# On the CCN (de)activation nonlinearities

Sylwester Arabas and Shin-ichiro Shima



## Sylwester Arabas (speaker)

alma mater: University of Warsaw (group of Hanna Pawłowska)

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  - ≥ 2015–2017: Chatham Financial, Cracow (software developer)
  - 2017–2018: AETHON, Athens (H2020 "Innovation Associate")
- back to academia:
  - 2018-...: Jagiellonian University, Cracow (Math/CS Dept.)

#### Shin-ichiro Shima



#### シミュレーション学研究科 GRADUATE SCHOOL OF SIMULATION STUDIES, UNIVERSITY OF HYOGO

**日本語** / English 交通アクセス お問い合わせ





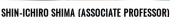




#### ★ーム

#### 研究科について

- 研究科長のメッセージ
- ■本研究科が目指す研究
- 入学後の研究について
- 製 教員
- 計算機環境
- 受験や入学を希望される 方へ





( Japanese / English )

Computer simulation is the third methodology of scientific research, complementing theory and experiment. This methodology is new and still developing. In particular, it is still difficult to predict the behavior of complex systems, in which a large number of components are interacting together and various collective behaviors emerge. My research interest is on exploring the full possibility of computer simulation to understand complex systems.

Keywords: Nonlinear Science, Complex Systems, Computational Science,

Multiscale-Multiphysics Phenomena, Meteorology, Data Assimilation, Synchronization

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#### Arabas & Shima 2017

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#### On the CCN (de)activation nonlinearities

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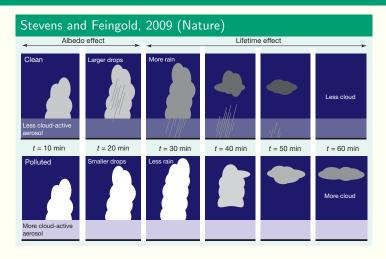
<sup>&</sup>lt;sup>1</sup>Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland

<sup>&</sup>lt;sup>2</sup>Chatham Financial Corporation Europe, Cracow, Poland

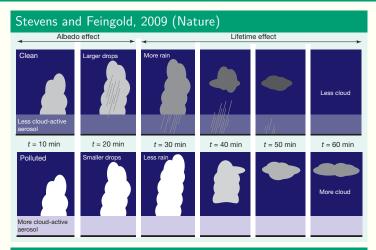
<sup>&</sup>lt;sup>3</sup>Graduate School of Simulation Studies, University of Hyogo, Kobe, Japan

one-slide aerosol-cloud (micro-macro) interaction primer

## one-slide aerosol-cloud (micro-macro) interaction primer



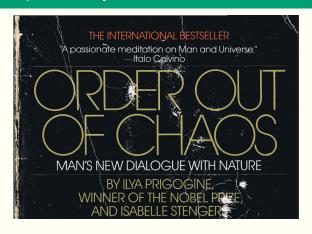
## one-slide aerosol-cloud (micro-macro) interaction primer



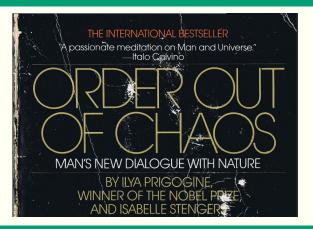
#### Stevens and Boucher, 2012 (Nature)

"there is something captivating about the idea that fine particulate matter, suspended almost invisibly in the atmosphere, holds the key to some of the greatest mysteries of climate science" ... others captivated by micro-macro interactions

# ... others captivated by micro-macro interactions



## ... others captivated by micro-macro interactions



#### Prigogine and Stengers 1984

"Much of this book has centered around the relation between the microscopic and the macroscopic. One of the most important problems in evolutionary theory is the eventual feedback between macroscopic structures and microscopic events: macroscopic structures emerging from microscopic events would in turn lead to a modification of the microscopic mechanisms."

regime-transition (bifurcation) example from P&S 1984

# regime-transition (bifurcation) example from P&S 1984

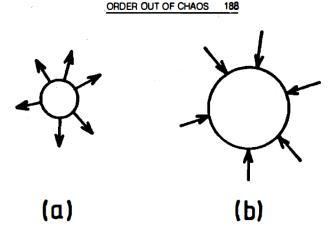
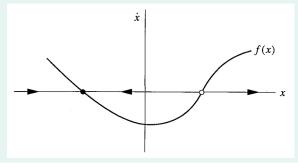


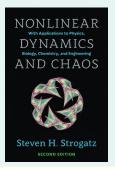
Figure 19. Nucleation of a liquid droplet in a supersaturated vapor. (a) droplet smaller than the critical size; (b) droplet larger than the critical size. The existence of the threshold has been experimentally verified for dissipative structures.

