

Modeling of cloud processes. Part I: warm-rain microphysics

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Earth
in visible light

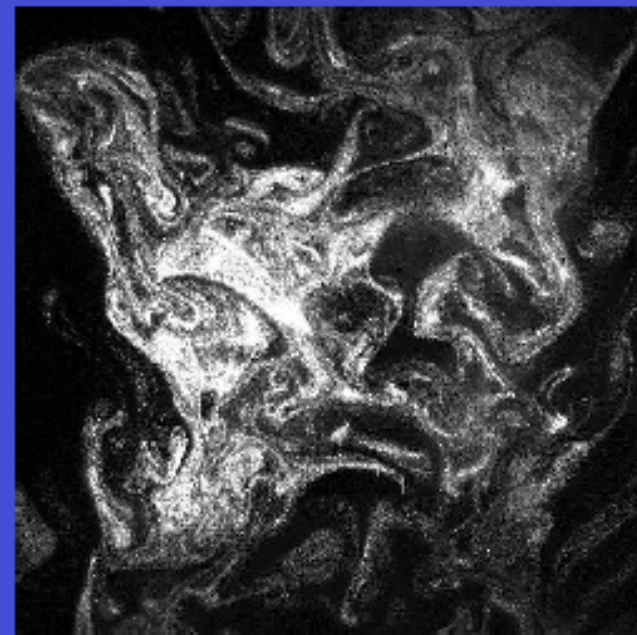


1,000 km

Small cumulus
clouds

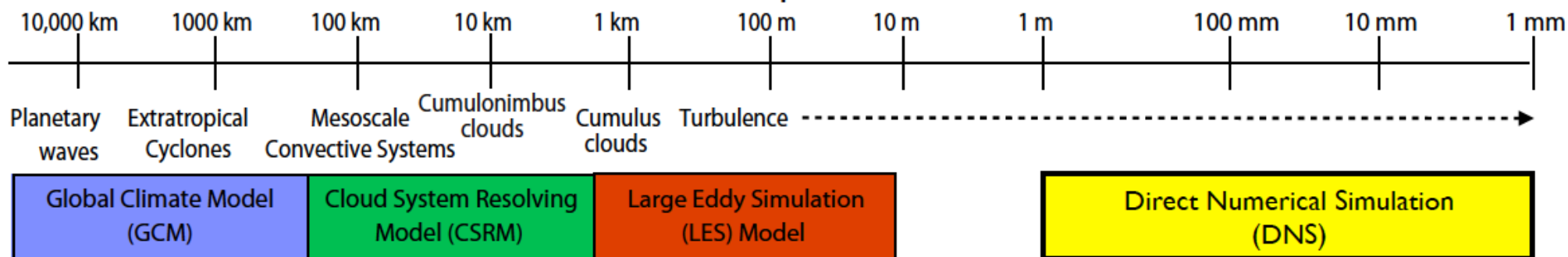


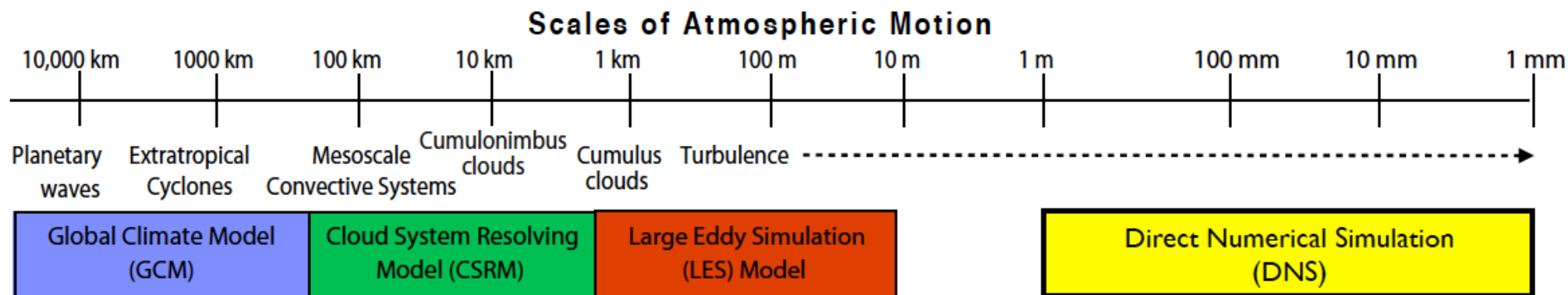
Mixing in laboratory
cloud chamber



10 cm

Scales of Atmospheric Motion





parameterization problem:
parameterized microphysics in
(under)resolved clouds

parameterization² problem:
parameterized microphysics in
parameterized clouds

microphysics at its native scale

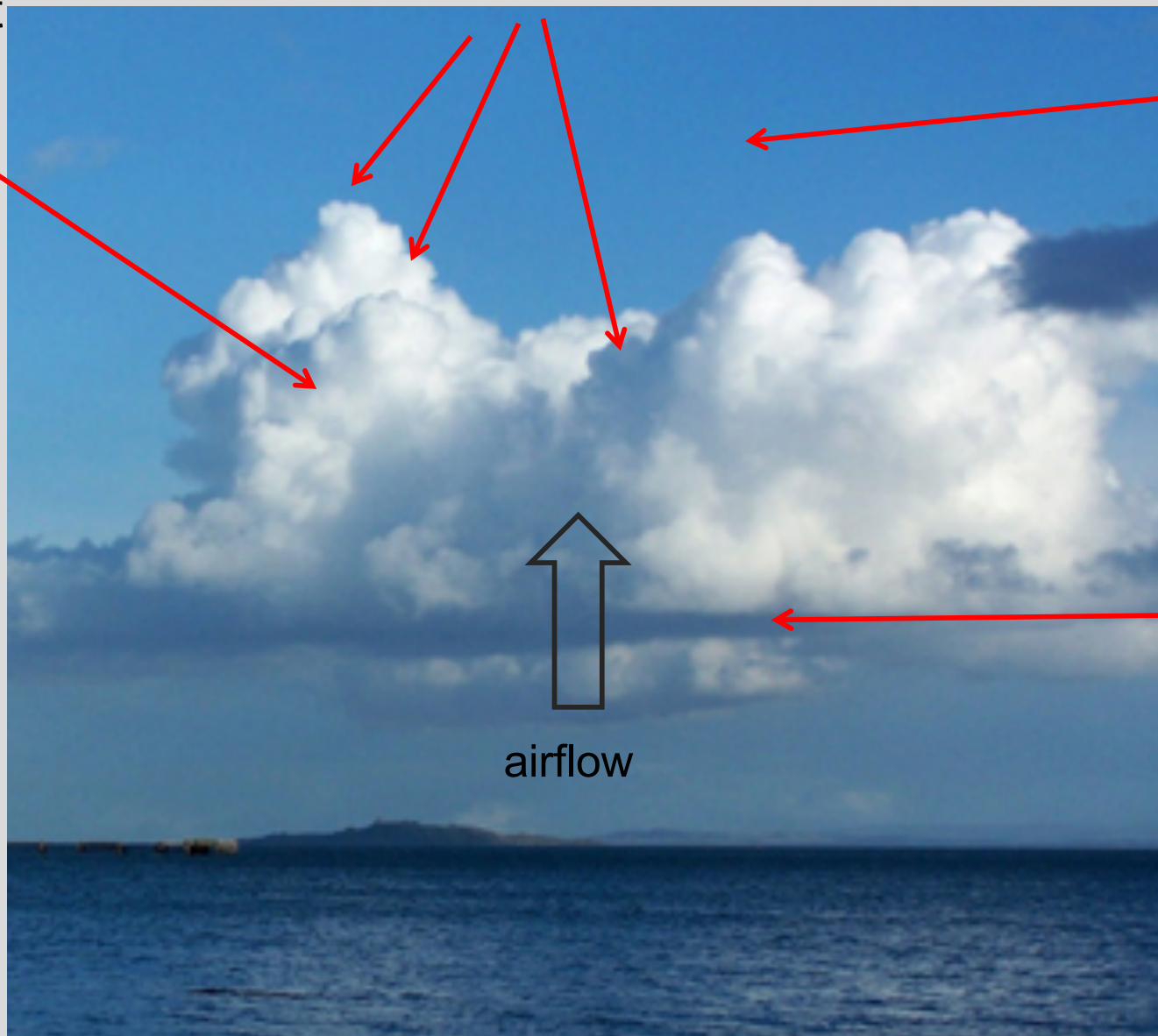
Cloud microphysics across scales

Eulerian versus Lagrangian methodology
(continuous medium versus particle-based)

Warm (no-ice) versus ice-bearing clouds

Understanding of the physics
versus numerical implementation

Precise and complex
versus approximate and easy to apply



interfacial
instabilities

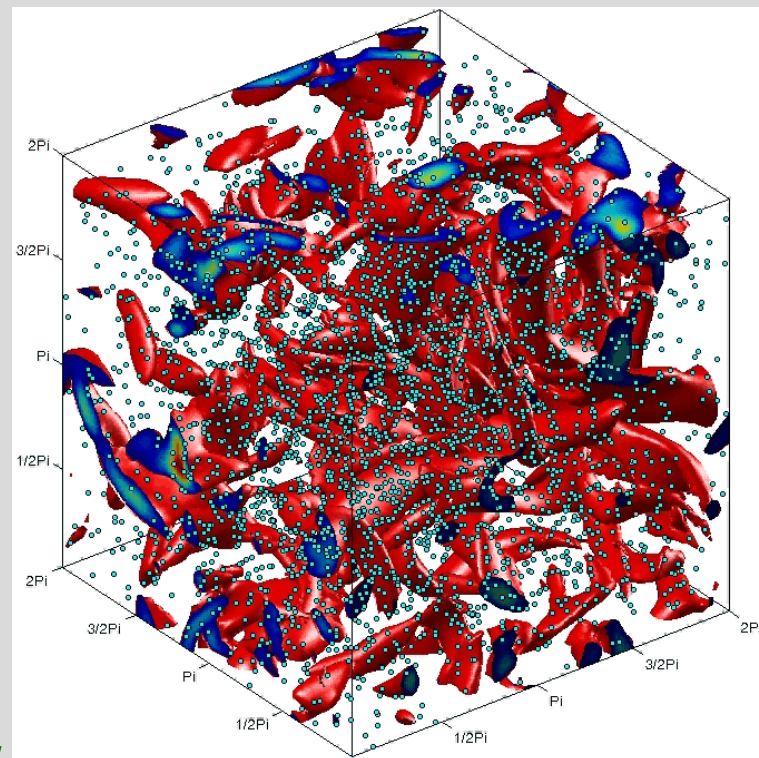
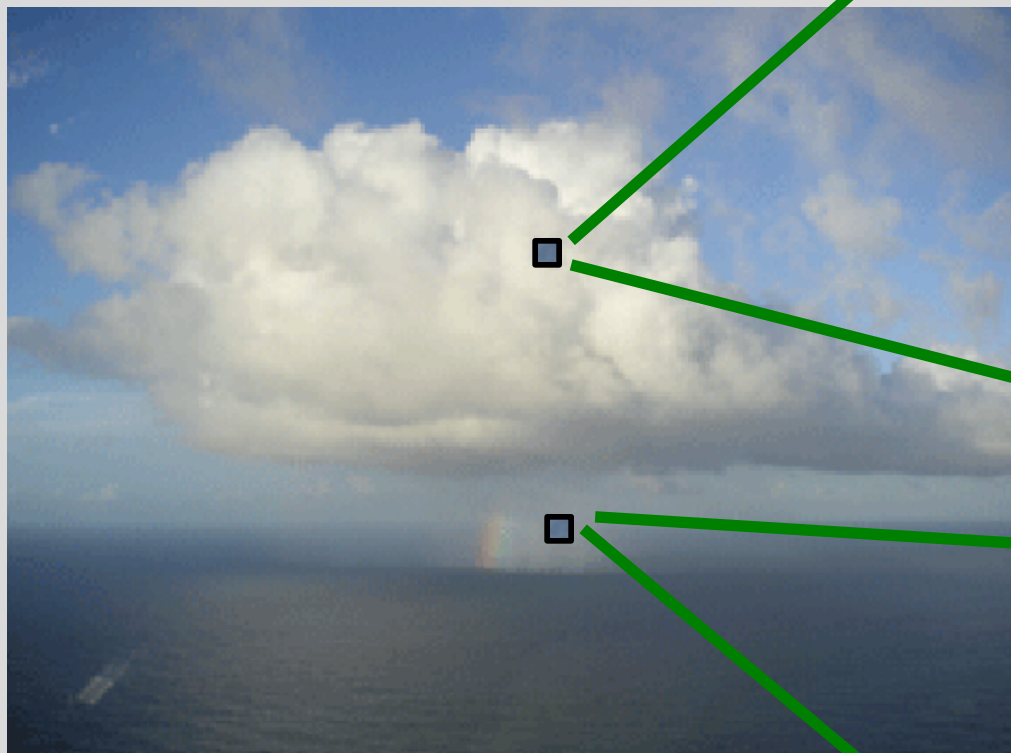
turbulent
cloud

calm
(low-turbulence)
environment

cloud base
(activation of
cloud droplets)

airflow





Fundamentals of cloud physics

ELEMENTARY CLOUD PHYSICS:

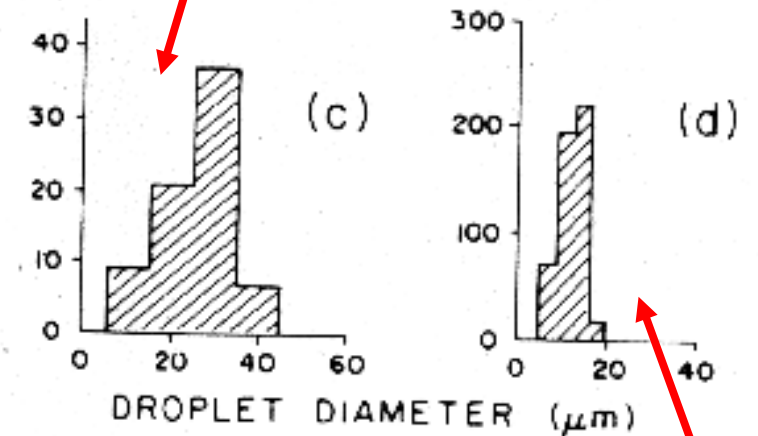
clouds form due to cooling of air (e.g., adiabatic expansion of a parcel of air rising in the atmosphere)

- *condensation*: water vapor \rightarrow cloud droplets

heterogeneous nucleation on atmospheric aerosols called Cloud Condensation Nuclei (CCN); typically highly soluble salts (sea salt, sulfates, ammonium salts, nitrates)

typically, only a small percentage of CCN used by clouds (i.e., water clouds form just above saturation)

Maritime cumulus



Continental cumulus

From cloud droplets and ice crystals
to precipitation:

WARM RAIN:

→ gravitational collision and coalescence between
cloud droplets

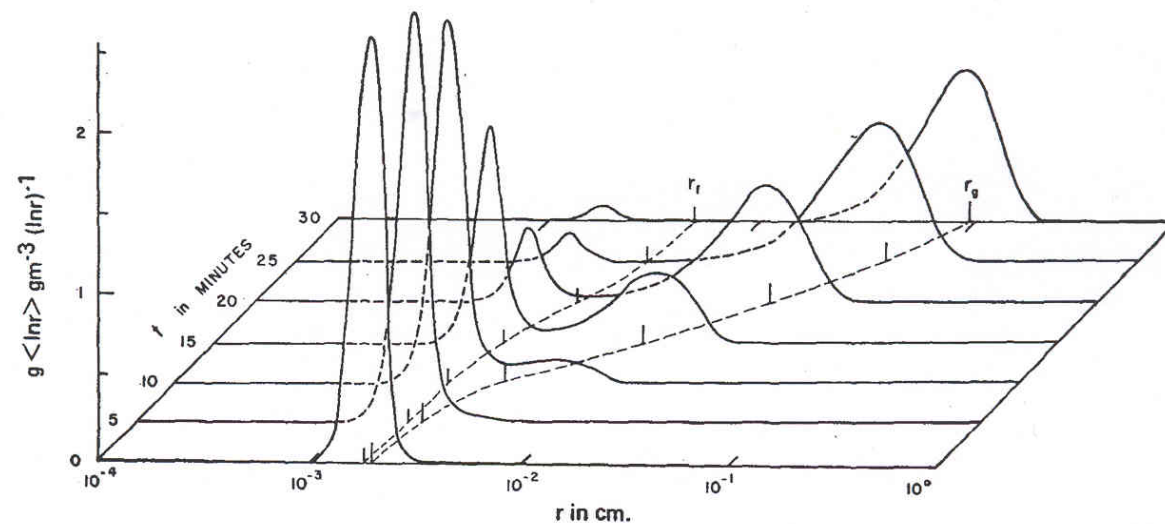


FIG. 5. Time evolution of the initial spectrum for $r_f^0 = 18 \mu\text{m}$, var $x = 0.25$.

