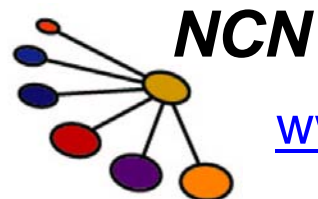


**NCN@Purdue-Intel Summer School**  
**Notes on Percolation Theory**

# **Lecture 2**

## **Thresholds, Islands, and Fractals**

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Electrical and Computer Engineering  
Purdue University  
West Lafayette, IN USA



[www.nanohub.org](http://www.nanohub.org)

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UNIVERSITY

# Outline of lecture 2

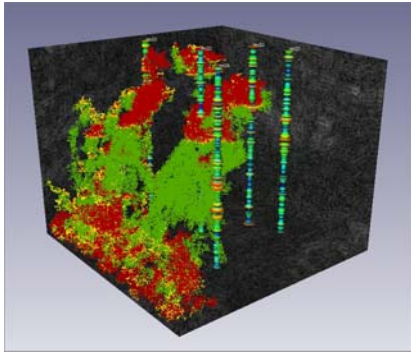
- 1) **Basic concepts of percolation theory**
- 2) Percolation threshold and 'excluded volume'
- 3) Cluster size distribution, cluster Radius
- 4) Fractal dimension of a random surface
- 5) Conclusion

*Application Notes: Nanocrystal Flash*

# Three topics of random systems

## Cluster sizes

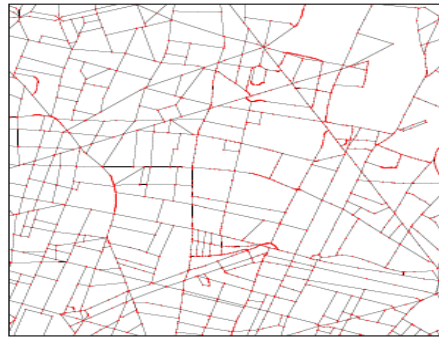
Oil fields, *NC Flash*



## Percolation threshold

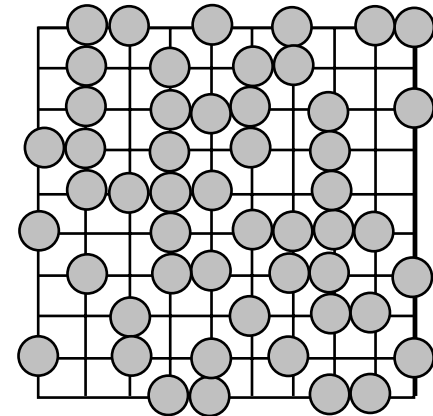
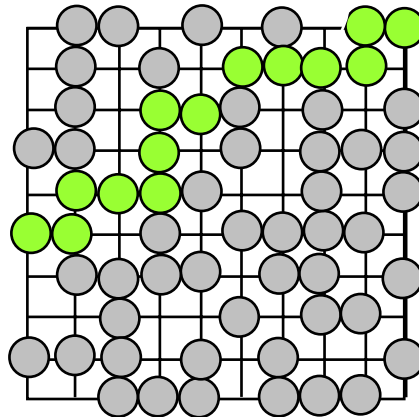
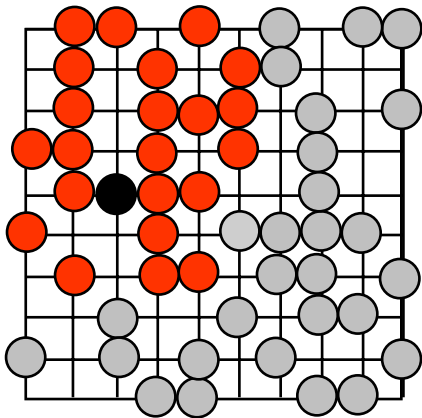
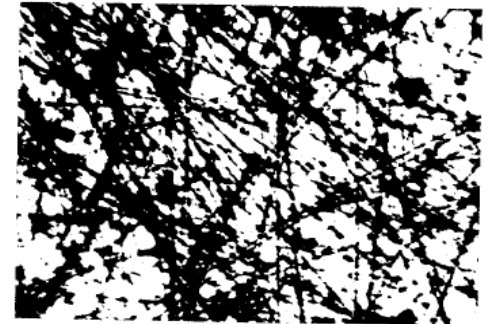
epidemics, forest fire,  
telecom grid, *www*

*Nanonets*, *photovoltaics*



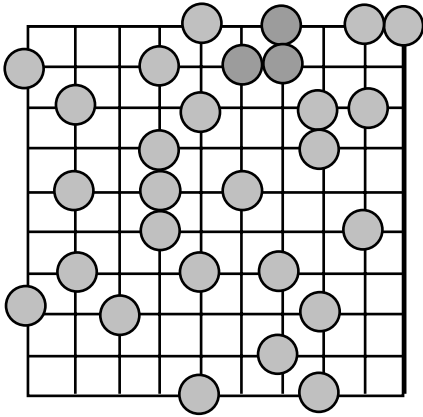
## Fractal dimension

Aerosol, paper, *sensors*

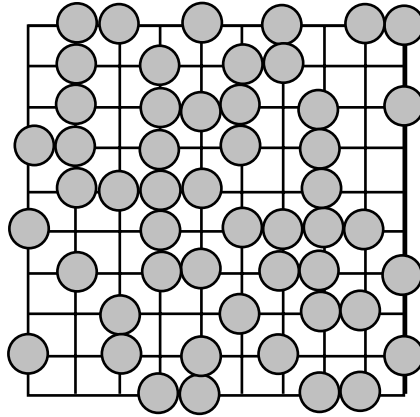


# basic concepts: percolation threshold

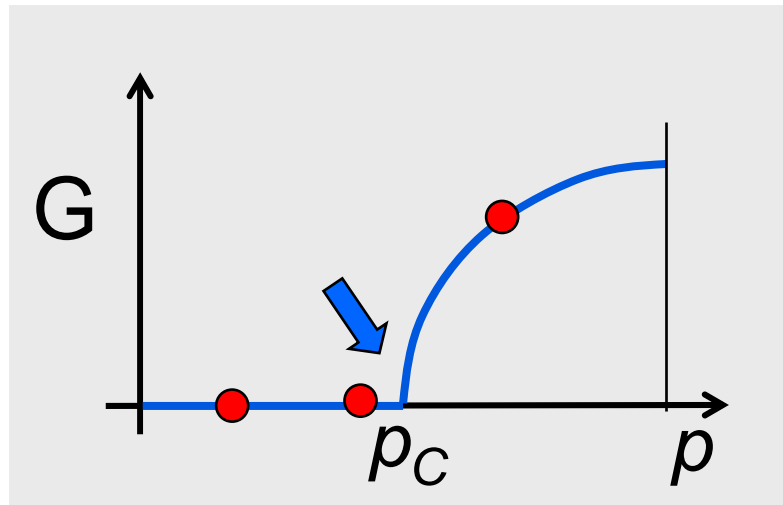
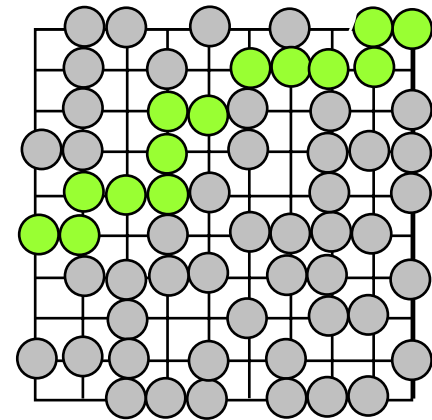
$p=0.3$



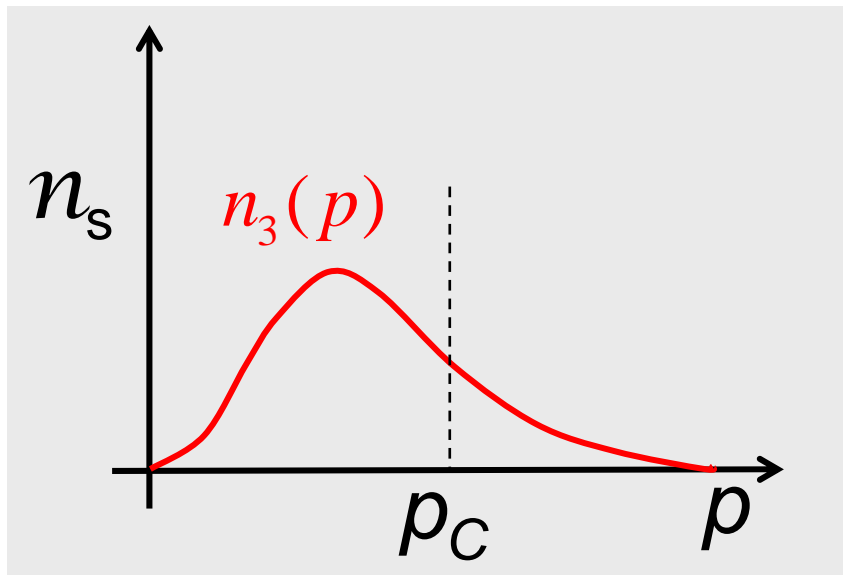
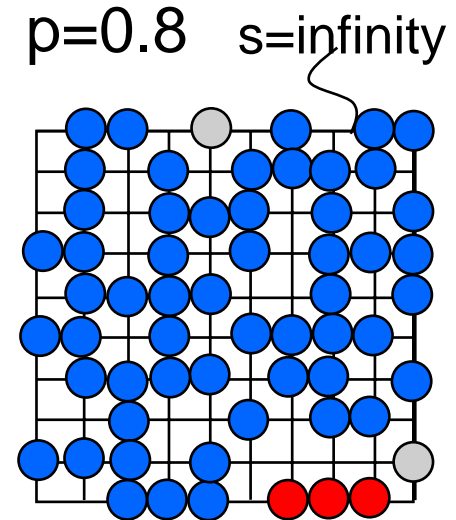
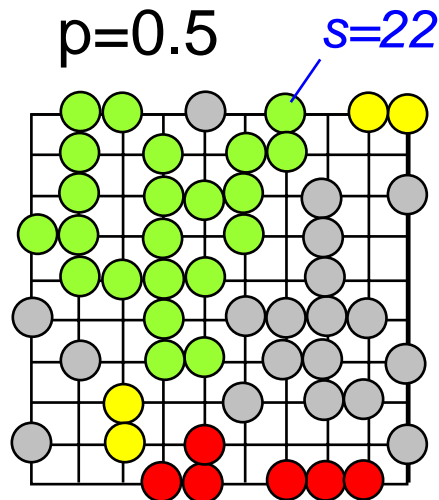
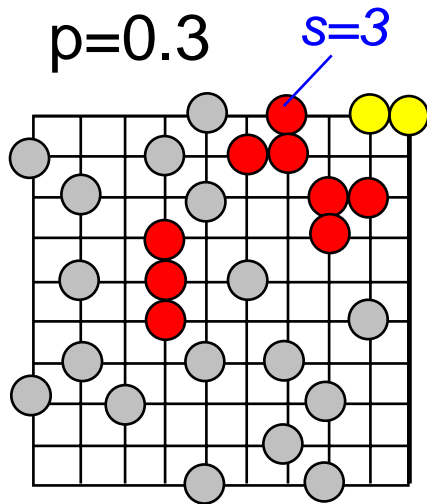
$p=0.5$



