

# The Representation of Cloud Microphysical Processes in NWP Models

**Jason Milbrandt**

Environment Canada  
Science and Technology Branch  
Meteorological Research Division  
Atmospheric Numerical Weather Prediction Research Section

In collaboration with:

**Hugh Morrison**  
NCAR, Boulder USA

**Annual Seminar 2015:  
Physical Processes in Present and Future Large-Scale Models**



Environment  
Canada

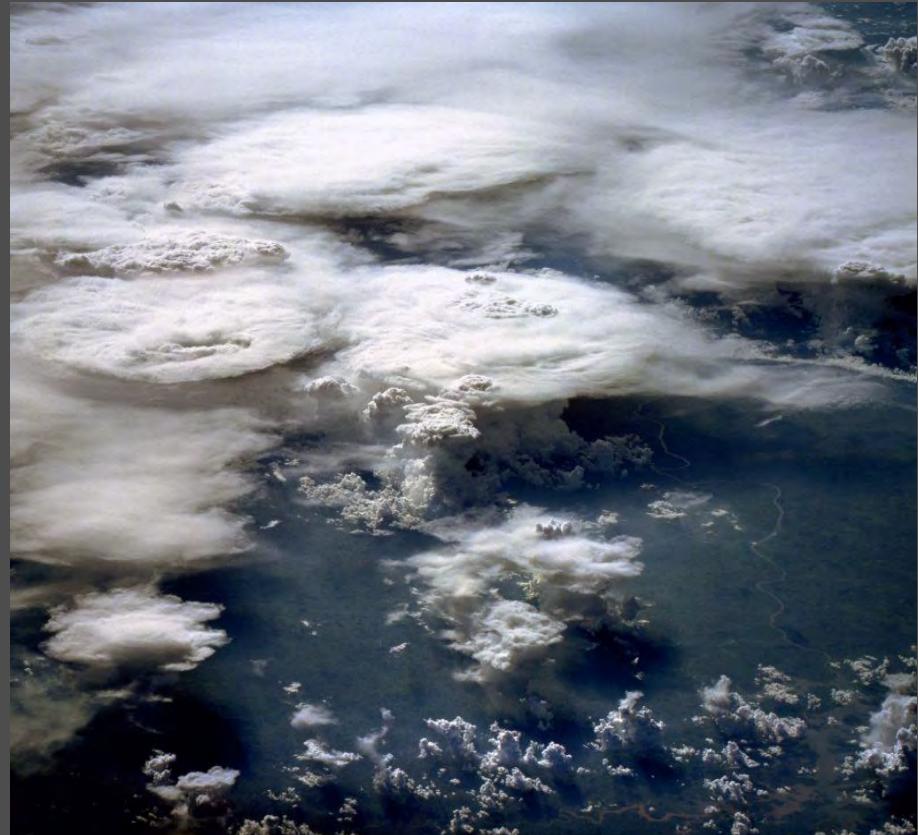
Environnement  
Canada

ECMWF, 1-4 September 2015



# Role of Clouds in NATURE

- radiative forcing
- thermodynamical feedback
- redistribution of atmospheric moisture
- precipitation
- etc.



# **Representation of Clouds in MODELS**

Treated by a combination of different physical parameterizations:

**1. Grid-scale condensation (microphysics) scheme**

**2. Subgrid-scale schemes**

- cloud fraction
- deep convection
- shallow convection
- boundary layer

**3. Radiative transfer scheme**

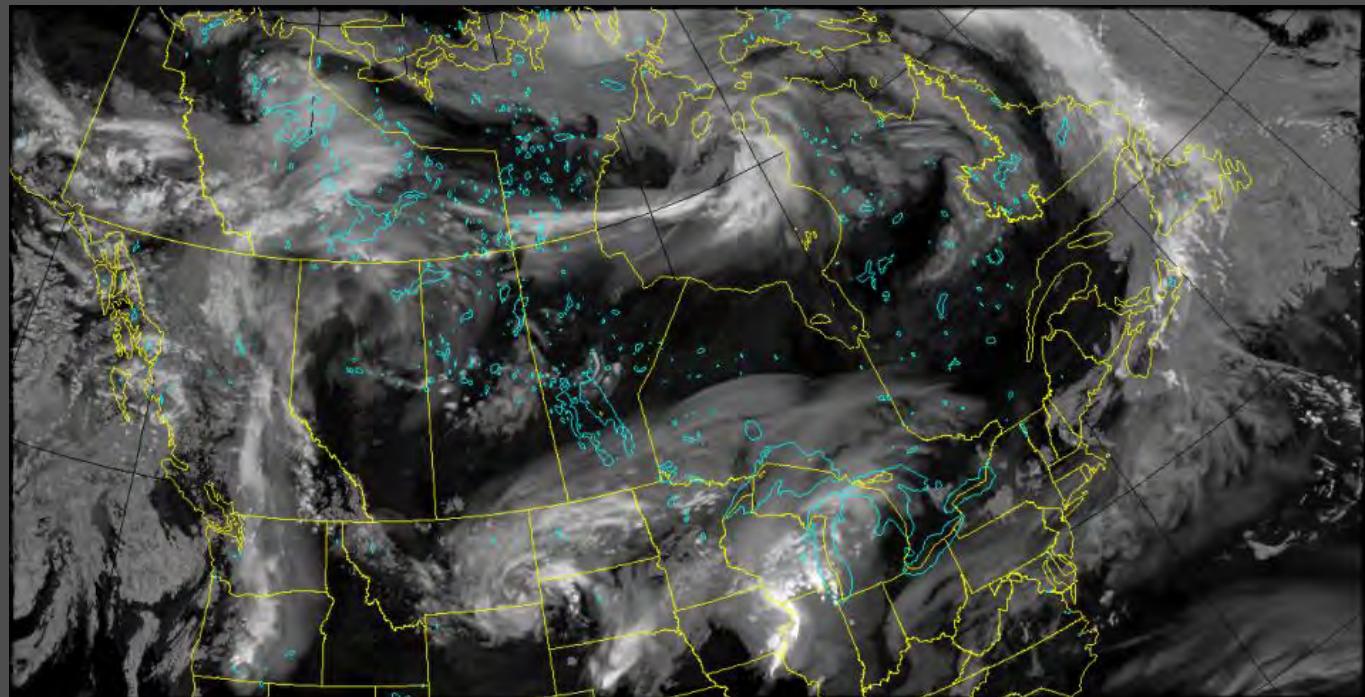
- computes radiative fluxes SW/LW

# Representation of Clouds in MODELS

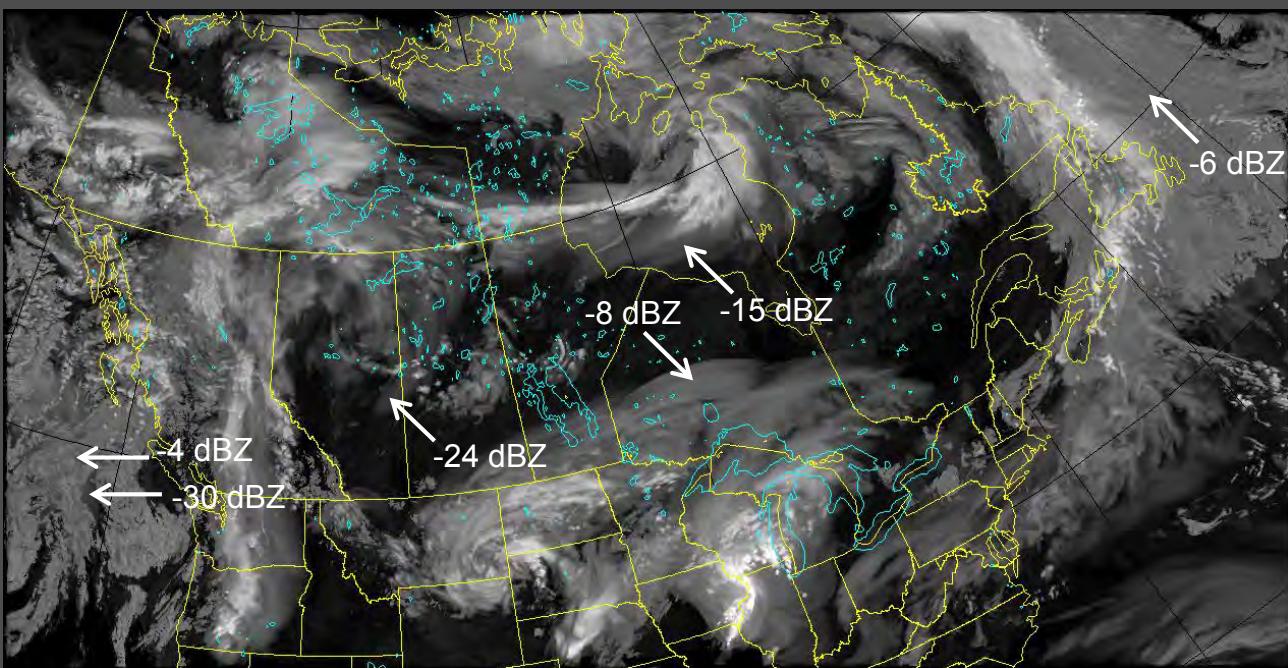
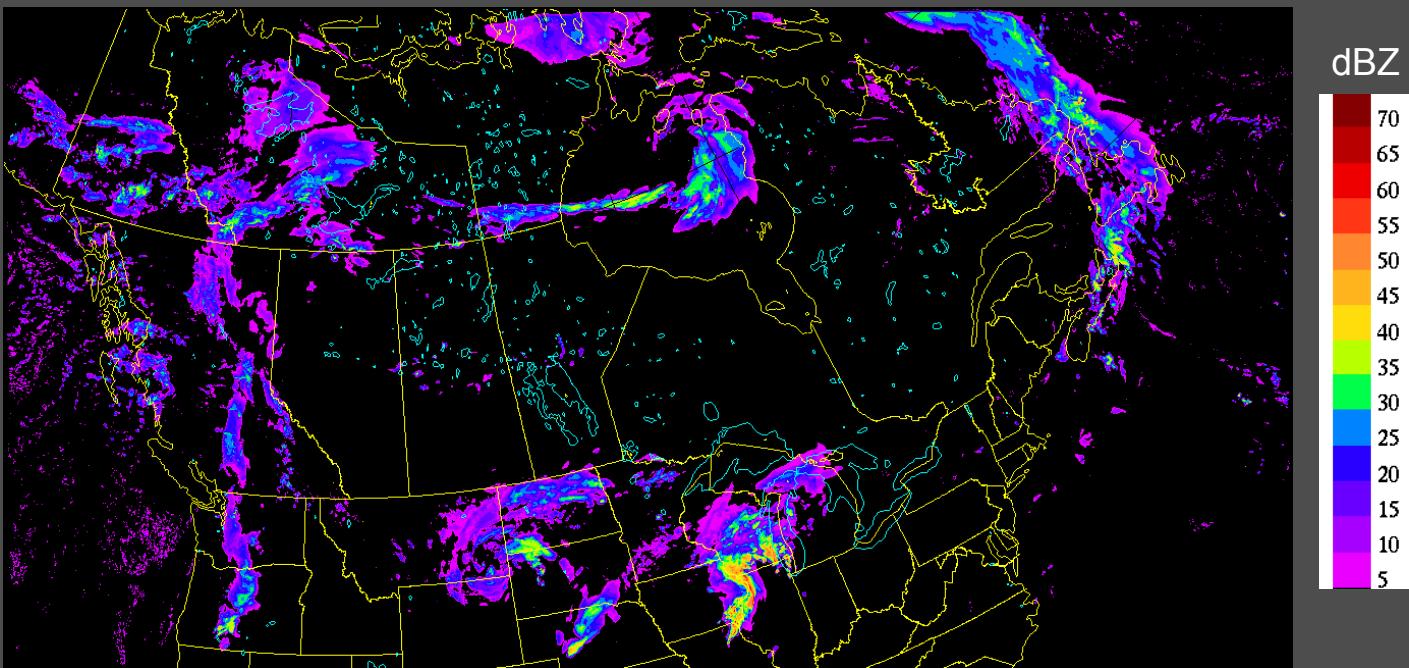
## Cloud Microphysics Scheme