Berry and Reinhardt JAS 1974

THE DISTRIBUTION OF RAINDROPS WITH SIZE

By *J. S. Marshall and W. McK. Palmer*¹

McGill University, Montreal

(Manuscript received 26 January 1948)

$$N_D = N_0 e^{-\Lambda D}$$

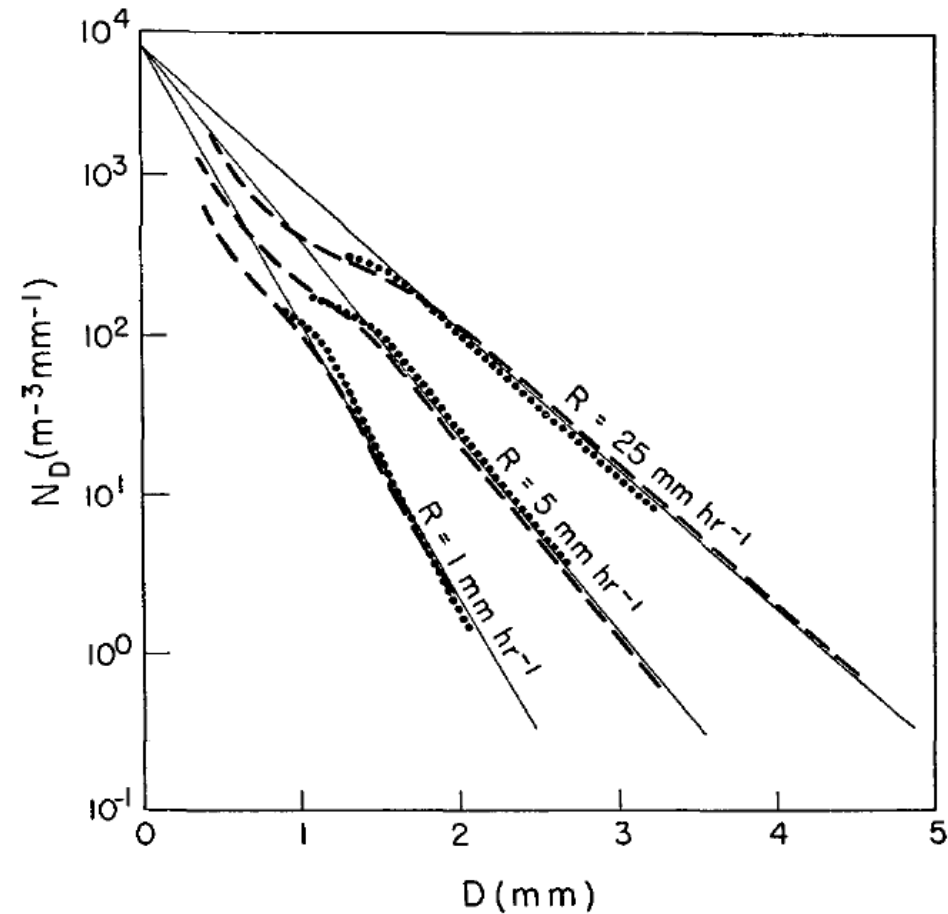


FIG. 2. Distribution function (solid straight lines) compared with results of Laws and Parsons (broken lines) and Ottawa observations (dotted lines).

Fundamentals of cloud dynamics and thermodynamics modeling

Water vapor is a minor constituent:

mass loading is typically smaller than 1%; thermodynamic properties (e.g., specific heats etc.) only slightly modified;

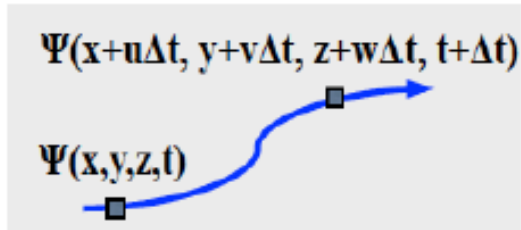
Suspended small particles (cloud droplets, cloud ice):

mass loading is typically smaller than a few tenths of 1%, particles are much smaller than the smallest scale of the flow; multiphase approach is not required, but sometimes used (e.g., DNS with suspended droplets, Lagrangian Cloud Model)

Precipitation (raindrops, snowflakes, graupel, hail):

mass loading can reach a few %, particles are larger than the smallest scale the flow; multiphase approach needed only for very-small-scale modeling

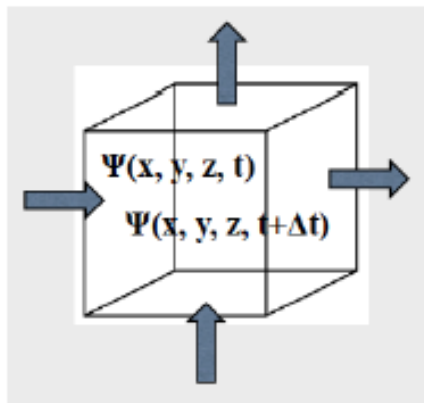
Lagrangian versus Eulerian formulation



$$\boxed{\frac{D\Psi}{Dt} = S} \quad \text{or} \quad \frac{\partial \Psi}{\partial t} + \mathbf{u} \cdot \nabla \Psi = S$$

combined with dry air continuity equation:

$$\frac{\partial \rho_a}{\partial t} + \nabla(\rho_a \mathbf{u}) = 0$$



gives:

$$\boxed{\frac{\partial \rho_a \Psi}{\partial t} + \nabla(\rho_a \mathbf{u} \Psi) = \rho_a S}$$

For the anelastic system:

$$\frac{\partial \Psi}{\partial t} + \frac{1}{\rho_o} \nabla(\rho_o \mathbf{u} \Psi) = S$$

$$\rho_o = \rho_o(z)$$

SMALL-SCALE DYNAMICS:

Navier-Stokes equations

In the spirit of the Boussinesq approximation, moisture and condensate affect gas dynamics equations only through the buoyancy term

$$\frac{d\mathbf{u}}{dt} = -\frac{1}{\rho}\nabla p - g\mathbf{k} + \dots (\text{Coriolis, turbulence, etc})$$

$$\rho = \rho_o(z) + \rho'$$

$$p = p_o(z) + p'$$

$$(\rho_o + \cancel{\rho'}) \frac{d\mathbf{u}}{dt} = -\cancel{\frac{\partial p_o}{\partial z}} - \rho_o g - \frac{\partial p'}{\partial z} - \rho' g + \dots$$

$$\frac{p}{p'} = \frac{\rho R T}{\rho' R T'} \Rightarrow \frac{p'}{p} = \frac{\rho'}{\rho} + \frac{T'}{T}$$

$$\frac{p}{p'} \sim \frac{1000 \text{ hPa}}{1 \text{ hPa}} \sim 1000$$
$$\frac{\rho'}{\rho} \sim \frac{\rho u^2}{\rho u^2} \sim 1$$

$$\frac{d\mathbf{u}}{dt} = -\frac{1}{\rho_o}\nabla p' - g\mathbf{k} \frac{\rho'}{\rho_o} + \dots$$

For small-Mach number flows ($|\mathbf{u}| \ll c_s$; c_s - speed of sound):

$$\frac{\rho'}{\rho_o} \approx -\frac{T'}{T_o}$$

$$\frac{d\mathbf{u}}{dt} = -\frac{1}{\rho_o}\nabla p' + g\mathbf{k} \frac{T'}{T_o} + \dots$$

Density temperature T_d : the temperature dry air has to have to yield the same density as moist cloudy air

$$T_d = T \frac{1 + q/\epsilon}{1 + q + Q}$$

T - air temperature

q - water vapor mixing ratio ($\sim 10^{-3}$)

Q - condensate mixing ratio (cloud water, rain, ice, snow, etc.; $\sim 10^{-3}$)

$$\epsilon = \frac{R_d}{R_v} \approx 0.622$$

$$T_d \approx T \left[1 + \left(\frac{1}{\epsilon} - 1 \right) q - Q \right]$$

$$T_d \approx T (1 + 0.61q - Q)$$

**T , q and Q –
thermodynamics
(and much more!)**

And we also need equation for the temperature:

First Law of Thermodynamics:

$$dq = du + p \, dv \quad (1)$$

dq - heat (per unit mass) added to the system

du - increase of internal energy (per unit mass)

$p \, dv$ - work (per unit mass) performed by the system

$$du = c_v \, dT, \quad pv = RT, \quad v = 1/\rho, \quad c_v + R = c_p$$

$$dq = c_p \, dT - \frac{RT}{p} dp \quad (2)$$

Introducing *potential temperature* as:

$$\theta = T \left(\frac{p_{oo}}{p} \right)^{R/c_p} \quad (3)$$

where $p_{oo} = \text{const}$ (typically 1000 mb), (1) can be written as:

$$d\theta = \frac{\theta}{c_p T} dq \quad (4)$$

And we also need equation for the temperature:

$$\frac{d\theta}{dt} = \frac{\theta}{c_p T} S$$

where $S = \frac{dq}{dt}$ is the heat source per unit mass [in J kg⁻¹ s⁻¹]

$S = 0$ - adiabatic motions

$S \neq 0$ - motions with diabatic processes (heating due to radiative transfer, phases changes, chemical reactions, etc)

For phase changes of water substance:

$$S = L \frac{dQ}{dt}$$

where L is the latent heat (of condensation, freezing, or sublimation), and $\frac{dQ}{dt}$ is the change of corresponding water mixing ratio

Continuous medium approach: *density (i.e., mass of the unit volume) is the main field variable (density of water vapor, density of cloud water, density of rainwater, etc...)*

$$\frac{\partial \rho_v}{\partial t} + \nabla(\rho_v \mathbf{u}) = S \quad \text{or} \quad \frac{d\rho_v}{dt} + \rho_v \nabla \mathbf{u} = S$$

$$\frac{d\psi}{dt} = \frac{\partial \psi}{\partial t} + \mathbf{u} \cdot \nabla \psi$$

In practice, mixing ratios are typically used. Mixing ratio is the ratio between the density (of water vapor, cloud water...) and the air density.

**Mixing ratios
versus specific
humidities...**

$$\frac{\partial \rho_a}{\partial t} + \nabla(\rho_a \mathbf{u}) = 0 \quad \text{or} \quad \frac{d\rho_a}{dt} + \rho_a \nabla \mathbf{u} = 0$$

$$\frac{\partial \rho_v}{\partial t} + \nabla(\rho_v \mathbf{u}) = S \quad \text{or} \quad \frac{d\rho_v}{dt} + \rho_v \nabla \mathbf{u} = S$$

$$\text{mixing ratio : } q = \frac{\rho_v}{\rho_a}$$

$$\frac{dq}{dt} = \frac{S}{\rho_a}$$

$$\text{specific humidity : } Q = \frac{\rho_v}{\rho_v + \rho_a}$$

$$\frac{dQ}{dt} = \left(\frac{\rho_a}{\rho_v + \rho_a} \right) \frac{S}{\rho_v + \rho_a}$$

Modeling of warm-rain microphysics

BULK MODEL OF CONDENSATION:

$$\frac{d\theta}{dt} = \frac{L_v \theta}{c_p T} C_d$$

$$\frac{dq_v}{dt} = -C_d$$

$$\frac{dq_c}{dt} = C_d$$

θ - potential temperature

q_v - *water vapor* mixing ratio

q_c - *cloud water* mixing ratio

L_v - latent heat of condensation/evaporation

C_d - condensation rate

Note: θ/T function of pressure only ($\approx \theta_o/T_o$)

$$\frac{L_v}{c_p \Pi_e}$$

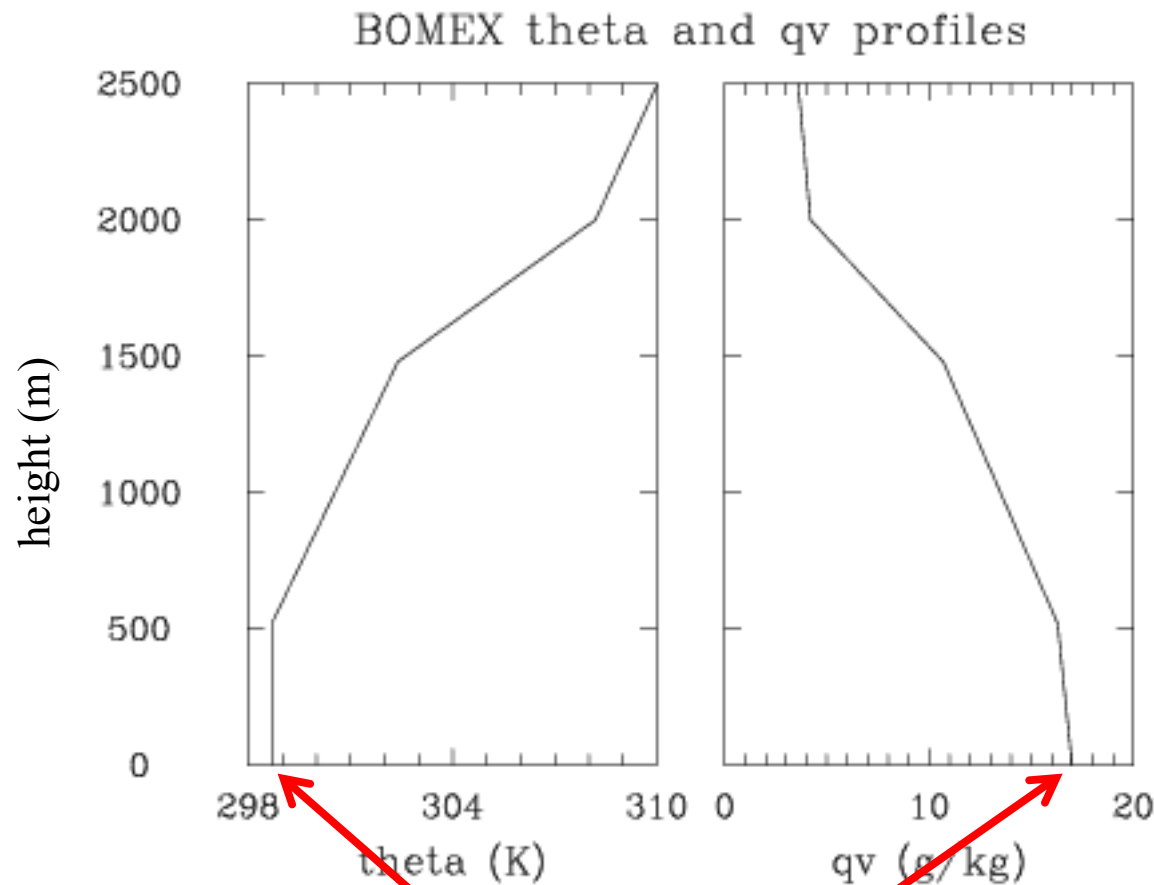
C_d is defined such that cloud is always at saturation,
which is a very good approximation:

$$q_c = 0 \quad \text{if} \quad q_v < q_{vs}$$

$$q_c > 0 \quad \text{only if} \quad q_v = q_{vs}$$

where $q_{vs}(p, T) \approx 0.622 \frac{e_s(T)}{p}$ is the water vapor
mixing ratio at saturation

A very simple (but useful) model: rising adiabatic parcel...