#### Strogatz 2014 (sect. 2.2): fixed points and stability

graphical (qualitative) analysis of a non-linear one-dimensional dynamical system:

$$\dot{x} = f(x)$$





#### Strogatz 2014 (sect. 3.1): saddle-node bifurcation

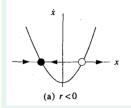
prototypical example of saddle-node bifurcation:

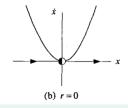
$$\dot{x} = r + x^2$$

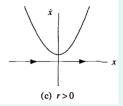
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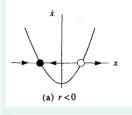


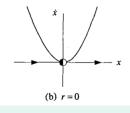


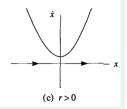
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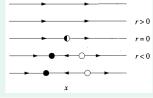
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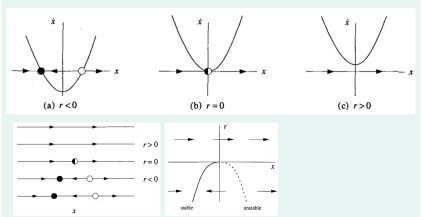




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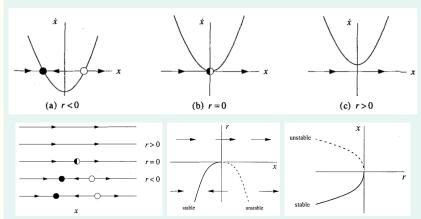
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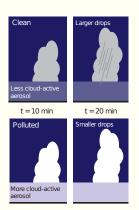


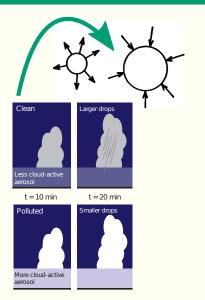
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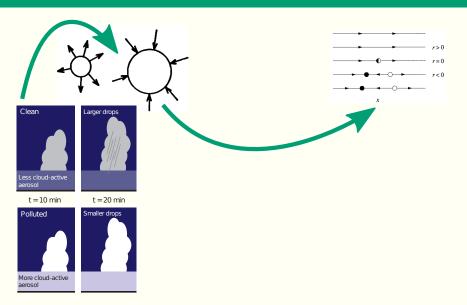
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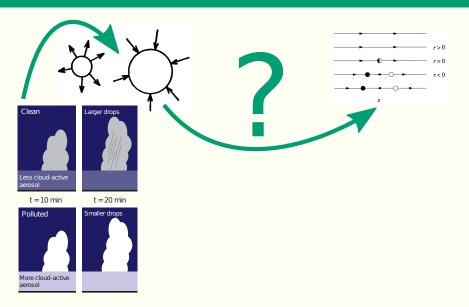
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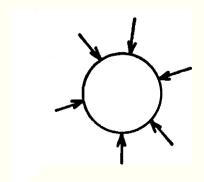


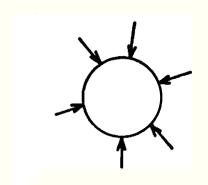






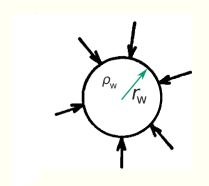






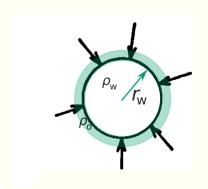
# Fick's and Fourier's laws combined spherical geometry

$$\dot{r}_{\mathsf{w}} = \frac{1}{r_{\mathsf{w}}} \frac{D_{\mathsf{eff}}}{\rho_{\mathsf{w}}} (\rho_{\mathsf{v}} - \rho_{\circ})$$