### Three main roles:

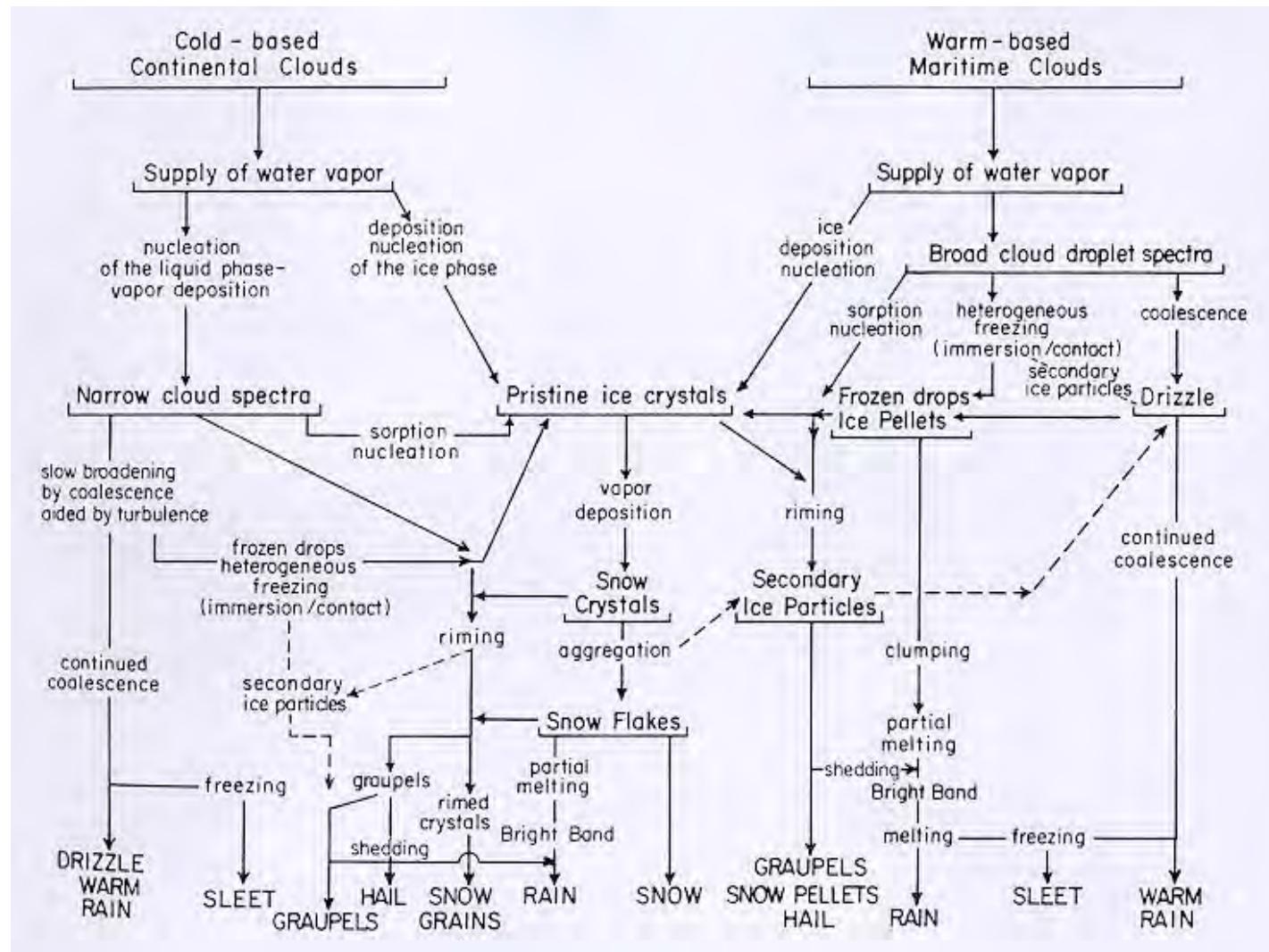
1. optical properties (for radiation scheme)
2. thermodynamic feedbacks (latent heating/cooling; mass loading)
3. precipitation (rates and types at surface)



# Column-Maximum Model Reflectivity

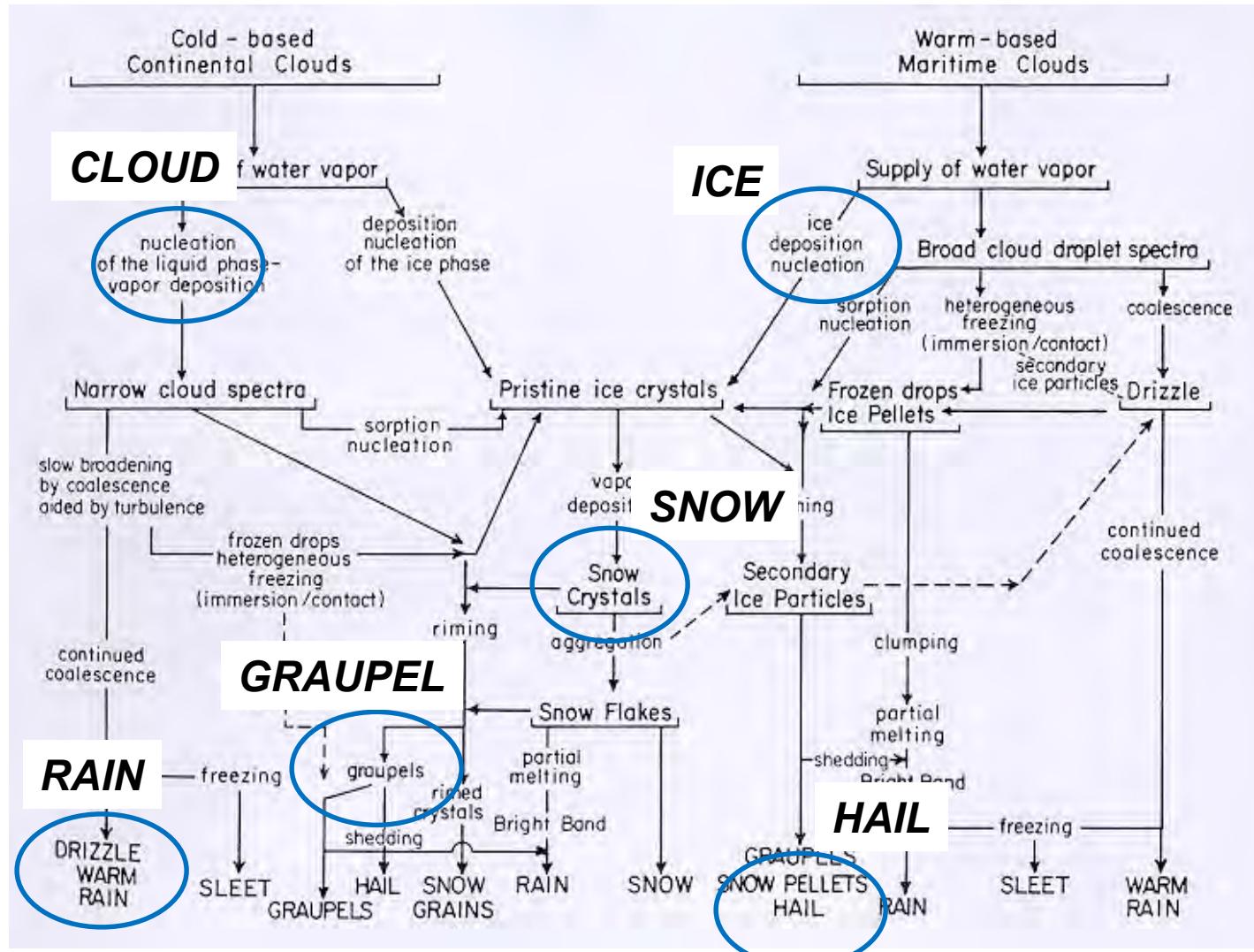


# Cloud Microphysical Processes



# Microphysics Parameterization Schemes

Hydrometeors are traditionally partitioned into categories



# Microphysics Parameterization Schemes

The particle size distributions are modeled

e.g.

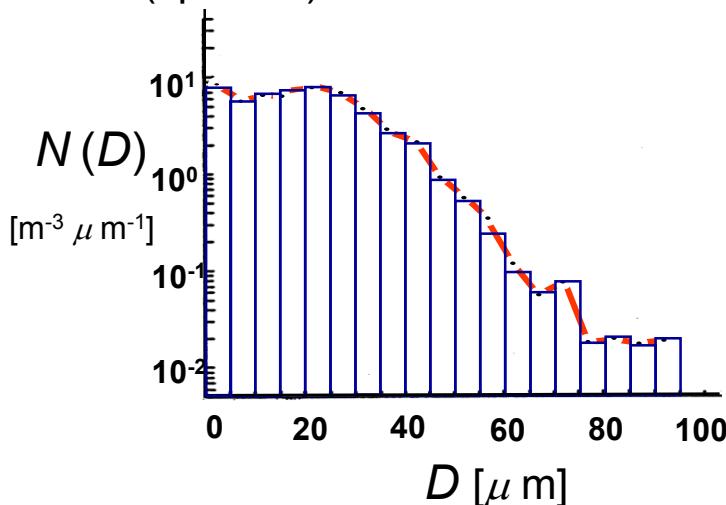


**SNOW**

For each category, microphysical processes are parameterized in order to predict the evolution of the particle size distribution,  $N(D)$

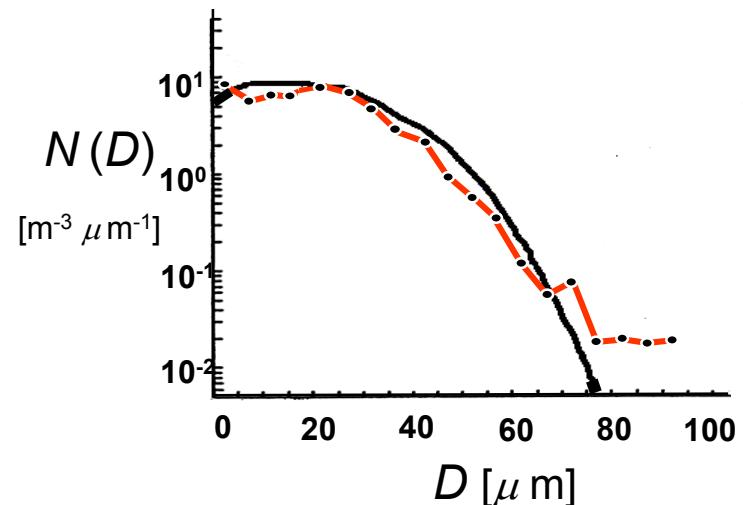
## TYPES of SCHEMES:

**Bin-resolving:**  
(spectral)



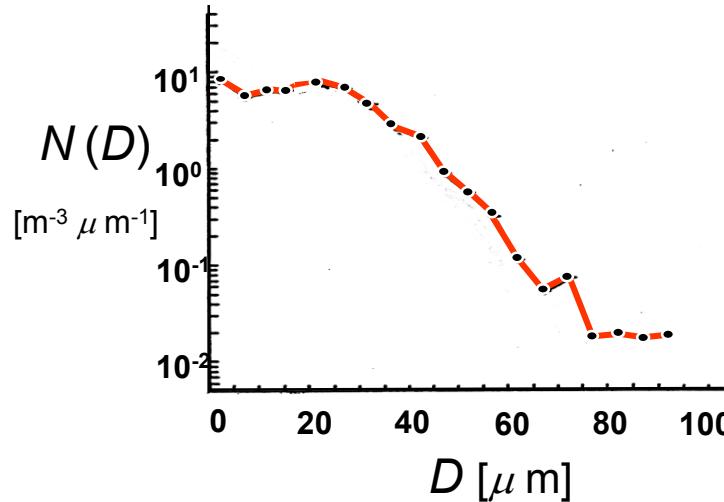
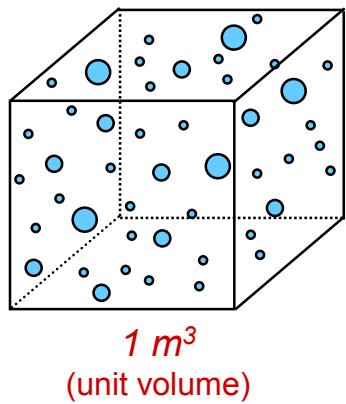
**Bulk:**

$$N(D) = N_0 D^\alpha e^{-\lambda D}$$



# Approaches to parameterize cloud microphysics

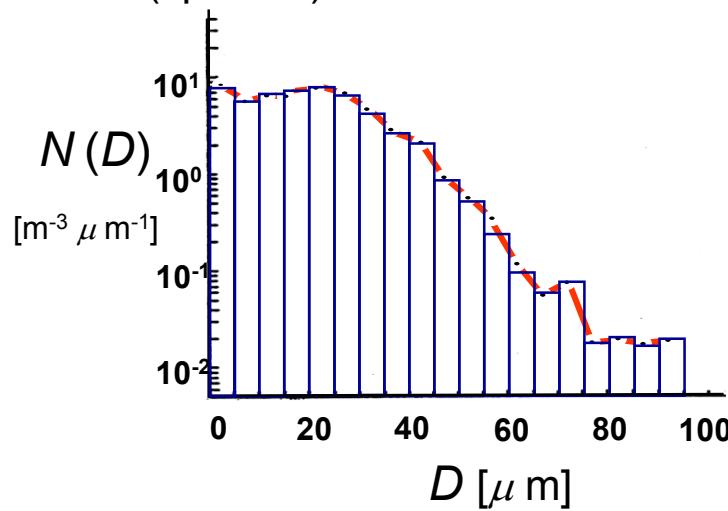
**ULTIMATE GOAL:** Predict evolution of hydrometeor size distributions



Note: microphysics schemes assume grid-scale homogeneity

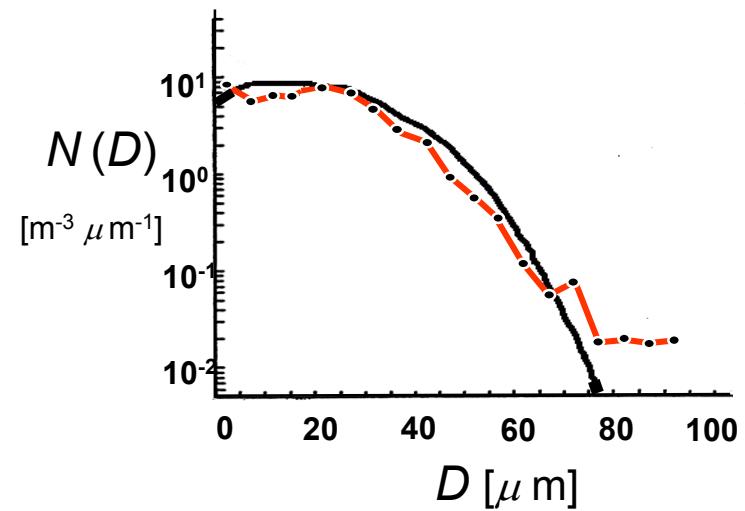
**Bin-resolving:**  
(spectral)

$$N(D) = \sum_{i=1}^I N_i$$

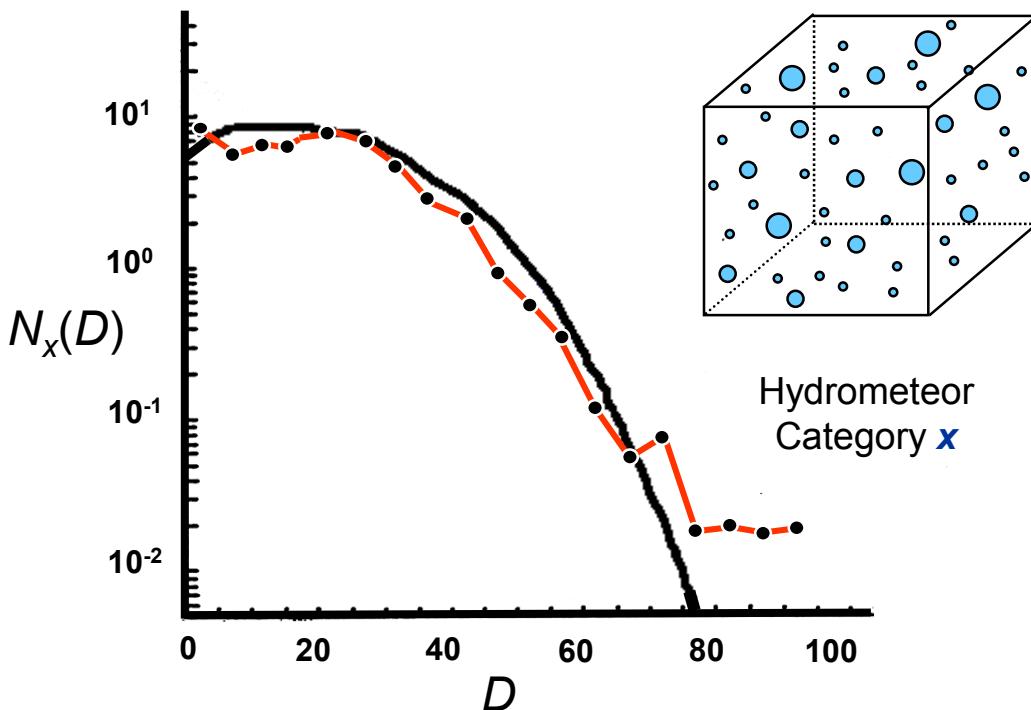


**Bulk:**

$$N(D) = N_0 D^\alpha e^{-\lambda D}$$



# BULK METHOD



**Size Distribution Function:**

$$N_x(D) = N_{0x} D^{\alpha_x} e^{-\lambda_x D}$$

**3<sup>rd</sup>, 0<sup>th</sup>, 6<sup>th</sup> MOMENTS:**

**Mass mixing ratio,  $q_x$**

$$q_x \equiv \frac{\pi \rho_x}{6\rho} \int_0^\infty D^3 N_x(D) dD = \frac{\pi \rho_x}{6\rho} M_x(3)$$