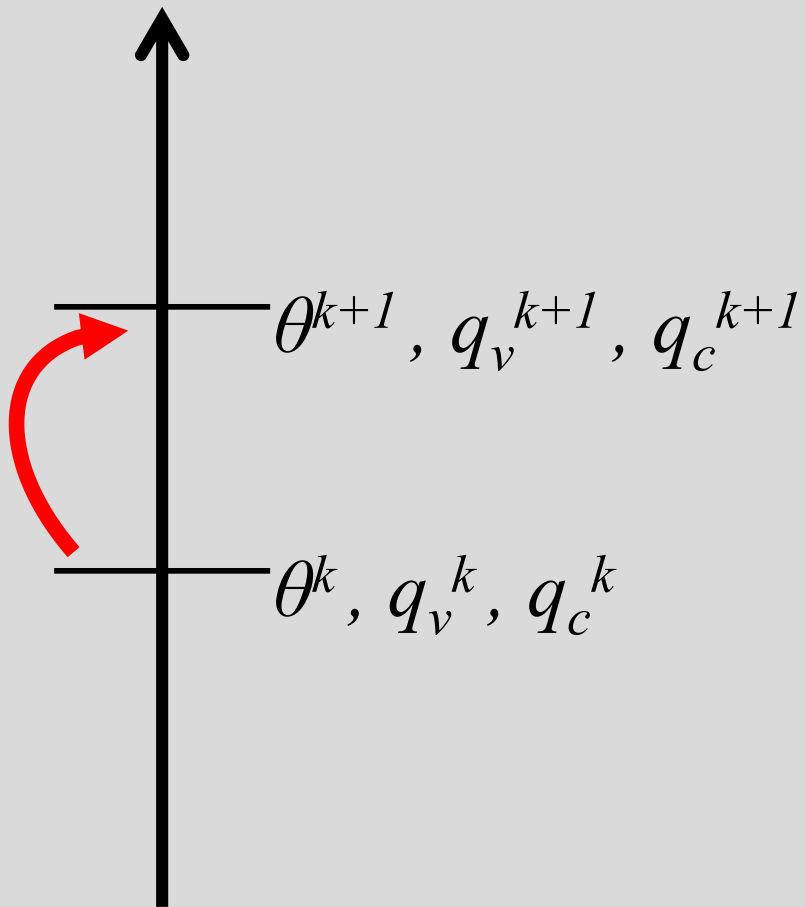
Take a parcel from
the surface and
move it up...

$$\frac{d\theta}{dt} = \frac{L_v \theta}{c_p T} C_d$$

$$\frac{dq_v}{dt} = -C_d$$

$$\frac{dq_c}{dt} = C_d$$

... by solving these
equations.



$$\theta^{k+1} = \theta^k + \frac{L_v}{c_p \Pi_e} \Delta q$$

$$q_v^{k+1} = q_v^k - \Delta q$$

$$q_c^{k+1} = q_c^k + \Delta q$$

$$\Delta q = ?$$

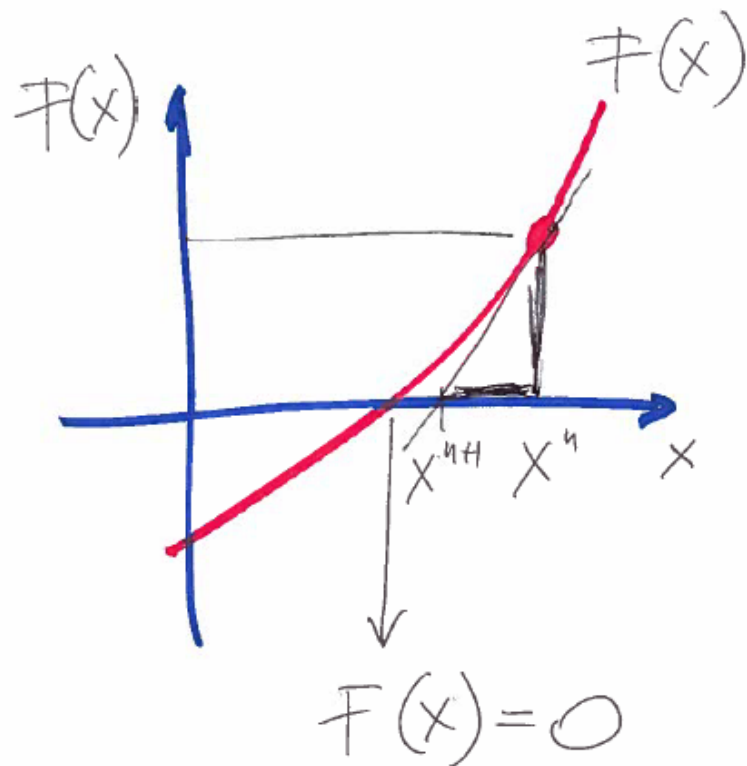
$$q_v^{k+1} = q_{vs}(\theta^{k+1})$$

$$q_v^k - \Delta q = q_{vs}\left(\theta^k + \frac{L_v}{c_p \Pi_e} \Delta q\right)$$

The nonlinear equation for Δq can be solved using the Newton-Raphson method...

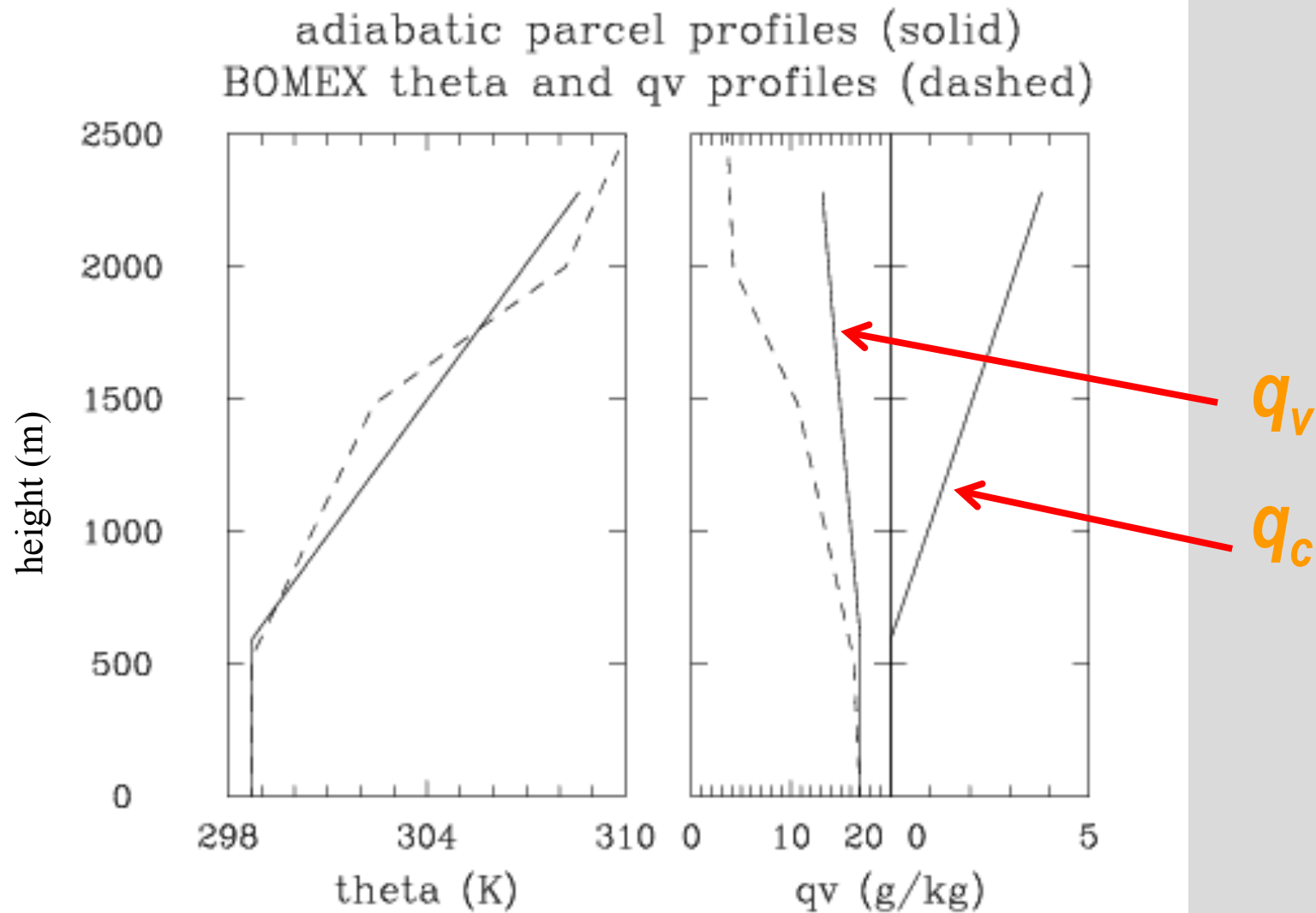
$$F(x) = 0$$

$$x = ?$$



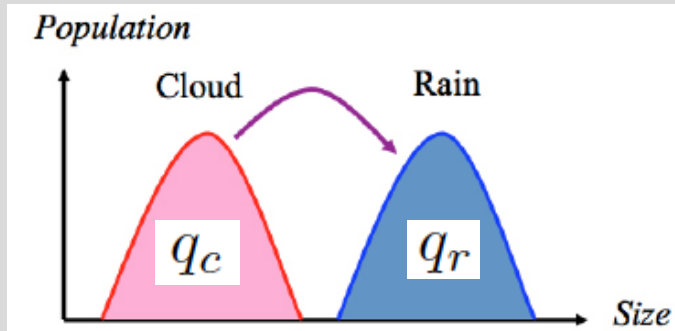
$$F'(x^n) = \frac{F(x^n)}{x^n - x^{n+1}}$$

$$x^{n+1} = x^n - \frac{F(x^n)}{F'(x^n)}$$



Look not only on the patterns (i.e., processes), but also on specific numbers (e.g., temperature change, mixing ratios, etc).

Adding rain or drizzle:

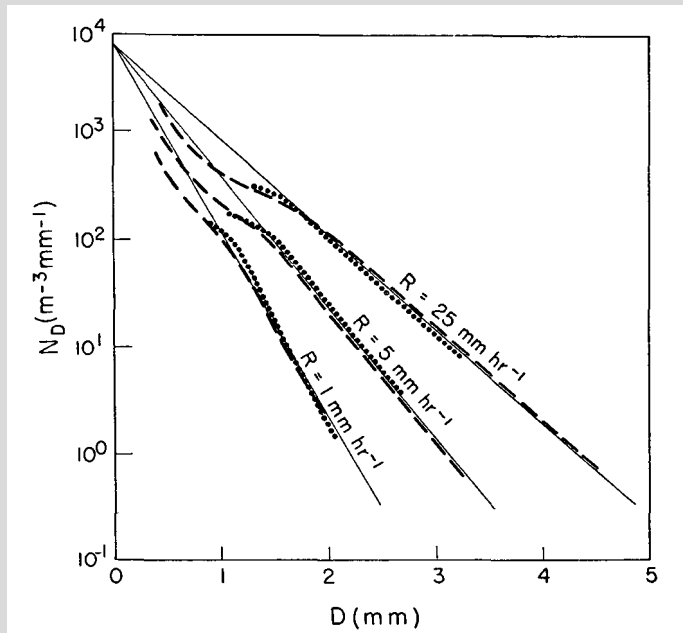


THE DISTRIBUTION OF RAINDROPS WITH SIZE

By J. S. Marshall and W. McK. Palmer¹

McGill University, Montreal

(Manuscript received 26 January 1948)



WARM RAIN BULK MODEL (Kessler 1969):

$$\frac{D\theta}{Dt} = \frac{L_v\theta}{c_p T}(C_d - EVAP)$$

$$\frac{Dq_v}{Dt} = -C_d + EVAP$$

$$\frac{Dq_c}{Dt} = C_d - AUT - ACC$$

$$\frac{Dq_r}{Dt} = \frac{1}{\rho} \frac{\partial}{\partial z} (\rho q_r v_t) + AUT + ACC - EVAP$$

θ - potential temperature

q_v - water vapor mixing ratio

q_c - cloud water mixing ratio

q_r - rain water mixing ratio

C_d - condensation rate

$EVAP$ - rain evaporation rate

AUT - "autoconversion" rate: $q_c \rightarrow q_r$

ACC - accretion rate: $q_c, q_r \rightarrow q_r$

$v_t(q_r)$ - rain terminal velocity (typically derived by assuming a drop size distribution; e.g., the Marshall-Palmer distribution $N(D) = N_o \exp(-\Lambda D)$, $N_o = 10^7 \text{ m}^{-4}$).

Parameterization of microphysical terms:

$$\frac{D\theta}{Dt} = \frac{L_v\theta}{c_p T} (C_d - EVAP)$$

$$\frac{Dq_v}{Dt} = -C_d + EVAP$$

$$\frac{Dq_c}{Dt} = C_d - AUT - ACC$$

$$\frac{Dq_r}{Dt} = \frac{1}{\rho} \frac{\partial}{\partial z} (\rho q_r v_t) + AUT + ACC - EVAP$$

C_d – condensation rate:
already discussed in the
case of the parcel model:

“return to saturation”
through condensation or
cloud water evaporation
(infinitely fast).

Parameterization of microphysical terms:

$$\frac{D\theta}{Dt} = \frac{L_v\theta}{c_p T} (C_d - EVAP)$$

$$\frac{Dq_v}{Dt} = -C_d + EVAP$$

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$$\frac{Dq_r}{Dt} = \frac{1}{\rho} \frac{\partial}{\partial z} (\rho q_r v_t) + AUT + ACC - EVAP$$

EVAP – rain evaporation

AUT “autoconversion” (cloud water being converted into drizzle/rain)

ACC – accretion (falling drizzle/rain collecting cloud droplets)

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$$N_D = N_0 e^{-\Lambda D}$$

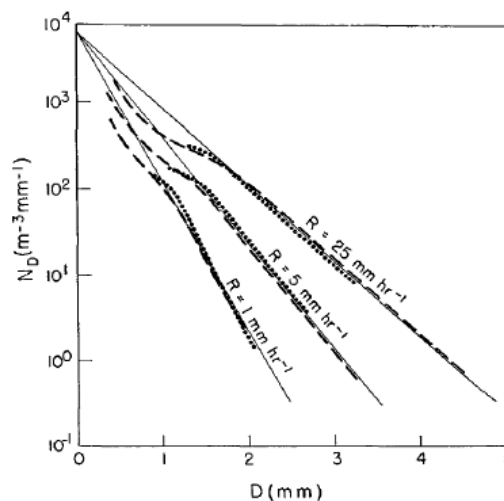


FIG. 2. Distribution function (solid straight lines) compared with results of Laws and Parsons (broken lines) and Ottawa observations (dotted lines).

threshold radius separating cloud droplets from drizzle/rain is often taken as 40 microns...

AUT autoconversion

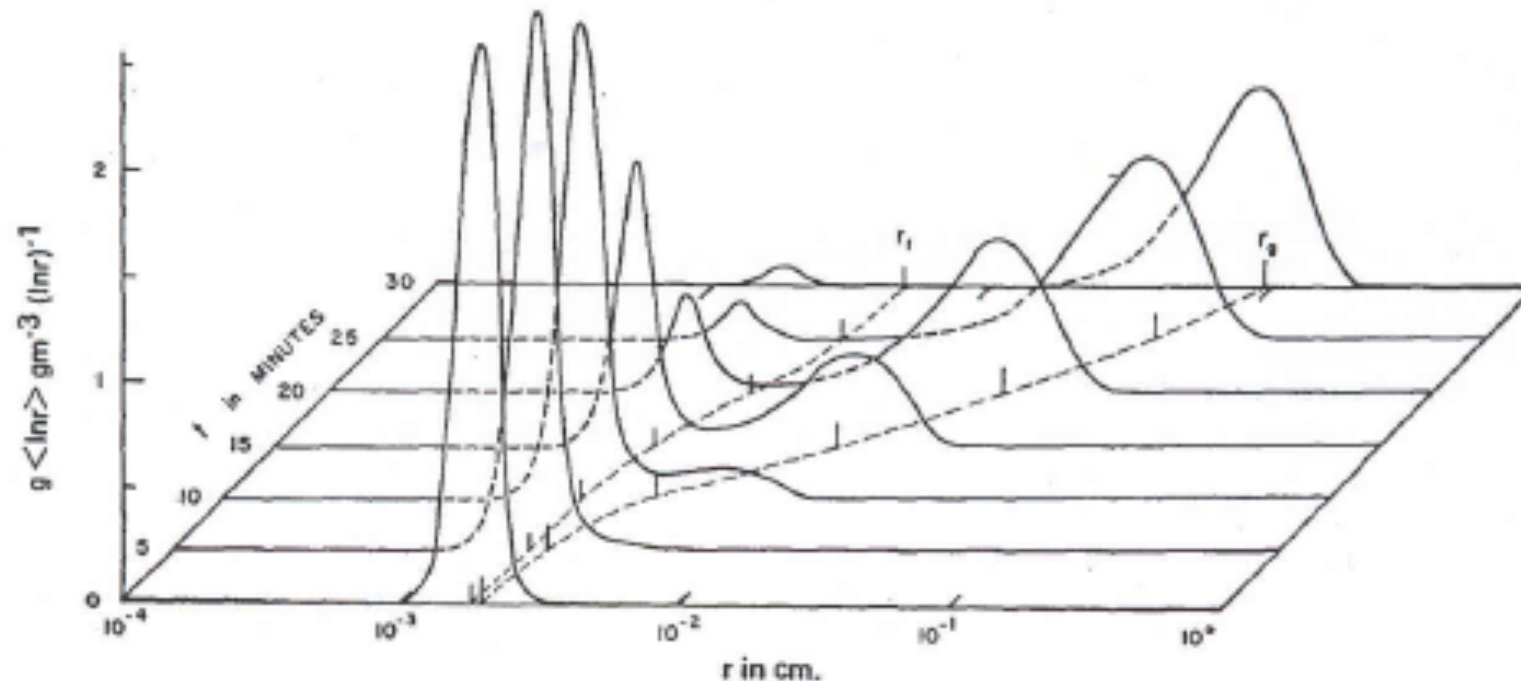


FIG. 5. Time evolution of the initial spectrum for $r_f^2 = 18 \mu\text{m}$, var $\alpha = 0.25$.