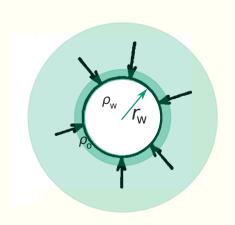
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ho_{\circ} 
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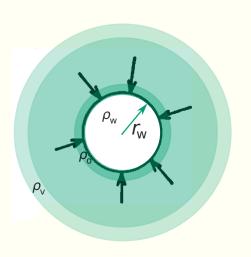
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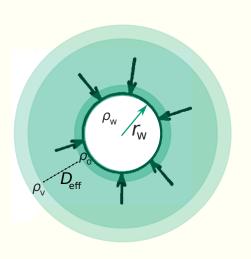
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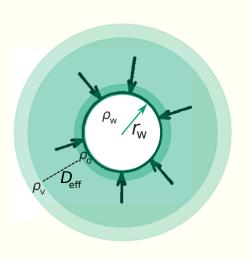
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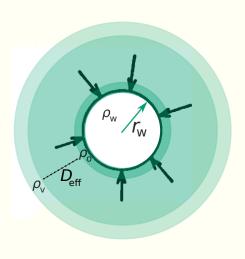


Fick's and Fourier's laws combined spherical geometry

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non-dimensional numbers:

$$\mathrm{RH} = 
ho_\mathrm{v}/
ho_\mathrm{vs}$$
  $\mathrm{RH}_\mathrm{eq} = 
ho_\mathrm{o}/
ho_\mathrm{vs}$ 



Fick's and Fourier's laws combined spherical geometry

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$$RH = \rho_{\rm v}/\rho_{\rm vs}$$
 
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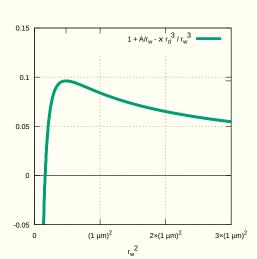
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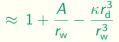
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ight) \ pprox \ 1 + rac{A}{r_{\mathrm{w}}} - rac{\kappa r_{\mathrm{d}}^3}{r_{\mathrm{w}}^3}$$

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$$\dot{r}_{\rm w} = \frac{1}{r_{\rm w}} D_{\rm eff} \frac{\rho_{\rm vs}}{\rho_{\rm w}} \left( {\rm RH-RH_{\rm eq}} \right) \qquad {\rm RH_{\rm eq}} \ = \ \frac{r_{\rm w}^3 - r_{\rm d}^3}{r_{\rm w}^3 - r_{\rm d}^3 (1-\kappa)} \exp \left( \frac{A}{r_{\rm w}} \right)$$





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$$\approx 1 + \frac{A}{r_{w}} - \frac{\kappa r_{d}^{3}}{r_{w}^{3}}$$

$$= \frac{1 + \frac{A}{r_{w}} - \frac{\kappa r_{d}^{3}}{r_{w}^{3}}}{(1 - \kappa)} \exp \left( \frac{A}{r_{w}} \right)$$

$$= \frac{1}{r_{w}} \int_{0.15}^{r_{w}} \frac{A}{r_{w}} \left( \frac{A}{r_{w}} \right) \left( \frac{A}{r_{w}} \right) \left( \frac{A}{r_{w}} \right)$$

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RH - 1 [%]

 $\approx 1 + \frac{A}{r_w} - \frac{\kappa r_d^3}{r^3}$ 

$$\dot{r}_{w} = \frac{1}{r_{w}} D_{eff} \frac{\rho_{vs}}{\rho_{w}} \left( RH - RH_{eq} \right) \qquad RH_{eq} = \frac{r_{w}^{3} - r_{d}^{3}}{r_{w}^{3} - r_{d}^{3} (1 - \kappa)} \exp \left( \frac{A}{r_{w}} \right)$$

$$\approx 1 + \frac{A}{r_{w}} - \frac{\kappa r_{d}^{3}}{r_{w}^{3}}$$

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$$\approx RH_{c}$$

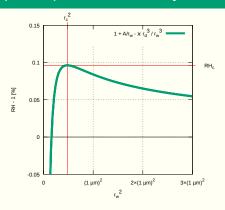
maximum at  $(r_c, RH_c)$ :

