest last

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radius of kth smallest bond:

$$\int_0^{r_k} 2\alpha r \, e^{-\alpha r^2} \, dr = \frac{k}{w}, \qquad r_k = s \, \sqrt{\frac{k}{w}}$$

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flow rate when k bonds still open:

$$\kappa(k) = \sum_{j=1}^{k} r_j^4 \approx s^4 \sum_{j=1}^{k} \left(\frac{j}{w}\right)^2 \sim \frac{s^4 k^3}{w^2}$$

$$\kappa(w) = s^4 w$$

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clogging time:

$$T = t_1 + t_2 + t_3 + \ldots \approx w^2 \left[1 + \frac{1}{2^3} + \frac{1}{3^3} + \ldots \right] \propto w^2$$

hypothesis: clogging time determined by smallest bond

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If
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 $S_w(r) \equiv$ prob. smallest bond out of w has radius r= $w b(r) [b_>(r)]^{w-1}$

$$= 2\alpha wr e^{-\alpha wr^2}$$

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 $S_w(r) \equiv \text{prob. smallest bond out of } w \text{ has radius } r$ $= w b(r) [b_{>}(r)]^{w-1}$ $= 2\alpha wr e^{-\alpha wr^2}$

connection between t and r: $T \sim t_1 \approx \frac{1}{w} \frac{\kappa(w)}{\kappa(1)} = \frac{s^4}{r_1^4}$

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$$\rightarrow P_w(t) \sim \frac{w}{t^{3/2}} e^{-w/t^{1/2}} \qquad w^2 < t < w^2 N^2$$
Clogging Time Distribution $P_w(t) \sim \frac{w}{t^{3/2}} e^{-w/t^{1/2}}$



Moments of the Clogging Time

$$P_w(t) \sim \frac{w}{t^{3/2}} e^{-w/t^{1/2}} w^2 < t < w^2 N^2$$

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$$\langle t^k \rangle = \int_0^\infty t P_w(t) dt \approx \int_{w^2}^{N^2 w^2} w t^{k-3/2} dt$$

$$M_k(w) \equiv \langle t^k \rangle^{1/k} \sim \begin{cases} w^2 N^{2-1/k} & k > 1/2 \\ w^2 (\ln N)^2 & k = 1/2 \\ w^2 & k < 1/2 \end{cases}$$

Measures of Clogging Time

moments of clogging time



Measures of Clogging Time

moments of clogging time

partial clogging time distribution



Summary & Outlook

Gradients drive depth filtration breakdown

Basic contradiction of filters:

A filter should be long for good filtering short to be active

Clogging time governed by extreme events →power law clogging time distribution

Some open questions:

When is a filter "dead"?

How to describe gradient-driven percolation?

Other mechanisms: sclerosis, relaunching, aggregation...