Berry and Reinhardt JAS 1974

The Simulation of Three-Dimensional Convective Storm Dynamics

JOSEPH B. KLEMP

J. Atmos. Sci. 1978

National Center for Atmospheric Research¹, Boulder, Colo. 80307

ROBERT B. WILHELMSON

rain evaporation

EVAP

$$\frac{D\theta}{Dt} = \frac{L_v\theta}{c_p T} (C_d - EVAP)$$

$$\frac{Dq_v}{Dt} = -C_d + EVAP$$

$$\frac{Dq_c}{Dt} = C_d - AUT - ACC$$

$$\frac{Dq_r}{Dt} = \frac{1}{\rho} \frac{\partial}{\partial z} (\rho q_r v_t) + AUT + ACC - EVAP$$

$$E_r = \frac{1}{\bar{\rho}} \frac{(1 - q_v/q_{vs}) C (\bar{\rho} q_r)^{0.525}}{5.4 \times 10^5 + 2.55 \times 10^6 / (\bar{\rho} q_{vs})},$$

$$C = 1.6 + 124.9 (\bar{\rho} q_r)^{0.2046}.$$

autoconversion

AUT

$$A_r = k_1 (q_c - a),$$

ACC

$$C_r = k_2 q_c q_r^{0.875},$$

accretion

$$V = 3634 (\bar{\rho} q_r)^{0.1346} \left(\frac{\bar{\rho}}{\rho_0} \right)^{-\frac{1}{2}} [\text{cm s}^{-1}],$$

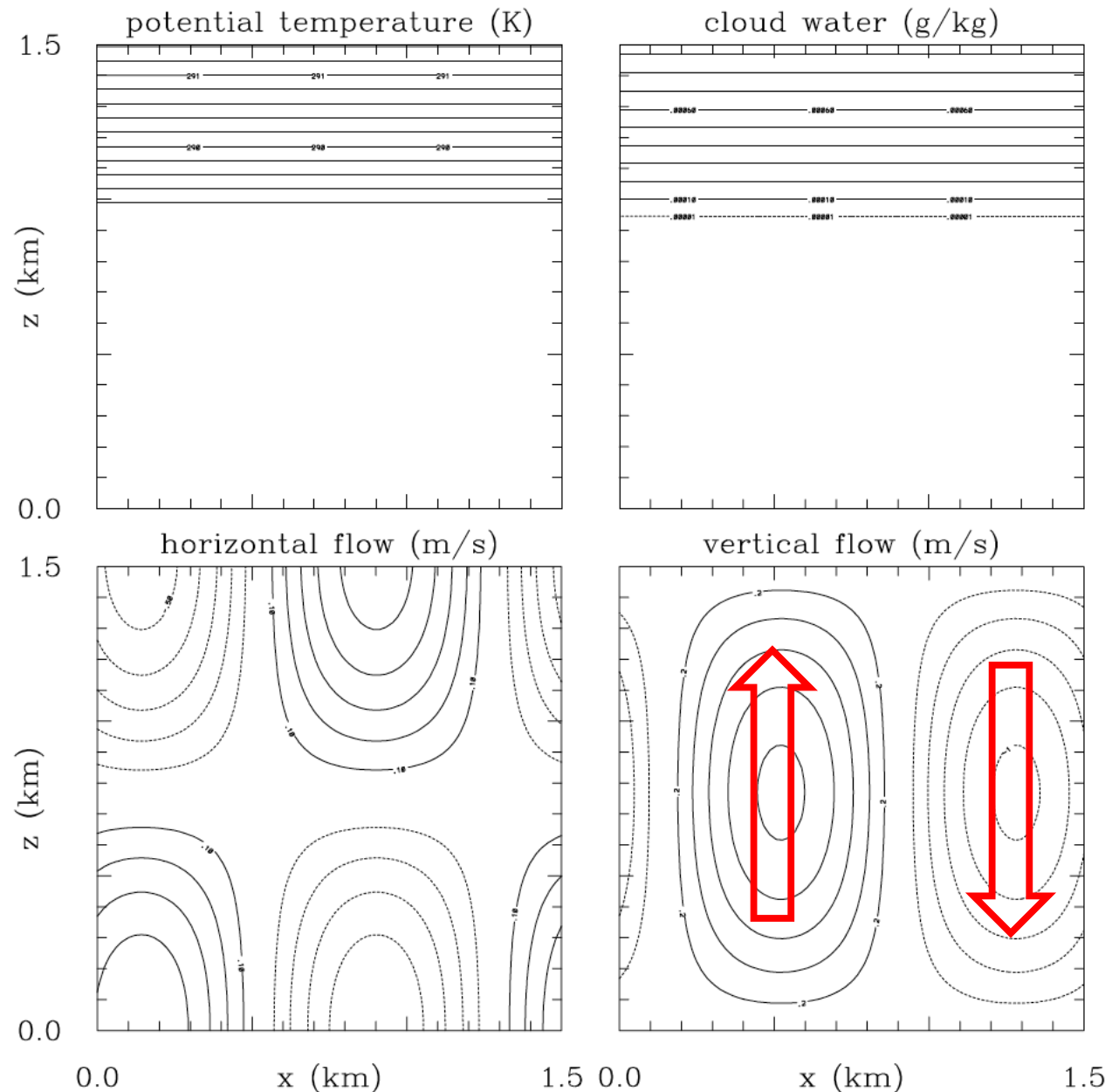
mass-weighted fall velocity

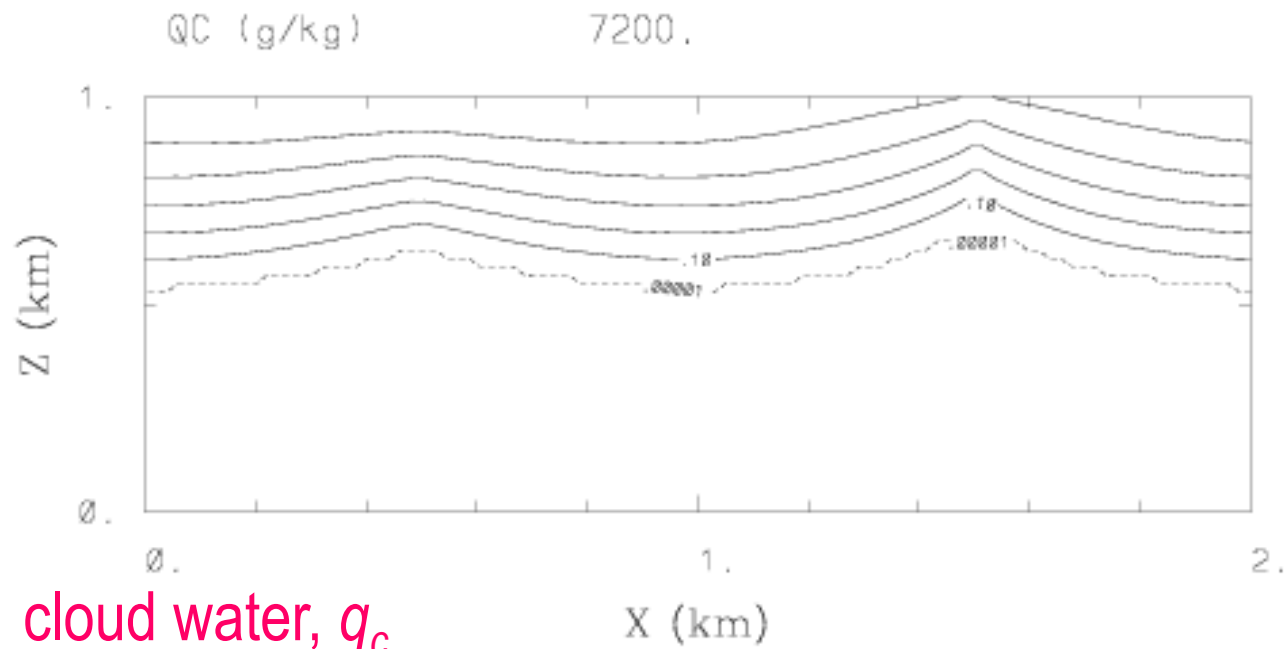
We need something more complicated than a rising parcel as rain has to fall out. One possibility is to use the *kinematic* (prescribed flow) framework...

```
cc initial theta_l and q_tot profiles:
do k=1,npin
  zin(k)=float(k-1)*dz
  theta_l(k)=289.
  q_tot(k)=7.5e-3
enddo
```

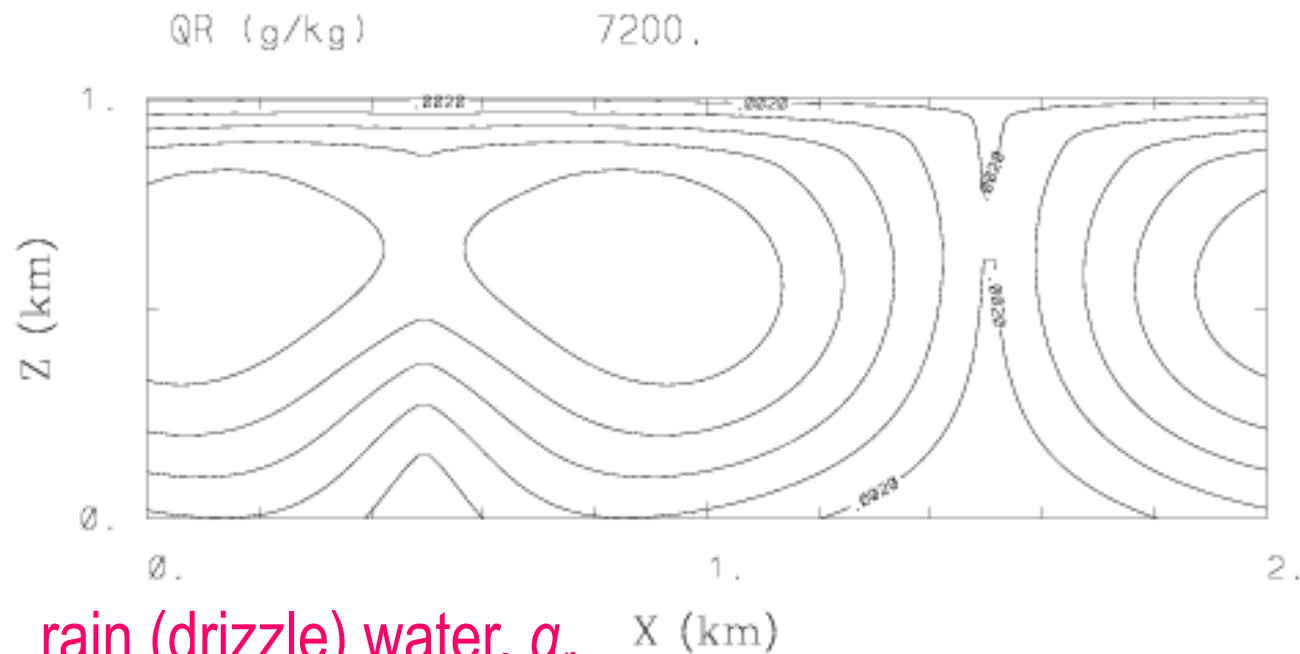
```
cc rho*ux velocity:
do i=1,nxp
  do k=1,nz
    ux(i,k)=-(phi(i,k+1)-phi(i,k))/dz
  enddo
enddo

cc rho*uz velocity:
do k=1,nzp
  do i=1,nx
    uz(i,k)=(phi(i+1,k)-phi(i,k))/dx
  enddo
enddo
```





