

# Particle Aggregation Phenomena

## Fractals and more!

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# Outline

- 1 Introduction
  - Acknowledgements
  - Why this topic?
- 2 Fractals & Aggregation
  - Types
  - Scaling Law
- 3 Fractals in action!
- 4 Summary
- 5 Appendix

# Acknowledgements

Part of my research internship at Washington University in Summer, 2017

## Primary articles:

- *The sol to gel transition in irreversible particulate systems*, C. M. Sorensen and A. Chakrabarti, Soft Matter, 2011
- *PhD Dissertation*, William Heinson, 2015
- *Kinetic Percolation*, William Heinson et al, 2017

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## Particle Aggregation:

- Climate Models - important in aerosol science
- Condensation of Stardust
- Cheese Making :)
- Coagulation of Blood and more!

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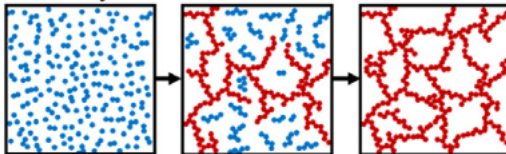
## Particle Aggregation:

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Fractal math is also used for : Trading in Stock Markets - *finding order in chaotic price movements*

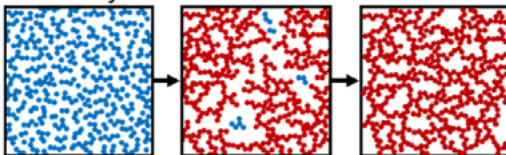
# Summary of Particle Aggregation

Dilute System



Gelation of **sol clusters**

Dense System



Gelation of **sol clusters**    Aggregation of **gel clusters**

1

<sup>1</sup>Pai Liu et.al., 2019 - My mentors at WashU



# Types of Aggregation Models

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Mathematical formalism for these dynamically formed clusters

## Fractals

Property : "Scalar Invariance"



Figure: Snowflake

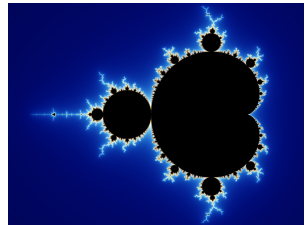


Figure: Mandelbrot Set

# Scaling Law in Fractals

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<sup>2</sup>img from Janusz et al., 2012

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Simple equation

$$N = k_o (R_g/a)^{D_f} \quad (1)$$

Where,

- $D_f$  = Fractal dimension
- $k_o$  = Prefactor info about shape
- $N$  = monomer units in a cluster
- $R_g$  = Radius of gyration
- $a$  = Monomer radius

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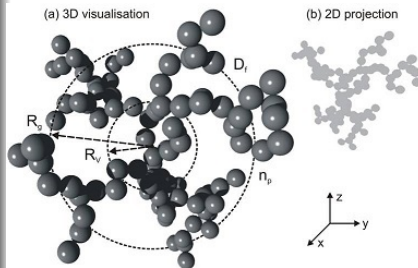
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2

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# General notion of Fractal Dimension ( $D_f$ )

Observe:  $D_f < 3$  (spatial dimension) for 3D aggregates.

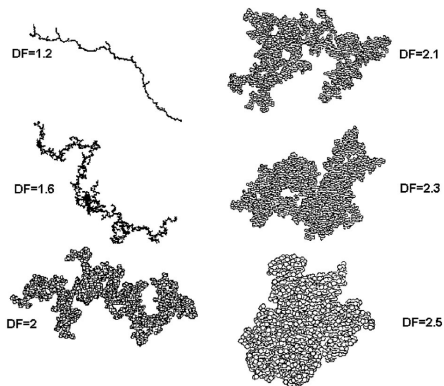


Figure: 2D projections of 3D clusters

# Comparison

- I verified the scale invariance ( $D_f$ ) of diffusion limited process (DLCA) through computer simulations.



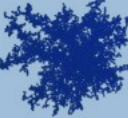



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<sup>4</sup>Martin et al. "Fractal Scaling..", 2014



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- I verified the scale invariance ( $D_f$ ) of diffusion limited process (DLCA) through computer simulations.

	Reaction-limited	Ballistic	Diffusion-limited
Particle-cluster	 $D_f=3.00$	 $D_f=3.00$	 $D_f=2.50$
Cluster-cluster	 $D_f=2.09$	 $D_f=1.95$	 $D_f=1.80$

4

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# The Sol-Gel transition-1 (case study: DLCA)

- Different stages of a diffusion limited process follow particular kinetics (i.e.  $D_f$ )

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- Different stages of a diffusion limited process follow particular kinetics (i.e.  $D_f$ )
- Progression of events is as follows