**Total number concentration,  $N_{Tx}$**

$$N_{Tx} \equiv \int_0^\infty N_x(D) dD = M_x(0)$$

**Radar reflectivity factor,  $Z_x$**

$$Z_x \equiv \int_0^\infty D^6 N_x(D) dD = M_x(6)$$

(assuming spheres)

**$p^{\text{th}}$  moment:**

$$M_x(p) \equiv \int_0^\infty D^p N_x(D) dD = N_{0x} \frac{\Gamma(1 + \alpha_x + p)}{\lambda_x^{p+1+\alpha_x}}$$

# BULK METHOD

Predict changes to specific moment(s)

e.g.  $q_x$ ,  $N_{Tx}$ , ...



Implies changes to values of parameters

i.e.  $N_{0x}$ ,  $\lambda_x$ , ...

**Size Distribution Function:**

$$N_x(D) = N_{0x} D^{\alpha_x} e^{-\lambda_x D}$$

**3<sup>rd</sup>, 0<sup>th</sup>, 6<sup>th</sup> MOMENTS:**

**Mass mixing ratio,  $q_x$**

$$q_x \equiv \frac{\pi \rho_x}{6\rho} \int_0^\infty D^3 N_x(D) dD = \frac{\pi \rho_x}{6\rho} M_x(3)$$

**Total number concentration,  $N_{Tx}$**

$$N_{Tx} \equiv \int_0^\infty N_x(D) dD = M_x(0)$$

**Radar reflectivity factor,  $Z_x$**

$$Z_x \equiv \int_0^\infty D^6 N_x(D) dD = M_x(6)$$

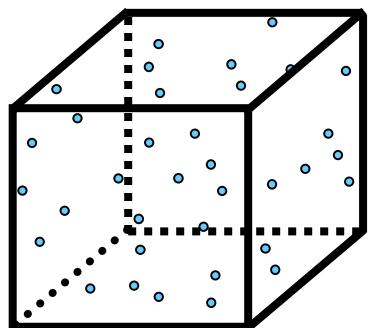
**p<sup>th</sup> moment:**

$$M_x(p) \equiv \int_0^\infty D^p N_x(D) dD = N_{0x} \frac{\Gamma(1 + \alpha_x + p)}{\lambda_x^{p+1+\alpha_x}}$$

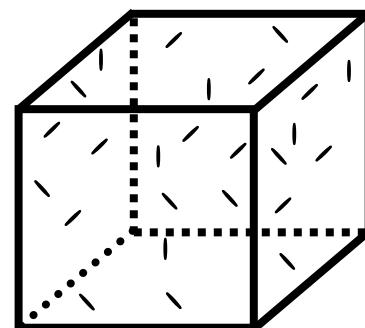
# BULK METHOD

## Traditional Approach: PARTITIONING HYDROMETEORS INTO CATEGORIES

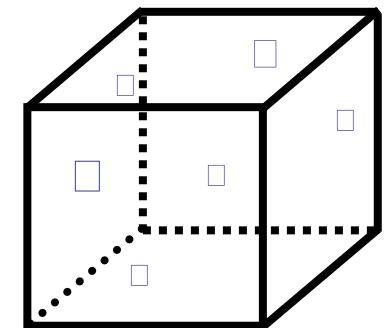
CLOUD



ICE



SNOW

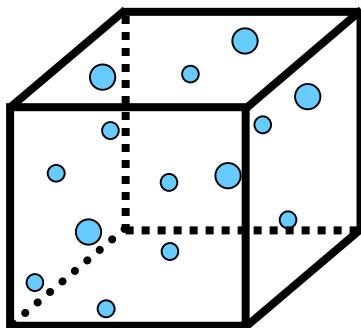


$$N_c(D) = N_{0c} D^{\alpha_c} e^{-\lambda_c D}$$

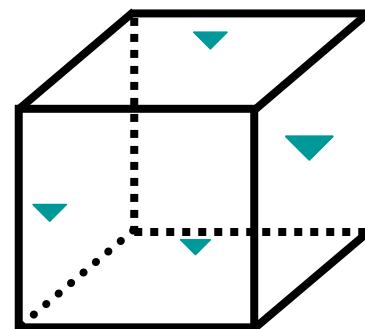
$$N_i(D) = N_{0i} D^{\alpha_i} e^{-\lambda_i D}$$

$$N_s(D) = N_{0s} D^{\alpha_s} e^{-\lambda_s D}$$

RAIN



GRAUPEL

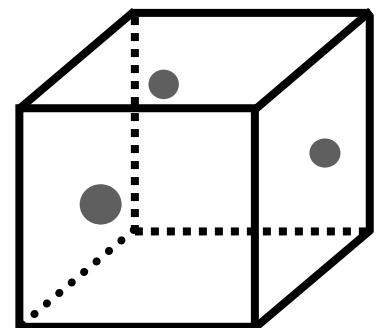


$$N_r(D) = N_{0r} D^{\alpha_r} e^{-\lambda_r D}$$

$$N_g(D) = N_{0g} D^{\alpha_g} e^{-\lambda_g D}$$

$$N_h(D) = N_{0h} D^{\alpha_h} e^{-\lambda_h D}$$

HAIL



## **BULK METHOD**

### **Advantages of 2-moment:**

More flexible representation of size distributions

→ Better calculation of process rates

→ Better representation of sedimentation

(can represent the effects of gravitational size sorting)

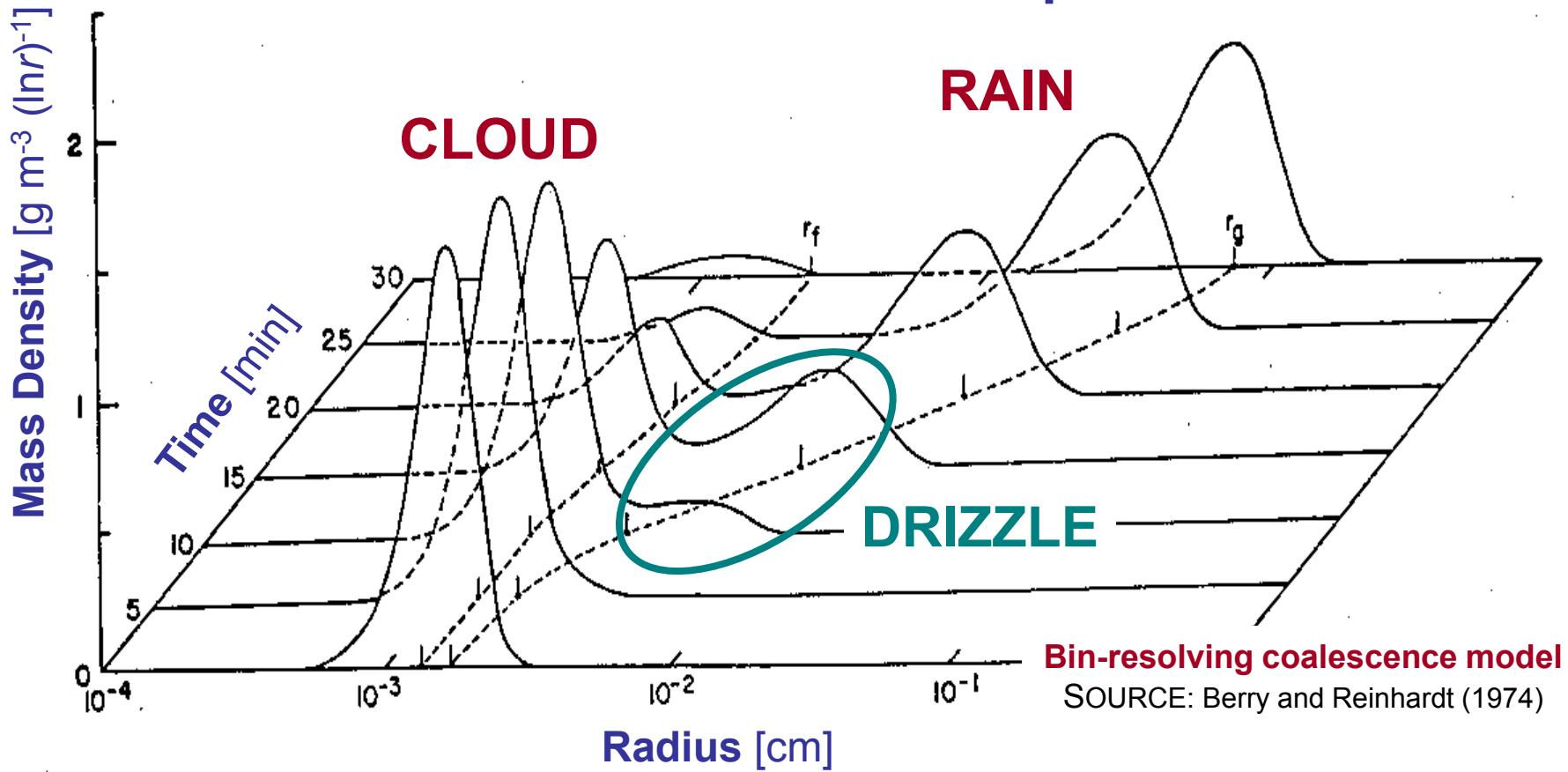
### **Advantages of 3-moment:**

Independent representation of spectral dispersion – even better representation of size distributions

→ Better process rates

→ Controls excessive size sorting inherent in 2-moment schemes

# The warm-rain coalescence process



## Partitioning of Coalescence Processes:

- Autoconversion (*cloud to rain*)
- Accretion (*rain collecting cloud*)
- Self-collection (*rain collecting rain*) → *multi-moment only*

# The warm-rain coalescence process

Stochastic collection equation:

$$QCL_{yx} = \frac{1}{\rho} \frac{\pi}{4} \int_0^\infty \int_0^\infty |V_x(D_x) - V_y(D_y)| (D_x + D_y)^2 m_y(D_y) E(x, y) N_y(D_y) N_x(D_x) dD_y dD_x$$

$$N_y CL_{yx} = -\frac{\pi}{4} \int_0^\infty \int_0^\infty |V_x(D_x) - V_y(D_y)| (D_x + D_y)^2 E(x, y) N_y(D_y) N_x(D_x) dD_y dD_x$$

Using the Long (1974) collection kernel and complete gamma functions, these can be solved analytically:

$$QCL_{yx} = \frac{c_y}{\rho} \frac{\pi}{4} E_{xy} \Delta \bar{V} \frac{N_{Tx} N_{Ty}}{\Gamma(1+\alpha_x) \Gamma(1+\alpha_y)} \left[ \frac{\Gamma(3+\alpha_x) \Gamma(4+\alpha_y)}{\lambda_x^2 \lambda_y^3} + \frac{2\Gamma(2+\alpha_x) \Gamma(5+\alpha_y)}{\lambda_x \lambda_y^4} + \frac{\Gamma(1+\alpha_x) \Gamma(6+\alpha_y)}{\lambda_y^5} \right]$$

$$NCL_{yx} = \frac{\pi}{4} E_{xy} \Delta \bar{V} \frac{N_{Tx} N_{Ty}}{\Gamma(1+\alpha_x) \Gamma(1+\alpha_y)} \left[ \frac{\Gamma(3+\alpha_x) \Gamma(1+\alpha_y)}{\lambda_x^2} + \frac{2\Gamma(2+\alpha_x) \Gamma(2+\alpha_y)}{\lambda_x \lambda_y} + \frac{\Gamma(1+\alpha_x) \Gamma(3+\alpha_y)}{\lambda_y^2} \right]$$

Thus:

**CLOUD**

$$dq_c/dt = - QCN_{cr} - QCL_{cr}$$

$$dN_c/dt = - NCN_{cr} - NCL_{cr}$$

**RAIN**

$$dq_r/dt = QCN_{cr} + NCL_{cr}$$

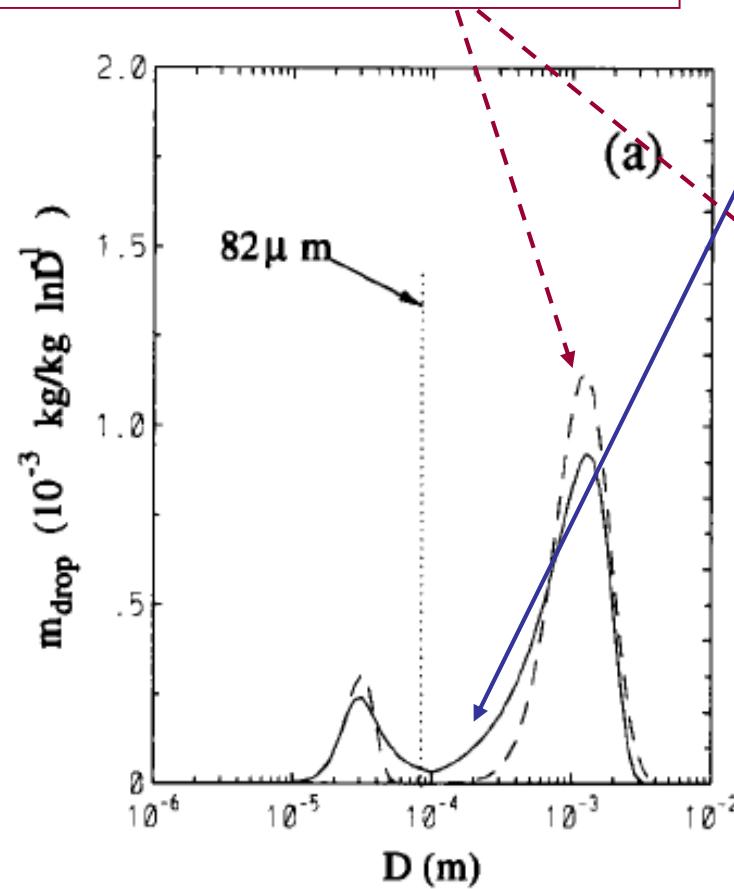
$$dN_r/dt = NCN_{cr} - NCL_{rr}$$

*accretion*

*autoconversion      self-collection*

**Autoconversion** is based on an empirical formulation of a bin model solution (Berry and Reinhardt, 1974)

## 2-moment BULK model solution



## BIN model reference solution

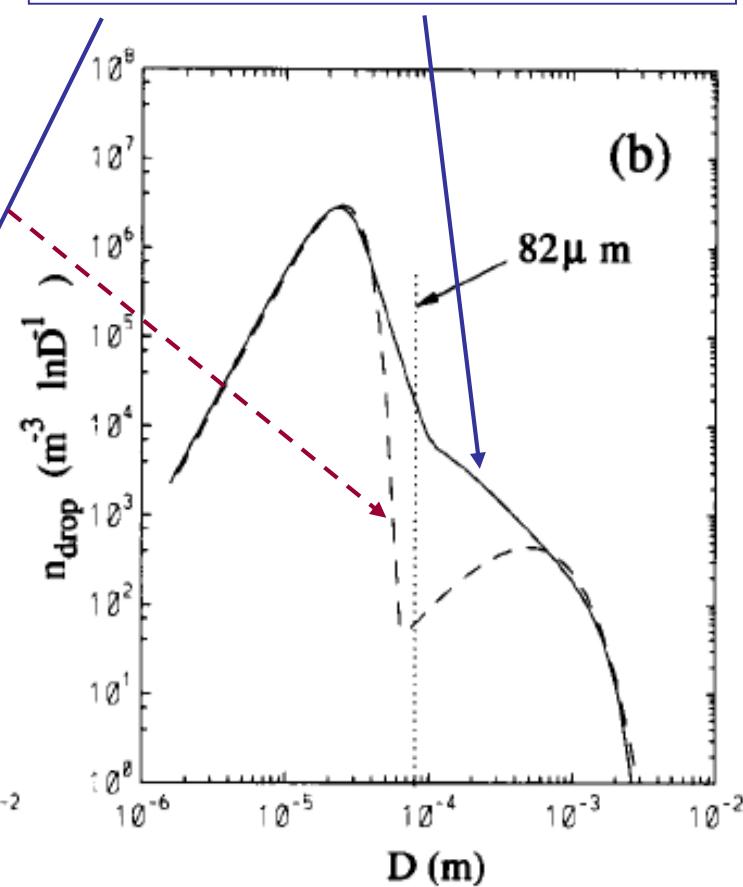


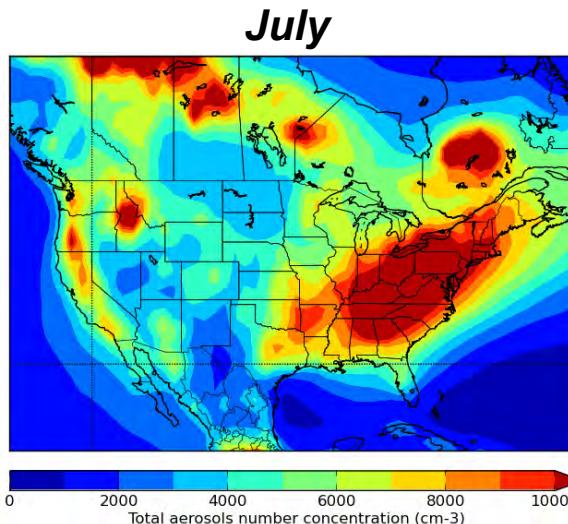
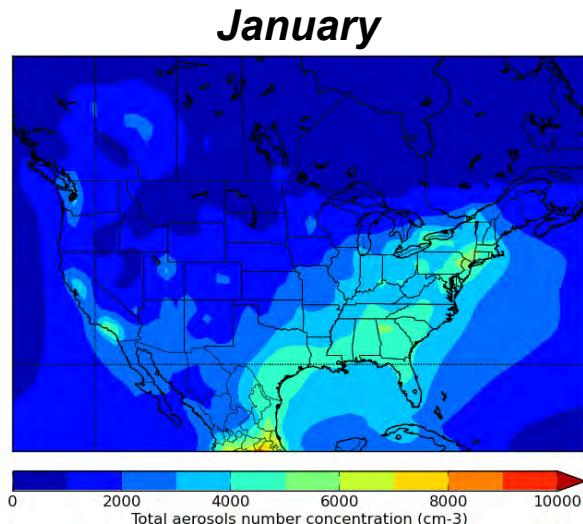
Figure 1. Representative distributions of (a) liquid-water mass and (b) number concentration, resulting from the discrete bin integration of Eq. (13) (solid lines) and resulting from the parametrization set out in section 3(c) with two generalized gamma functions (dashed lines). Initial experimental conditions:  $r_c = 1.5 \times 10^{-3} \text{ kg kg}^{-1}$ ,  $D_c = 24 \mu\text{m}$ ,  $v_c = 1$  and  $\alpha_c = 3$  (see appendix D). Plots are made after 1200 s of integration.

Source: Cohard and Pinty (2000a)

# Initial input aerosol

- Combination of **primary aerosol sources**: Sulfates, organic carbon and sea salts.
- 3-D monthly climatology** from GOCART\* model with  $0.5^\circ(\text{lon}) \times 1.25^\circ(\text{lat})$  grid spacing from 2001-2007.
- Mass converted to number concentration by assuming log-normal distributions.

Source: *Thompson and Eidhammer, 2014*



$\sim 1000 \text{ to } 10\,000 \text{ cm}^{-3}$

\*Georgia Institute of Technology  
Goddard Global Ozone  
Chemistry Aerosol Radiation  
and Transport model

**Aerosols monthly climatology at model level near the surface**

# Nucleation of Cloud Droplets ( $NU_{vc}$ )

- Implementation of *Abdul-Razzak & Ghan (2002)* activation scheme.
- From the Köhler theory, the parameterization establishes a relationship between  $S_{max}$  reached in updraft and an critical supersaturation ( $S_m$ ) for the mode radius of mode  $m$ :

$$S_{max}^2 = 1 \left/ \left( \frac{1}{S_m^2} f_m \zeta \frac{\partial}{\partial h_m} + g_m \frac{S_m^2}{h_m + 3\zeta} \right) \right.$$

$\zeta$  and  $\eta$  are two non-dimensional parameters dependant on vertical velocity, growth coefficient (accounting for diffusion of heat and moisture to particles), surface tension, etc.  $S_m$  depends on size, hygroscopicity and surface tension characteristics of the particles.  $f_m$  and  $g_m$  depends on the geometric standard deviation of mode  $m$ .

- Activated aerosols concentration:  $N_{act} = \frac{1}{2} \sum_m N_{aero} [1 - erf(z_m)] z_m \circ 2 \frac{\ln(S_m/S_{max})}{3\sqrt{2} \ln S_m}$

# Nucleation of Cloud Droplets ( $NU_{vc}$ )

- Implementation of *Abdul-Razzak & Ghan (2002)* activation scheme.
- From the Köhler theory, the parameterization establishes a relationship between  $S_{max}$  reached in updraft and an critical supersaturation ( $S_m$ ) for the mode radius of mode  $m$ :

$$S_{max}^2 = \frac{1}{\left( \frac{1}{S_m^2} + f_m \frac{z^{3/2}}{h_m} + g_m \frac{S_m^2}{h_m + 3z} \right)^{1/4}}$$

## Activation depends on:

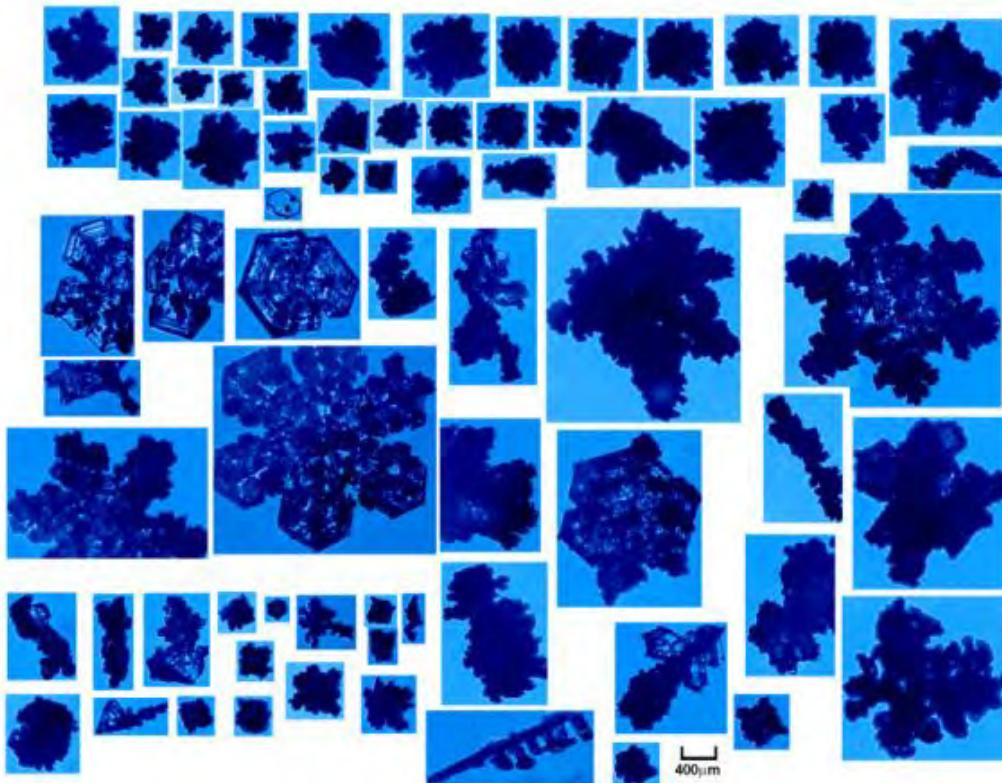
- aerosol concentration,  $N_{aero}$
- aerosols mean radius,  $r_{aero}$
- aerosol hygroscopicity,  $kappa$
- aerosol size distribution,  $\sigma$
- updraft velocity,  $w$
- temperature and pressure,  $T, p$

## Implementation details:

- grid-scale vertical velocity
- one aerosol mode/type
- $kappa = 0.4$
- $\sigma = 1.8$
- $r_{aero} = 0.04 \mu m$
- $N_{aero}$ : **3-D monthly climatology**

# Ice Phase

Observed crystals:



- Complex shapes, densities, etc.
  - growth/decay processes include:  
deposition/sublimation, riming  
(wet/dry growth), ice multiplication, aggregation, gradual melting, shedding, ...
- Difficult to represent simply

# *Ice Phase*

## **Traditional bulk approach: Partition into representative categories**

with prescribed bulk physical properties

- bulk density
  - shape
  - fall speed-diameter ( $V-D$ ) relations
  - etc.
- } mass-diameter ( $m-D$ ) relations

e.g.