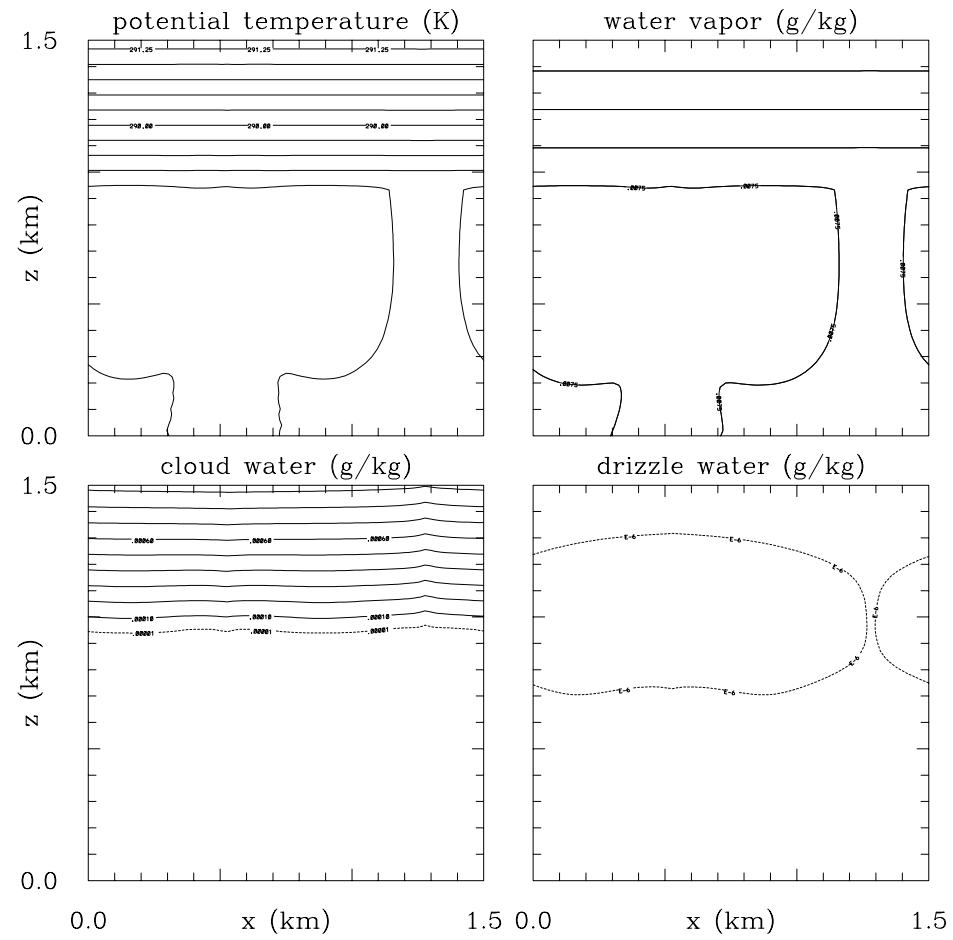
cloud water, q_c



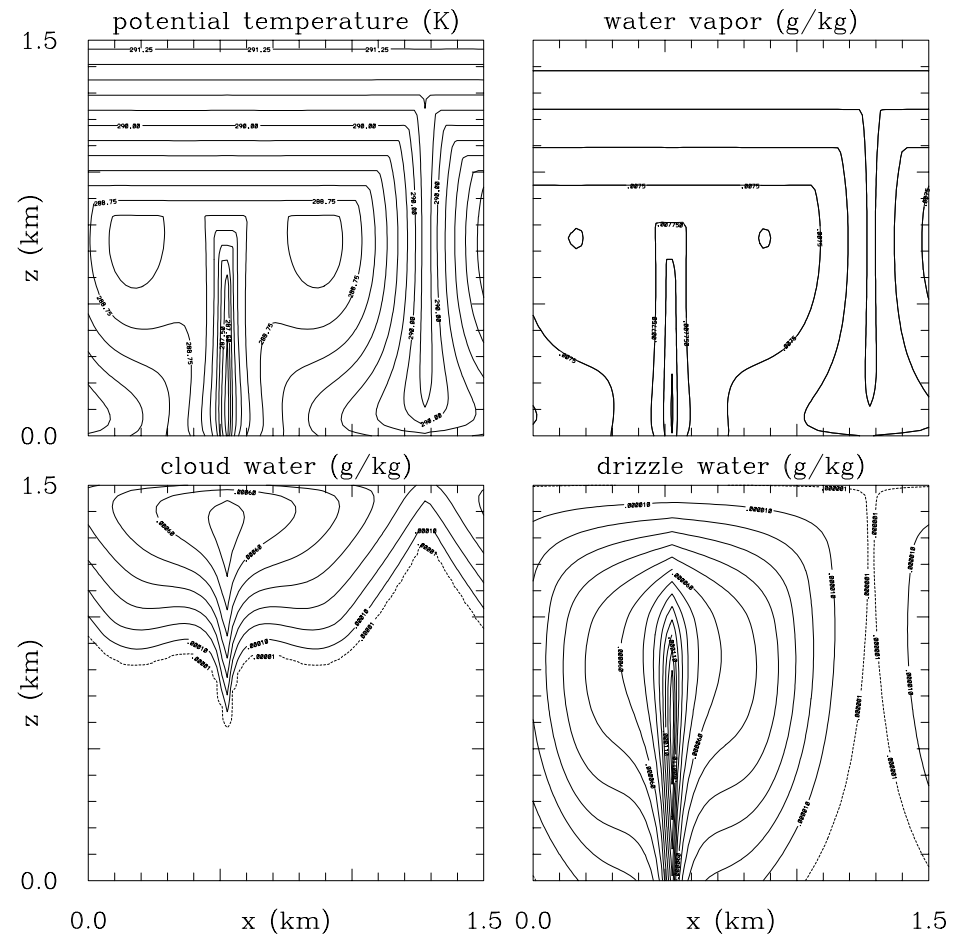
rain (drizzle) water, q_r

Cloud water
and rain
(drizzle) fields
after 2 hrs
(almost quasi-
equilibrium...)

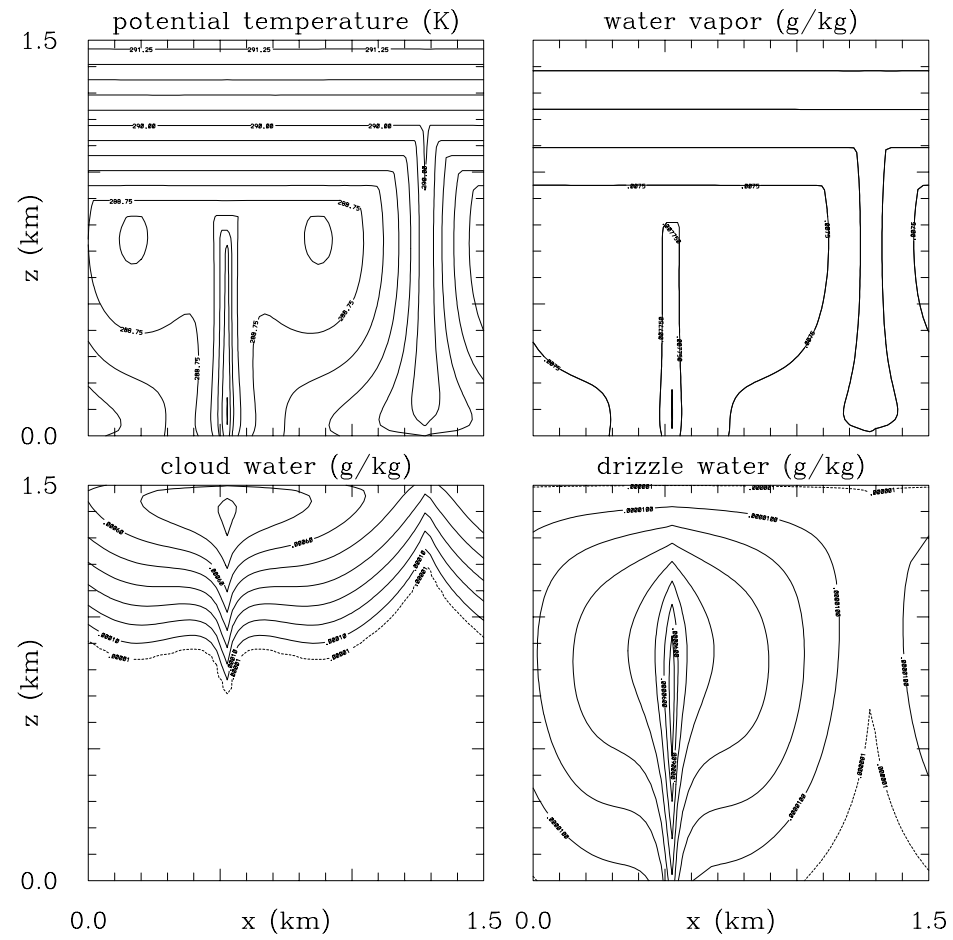
Kogan JAS 2013



Kessler



Berry 1968 / Grabowski 1998

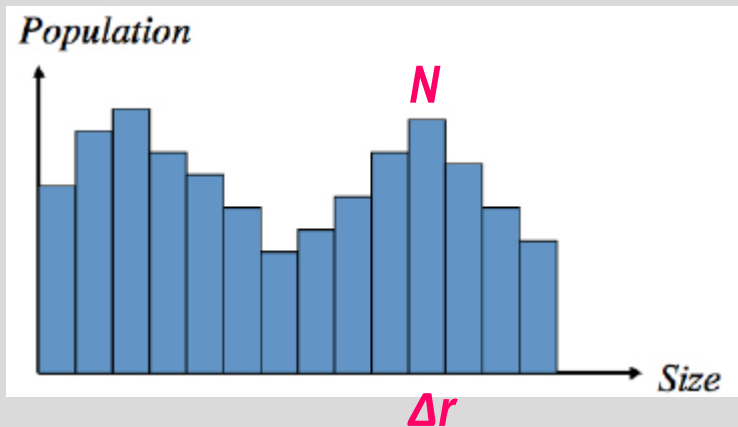


BIN-RESOLVING WARM MICROPHYSICS:

Introducing *spectral density function* $f(r, t)$:

$$f(r, t) \equiv \frac{dN(r, t)}{dr}$$

$dN(r, t)$ is the concentration (per unit mass as mixing ratio) of droplets smaller than r (cumulative concentration).



$$f = N / \Delta r$$

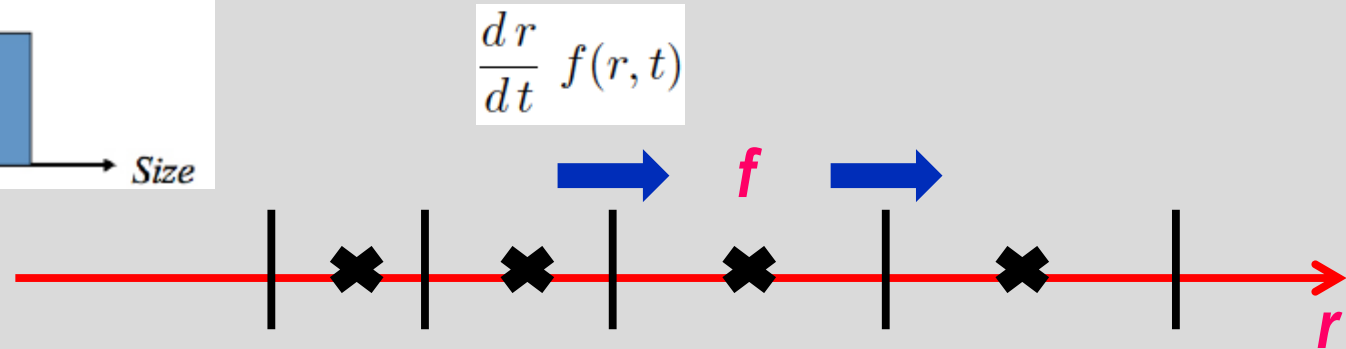
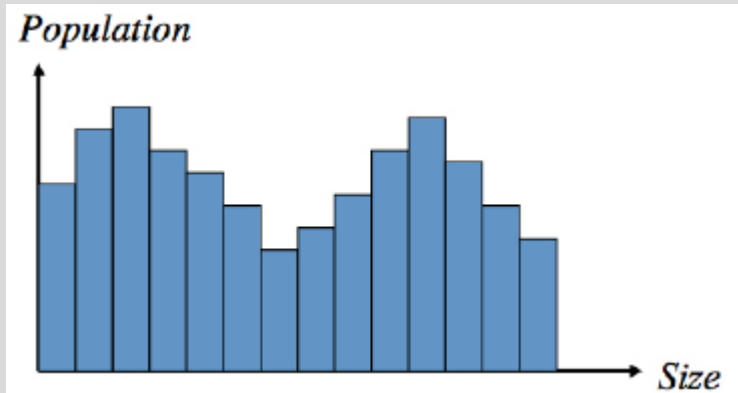
Continuity equation for the growth by condensation:

$$\frac{\partial f(r, t)}{\partial t} + \frac{\partial}{\partial r} \left(\frac{dr}{dt} f(r, t) \right) = 0$$

where $\frac{dr}{dt}$ is growth rate of a droplet with radius r :

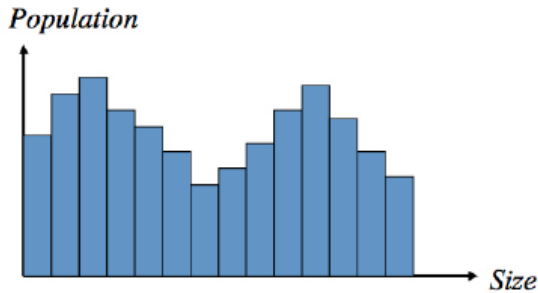
$$\frac{dr}{dt} = \frac{A(T, p) S}{r}$$

$S = \frac{q_v}{q_{vs}} - 1$ is the supersaturation; q_v is the ambient water vapor mixing ratio; $q_{vs}(p, T)$ is the saturated water vapor mixing ratio.



BIN-RESOLVING WARM MICROPHYSICS:

ACTIVATION AND CONDENSATION

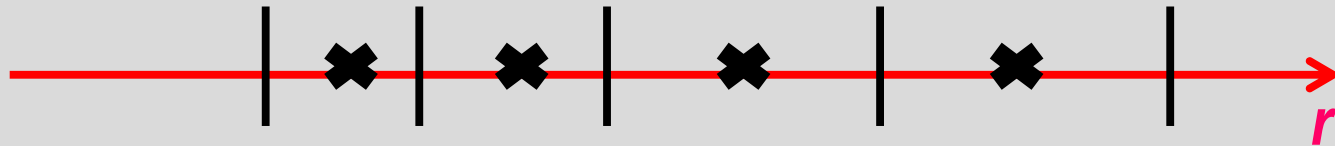


Continuity equation for activation and growth by condensation:

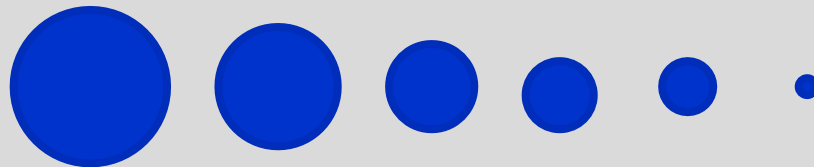
$$\frac{\partial f(r, t)}{\partial t} + \frac{\partial}{\partial r} \left(\frac{dr}{dt} f(r, t) \right) = S_{nucl}$$

where S_{nucl} is the source associated with activation of cloud droplets (CCN activation).

cloud droplets

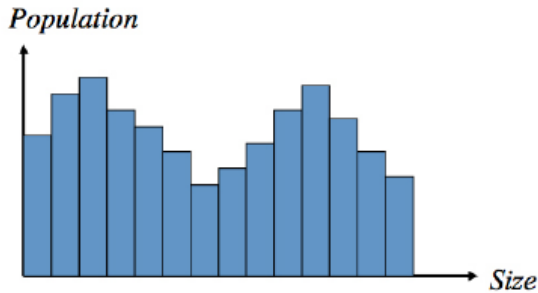


aerosols (CCN)



BIN-RESOLVING WARM MICROPHYSICS:

ACTIVATION AND CONDENSATION

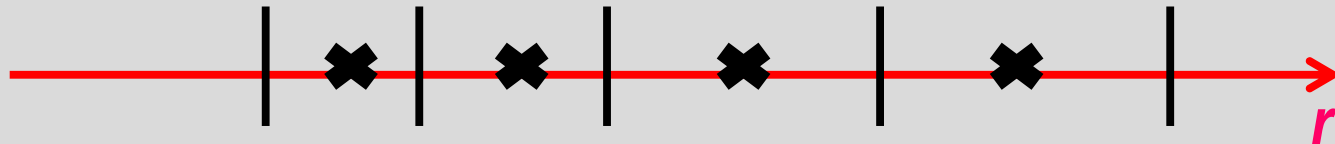


Continuity equation for activation and growth by condensation:

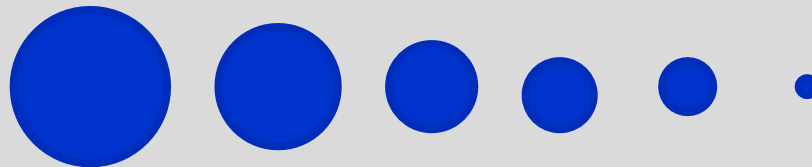
$$\frac{\partial f(r, t)}{\partial t} + \frac{\partial}{\partial r} \left(\frac{dr}{dt} f(r, t) \right) = S_{nucl}$$

where S_{nucl} is the source associated with activation of cloud droplets (CCN activation).

cloud droplets



aerosols (CCN)



move activated
CCN to
droplet grid
once
activated...