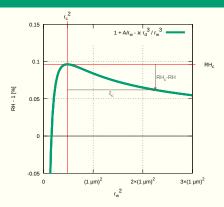
$$r_{\rm c} = \sqrt{3\kappa r_{\rm d}^3/A}$$
  
 $RH_{\rm c} = 1 + \frac{2A}{3r_{\rm c}}$ 

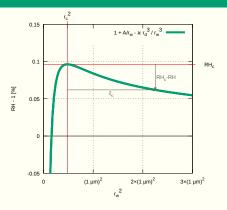
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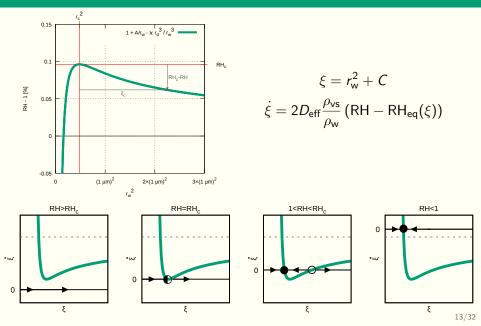
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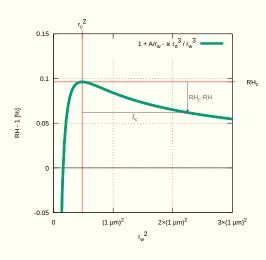




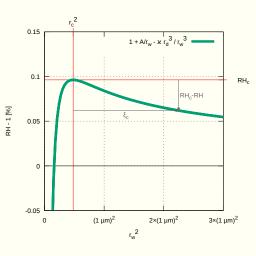


$$\xi = r_{\rm w}^2 + C$$
  $\dot{\xi} = 2D_{\rm eff} rac{
ho_{
m vs}}{
ho_{
m w}} \left({
m RH} - {
m RH}_{
m eq}(\xi)
ight)$ 

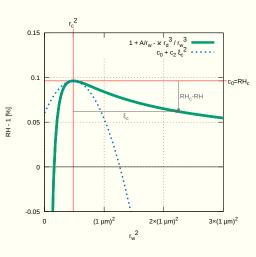




$$RH_{eq}(\xi_c) = c_0 + c_1 \xi_c + c_2 \xi_c^2 + \dots$$

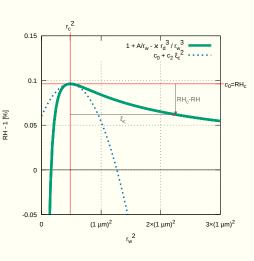


$$RH_{eq}(\xi_c) = c_0 + c_1 \xi_c + c_2 \xi_c^2 + \dots$$



$$RH_{eq}(\xi_c) = c_0 + c_1 \xi_c + c_2 \xi_c^2 + \dots$$

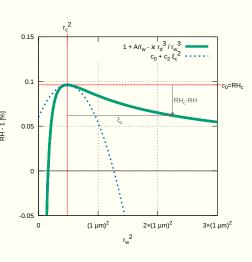
$$\left.\dot{\xi_{c}}\right|_{\xi_{c}\rightarrow0}\sim\frac{\mathsf{RH}-\mathsf{RH}_{c}}{A/(4r_{c}^{5})}+\xi_{c}^{2}$$