$p=0.8$



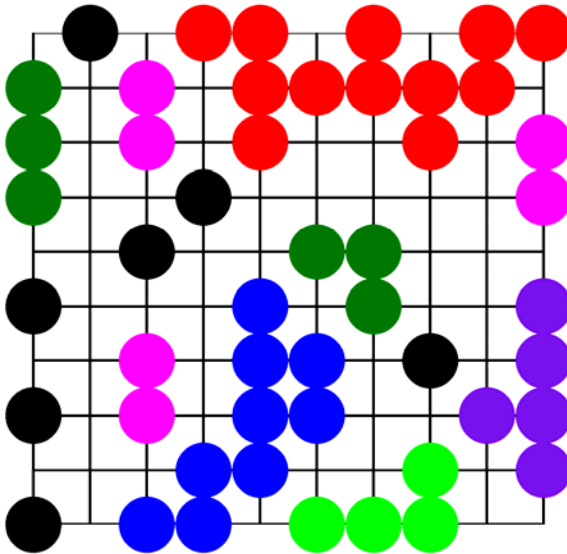
# basic concepts: cluster size



# cluster-size distribution and its moments

$$n_s(p, L)$$

Number of cluster of size  $s$   
divided by the number of sites

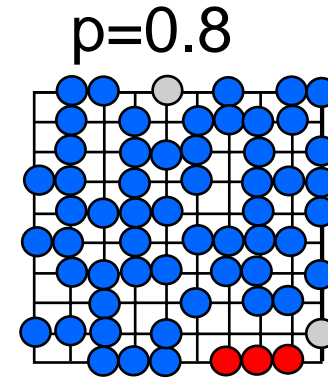
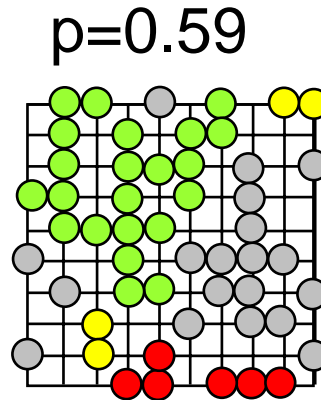
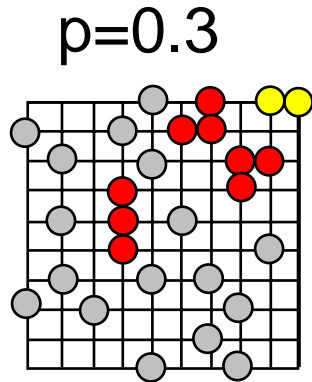


$$p = \sum_{0 < s < \infty} s n_s(p)$$

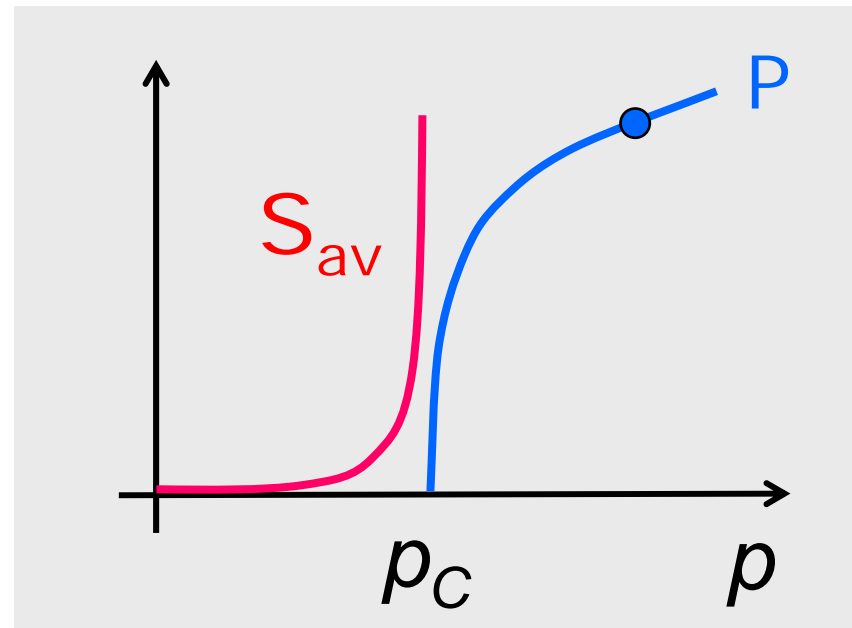
$$s_{avg} = \frac{\sum_{s>0} s^2 n_s(p)}{\sum_{s>0} s n_s(p)}$$

...plays a role similar to  
Boltzmann distribution  $f(E)$

# average cluster vs. infinite cluster

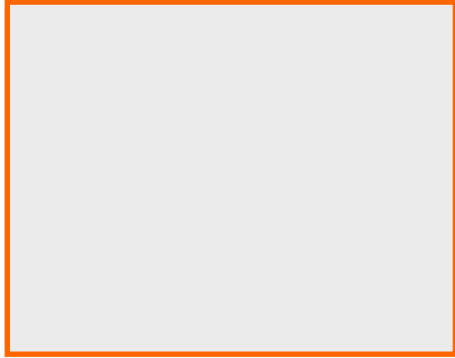


$$s_{avg} = \frac{\sum_{s>0} s^2 n_s(p)}{\sum_{s>0} s n_s(p)}$$

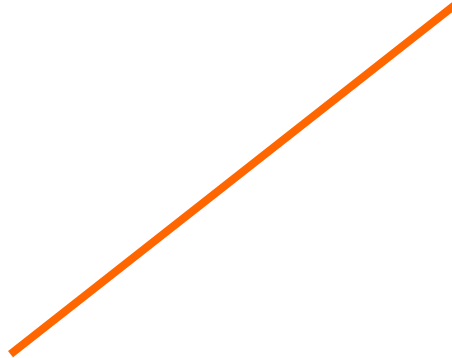


# basic concepts: dimension of a surface

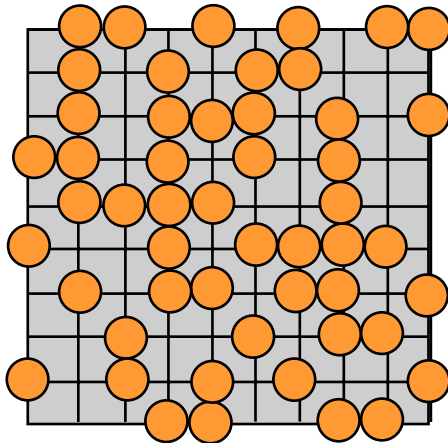
$D=2$



$D=1$



$D=0$



$D=?$



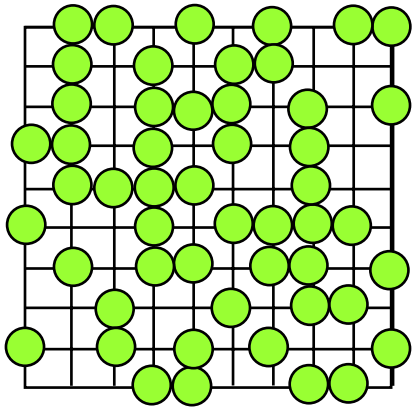
# outline

- 1) Basic Concepts of Percolation Theory
- 2) Percolation Threshold and Excluded Volume**
- 3) Cluster Size Distribution, Cluster Radius
- 4) Fractal dimension of a random structure
- 5) Conclusion

*Application Notes: Nanocrystal Flash*

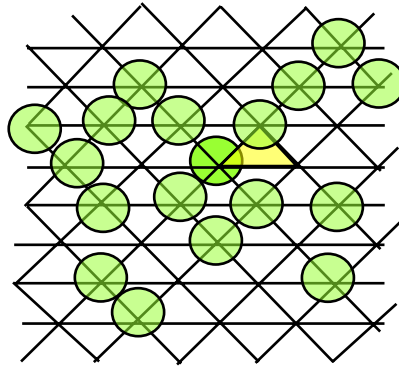
# calculation of percolation threshold

Square



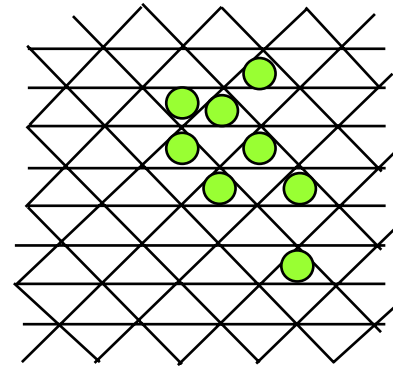
$$p_c = 0.593$$

Triangular



$$p_c = 0.500$$

Hexagonal

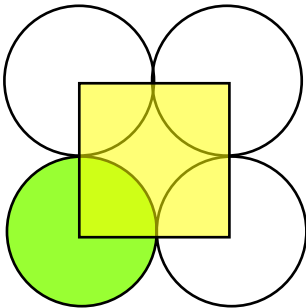
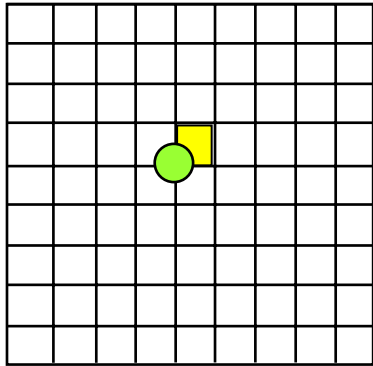


$$p_c = 0.697$$

Percolation threshold ( $p_c = N_c / N_T$ ) depends on lattice,  
there is something wrong here !