### ***CLOUD “ICE”***

$$\rho_s = 500 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_s)D^3$$

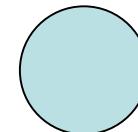
$$V = a_i D^{bi}$$

### ***“SNOW”***

$$\rho_s = 100 \text{ kg m}^{-3}$$

$$m = cD^2$$

$$V = a_s D^{bs}$$

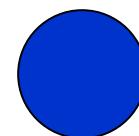


### ***GRAUPEL***

$$\rho_g = 400 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_g)D^3$$

$$V = a_g D^{bg}$$



### ***HAIL***

$$\rho_h = 900 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_h)D^3$$

$$V = a_h D^{bh}$$

# *Ice Phase*

**Traditional bulk approach:**

**Problems with pre-defined categories:**

1. Real ice particles have complex shapes
2. Conversion between categories is ad-hoc and leads to large, discrete changes in particle properties
3. Physics applied is often inconsistent



**CLOUD “ICE”**

$$\rho_s = 500 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_s)D^3$$

$$V = a_i D^{bi}$$

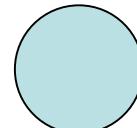


**“SNOW”**

$$\rho_s = 100 \text{ kg m}^{-3}$$

$$m = cD^2$$

$$V = a_s D^{bs}$$

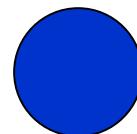


**GRAUPEL**

$$\rho_g = 400 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_g)D^3$$

$$V = a_g D^{bg}$$



**HAIL**

$$\rho_h = 900 \text{ kg m}^{-3}$$

$$m = (\pi/6 \rho_h)D^3$$

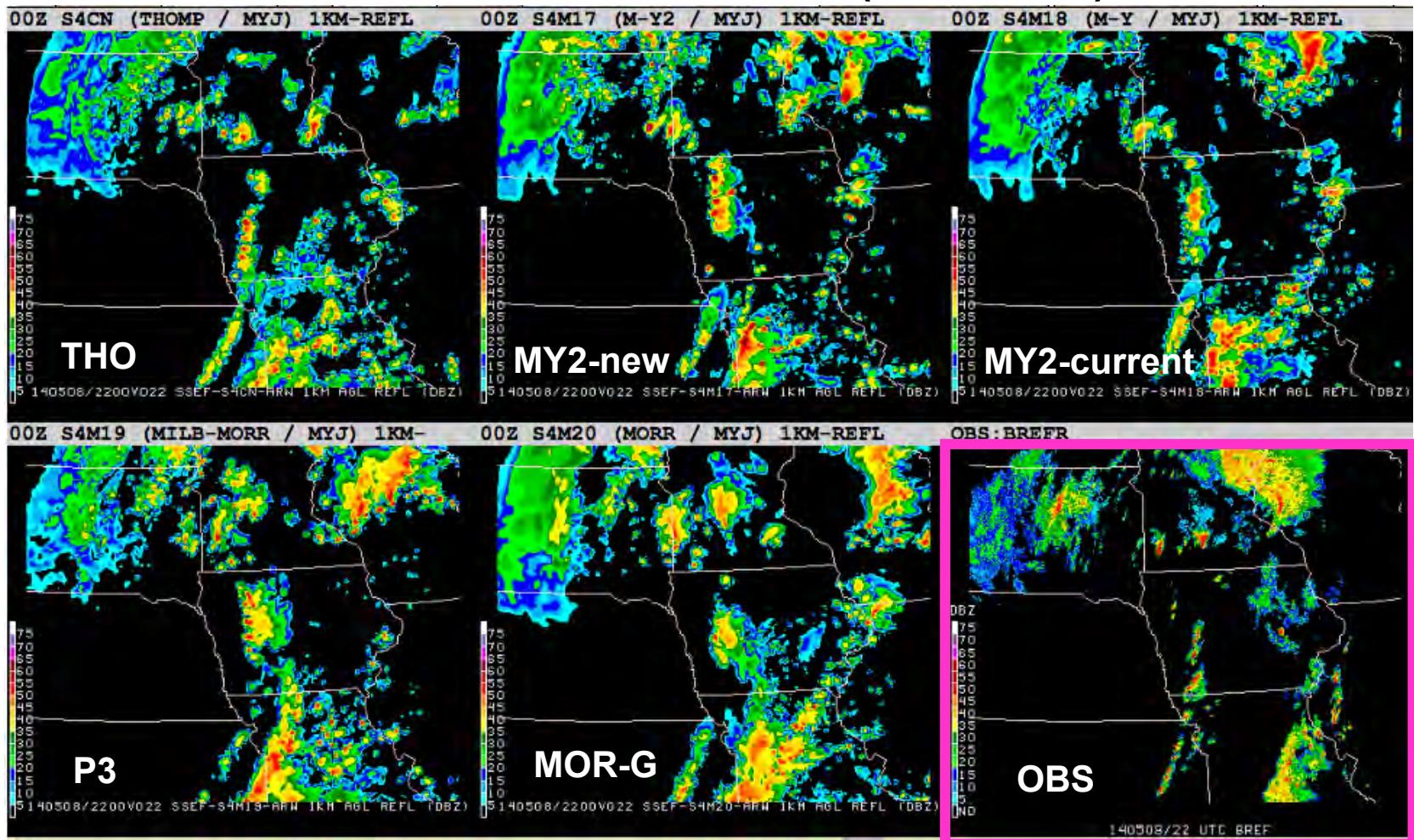
$$V = a_h D^{bh}$$



← abrupt /  
unphysical  
conversions

NOTE: *Bin microphysics schemes have the identical problem*

## 2014 OU CAPS Ensemble (4-km WRF)\*

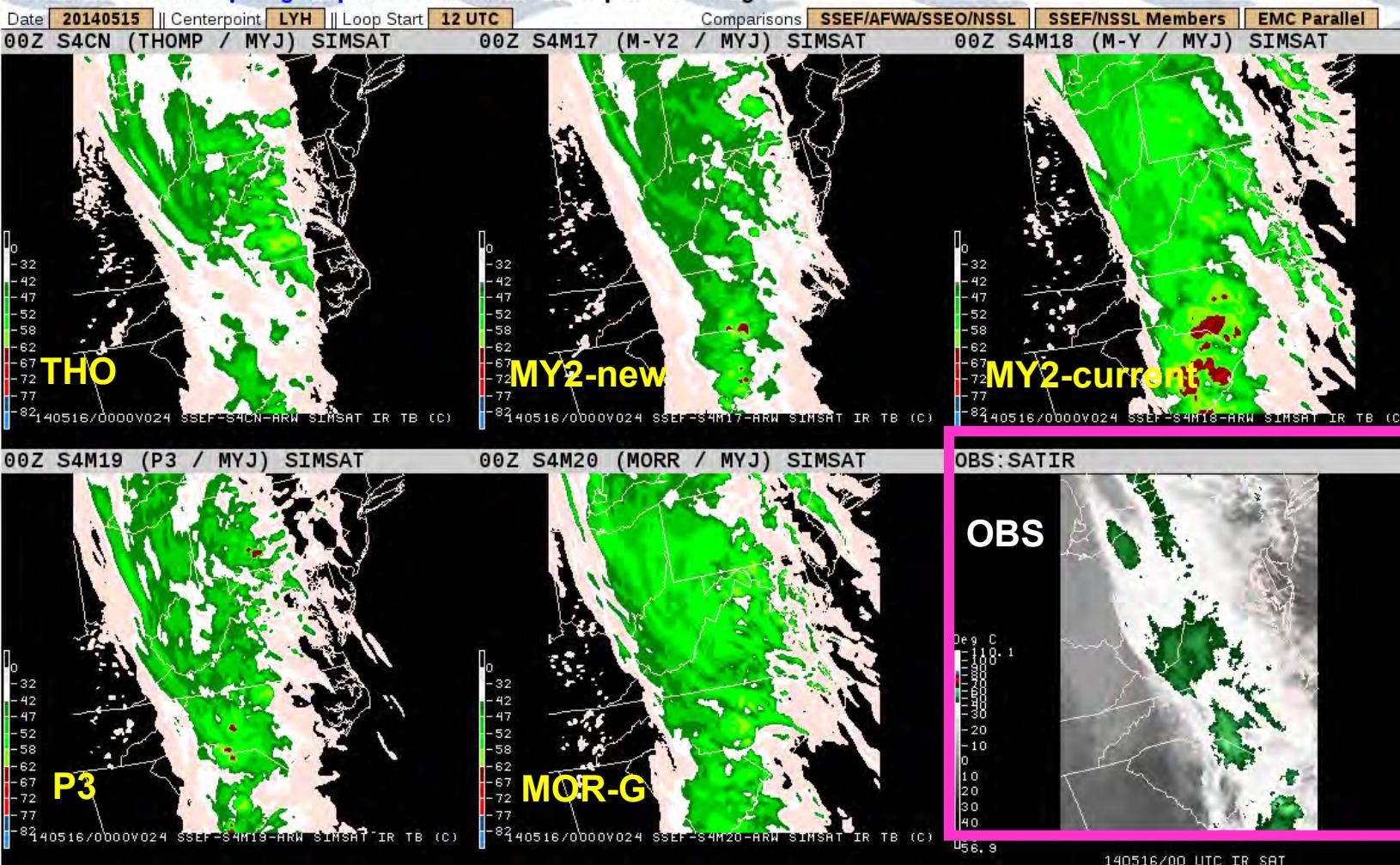


22-h FCST, 1-km Reflectivity, 22 UTC 8 May, 2014

\* c/o Fanyou Kong

## 2014 OU CAPS Ensemble (4-km WRF)\*

NSSL/SPC 2014 Spring Experiment Model Comparison Page

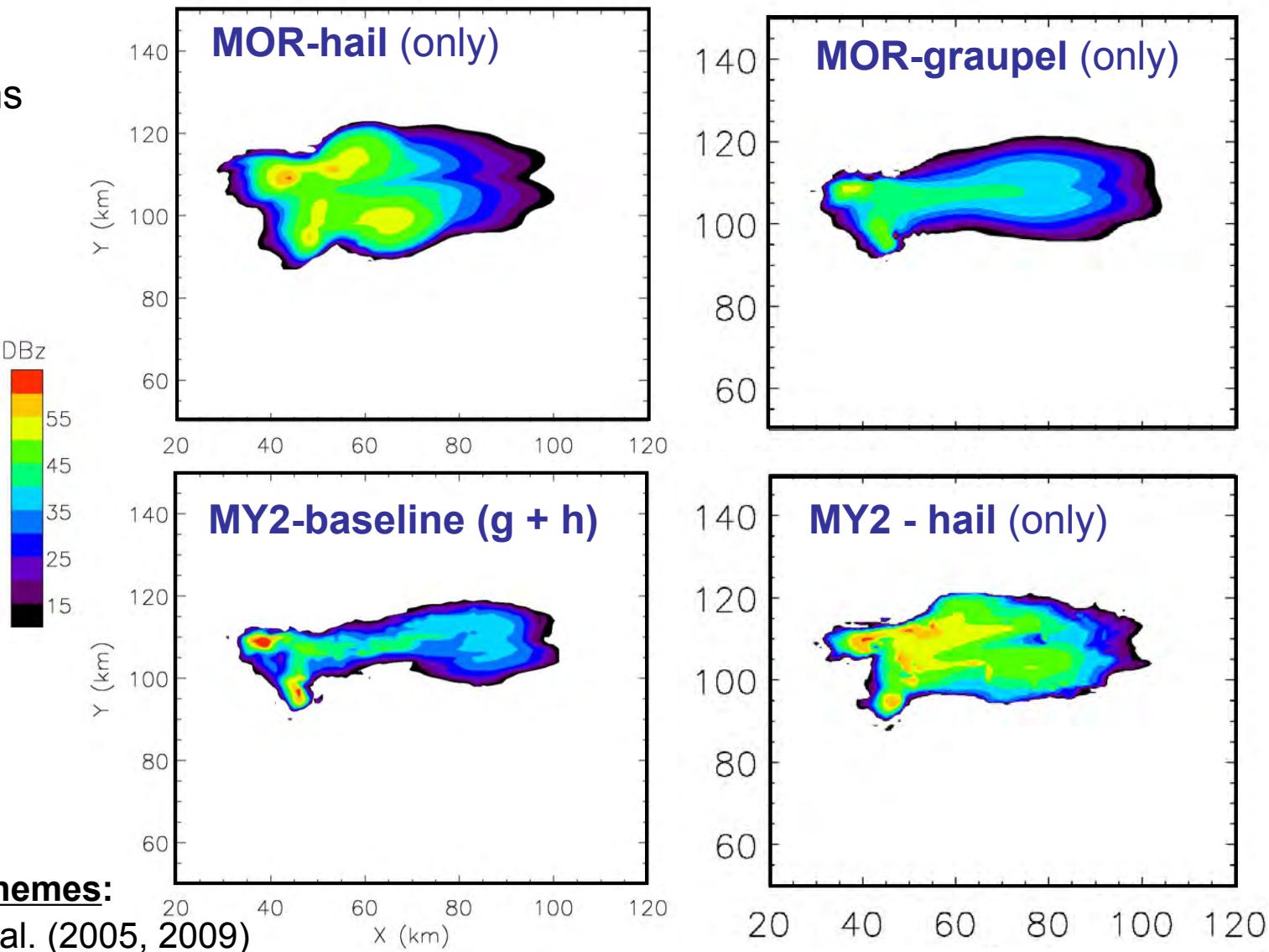


Simulated 10.7 MICRON Brightness Temperatures

\* c/o Fanyou Kong

# The simulation of ice-containing cloud systems is often very sensitive to how ice is partitioned among categories

- idealized 1-km WRF simulations (em\_quarter\_ss)
- base reflectivity



## Microphysics Schemes:

**MOR**: Morrison et al. (2005, 2009)

**MY2**: Milbrandt and Yau (2005)

Morrison and Milbrandt (2011), MWR

## **CURRENT TREND:**

**There is a paradigm shift in the way ice-phase microphysics is represented**

→ Moving away from increased number of pre-defined categories; towards emphasis on physical properties of ice

e.g.:

- 2-moment: more info on mean-particle size
- 3-moment: info on *spectral dispersion* of size distribution
- graupel *density*: better fall speeds, etc.
- axis ratio