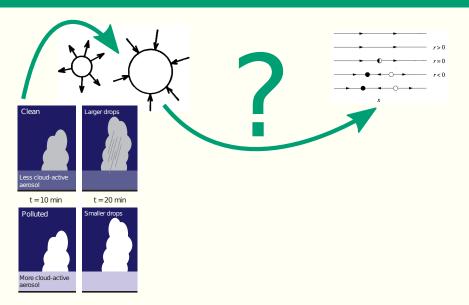


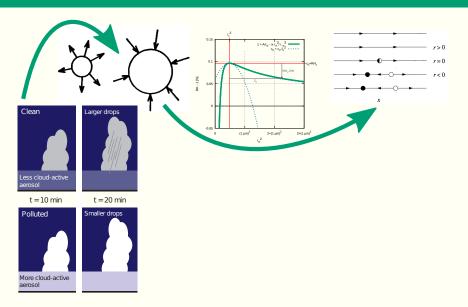
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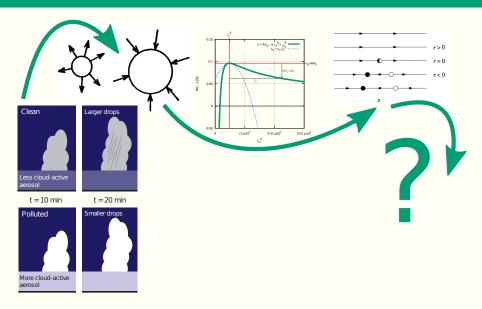
$$\left.\dot{\xi_c}\right|_{\xi_c\to 0}\sim \frac{RH-RH_c}{A/(4r_c^5)}+\xi_c^2$$

$$\dot{x} = r + x^2$$









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$$au_{act} pprox \int_{-\infty}^{+\infty} rac{d\xi_{
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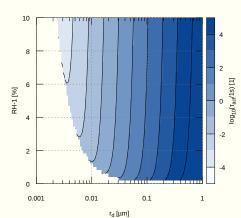
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$$\begin{aligned} \tau_{act} &\approx \int_{-\infty}^{+\infty} \frac{d\xi_{\rm c}}{\dot{\xi_{\rm c}}} \\ &= \frac{r_{\rm c}^{5/2}}{\sqrt{A}} \frac{\rho_{\rm w}/\rho_{\rm vs}}{D_{\rm eff}} \frac{\pi}{\sqrt{\rm RH-RH_c}} \end{aligned}$$

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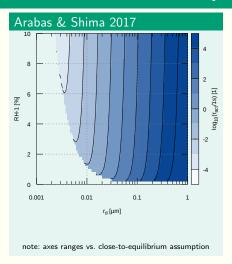
key observation: time of passage through the parabolic *bottleneck* dominates all other timescales

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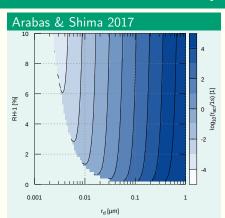


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## activation timescale: analytic vs. numerical



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note: axes ranges vs. close-to-equilibrium assumption

#### Hoffmann, 2016 (MWR)

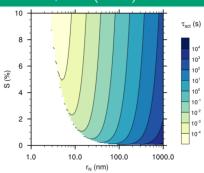
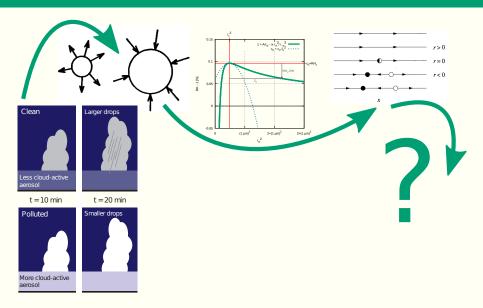


FIG. 2. The activation time scale  $\tau_{\rm act}$  as a function of dry aerosol radius  $r_N$  and supersaturation S. For values of  $S < S_{\rm crit}$  (white areas),  $\tau_{\rm act}$  does not exist.

$$r\frac{dr}{dt} = \left(S - \frac{A}{r} + \frac{Br_N^3}{r^3}\right) / (F_k + F_D),\tag{10}$$

The second time scale is associated with the activation of particles, for which Köhler theory is essential. This makes an analytic solution for (10) impossible. Numerically calculated values of  $\tau_{\rm act}$  measuring the time needed for a wetted aerosol to grow beyond its critical radius  $r_{\rm crit} = \sqrt{3Br_{\rm b}^2/A}$  are given in Fig. 2 as a function of



simple moisture budget (const T,p):

$$\dot{RH} \approx \frac{\dot{\rho}_{v}}{\rho_{vs}} = -N \underbrace{\frac{4\pi \rho_{w}}{3\rho_{vs}}}_{3} 3r_{w}^{2} \dot{r}_{w}$$

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$$\dot{\xi} \sim (\mathsf{RH_0} - 1) - \underbrace{\left(\frac{A}{\xi^{\frac{1}{2}}} - \frac{\kappa r_{\mathsf{d}}^3}{\xi^{\frac{3}{2}}} + \alpha N \xi^{\frac{3}{2}}\right)}_{f}$$