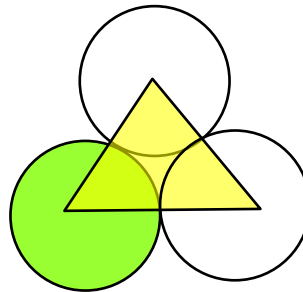
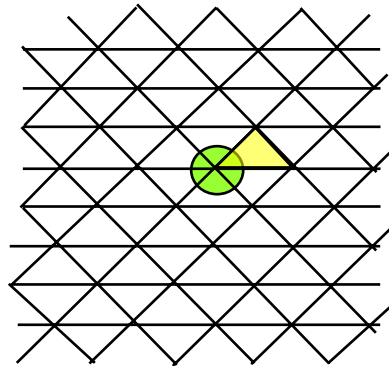
area fraction fill-factor  $F \equiv A_{\text{element}} / A_{\text{cell}}$

Square



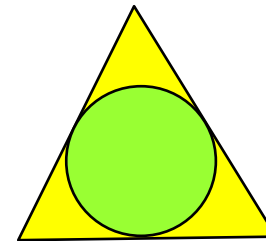
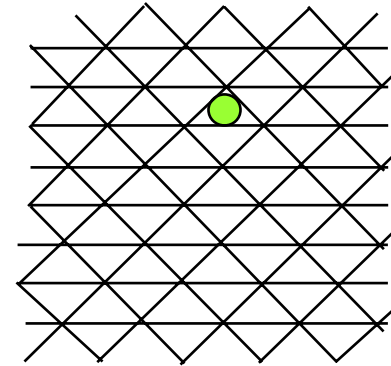
$$F = \frac{\pi}{4}$$

Triangular



$$F = \frac{\pi}{2\sqrt{3}}$$

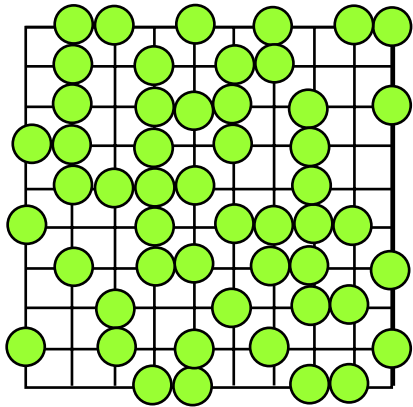
Hexagonal



$$F = \frac{\pi}{3\sqrt{3}}$$

# $(F \times p_c)$ is universal ....

Square

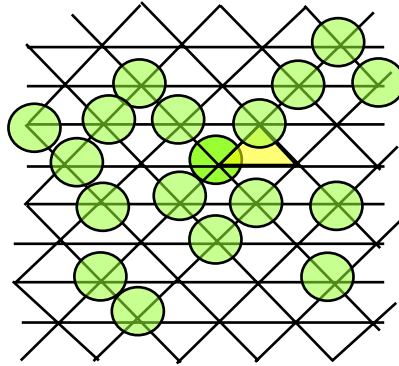


$$p_c = 0.593$$

$$F = \frac{\pi}{4}$$

$$F p_c \sim 0.45$$

Triangular

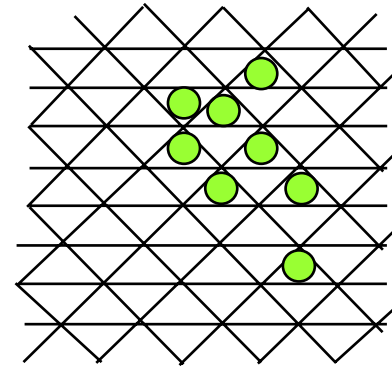


$$p_c = 0.500$$

$$F = \frac{\pi}{2\sqrt{3}}$$

$$F p_c \sim 0.45$$

Hexagonal



$$p_c = 0.697$$

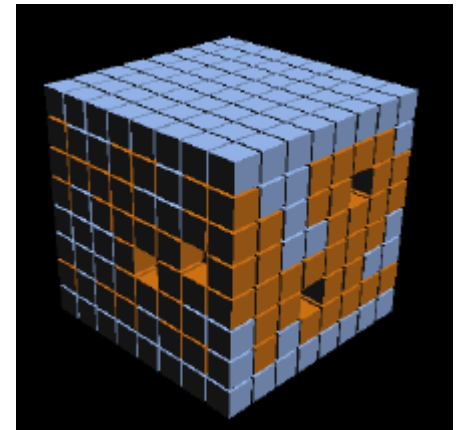
$$F = \frac{\pi}{3\sqrt{3}}$$

$$F p_c \sim 0.42$$

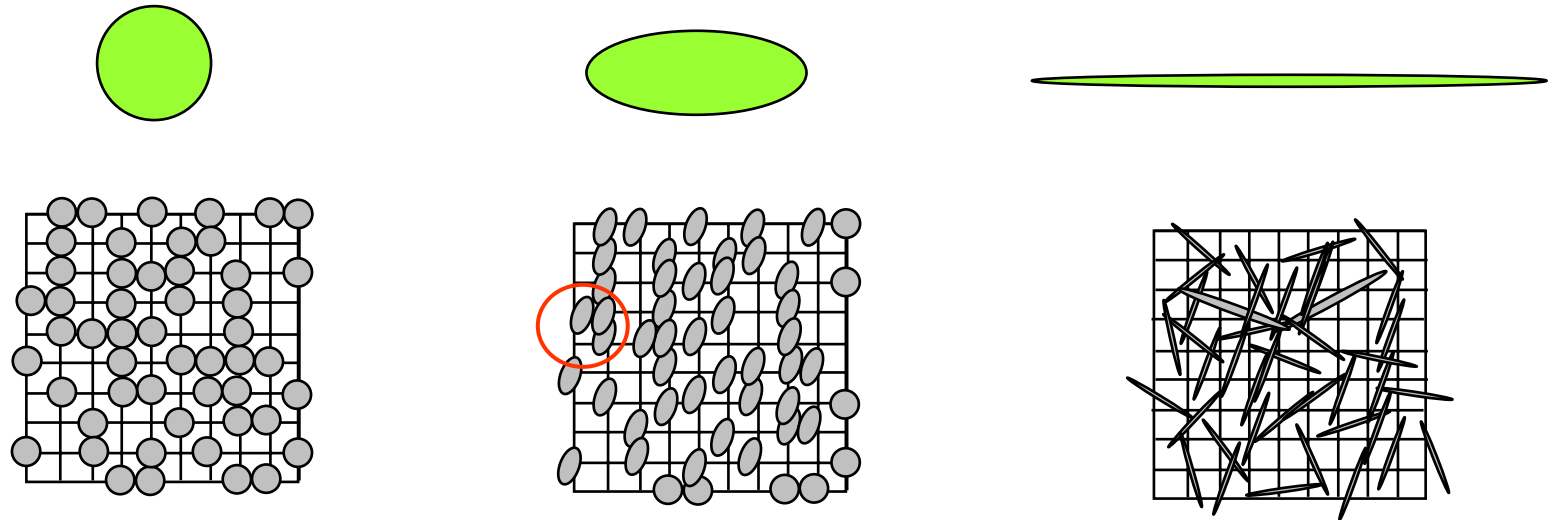
# HW: Percolation in 3D lattices

For simple cubic lattice site percolation,  $Fp_c \sim 0.16$  and  $p_c \sim 0.311$ . Here  $F$  is the volume fill fraction, not area fill fraction.

Use the universality of  $Fp_c$  to show that the percolation threshold for FCC lattice must be approximately 0.1



# percolation involving other shapes

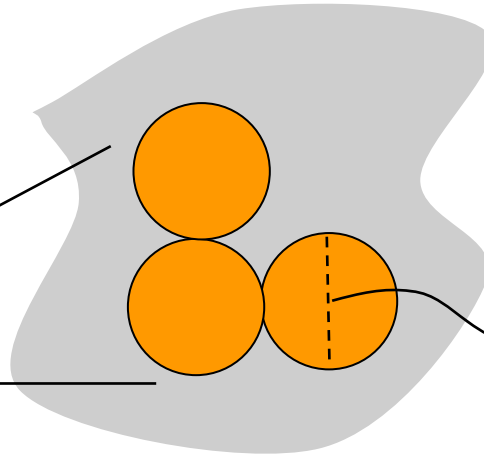
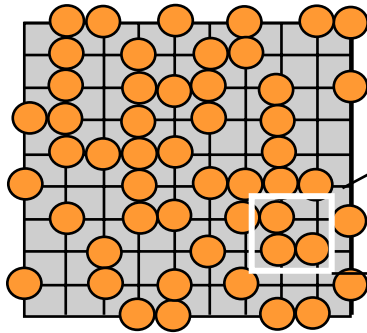


How do I determine the percolation threshold?

$F_{xp_c} \sim 0.45$  will not work, unfortunately !

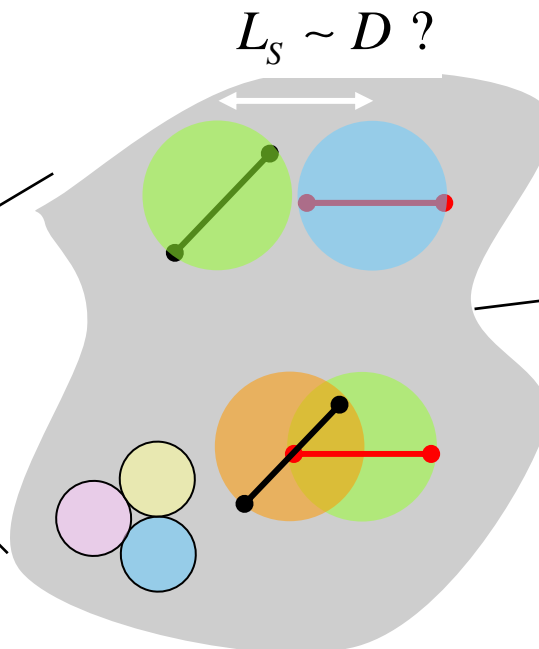
# excluded area ... first an intuitive result

Disk percolation



$$N_C \approx \frac{1}{\frac{\pi D^2}{4}} = \frac{4}{\pi D^2}$$

Stick percolation



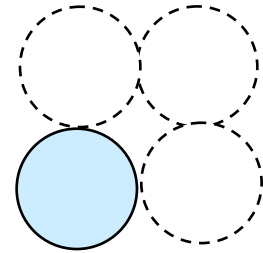
$$N_C \approx \frac{1}{\frac{\pi (L_s / 2)^2}{4}} = \frac{4^2}{\pi L_s^2}$$

$$N_{C, exact} = \frac{4.26^2}{\pi L_s^2}$$

# the concept of excluded area .....

For disks on arbitrary grid ...