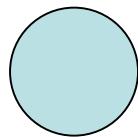
# Ice Phase

## TRADITIONAL:



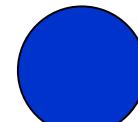
**SNOW**

$$\rho_s = f(D_s)$$
$$V = a_s D^{bs}$$



**GRAUPEL**

$$\rho_g = 400 \text{ kg m}^{-3}$$
$$V = a_g D^{bg}$$



**HAIL**

$$\rho_h = 900 \text{ kg m}^{-3}$$
$$V = a_h D^{bh}$$



← *abrupt / unphysical conversions*

## MODIFICATION:\*



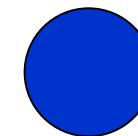
**SNOW**

$$\rho_s = f(D_s)$$
$$V = a_s D^{bs}$$



**GRAUPEL**

$$\rho_g \text{ is predicted } *$$
$$V = a_g(\rho_g) D^{bg(\rho_g)}$$



**HAIL**

$$\rho_h = 900 \text{ kg m}^{-3}$$
$$V = a_h D^{bh}$$



← *smooth conversions*

**$Q_s, N_s$**

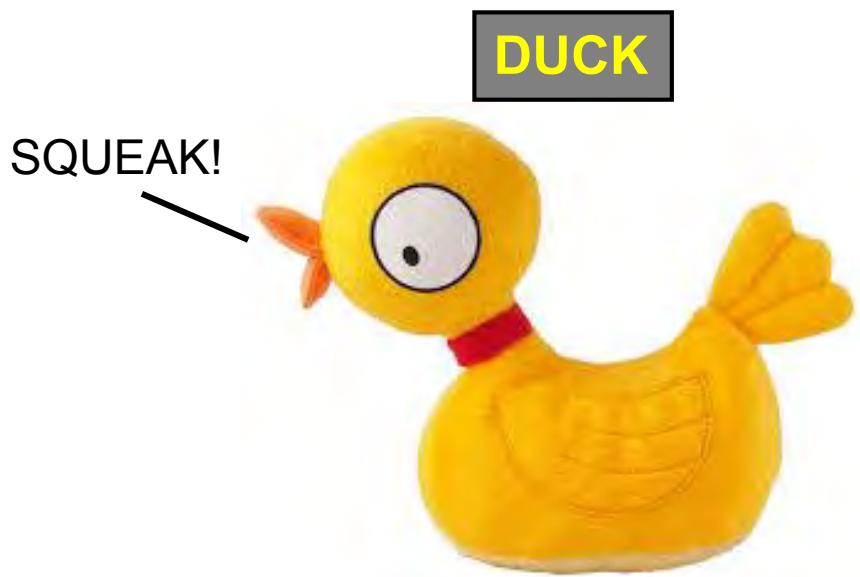
**$Qg, Ng, Bg$**

**$Qh, Nh$**

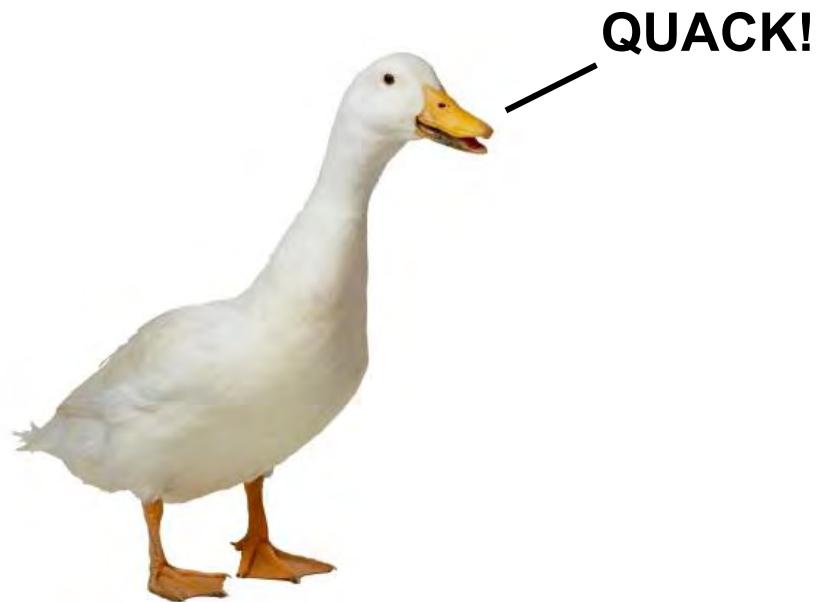
**Partial mitigation to the problems with pre-defined categories**

\* Milbrandt and Morrison (2013), JAS

# Which of the following is more duck-like?



- has a label that says “DUCK”
- big, round eyes
- plastic exterior, hollow interior
- yellow, wing-like appendages
- no feet
- makes a “squeak” noise



- has no label
- small, round eyes
- feathery exterior, meaty interior
- white, wing-like appendages
- webbed feet
- makes a “quack” noise

***IF IT QUACKS LIKE A DUCK ...***

**Which of the following is more duck-like?**

# *New Bulk Microphysics Parameterization: Predicted Particle Properties (P3)\**

*Based on a conceptually different approach to  
parameterize ice-phase microphysics.*

## NEW CONCEPT

**“free” category** – predicted properties, thus freely evolving type

**“fixed” category** – traditional; prescribed properties, predetermined type

## Compared to traditional (ice-phase) schemes, P3:

- avoids some necessary evils (ad-hoc category conversion, fixed properties)
- has self-consistent physics
- is better linked to observations
- is more computationally efficient

\* Morrison and Milbrandt (2015)  
[P3, part 1] *J. Atmos. Sci.*

## Prognostic Variables: (adverted)

**LIQUID PHASE:** 2 categories, 2-moment:

$Q_c$  – cloud mass mixing ratio [kg kg<sup>-1</sup>]

$Q_r$  – rain mass mixing ratio [kg kg<sup>-1</sup>]

$N_c$  – cloud number mixing ratio [#kg<sup>-1</sup>]

$N_r$  – rain number mixing ratio [#kg<sup>-1</sup>]

**ICE PHASE:**  $nCat$  categories, 4 prognostic variables each:

$Q_{dep}(n)$  – deposition ice mass mixing ratio [kg kg<sup>-1</sup>]

$Q_{rim}(n)$  – rime ice mass mixing ratio [kg kg<sup>-1</sup>]

$N_{tot}(n)$  – total ice number mixing ratio [# kg<sup>-1</sup>]

$B_{rim}(n)$  – rime ice volume mixing ratio [m<sup>3</sup> kg<sup>-1</sup>]

# Overview of P3 Scheme

A given (*free*) category can represent any type of ice-phase hydrometeor

## **Prognostic Variables:**

$Q_{dep}$ – deposition ice mass mixing ratio	[kg kg <sup>-1</sup> ]
$Q_{rim}$ – rime ice mass mixing ratio	[kg kg <sup>-1</sup> ]
$N_{tot}$ – total ice number mixing ratio	[# kg <sup>-1</sup> ]
$B_{rim}$ – rime ice volume mixing ratio	[m <sup>3</sup> kg <sup>-1</sup> ]

## **Predicted Properties:**

$F_{rim}$ – rime mass fraction, $F_{rim} = Q_{rim} / (Q_{rim} + Q_{dep})$	[--]
$\rho_{rim}$ – rime density, $\rho_{rim} = Q_{rim} / B_{rim}$	[kg m <sup>-3</sup> ]
$D_m$ – mean-mass diameter, $D_m \propto Q_{tot} / N_{tot}$	[m]
$V_m$ – mass-weighted fall speed, $V_m = f(D_m, \rho_{rim}, F_{rim})$	[m s <sup>-1</sup> ]

etc.

## **Diagnostic Particle Types:**

Based on the predicted properties (rather than pre-defined)

## **Predicting microphysical process rates ~ computing $M_x^{(p)}$**

### **P3 SCHEME**

$$M^{(p)} \equiv \int_0^\infty D^p N_x(D) dD = N_{0x} \frac{\Gamma(1 + \mu_x + p)}{\lambda_x^{p+1+\mu_x}}$$

**Fixed category**  $\Rightarrow$  constant  $m$ - $D$ ,  $A$ - $D$ ,  $V$ - $D$  parameters

**Free category**  $\Rightarrow$  variable  $m$ - $D$ ,  $A$ - $D$ ,  $V$ - $D$  parameters

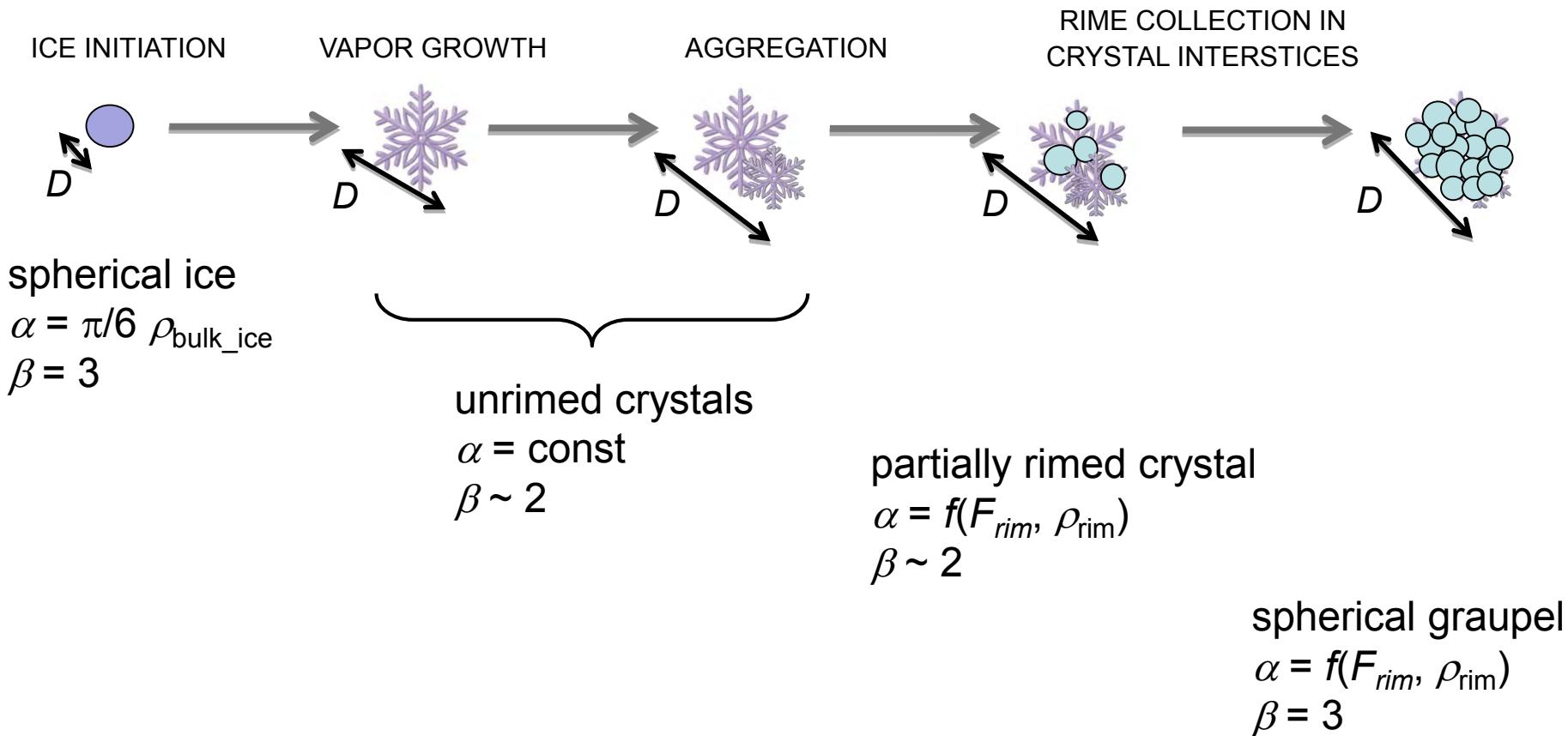
$$Q = \frac{1}{\rho} \int_0^\infty m(D) N(D) dD = \frac{1}{\rho} \int_0^\infty \alpha D^\beta N_x(D) dD = \frac{\alpha}{\rho} M^{(\beta)} = \frac{\alpha}{\rho} N_{0x} \frac{\Gamma(1 + \mu_x + \beta)}{\lambda_x^{1+\mu_x+\beta}}$$

$\rightarrow$  cannot compute moments analytically, lookup table approach is used in P3

## Predicting process rates ~ computing $M_x^{(p)}$

**P3 SCHEME – Determining  $m(D) = \alpha D^\beta$  for regions of  $D$ :**

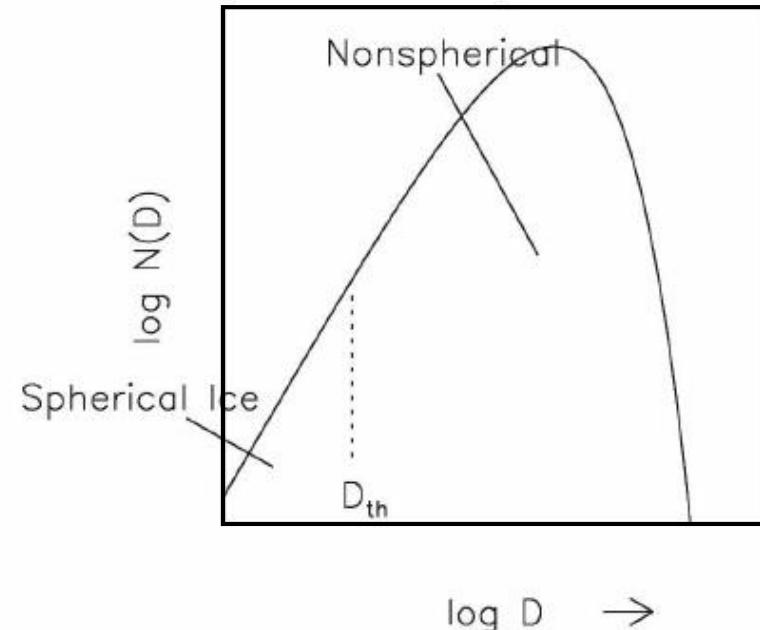
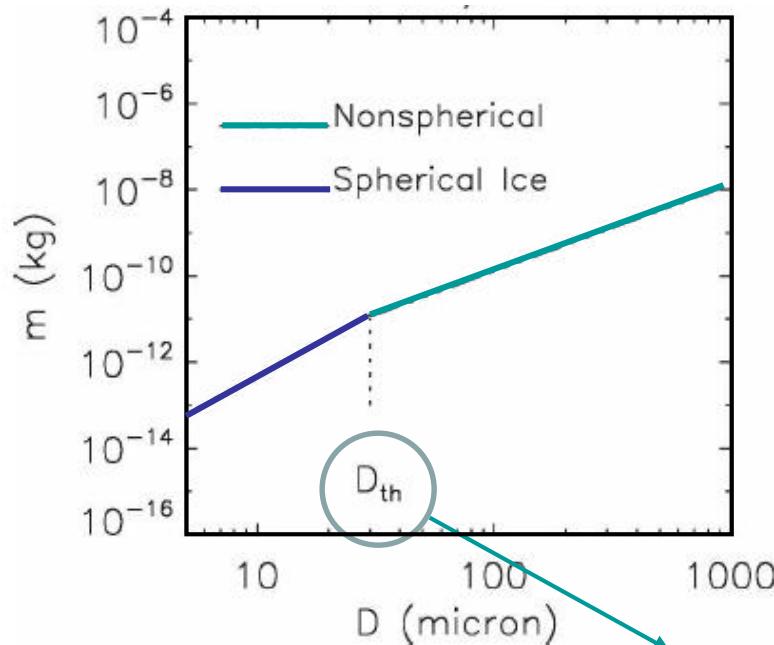
Conceptual model of particle growth following Heymsfield (1982):