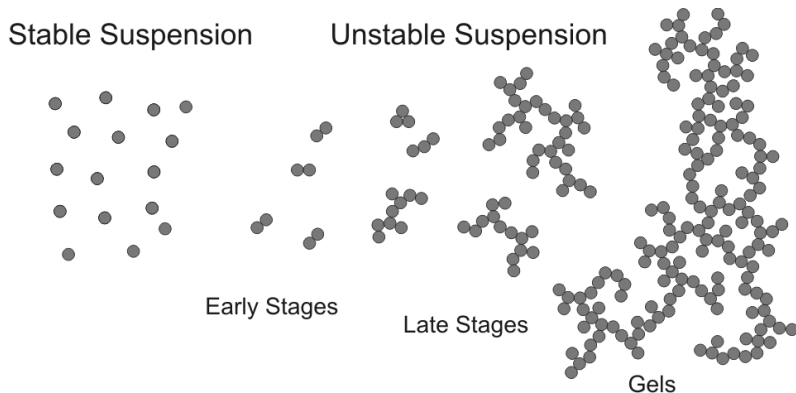


Figure: 2 stages - see next slide for simulation results

# The Sol-Gel transition-2 (case study: DLCA)

- Compare this with the scaling equation mentioned earlier

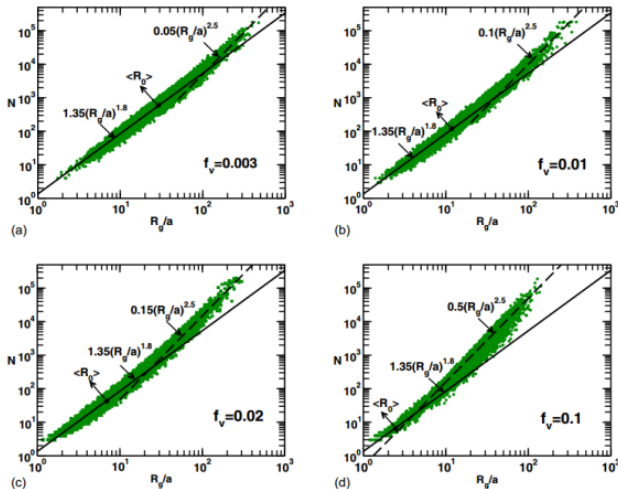


Figure: 2 fixed  $D_f$  (slopes of best-fit lines) - various volume fractions

# Summary

- 1 **Fractals** are useful to understand common physical phenomenon such as **Particle Aggregation**

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- ① **Fractals** are useful to understand common physical phenomenon such as **Particle Aggregation**
- ② Random collisions explained by a **fundamental equation** similar to the Ideal Gas Law
  - Case study: Scale invariance proved via simulations in a diffusion limited cluster aggregation process (DLCA)
  - Initially  $D_f = 1.8$  and then  $D_f = 2.5$  for this process (across different initial conditions)

# Appendix

# Growth Kinetics Equation

Growth Kinetics in cluster-cluster aggregation models is described by the Smoluchowski equation (2).

## Smoluchowski Equation

$$\frac{dn_N}{dt} = \sum_{i=1}^{N-1} K(i, N-i) n_i n_{N-i} - n_N \sum_{i=1}^{\infty} K(i, N) n_i \quad (2)$$

Here  $n_i$  is the number of clusters of size  $i$ . The kinetic state of the system is capture in the **kernel**  $K(i,j)$ , which is dependent on the present state of the system. i.e **time dependence**.

*Thus **Non linearity** is introduced into the system.*



# Langrangian vs Eulerian Perspective

Langrangian :

Viewing the simulation box from a single particle's point of view. i.e. It will be in a frame of reference where it is at rest.

- Cluster-Monomer aggregation as in BA, DLA, RLA

Eulerian :

Viewing the simulation box from outside the box

- Cluster-Cluster Aggregation as in BLCA, DLCA, RLCA

# Diffusion Models

- Follow Brownian Dynamics. Also heavier particles move slower
- There are two types:
  - 1 Diffusion limited monomer-cluster aggregation (DLA).
    - Eg: Coral growth, Coalescing of smoke and dust
  - 2 Diffusion limited cluster-cluster aggregation (DLCA)
    - Eg: Colloidal aggregation
    - ( $D_f=1.8$  in 3D and 1.4 in 2D).

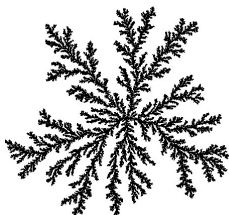


Figure: DLA

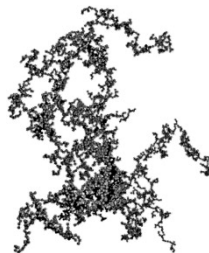


Figure: DLCA

# Ballistic models

- **Deterministic** system. Occurs in very low pressure situation or large molecular regime .High Knudsen number( $K_n$ ) compared to diffusion scenario.

$$K_n = \frac{\lambda}{L} \quad (3)$$

where  $\lambda$  = mean free path,  $L$  = representative physical length scale

- There are two types:
  - ① Ballistic limited monomer-cluster aggregation (BLA). Eg: Thin film growth by vapor deposition
  - ② Ballistic limited cluster-cluster aggregation (BLCA). Agrees with theory ( $D_f=1.91$  in 3D and 1.55 in 2D)