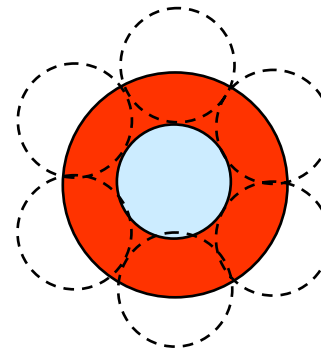
$$F \times p_c = \frac{A_{\text{element}}}{A_{\text{cell}}} \cdot \frac{N_C}{N_T} \approx 0.45$$



$$A_{\text{element}} = \frac{\pi}{4} (D)^2$$

For arbitrary shape on arbitrary grid ...

$$\frac{A_{\text{ex}}}{A_{\text{cell}}} \cdot \frac{N_C}{N_T} \approx$$



$$A_{\text{ex}} = \frac{\pi}{4} (2 \cdot D)^2$$

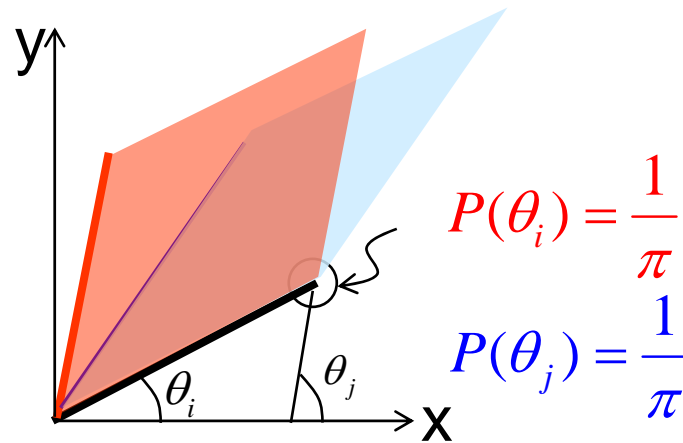
X 4

Percolation begins when excluded volume is routinely breached



## excluded volume for a stick ....

$$A_{\theta_i, \theta_j} = L_S L_S \sin(\theta_i - \theta_j)$$



$$\begin{aligned} A_{ex} &= \int_{-\pi/2}^{\pi/2} d\theta_i P(\theta_i) \int_{-\pi/2}^{\pi/2} d\theta_j P(\theta_j) \times A_{\theta_i, \theta_j} \\ &= \frac{2}{\pi} L_S^2 \end{aligned}$$

## excluded volume for a stick ....

$$\frac{A_{ex}}{A_{cell}} \cdot \frac{N_C}{N_T} \approx 1.8$$

$$A_{ex} N_C = 1.8$$

$$\frac{2L_S^2}{\pi} \frac{N_C}{A_{cell} N_T} \approx 1.8$$

$$N_C \approx \frac{0.9\pi}{L_S^2} \text{ area}^{-1}$$

percolation threshold correct within a factor of 2 !

# HW: excluded volume for other shapes ..

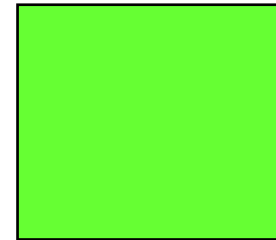
curved stick ...



**Ans.** 
$$A_{ex} = \frac{2}{\pi} L_{chord}^2$$
  
(if  $L_{chord} < \frac{R}{2}$ )

Hint.  
Use the stick algorithm

square ...



$$A_{ex} = 2L^2 (1 + 2/\pi + 4/\pi^2)$$

Hint. Compare with circle

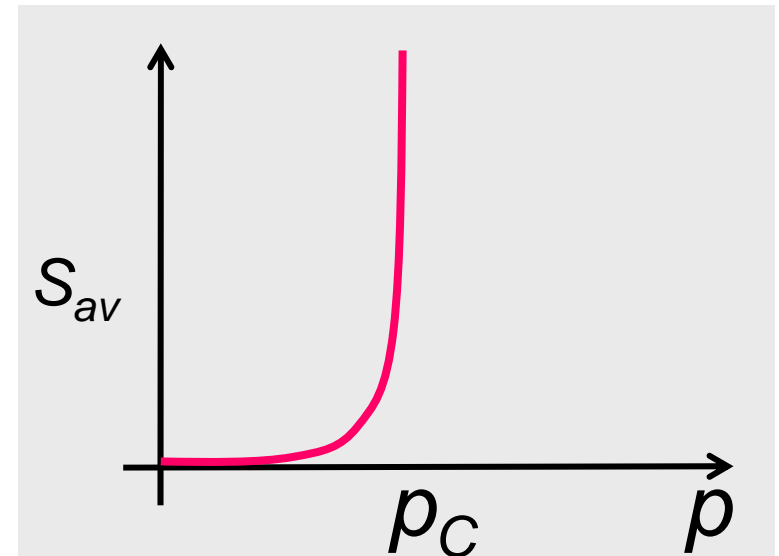
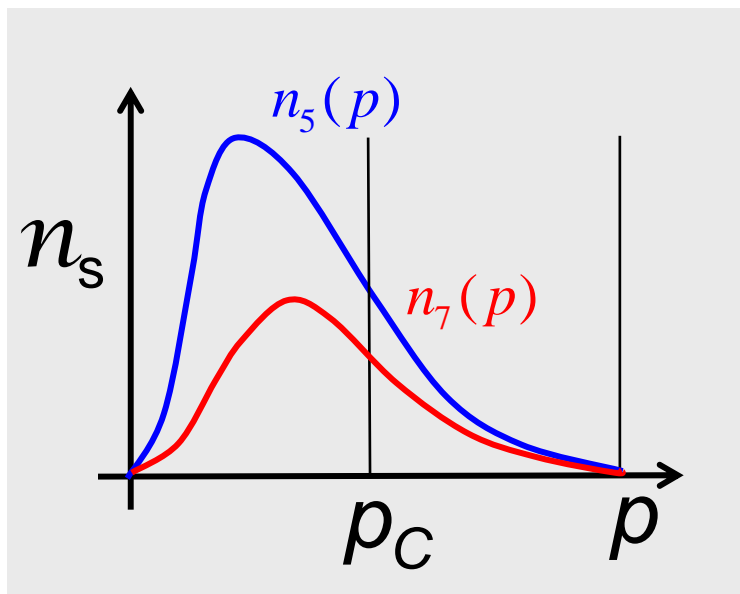
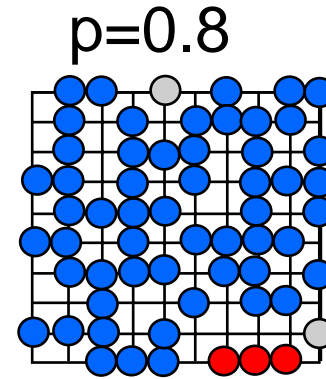
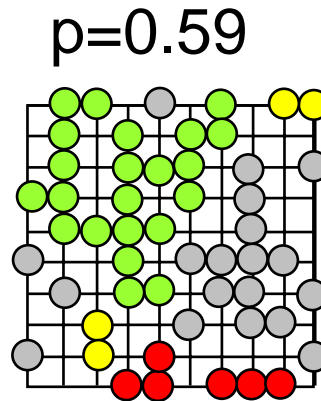
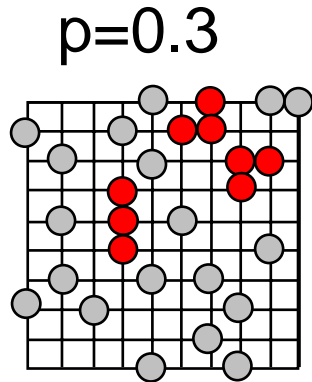
For general shape, use the  
Monte Carlo code posted

# outline

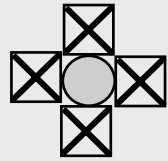
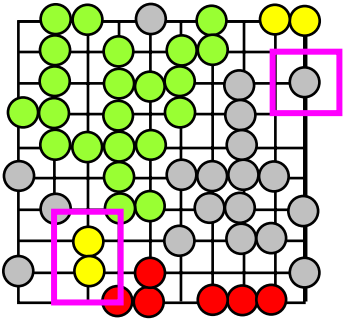
- 1) Basic Concepts of Percolation Theory
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- 5) Conclusion