Twomey CCN activation:

N - total concentration of activated droplets

S – supersaturation ($S = q_v/q_{vs} - 1$)

$$***N = a S^b***$$

a, b – parameters characterizing CCN

$0 < b < 1$ (typically, $b=0.5$)

$a \sim 100 \text{ cm}^{-3}$ maritime/clean

$a \sim 1,000 \text{ cm}^{-3}$ continental/polluted

Activated CCN are inserted into the first bin (say, $r=1 \text{ } \mu\text{m}$)

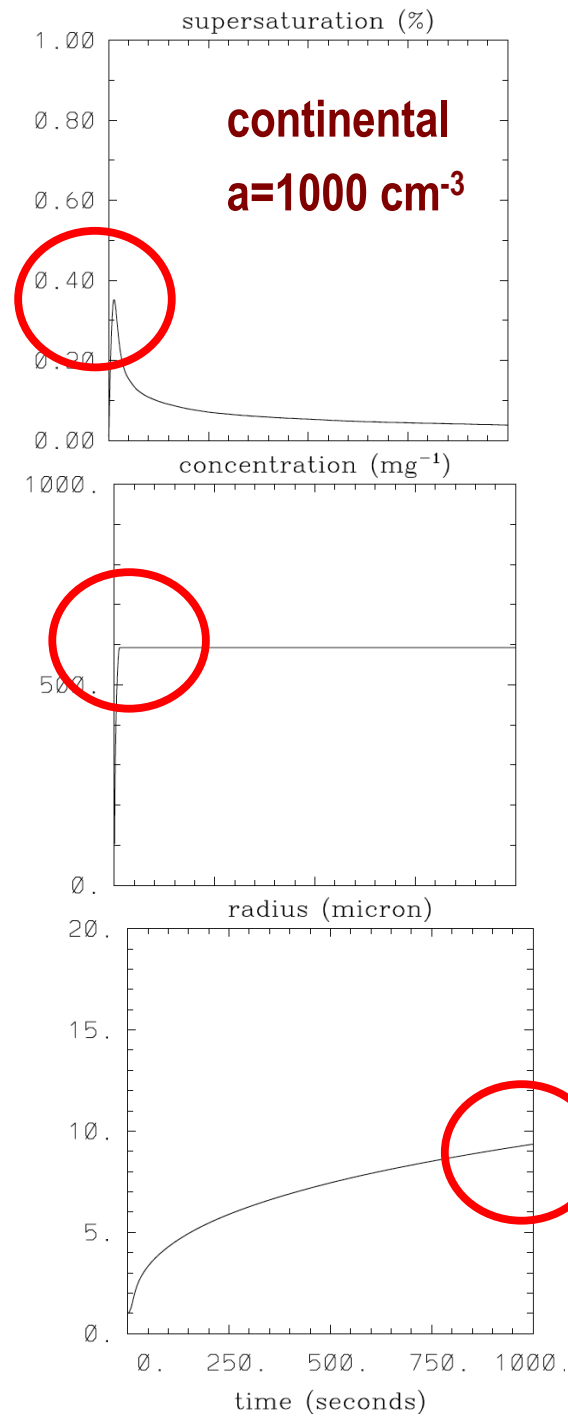
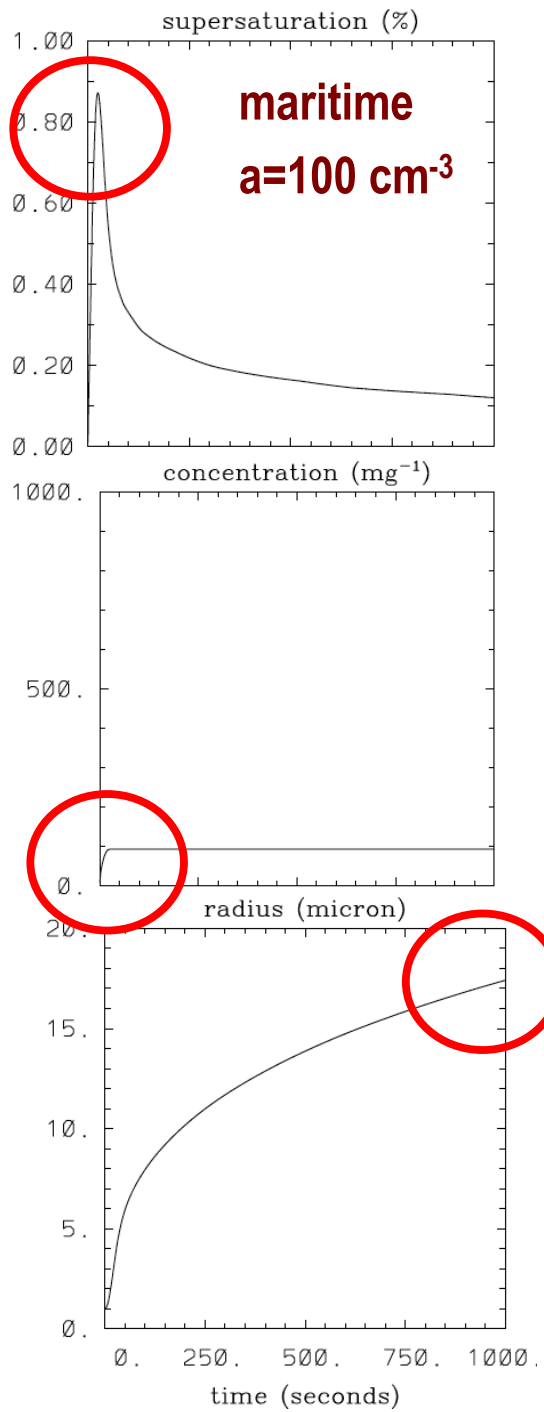
Computational example:

Nucleation and growth of cloud droplets in a parcel of air rising with vertical velocity of 1 m/s;

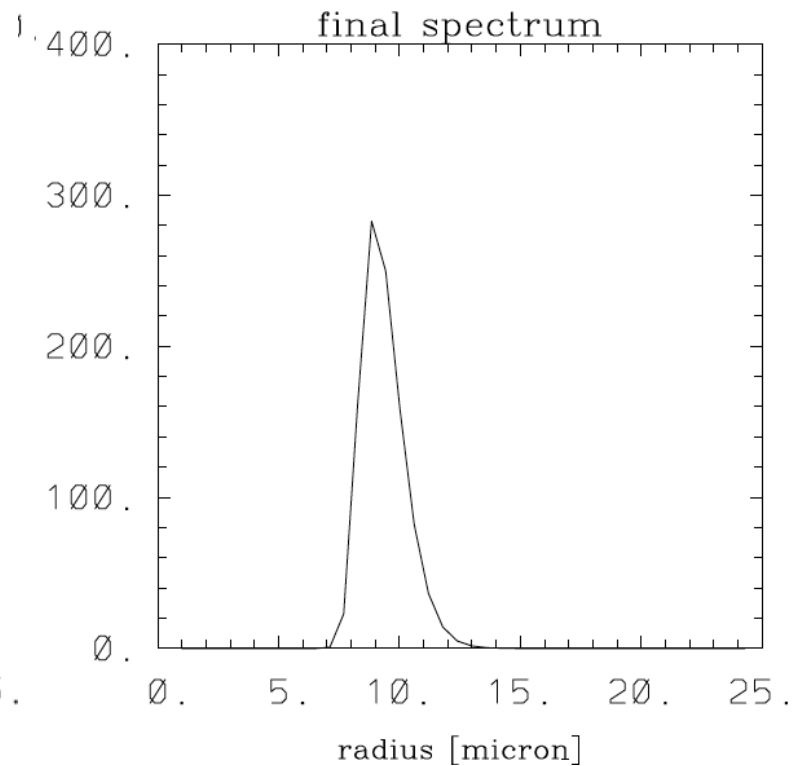
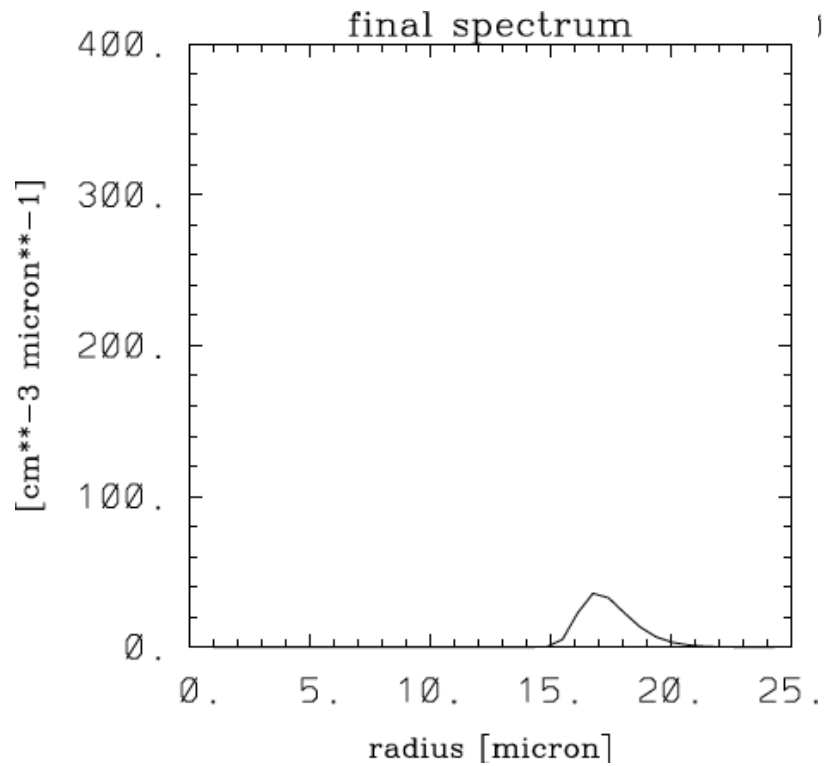
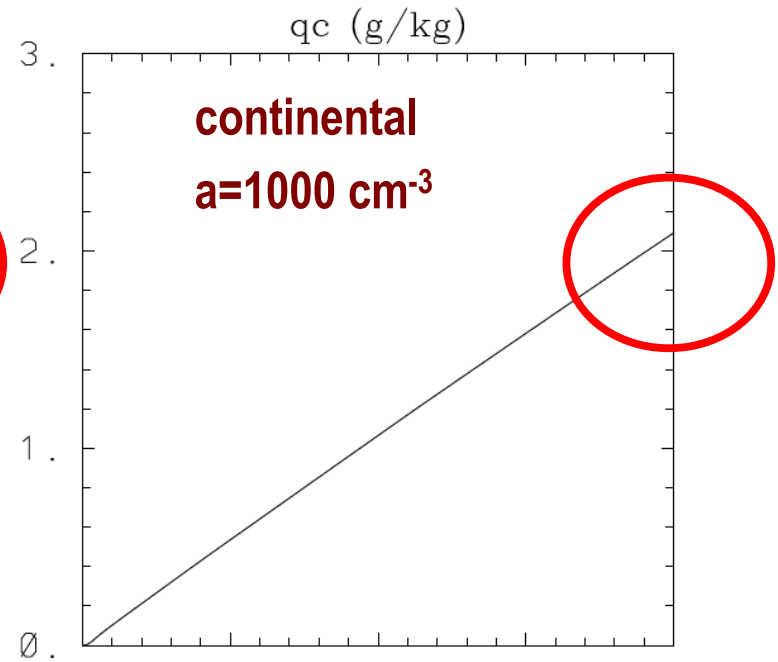
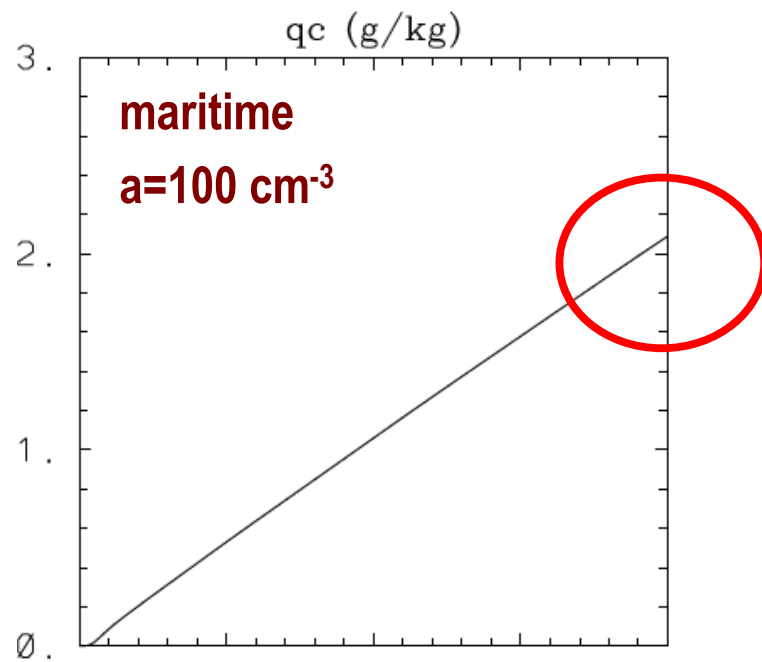
60 bins used;

1D flux-form advection applied in the radius space;

Difference between continental/polluted and maritime/pristine aerosols



$$N = a S^b$$
$$b = 0.5$$



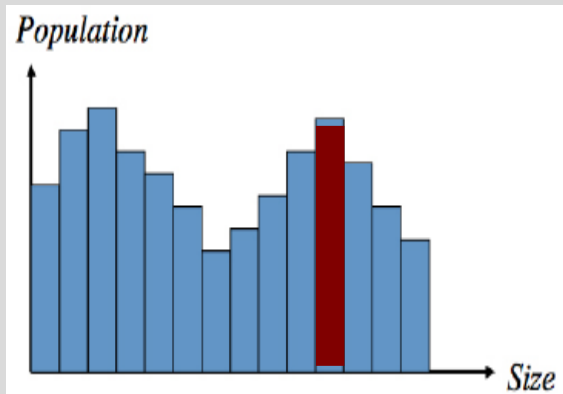
GROWTH BY COLLISION/COALESCENCE

The Smoluchowski equation (aka *kinetic collection equation*, *stochastic coalescence equation*) for the spectral density function $f(m, t)$:

$$\frac{\partial f(m, t)}{\partial t} =$$

$$= \frac{1}{2} \int_0^m f(m - M, t) f(M, t) K(m - M, M) dM$$

$$- f(m, t) \int_0^\infty f(M, t) K(m, M) dM$$



m, M - droplet masses

$K(m, M)$ - *collection kernel*; frequency of collisions (per unit volume of air) between droplets with mass m and M

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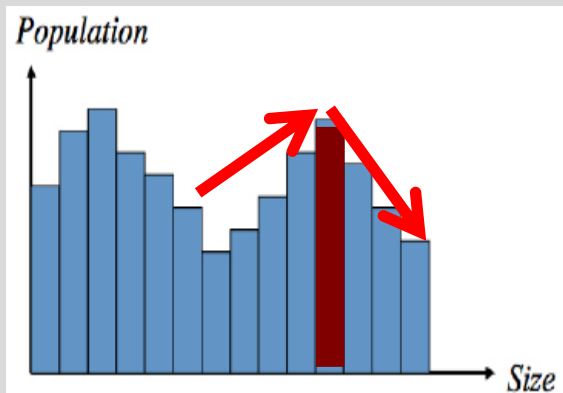
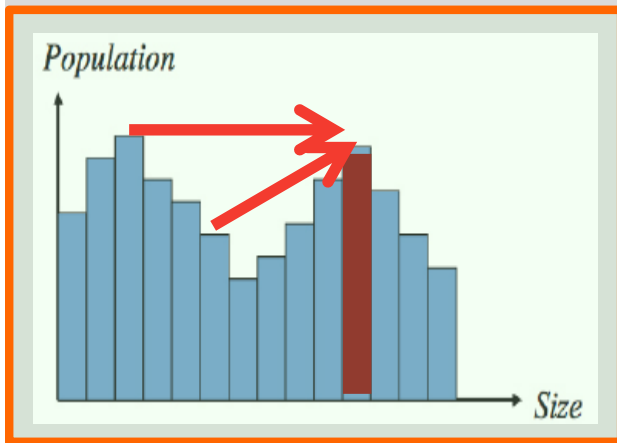
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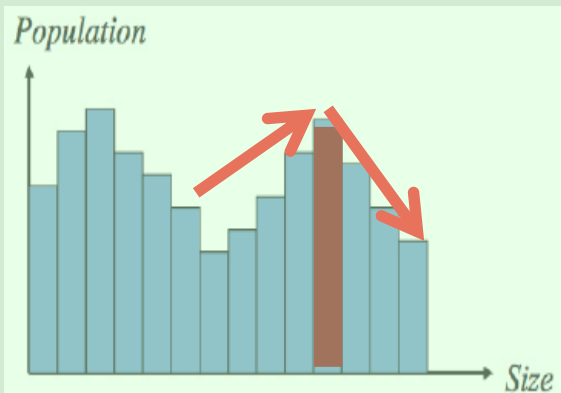
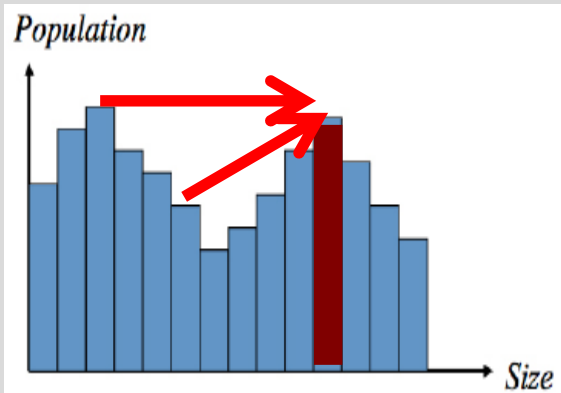
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GROWTH BY COLLISION/COALESCENCE

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$$\begin{aligned} \frac{\partial f(m, t)}{\partial t} = & \\ & = \frac{1}{2} \int_0^m f(m - M, t) f(M, t) K(m - M, M) dM \\ & - f(m, t) \int_0^\infty f(M, t) K(m, M) dM \end{aligned}$$