## RH-coupled system & particle concentration as parameter

#### simple moisture budget (const T,p):

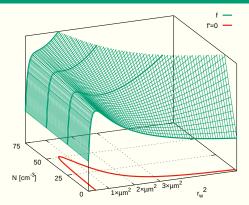
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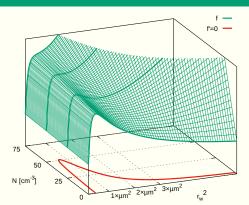
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N [cm<sup>-3</sup>] 1×µm² 2×µm² 3×µm²

$$\operatorname{sgn}(f') = \operatorname{sgn}\left(\kappa r_d^3 - \frac{A}{3}r_w + \alpha N r_w^3\right)$$

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### bifurcations (and catastrophe) in the RH-coupled system

#### Prigogine & Stengers 1984

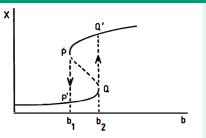


Figure 15. This figure shows how a "hysteresis" phenomenon occurs if we have the value of the bifurcation parameter b first growing and then diminishing. If the system is initially in a stationary state belonging to the lower branch, it will stay there while b grows. But at b =  $b_2$ , there will be a discontinuity: The system jumps from Q to Q, on the higher branch. Inversely, starting from a state on the higher branch, the system will remain there till b = b, when it will jump down to P. Such types of bistable behavior are observed in many fields, such as lasers, chemical reactions or biological membranes.

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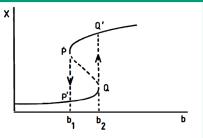
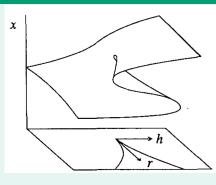


Figure 15. This figure shows how a "hysteresis" phenomenon occurs if we have the value of the bifurcation parameter D first growing and then diminishing. If the system is initially in a stationary state belonging to the lower branch, it will stay there while b grows. But at b =  $b_2$ , there will be a discontinuity. The system jumps from Q to Q, on the higher branch, inversely, starting from a state on the higher branch, the system will remain there till b = b, when it will jump down to P. Such types of bistable behavior are observed in many fields, such as lasers, chemical reactions or biological membranes.

#### Strogatz 2014



"cusp catastrophe"

### bifurcations (and catastrophe) in the RH-coupled system

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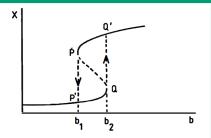
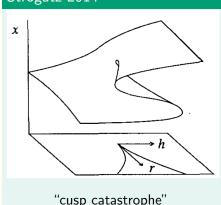


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#### Strogatz 2014



 $\rightsquigarrow$  "jumps", hysteretic behaviour ( $r_w$ , RH) for small enough N, close to equilibrium (slow process)









nomenclature:





- nomenclature:
  - CCN activation
  - ▶ (heterogeneous) nucleation





#### nomenclature:

- CCN activation
- CCN deactivation
- aerosol regeneration / resuspension / recycling
- drop-to-particle conversion
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#### significance:

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- spectral broadening (mixing, parcel history, ...)

vertically displaced (velocity w, hydrostatic background) adiabatic parcel: (q: mixing ratio,  $p_d$ : bgnd pressure,  $\rho_d$  bgnd density, g,  $l_v$ ,  $c_{pd}$ : constants)

$$\begin{bmatrix} \dot{p}_{d} \\ \dot{T} \\ \dot{r}_{w} \end{bmatrix} = \begin{bmatrix} -\rho_{\rm d} gw \\ (\dot{p}_{\rm d}/\rho_{\rm d} - \dot{q} l_{\rm v})/c_{\rm pd} \\ (D_{\rm eff}/\rho_{\rm w})(\rho_{\rm v} - \rho_{\rm o})/r_{\rm w} \end{bmatrix}$$