*Application Notes: Nanocrystal Flash*

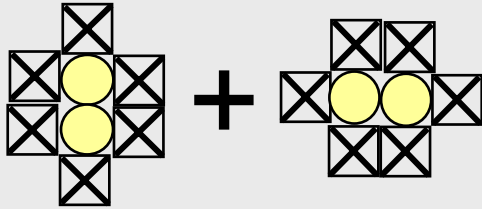
# cluster-size distribution



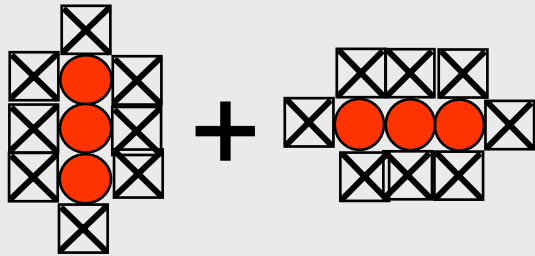
# small-cluster size distribution



$$n_1(p) = 1 \times p \times (1-p)^4$$

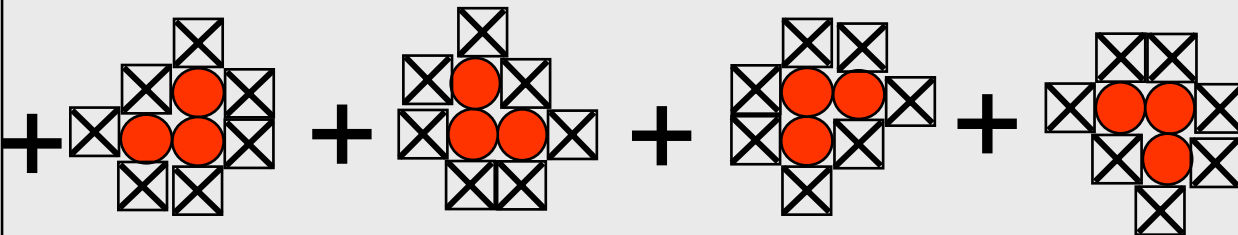


$$n_2(p) = 2 \times p^2 \times (1-p)^6$$



$$n_3(p) = 2 \times p^3 \times (1-p)^8$$

$$+ 4 \times p^3 \times (1-p)^7$$



# features of cluster-size distribution

$$n_1 = 1 \times p \times (1-p)^4$$

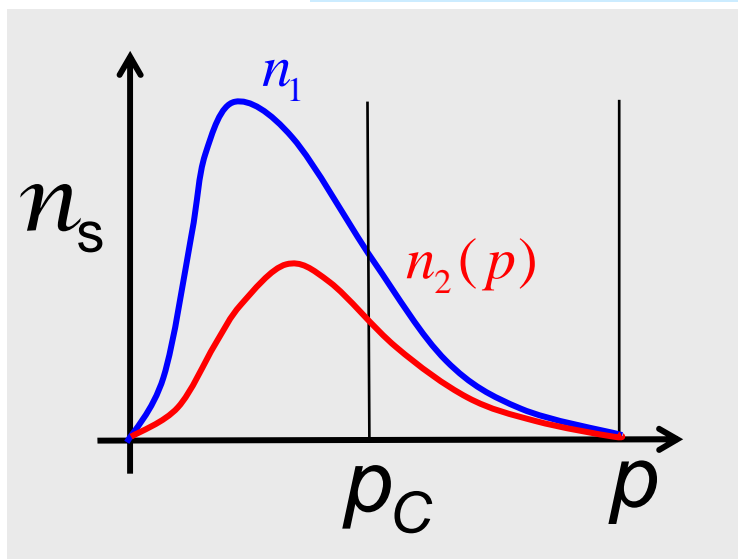
$$n_2 = 2 \times p^2 \times (1-p)^6$$

$$n_3 = 2 \times p^3 \times (1-p)^8 \\ + 4 \times p^3 \times (1-p)^7$$

- 'Zeros' at  $p=0,1$  with single peak

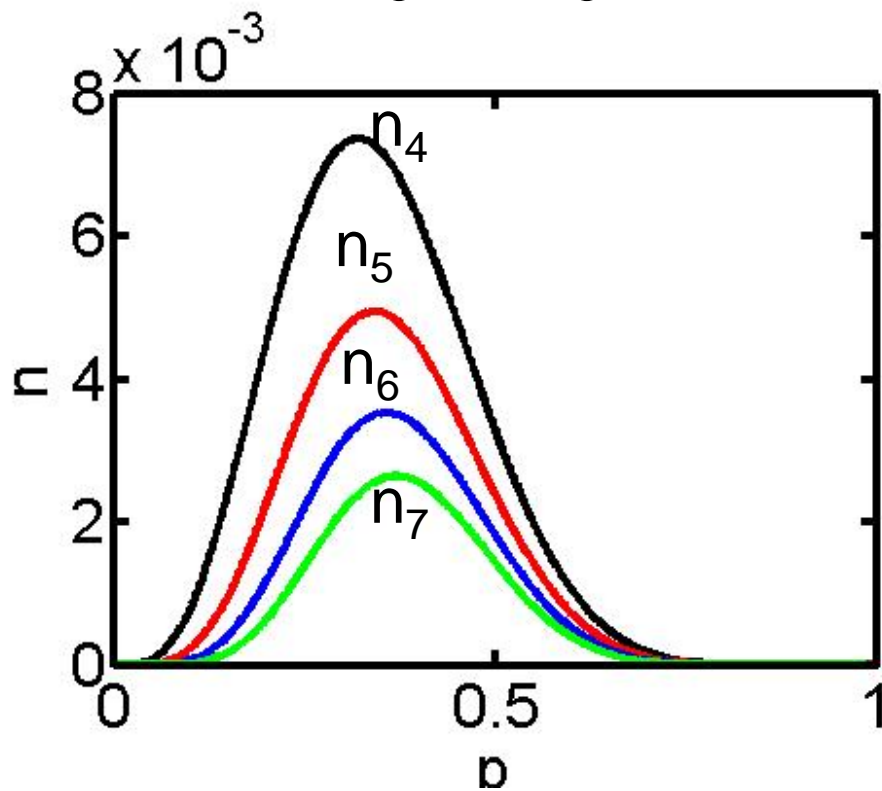
- Peak shifts towards  $p_c$  with  $s$   
(e.g.  $s=1$  is 0.2,  $s=2$  is 0.25;  $s=3$  is 0.29)

- General form:  $n_s(p) = \sum_t g_{st} \times p^s \times (1-p)^t$   
:  $g_{st}$  increases exponentially.

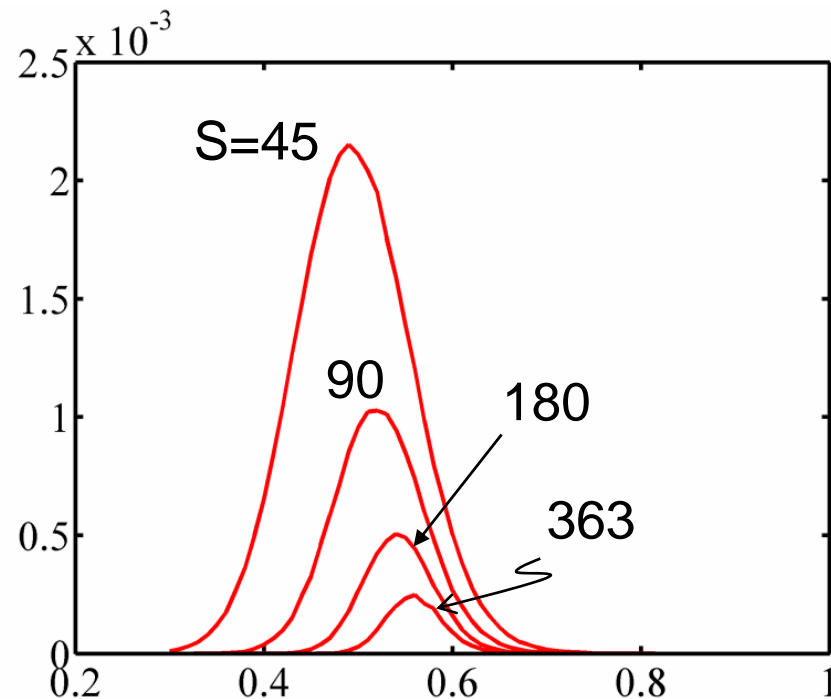


# numerical plots for cluster-size distribution

Analytically ...



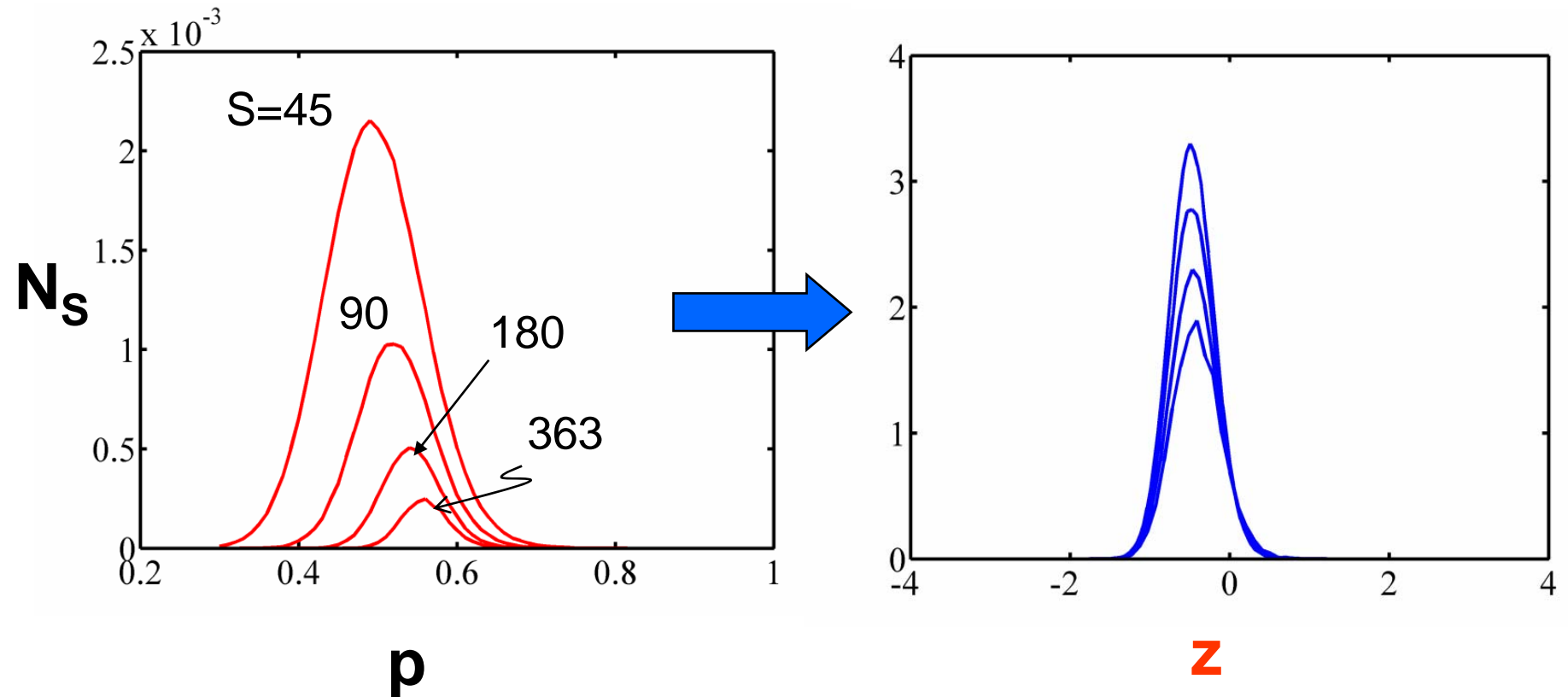
by computer ...