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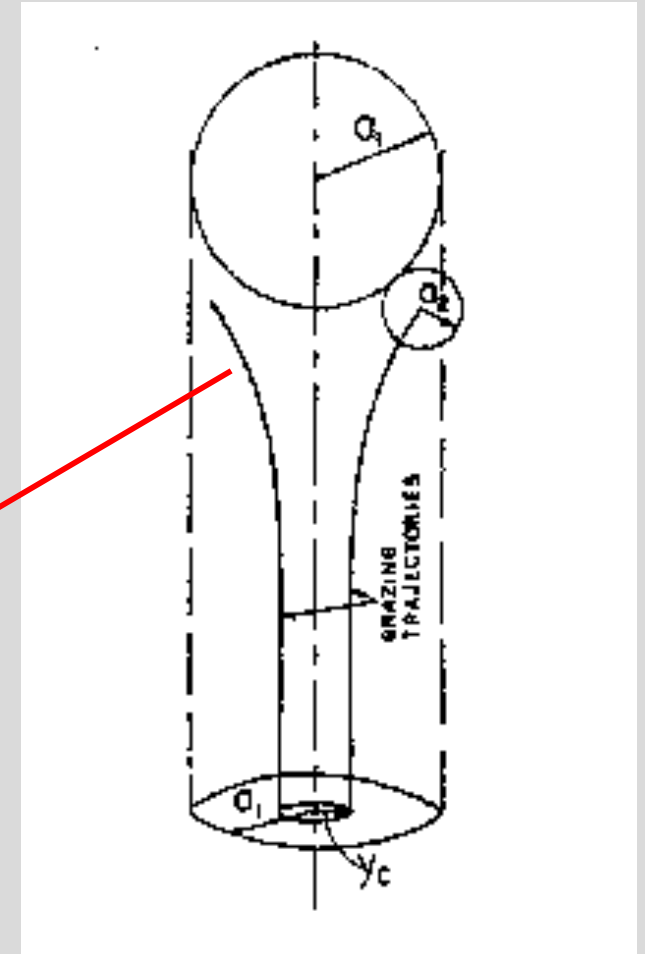
Growth of water droplets by gravitational collision-coalescence:

$$K(m_{a1}, m_{a2}) = E_c \pi (a_1 + a_2)^2 |(V_{a1} - V_{a2})|$$

Collision efficiency:

$$E_c = \frac{y_c^2}{(a_1 + a_2)^2}$$

Grazing trajectory



Droplet inertia is the key; without it, there will be no collisions. This is why collision efficiency for droplets smaller than $10 \mu\text{m}$ is very small.

$$K(m_{a1}, m_{a2}) = E_c \pi (a_1 + a_2)^2 |(V_{a_1} - V_{a_2}|$$

TABLE 1. Radius ratio r/R .

Collector drop radius (μm)	0.05	0.10	0.15	0.20	0.25	0.30	0.35	0.40	0.45	0.50	0.55	0.60	0.65	0.70	0.75	0.80	0.85	0.90	0.95	1.00
300	0.97	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
200	0.87	0.96	0.98	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
150	0.77	0.93	0.97	0.97	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
100	0.50	0.79	0.91	0.95	0.95	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
70	0.20	0.58	0.75	0.84	0.88	0.90	0.92	0.94	0.95	0.95	0.95	0.95	0.95	0.95	0.97	1.0	1.02	1.04	2.3	4.0
60	0.05	0.43	0.64	0.77	0.84	0.87	0.89	0.90	0.91	0.91	0.91	0.91	0.91	0.92	0.93	0.95	1.0	1.03	1.7	3.0
50	0.005	0.40	0.60	0.70	0.78	0.83	0.86	0.88	0.90	0.90	0.90	0.90	0.89	0.88	0.88	0.89	0.92	1.01	1.3	2.3
40	0.001	0.07	0.28	0.50	0.62	0.68	0.74	0.78	0.80	0.80	0.80	0.78	0.77	0.76	0.77	0.77	0.78	0.79	0.95	1.4
30	0.0001	0.002	0.02	0.04	0.085	0.17	0.27	0.40	0.50	0.55	0.58	0.59	0.58	0.54	0.51	0.49	0.47	0.45	0.47	0.52
20	0.0001	0.0001	0.005	0.016	0.022	0.03	0.043	0.052	0.064	0.072	0.079	0.082	0.080	0.076	0.067	0.057	0.048	0.040	0.033	0.027
10	0.0001	0.0001	0.0001	0.014	0.017	0.019	0.022	0.027	0.030	0.033	0.035	0.037	0.038	0.038	0.037	0.036	0.035	0.032	0.029	0.027

Hall (*J. Atmos. Sci.* 1980)
**(compilation of many theoretical studies and
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Hall (*J. Atmos. Sci.* 1980)
**(compilation of many theoretical studies and
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Seminal 4-part series of papers by Berry and Reinhardt (JAS 1974)

An Analysis of Cloud Drop Growth by Collection : Part I. Double Distributions

EDWIN X BERRY

National Science Foundation, Washington, D. C. 20550

RICHARD L. REINHARDT

Sierra Nevada Corporation, Reno 89505

(Manuscript received 29 January 1974, in revised form 9 April 1974)

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(Manuscript received 1 May 1974)

The method, described in the appendix of Part I, and serving as Reinhardt's PhD dissertation, is considered highly accurate but very cumbersome. The main criticism is that it does not conserve water...

Part 1

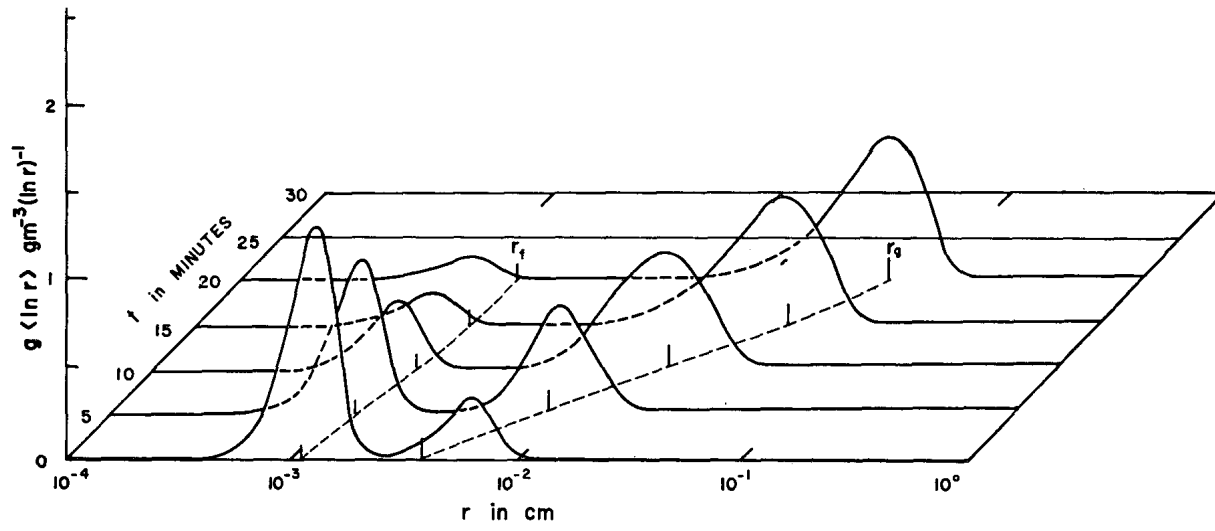


FIG. 2. Time evolution of the initial spectrum composed of 0.8 gm m^{-3} with $r_f^0 = 10 \text{ } \mu\text{m}$, and 0.2 gm m^{-3} with $r_f^0 = 50 \text{ } \mu\text{m}$, both with $\text{var } x = 1$.

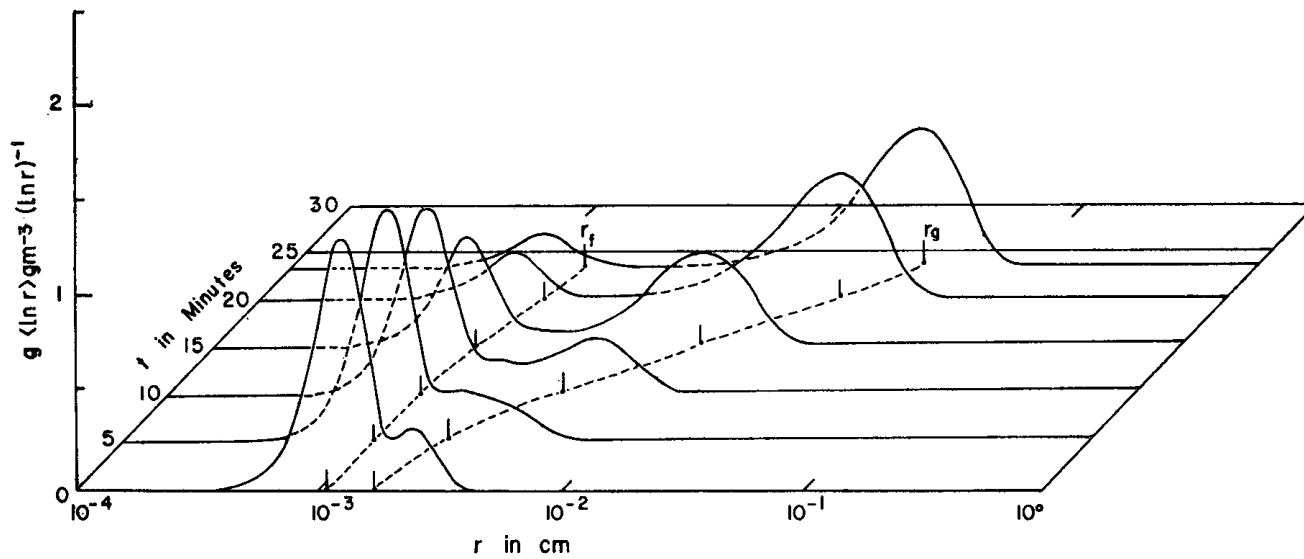


FIG. 3. As in Fig. 2 except for $r_f^0 = 20 \text{ } \mu\text{m}$.

Part 2

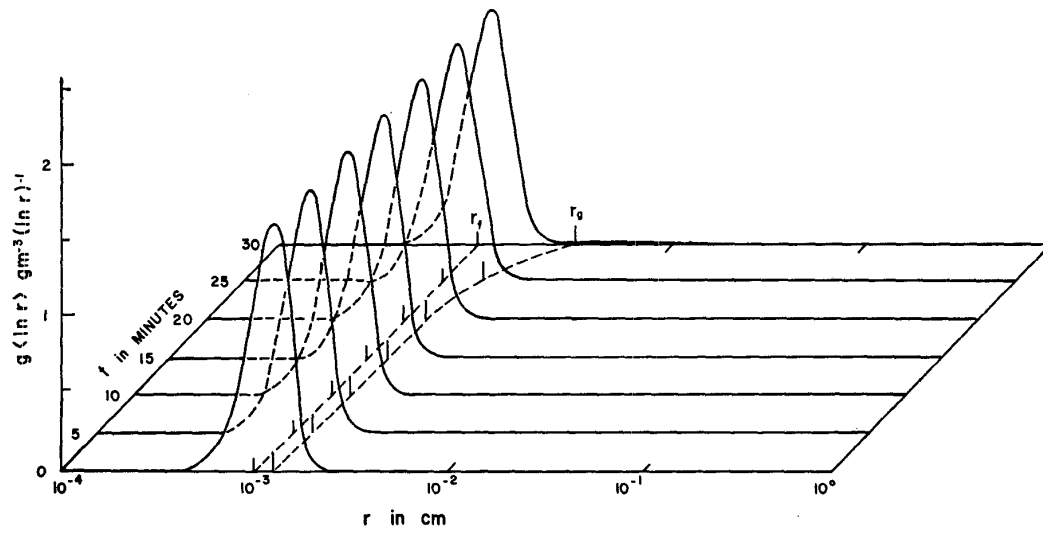


FIG. 1. Time evolution of the initial spectrum for $r_f^0 = 10 \mu\text{m}$, var $x = 1$.

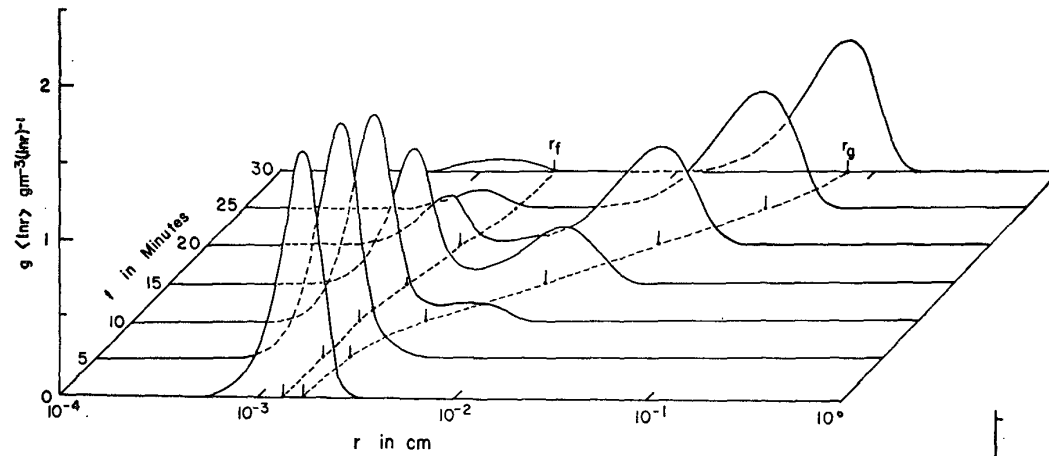


FIG. 4. Time evolution of the initial spectrum for $r_f^0 = 14 \mu\text{m}$, var $x = 1$.

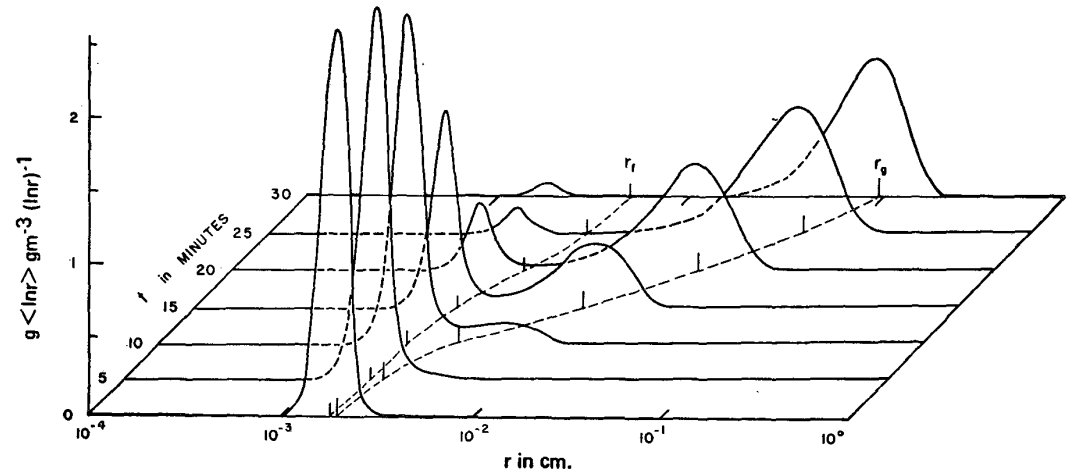


FIG. 5. Time evolution of the initial spectrum for $r_f^0 = 18 \mu\text{m}$, var $x = 0.25$.

Simulation of the droplet size distribution is difficult.

For growths by both diffusion and collision/coalescence, numerical spreading of the distribution is of primary concern. Accurate methods are expensive because they require many bins.

For multidimensional cloud simulations, each bin variable needs to be advected in the physical space. This makes bin microphysics schemes extremely expensive because the numerical cost is approximately proportional to the number of bins used. Moreover, numerical spreading of the size distribution is also affected by the the advection in the physical space.

This why bulk schemes are the workhorse of the multidimensional (2D, 3D) cloud simulations...