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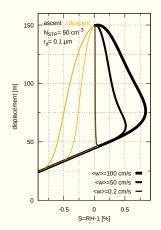
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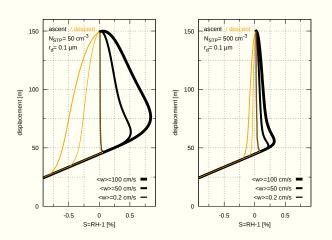
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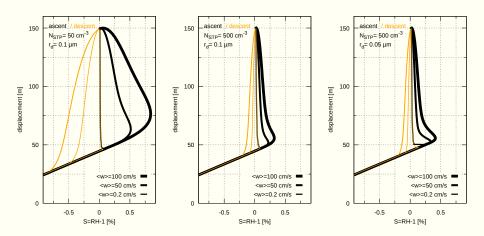
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- $N \to 0$  (and hence  $\dot{q} \approx 0$ ) i.e., weak coupling between particle size evolution and ambient thermodynamics (pertinent to the case of low particle concentration).



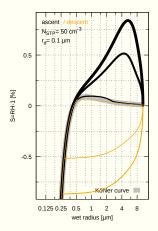
integration using CVODE adaptive solver open source code (based on libcloudph++) as electronic paper supplement



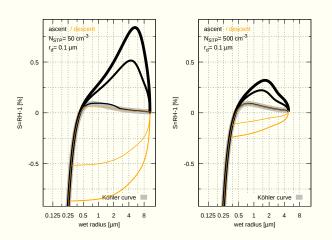
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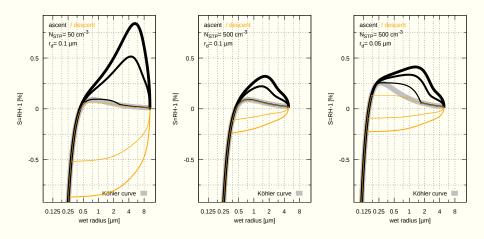
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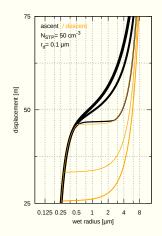
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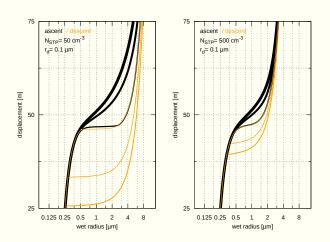
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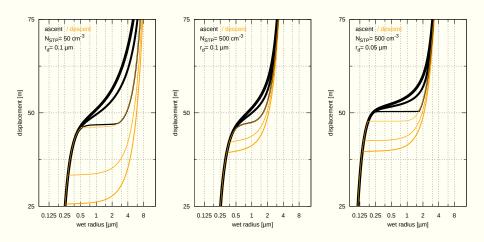
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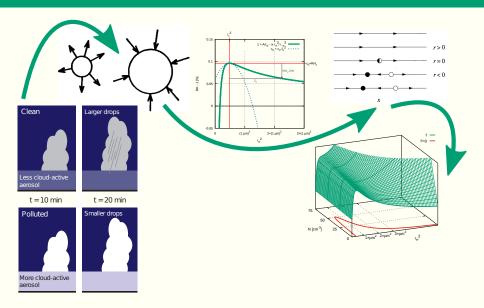
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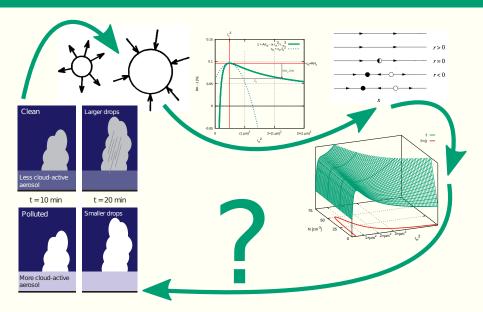
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### connecting the dots ...

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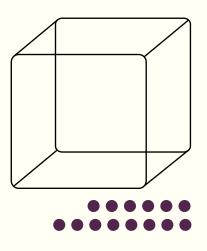
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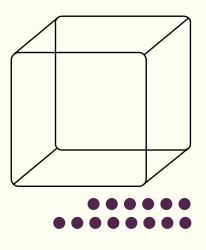
particle-based  $\mu$ -physics schemes for LES! (Lagrangian Cloud Models / Super-Droplet Models)