$$\left[ p_{\max}(s) - p_c \right] s^{0.395} \approx 0.45 \quad p_c \sim 0.6$$



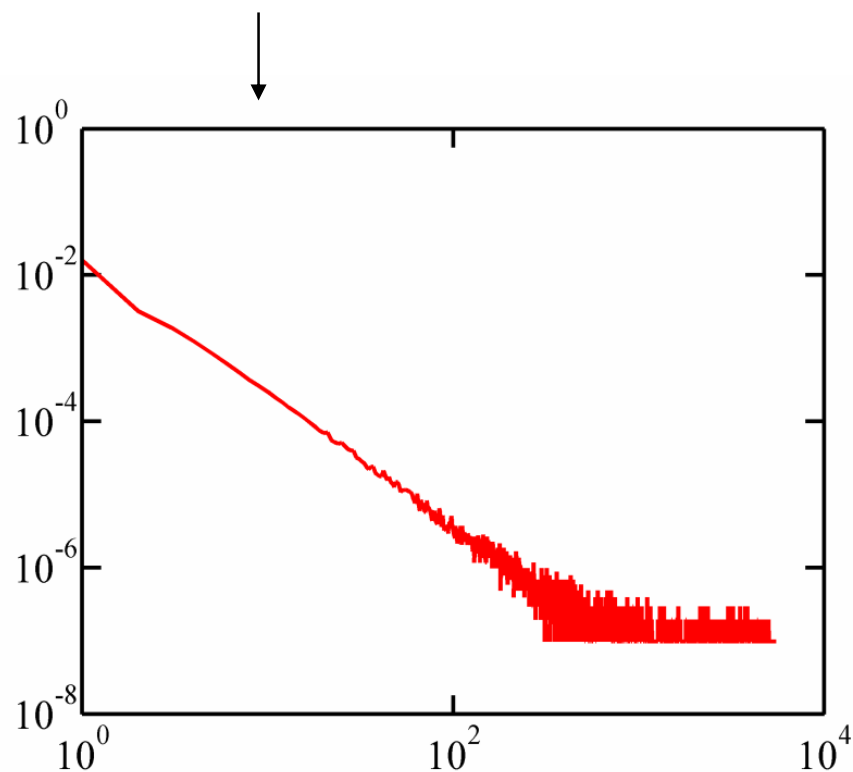
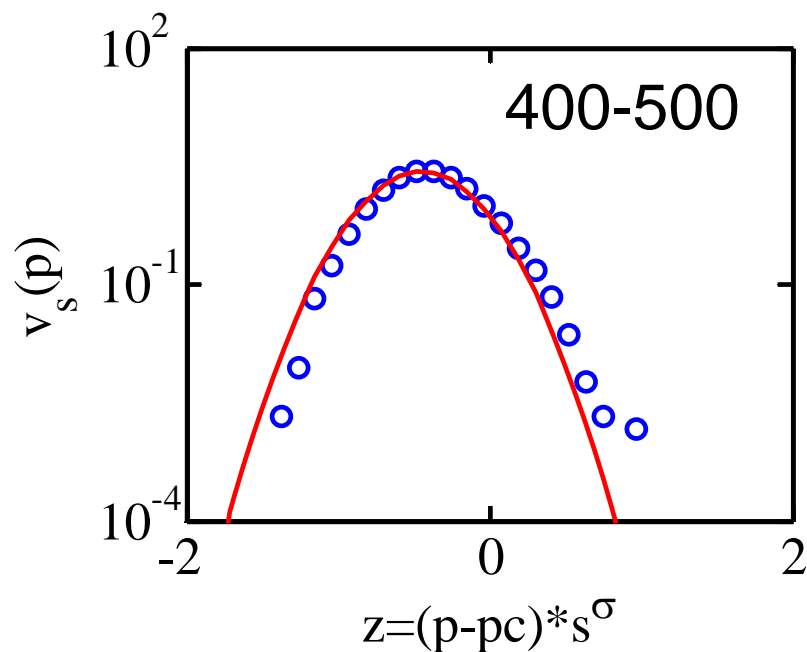
# scaling of cluster sizes



$$z \equiv [p(s) - p_c] s^{0.395}$$

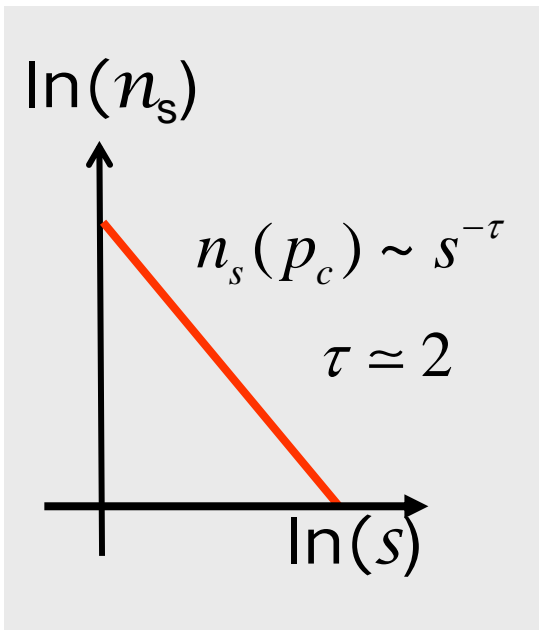
for reasonably large cluster-sizes ( $s > 20$ )

$$n_s(p) \approx e^{-c[(p-p_c)s^\sigma + 0.45]^\alpha} n_s(p_c)$$

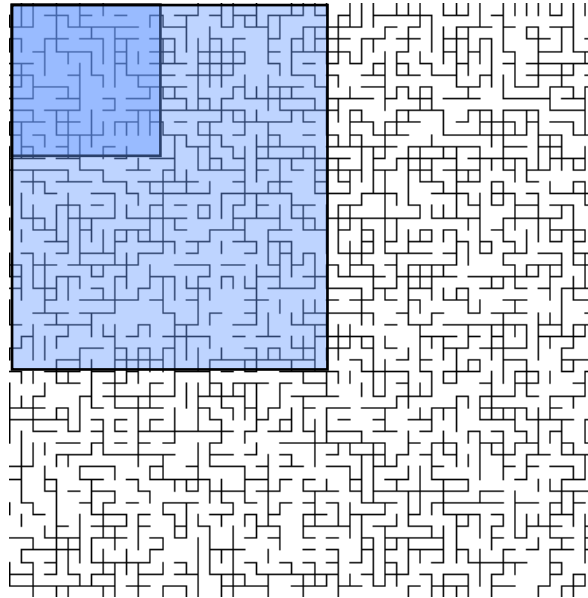


# self-similarity and scale-invariance

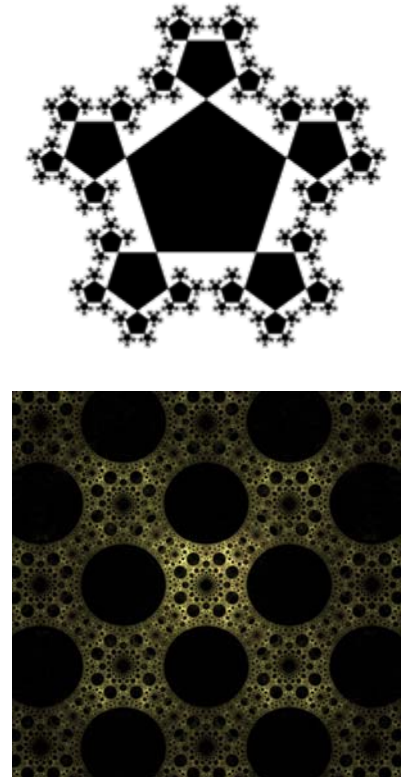
self-similarity



irregular  
self-similarity



regular  
self-similarity



# outline

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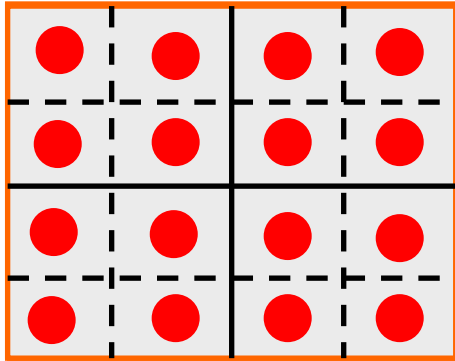
$D=?$



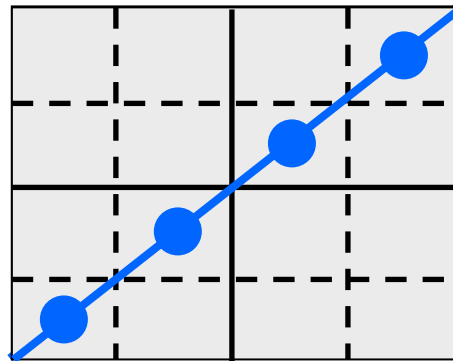
*Application Notes: Nanocrystal Flash*

# classification of surfaces...

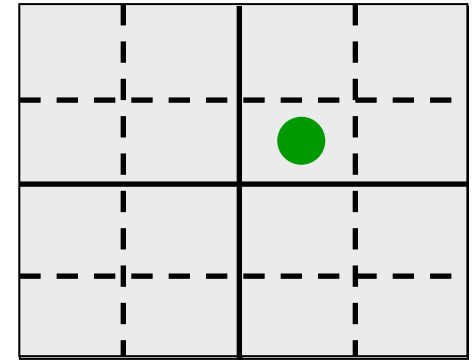
Fractal Dimension ( $D_F$ )- Box counting technique