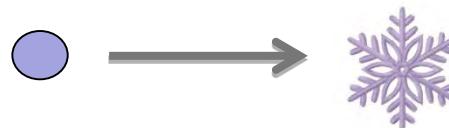
## Predicting process rates ~ computing $M_x^{(p)}$

### P3 SCHEME – Determining $m(D) = \alpha D^\beta$ for regions of $D$ :

e.g.  $F_{rim} = 0$



conceptual model + algebraic derivation



spherical ice

$$\alpha_1 = \pi/6 \rho_{\text{bulk\_ice}}$$

$$\beta_1 = 3$$

unrimmed, non-spherical crystals

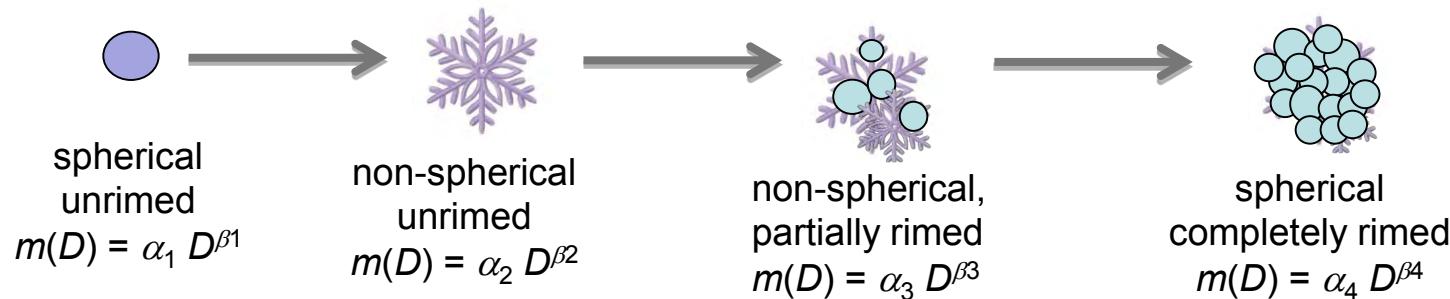
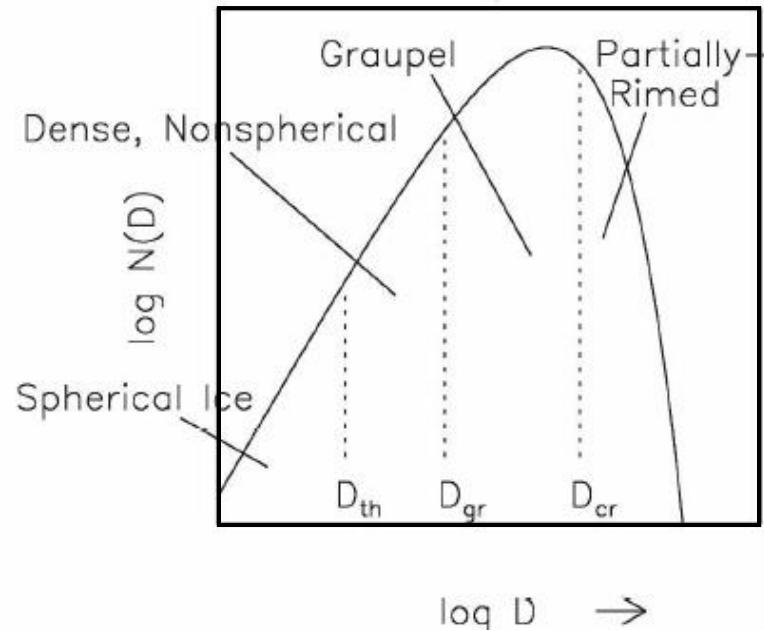
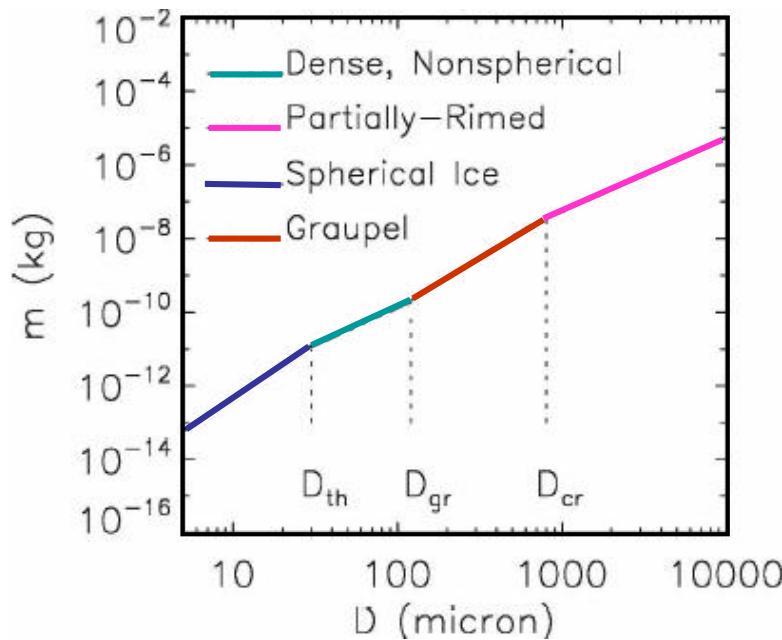
$$\left. \begin{array}{l} \alpha_2 = \text{const} \\ \beta_2 \sim 2 \end{array} \right\}$$

based on observed crystals

## Predicting process rates ~ computing $M_x^{(p)}$

### P3 SCHEME – Determining $m(D) = \alpha D^\beta$ for regions of $D$ :

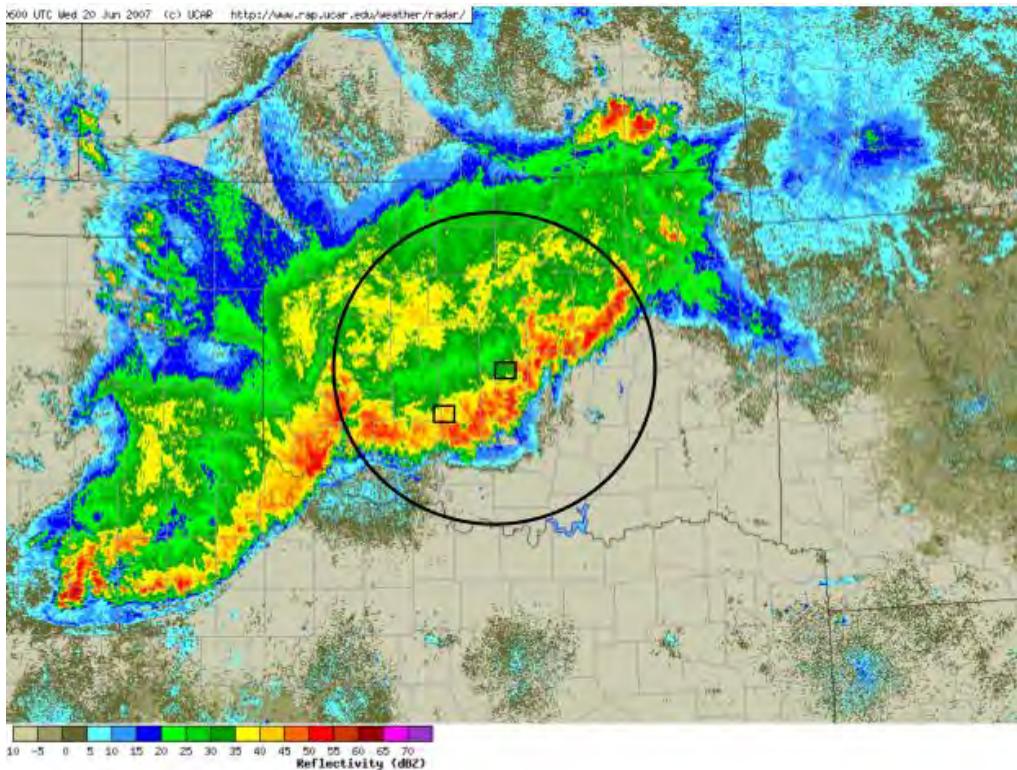
e.g.  $1 > F_{\text{rim}} > 0$ ; for a given  $\rho_{\text{rim}}$



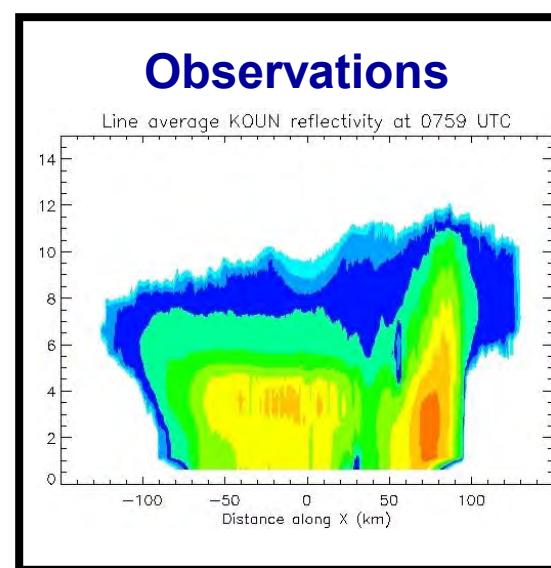
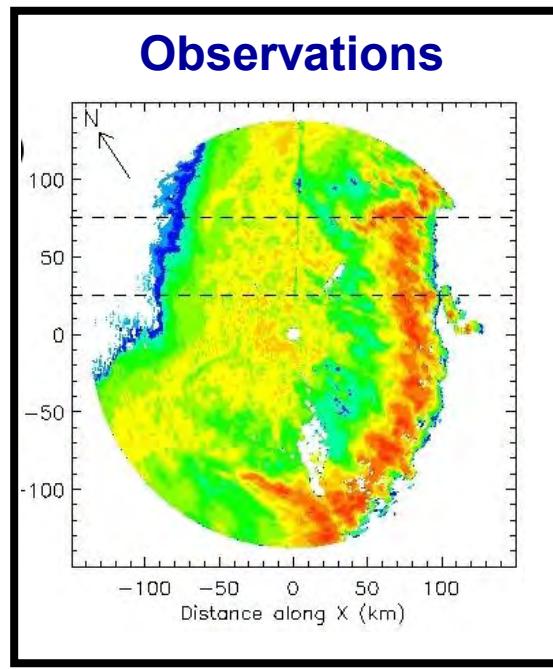
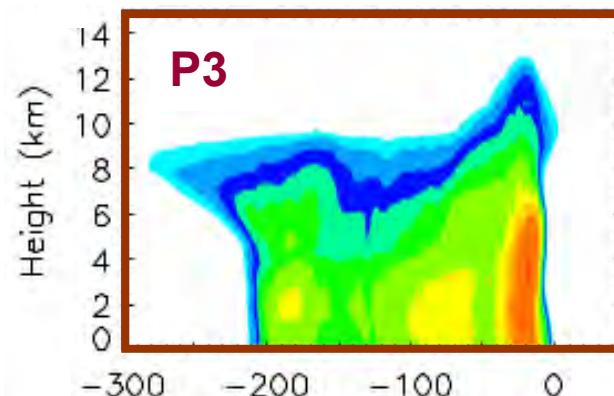
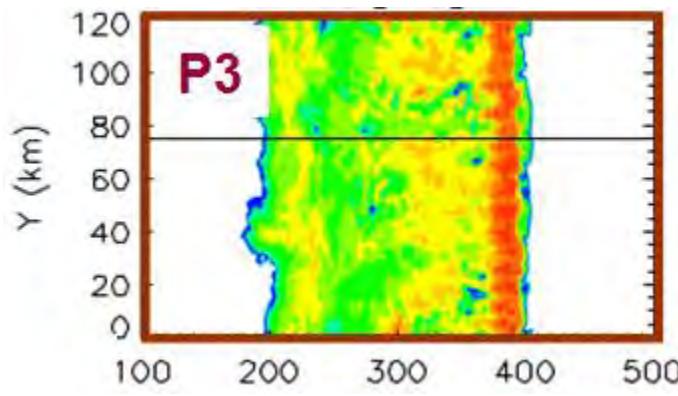
# 3D Squall Line case:

## (June 20, 2007 central Oklahoma)

- WRF\_v3.4.1,  $\Delta x = 1$  km,  $\Delta z \sim 250\text{-}300$  m,  $112 \times 612 \times 24$  km domain
- initial sounding from observations
- convection initiated by  $u$ -convergence
- no radiation, surface fluxes