#### particle-based $\mu$ -physics for LES

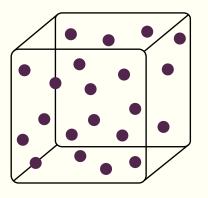
"information carriers" in LES domain



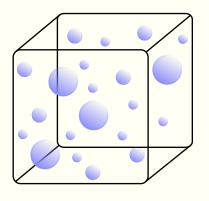
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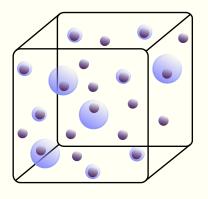
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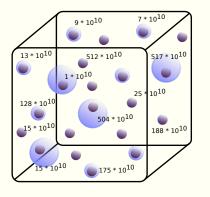
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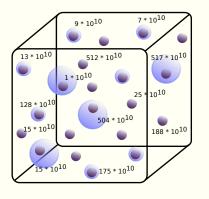
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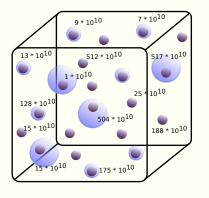
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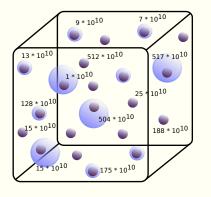
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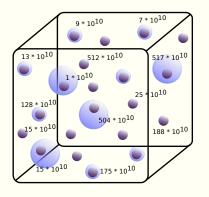
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- each timestep: constant RH!

Seminal works: Shima et al. 2009, Andrejczuk et al. 2010 (3D simulations of atmospheric aerosol-cloud-precipitation system)

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<sup>4</sup>http://github.com/uclales

<sup>6</sup> 

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<sup>1</sup>http://www.mmm.ucar.edu/eulag/

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- SCALE<sup>6</sup> from RIKEN (Sato et al. 2017),
- UWLCM<sup>7</sup> from Univ. Warsaw (Grabowski et al. 2018).

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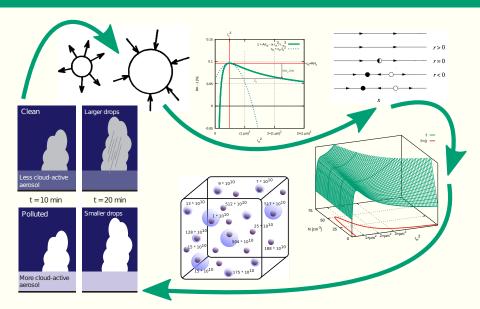
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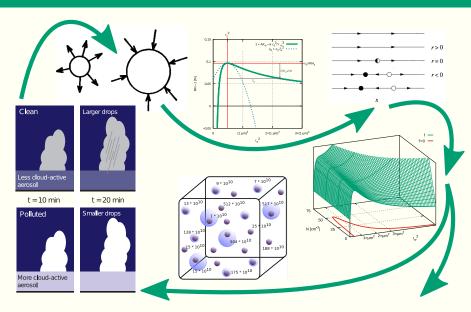
http://github.com/igfuw/UWLCM

connecting the dots ...

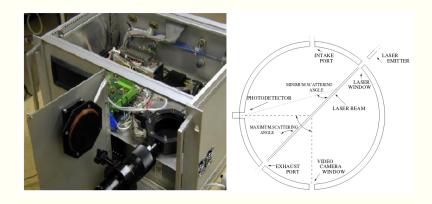
# connecting the dots ...



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# model applicability: CCN instruments? (hypothesis...)

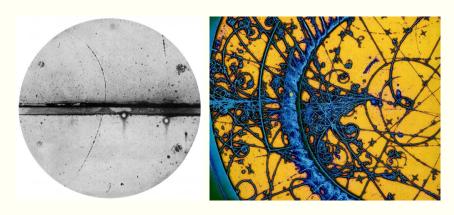


#### pictured: UWyoming WyoCCN instrument

(photo from DYCOMS-II CCN data report by Jeff Snider et al.)

https://www.eol.ucar.edu/projects/dycoms/dm/archive/docs/snider\_ccnreadme.pdf

# applicability beyond cloud physics (hypothesis...)



Wilson & bubble chambers

https://home.cern/about/updates/2015/06/seeing-invisible-event-displays-particle-physics

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- applications: CCN instrumentation modelling, non-cloud appl...

# last slide

#### last slide

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# Thank you for your attention!

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