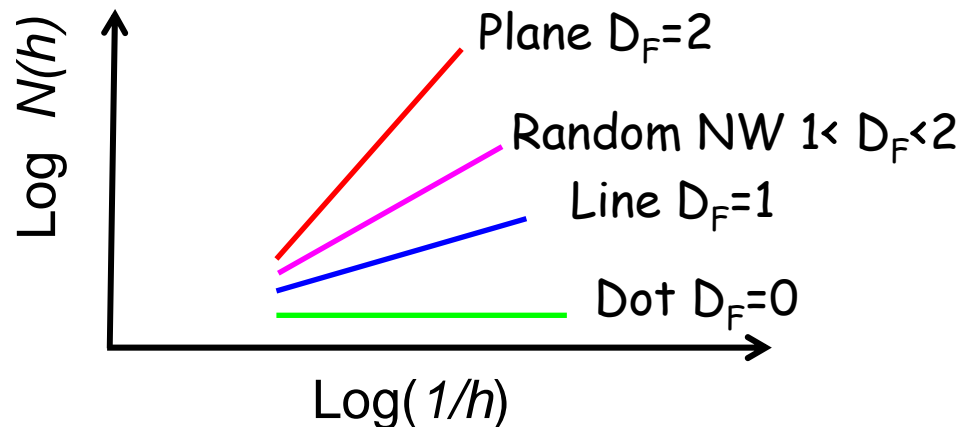
$$N(h) \sim h^2$$



$$N(h) \sim h^1$$



$$N(h) \sim h^0$$



# dimension of Cantor dust



h	1/3
N	2

h	1/9
N	4

h	1/27
N	8

h	1/3 <sup>n</sup>
N	2 <sup>n</sup>

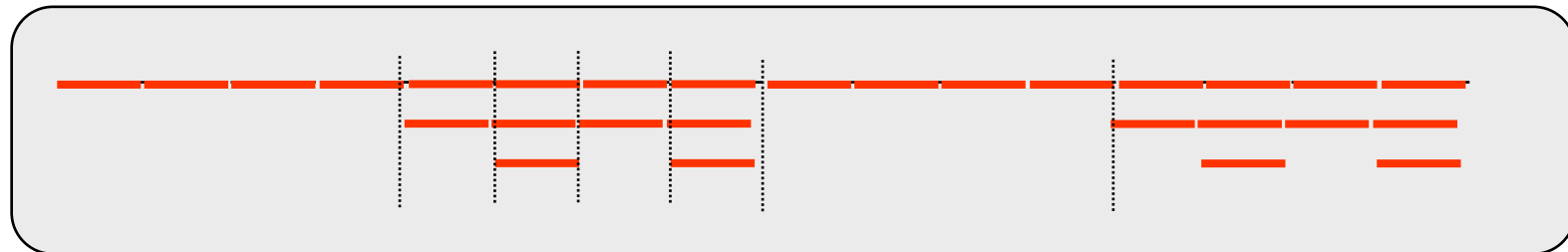
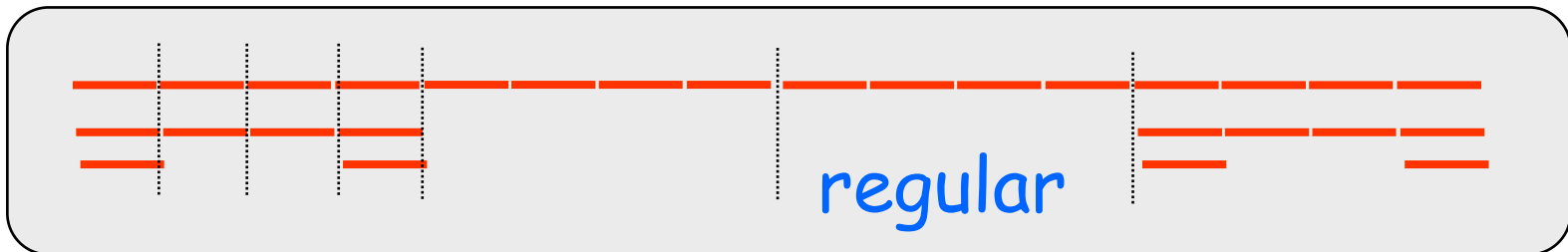
$$D_{F,1} = \frac{\log(N)}{\log(1/h)} = \frac{\log(2^n)}{\log(3^n)} = 0.63 \quad \text{Bigger than point, but smaller than line}$$

In general,  $D_{F,1} = \frac{\log(m)}{\log(n)}$  .... keep m piece  
 of n pieces

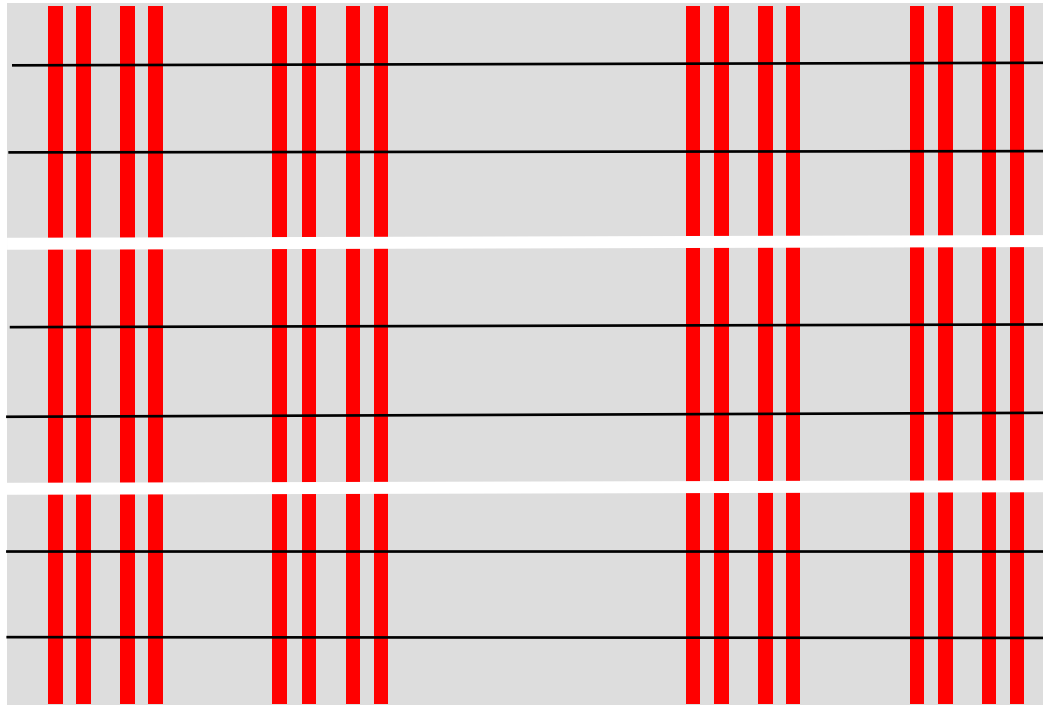
# regular and irregular fractals

$$D_{F,1} = \frac{\log(m)}{\log(n)} \quad \dots \text{keep } m \text{ piece}$$

of  $n$  pieces



# dimension of quasi-2D cantor stripes



h	1/3
N	6

h	1/9
N	36

h	$1/3^n$
N	$3^n 2^n$

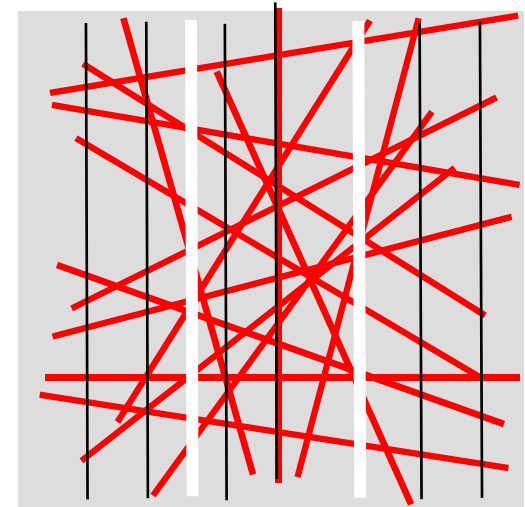
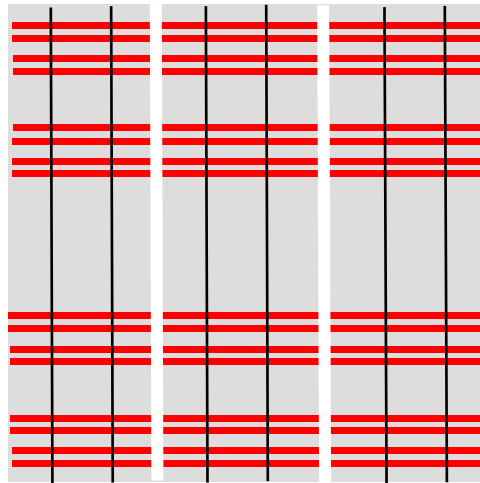
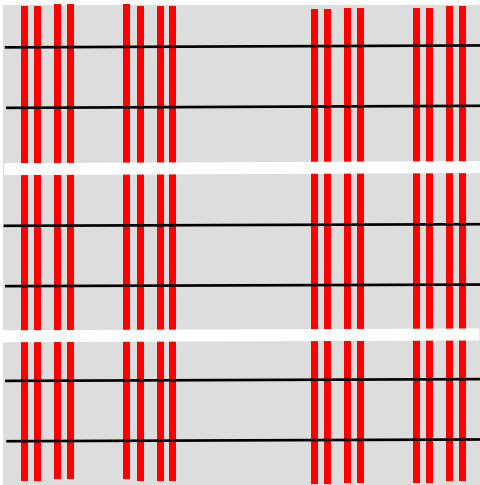
h	1/27
N	216

$$D_{F,2} = \frac{\log(N)}{\log(1/h)} = \frac{\log(3^n) + \log(2^n)}{\log(3^n)} = 1 + \frac{\log(2^n)}{\log(3^n)} = 1 + DF_x$$