New trend: Lagrangian treatment of the condensed phase:

The super-droplet method for the numerical simulation of clouds and precipitation: A particle-based and probabilistic microphysics model coupled with a non-hydrostatic model

S. Shima,^{a*} K. Kusano,^c A. Kawano,^a T. Sugiyama^a and S. Kawahara^b

Cloud-aerosol interactions for boundary layer stratocumulus in the Lagrangian Cloud Model

M. Andrejczuk,¹ W. W. Grabowski,² J. Reisner,³ and A. Gadian¹

Large-Eddy Simulations of Trade Wind Cumuli Using Particle-Based Microphysics with Monte Carlo Coalescence

SYLWESTER ARABAS

Institute of Geophysics, Faculty of Physics, University of Warsaw, Warsaw, Poland

SHIN-ICHIRO SHIMA

Graduate School of Simulation Studies, University of Hyogo, Kobe, and Japan Agency for Marine-Earth Science and Technology, Kanagawa, Japan

A new method for large-eddy simulations of clouds with Lagrangian droplets including the effects of turbulent collision

T Riechelmann^{1,3}, Y Noh² and S Raasch¹

Eulerian dynamics, energy and water vapor transport:

$$\frac{\partial(u\rho)}{\partial t} + \frac{\partial(uu\rho)}{\partial x} + \frac{\partial(wu\rho)}{\partial z} = -\frac{\partial p'}{\partial x} + \Phi_{m,x} + \frac{\partial(\kappa\rho\tau^{11})}{\partial x} + \frac{\partial(\kappa\rho\tau^{13})}{\partial z},$$

$$\frac{\partial(w\rho)}{\partial t} + \frac{\partial(uw\rho)}{\partial x} + \frac{\partial(ww\rho)}{\partial z} = -\frac{\partial p'}{\partial z} - \rho'g + \Phi_{m,z} + \frac{\partial(\kappa\rho\tau^{31})}{\partial x} + \frac{\partial(\kappa\rho\tau^{33})}{\partial z},$$

$$\frac{\partial(\theta\rho)}{\partial t} + \frac{\partial(u\theta\rho)}{\partial x} + \frac{\partial(w\theta\rho)}{\partial z} = \frac{\theta\rho L}{TC_p} f_{cond} + f_{surface-energy} + f_{rad} + \frac{\partial F_{\theta x}}{\partial x} + \frac{\partial F_{\theta z}}{\partial z},$$

$$\frac{\partial(q_v\rho)}{\partial t} + \frac{\partial(uq_v\rho)}{\partial x} + \frac{\partial(wq_v\rho)}{\partial z} = -f_{cond} + f_{surface-gas} + \frac{\partial F_{q_v x}}{\partial x} + \frac{\partial F_{q_v z}}{\partial z},$$

Lagrangian physics of “super-particles”

a single “super-particle” represents a number of the same airborne particles (aerosol, droplet, ice crystal, etc.) with given attributes

$$\frac{dx_i}{dt} = v_i$$

$$\frac{dv_i}{dt} = \frac{1}{\tau_p} (v_i^* - v_i) + g\delta_{i,2}$$

$$\frac{dr}{dt} = \frac{G}{r} (S^* - S_{eq})$$

Coupling

$$\Phi_{m,x} = \sum_{id} m_{id} \frac{M_{id}}{\Delta V} \frac{(u^* - u_{id})}{\tau_{p,id}}$$

$$\Phi_{m,z} = \sum_{id} m_{id} \frac{M_{id}}{\Delta V} \frac{(w^* - w_{id})}{\tau_{p,id}}$$

$$f_{cond} = \sum_{id} \frac{M_{id}}{\Delta V} \frac{dm_{id}}{dt}$$

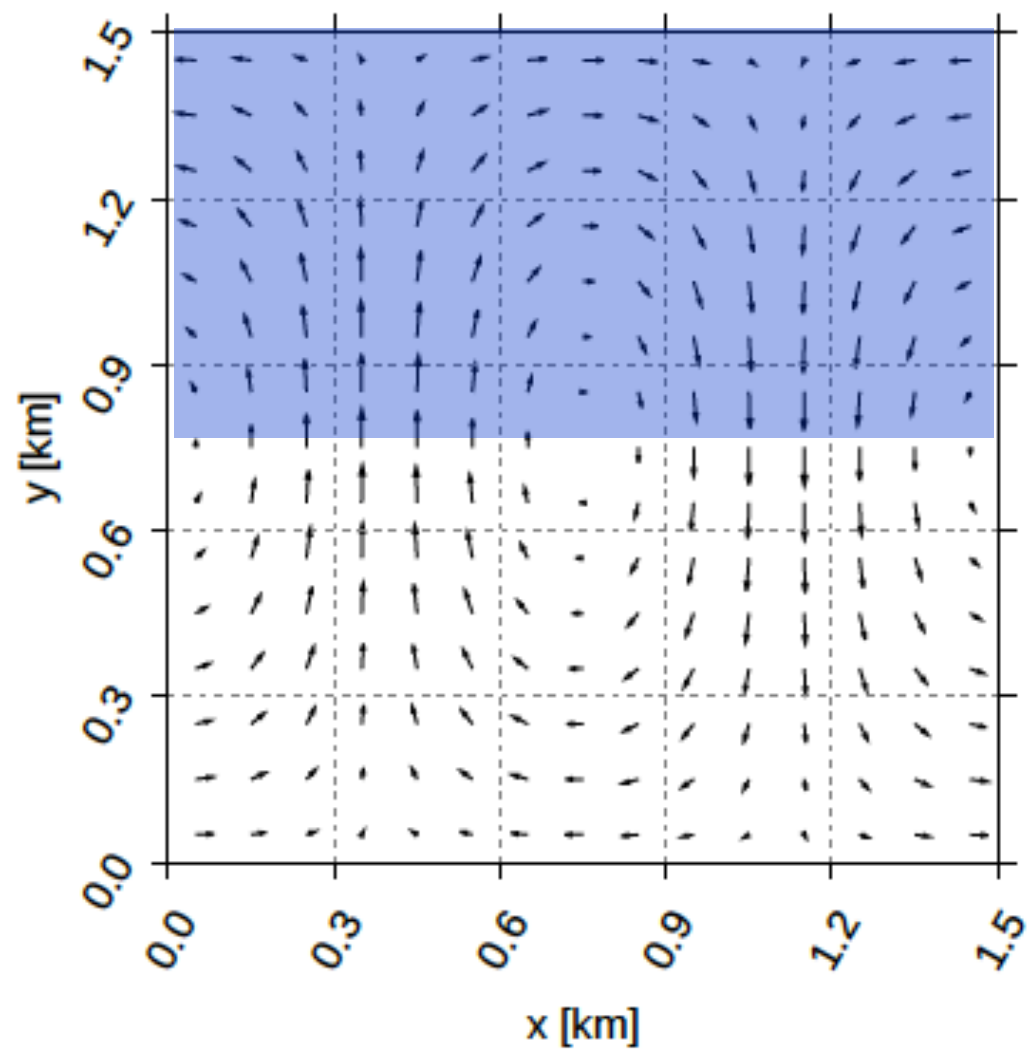
m_{id} – mass of the super-particle

M_{id} – concentration of super-particles

ΔV – volume of the gridbox

Why Lagrangian SD approach is appealing?

- no numerical diffusion due to advection;
- but sampling errors: one needs ~ 100 particles per gridbox for simple problems, many more with a longer list of attributes for appropriate sampling of the parameter space;
- straightforward for condensational growth of cloud droplets (initial sampling of the CCN distribution, growth/activation/evaporation of aerosol/droplet) – *ideal for entrainment/mixing!*
- more complex for collisions (collision of two SDs creates a new SD: two methods in the literature to deal with this...);
- seems ideal to couple with sophisticated subgrid-scale models to represent effects of turbulence (e.g., randomly choose thermodynamic environment within a gridbox, use LEM approach, etc);
- easy representation of ice particle habits and diffusional versus accretional growth.





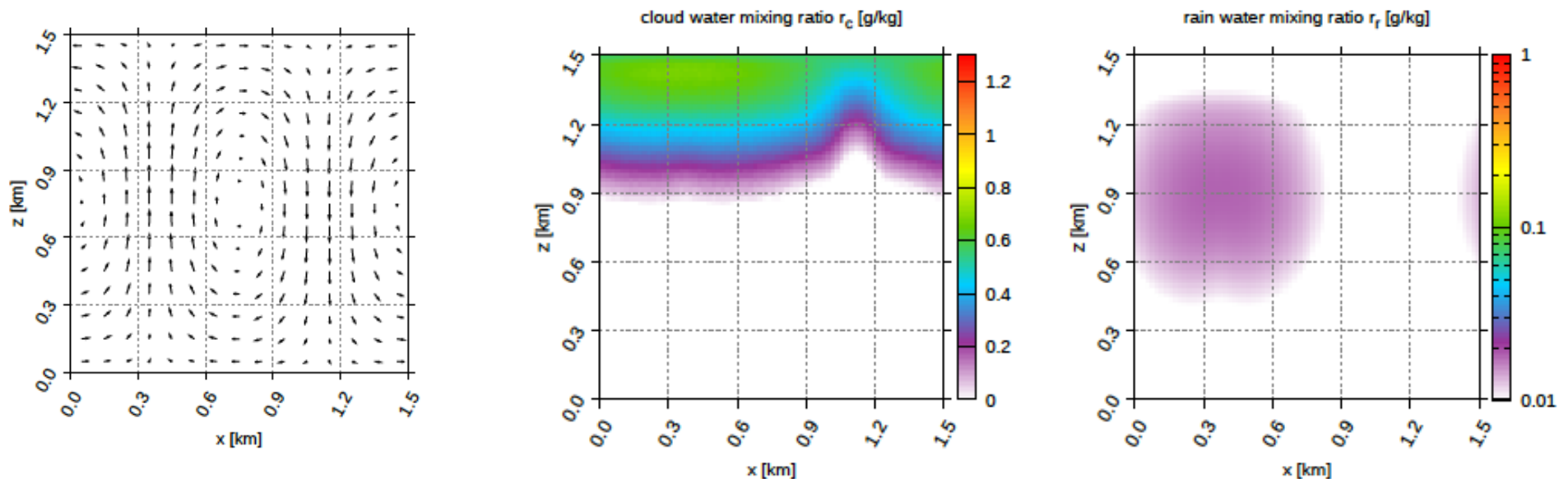
libcloudph++ 1.0: a single-moment bulk, double-moment bulk, and particle-based warm-rain microphysics library in C++

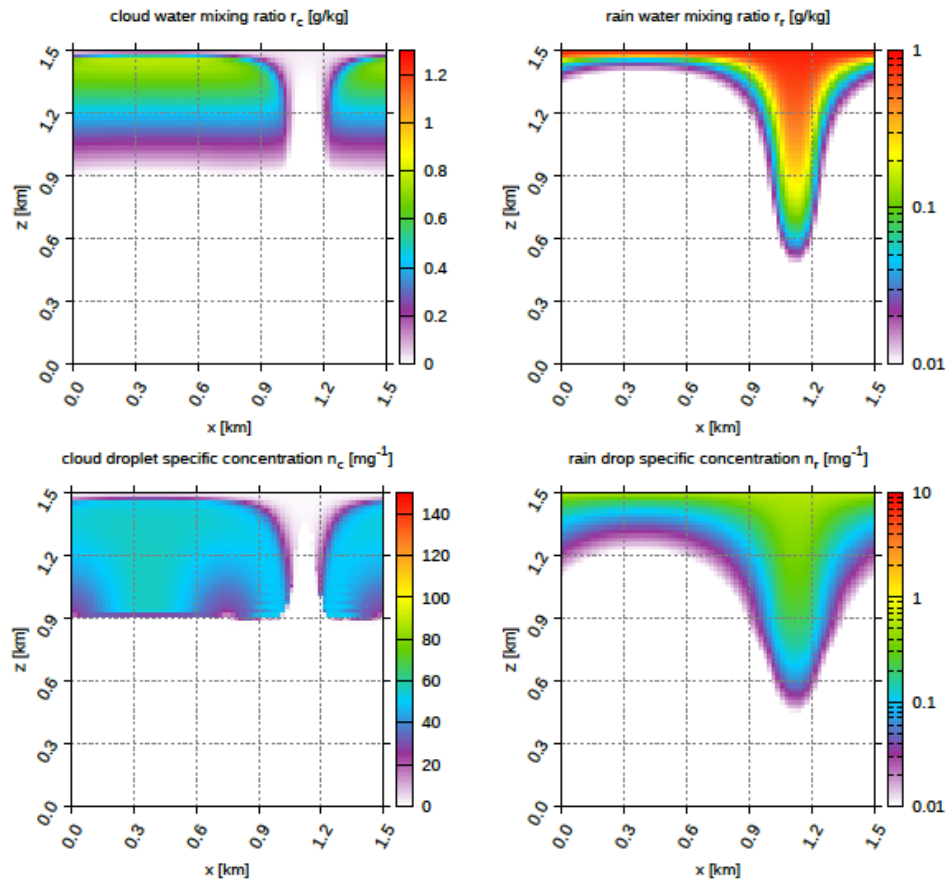
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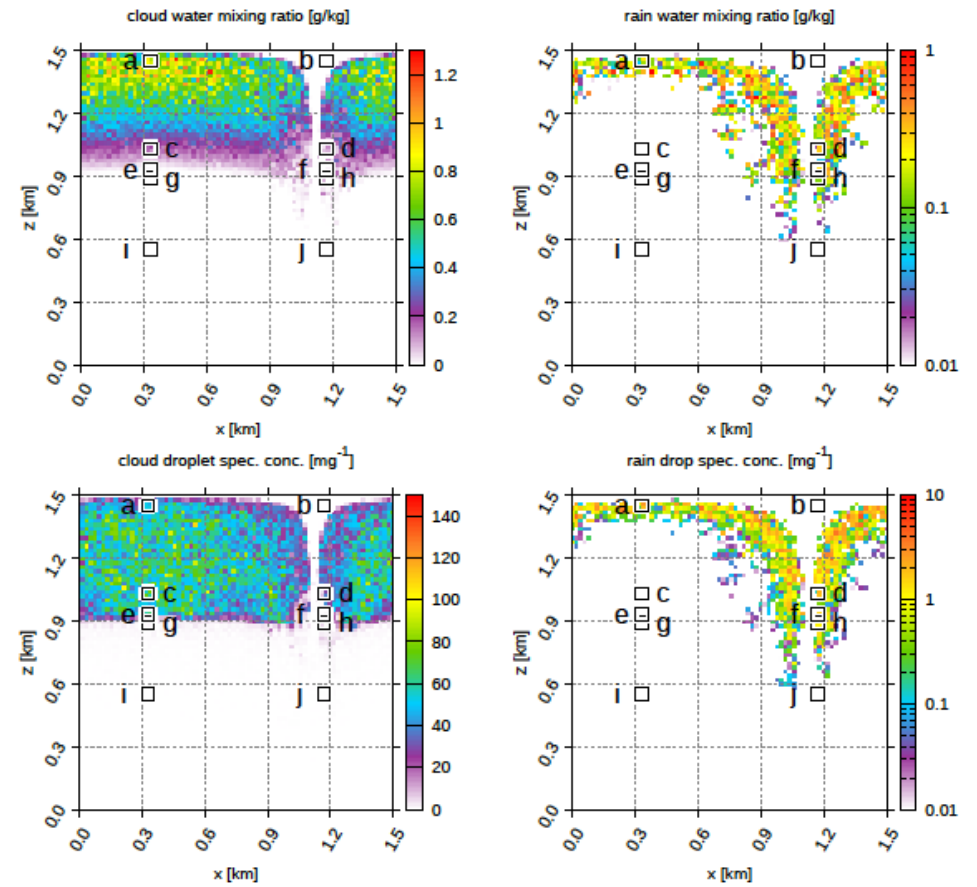
²National Center for Atmospheric Research (NCAR), Boulder, CO, USA

1-moment Eulerian scheme





2-moment Eulerian scheme



Lagrangian scheme (super-droplets)

Summary:

Warm-rain microphysics: cloud droplet activation, condensational growth, collisional growth.

Eulerian modeling warm-rain processes:

- bulk single-moment scheme: mixing ratios for cloud water and drizzle/rain water (activation irrelevant, no information about spectral characteristics, model resolution can be low);
- detailed (bin) microphysics: concentration (per unit mass) of cloud and drizzle/rain drop in each size (mass) category (~100 variables); supersaturation and droplet activation predicted, requires high spatial resolution (especially near cloud base); can be even more complicated if detailed information about aerosols is added;
- double-moment microphysics: mixing ratios and concentrations of cloud and drizzle/rain drops, supersaturation does not have to be predicted (but it can be; e.g., MG scheme), activation either predicted (MG; high resolution needed) or parameterized (e.g., as a function of the updraft speed; lower resolution possible).

Lagrangian modeling of warm-rain processes:

- relatively straightforward simulation of aerosol processing.