In general,  $D_{F,3} = DF_x + DF_y + DF_z$



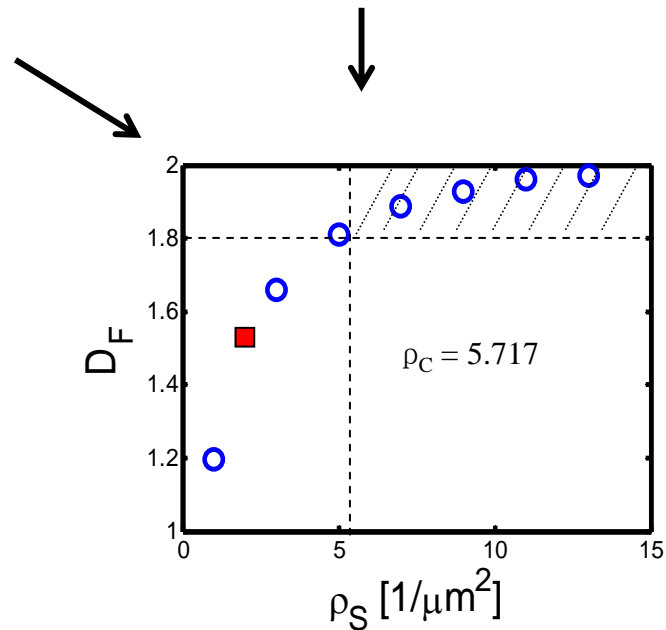
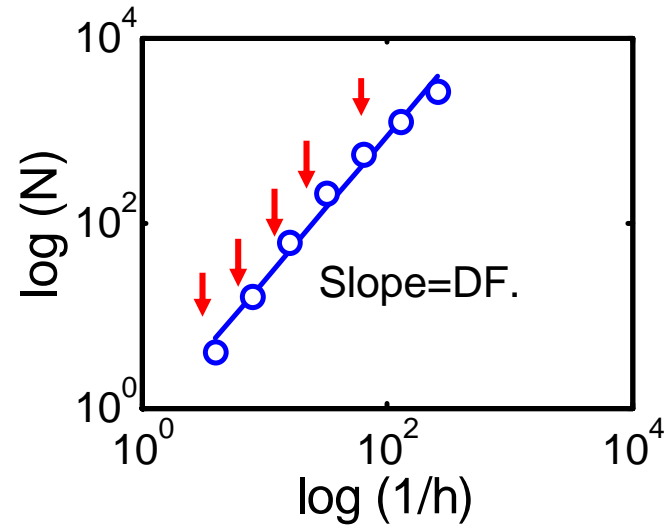
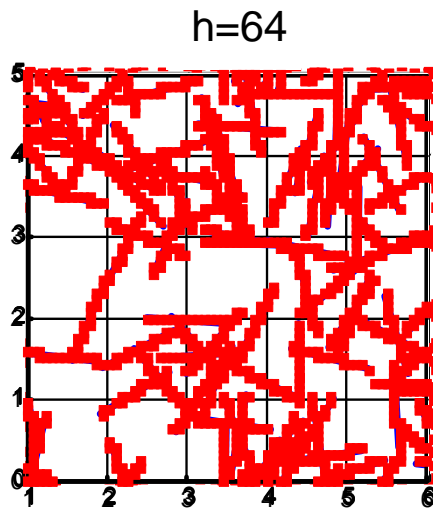
# same DF, but different geometry



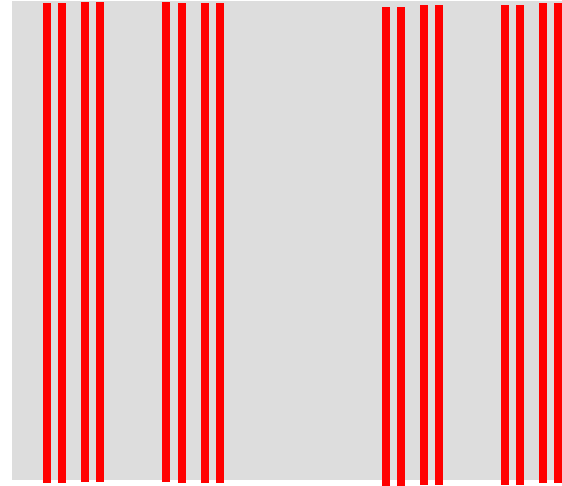
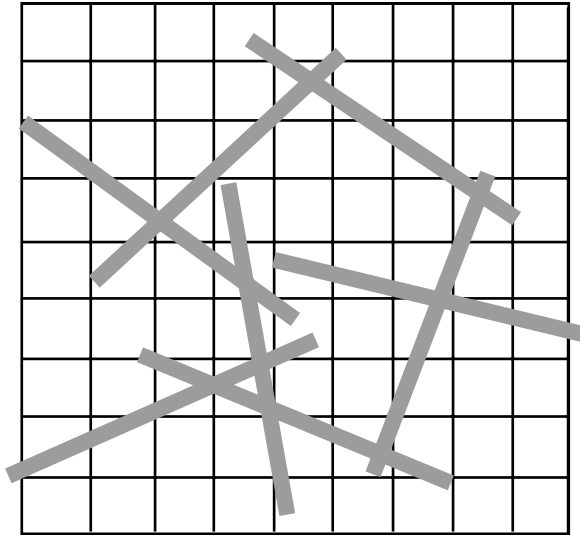
same dimension,  
because  $DF = \log(m)/\log(n)$

What about this  
irregular fractal?

# dimension of a irregular fractal



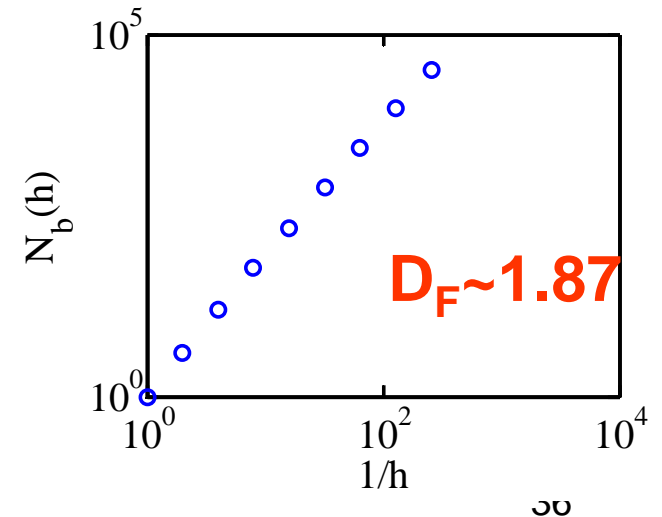
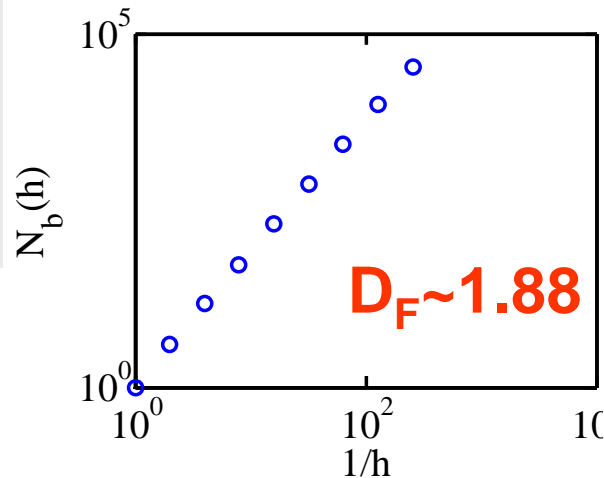
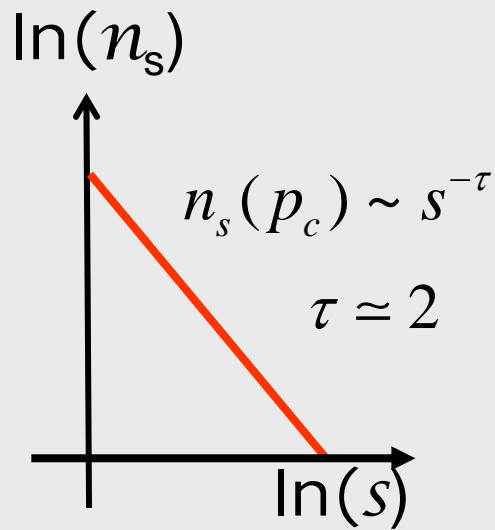
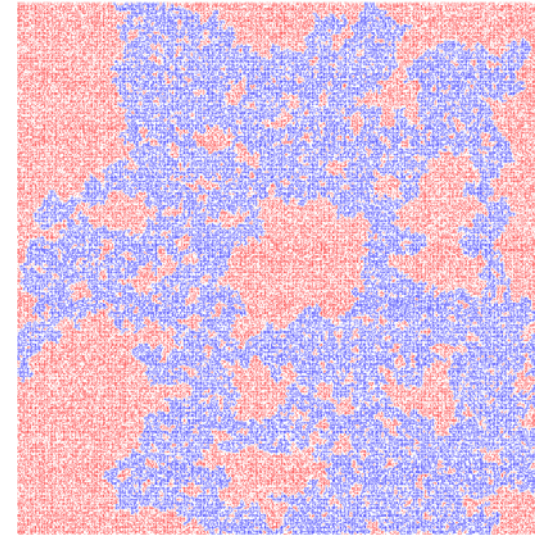
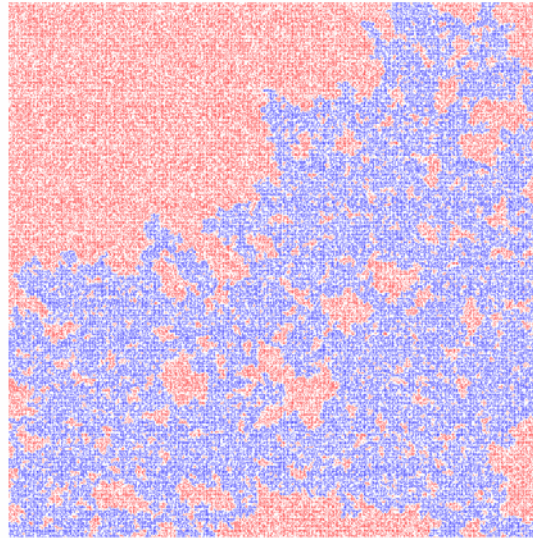
# cantor transform



Preserve  $D_F$  during transformation

# fractal dimension at percolation

self-similarity



# Summary

- ❑ Discussed three key concepts of percolative transport: percolation threshold, island size distribution, and fractal dimension
- ❑ The concept of excluded volume provides a (nearly) geometry independent way for calculating the percolation threshold for arbitrarily shaped objects on arbitrary grid.
- ❑ Distribution of island sizes is also described by simple formula with universal constants. At percolation threshold, the island sizes are self-similar and scale invariant.
- ❑ Fractal dimension provides a generalized technique to describe the dimension of any surfaces, even those defined by randomly oriented sticks.