# 1-km WRF Simulations with P3 microphysics (1 category):

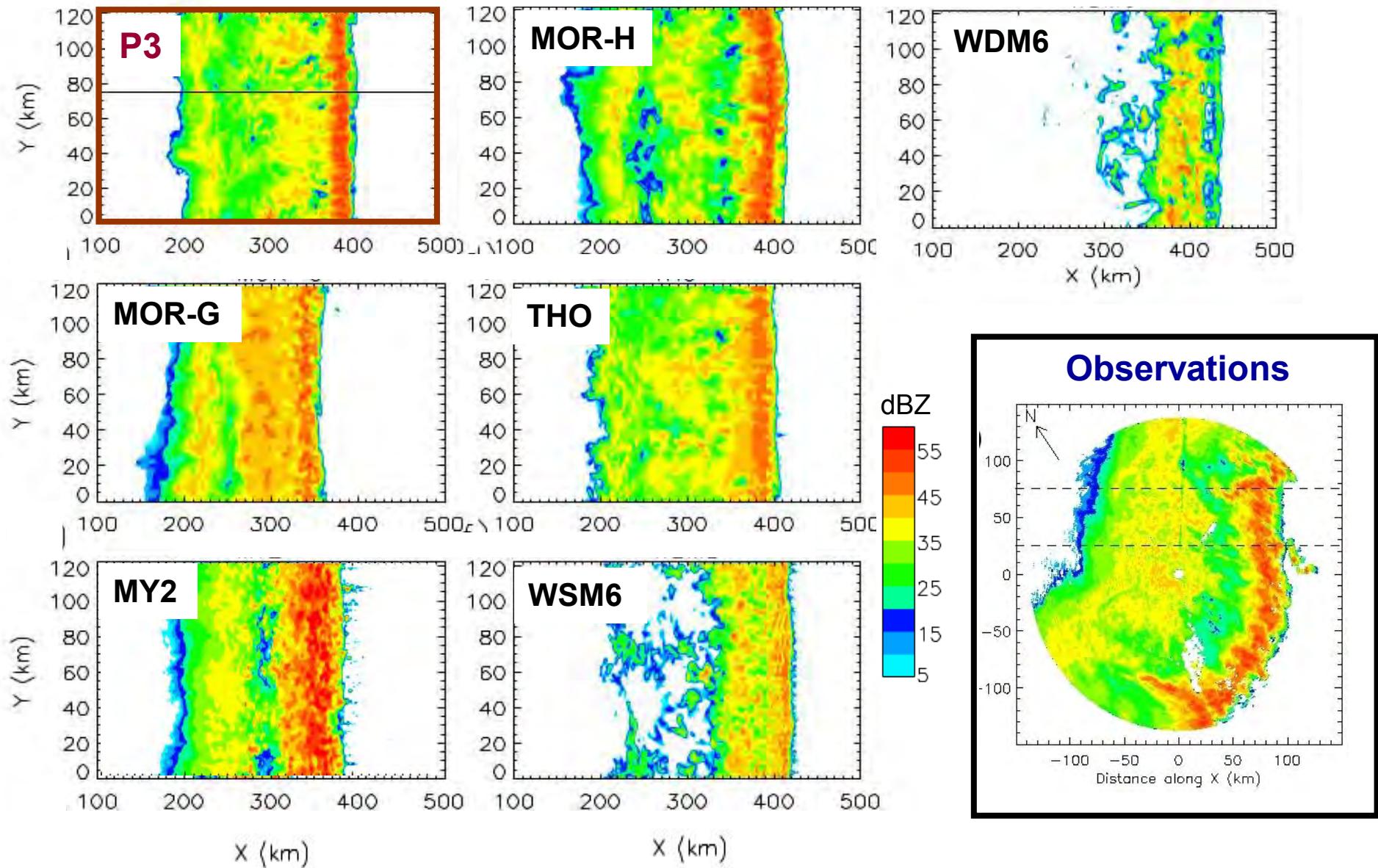


Reflectivity

dBZ

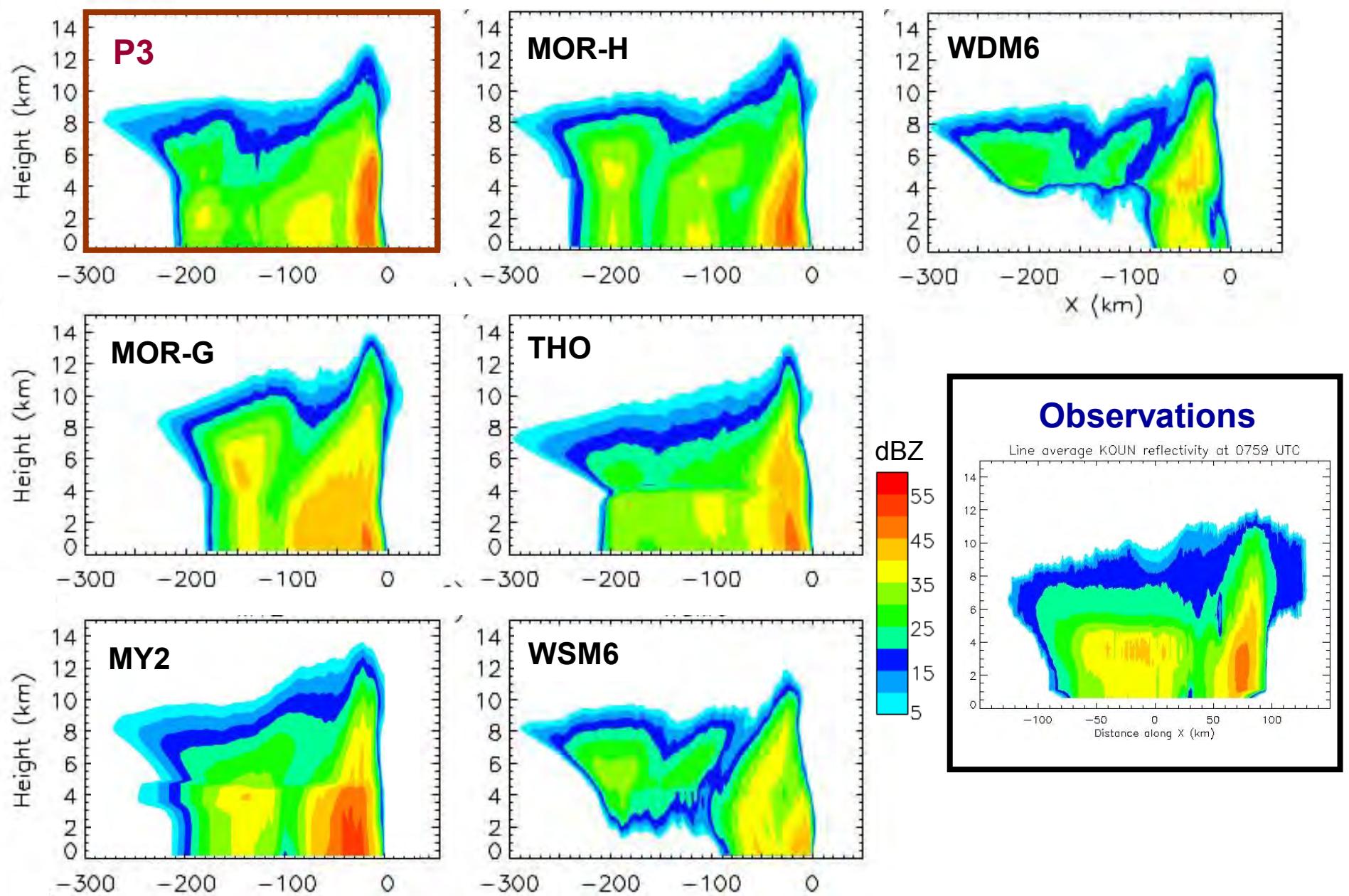
55
45
35
25
15
5

# WRF Results: Base Reflectivity (1 km AGL, t = 6 h)



Morrison et al. (2015) [P3, part 2]

# WRF Results: Line-averaged Reflectivity (t = 6 h)



## Vertical cross section of model fields ( $t = 6$ h)

$F_r \sim 0\text{--}0.1$   
 $\rho \sim 900 \text{ kg m}^{-3}$   
 $V \sim 0.3 \text{ m s}^{-1}$   
 $D_m \sim 100 \mu\text{m}$   
**→ small crystals**



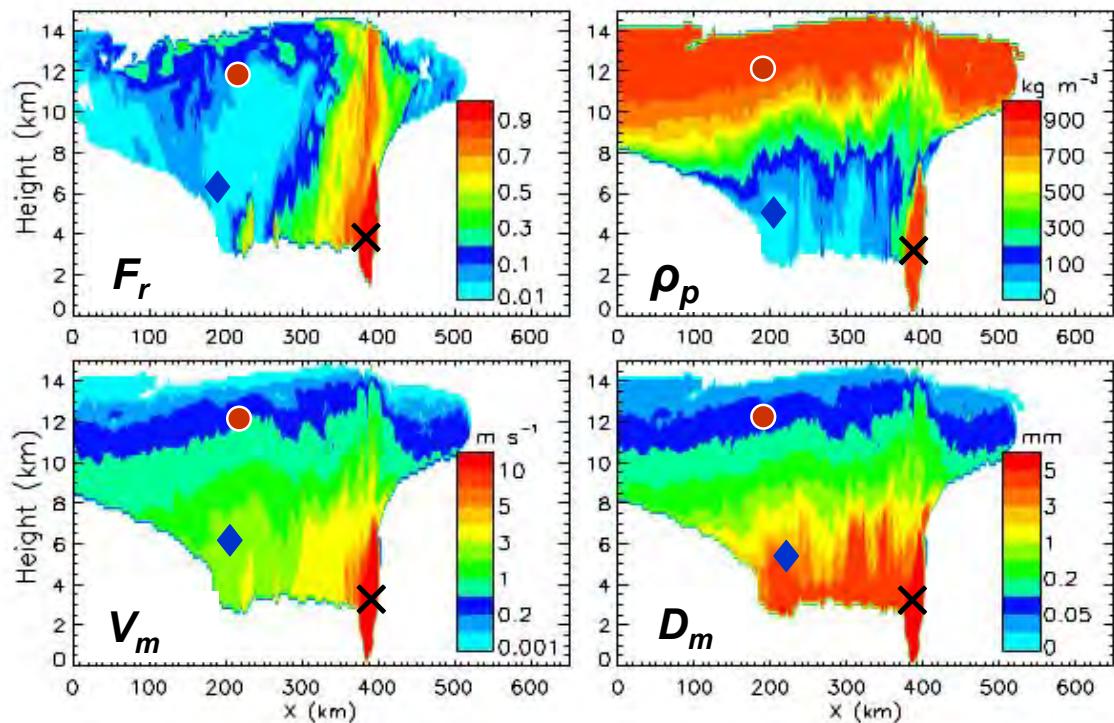
$F_r \sim 0$   
 $\rho \sim 50 \text{ kg m}^{-3}$   
 $V \sim 1 \text{ m s}^{-1}$   
 $D_m \sim 3 \text{ mm}$   
**→ aggregates**



$F_r \sim 1$   
 $\rho \sim 900 \text{ kg m}^{-3}$   
 $V > 10 \text{ m s}^{-1}$   
 $D_m > 5 \text{ mm}$   
**→ hail**



## Ice Particle Properties:



Note – only one (free) category

etc.

$F_r \sim 0\text{-}0.1$   
 $\rho \sim 900 \text{ kg m}^{-3}$   
 $V \sim 0.3 \text{ m s}^{-1}$   
 $D_m \sim 100 \mu\text{m}$   
→ ***small crystals***



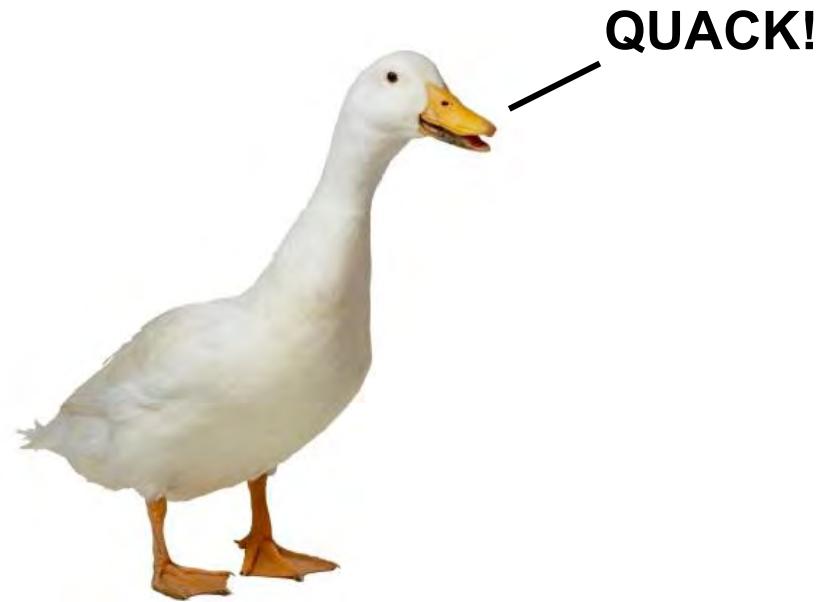
$F_r \sim 0$   
 $\rho \sim 50 \text{ kg m}^{-3}$   
 $V \sim 1 \text{ m s}^{-1}$   
 $D_m \sim 3 \text{ mm}$   
→ ***aggregates***



$F_r \sim 1$   
 $\rho \sim 900 \text{ kg m}^{-3}$   
 $V > 10 \text{ m s}^{-1}$   
 $D_m > 5 \text{ mm}$   
→ ***hail***



***etc.***



- small, round eyes
  - white, wing-like appendages
  - feathery exterior, meaty interior
  - webbed feet
  - makes a “quack” noise
- ***duck***

# Timing Tests for 3D WRF Simulations

Scheme	Squall line case ( $\Delta x = 1 \text{ km}$ )	Orographic case ( $\Delta x = 3 \text{ km}$ )	# prognostic variables
P3	0.436 (1.043)	0.686 (1.013)	7
MY2	0.621 (1.485)	1.012 (1.495)	12
MOR-H	0.503 (1.203)	0.813 (1.200)	9
THO	0.477 (1.141)	0.795 (1.174)	7
WSM6	0.418 (1.000)	0.677 (1.000)	5
WDM6	0.489 (1.170)	0.777 (1.148)	8

- Average wall clock time per model time step (units of seconds.)
- Times relative to those of WSM6 are indicated parenthetically.

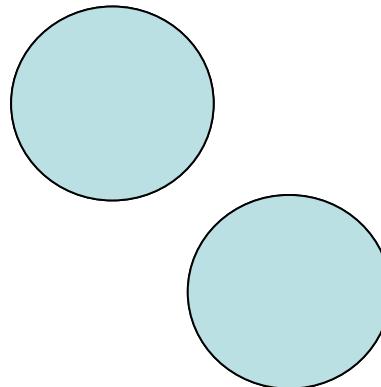
→ P3 is one of the fastest schemes in WRF

**So far** – despite using only 1 ice-phase category, P3 performs well compared to detailed, established (well-tuned), traditional bulk schemes

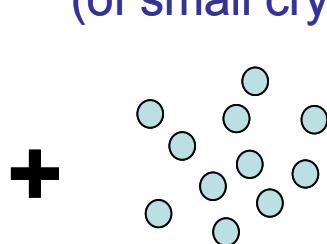
**However** – with 1 category, P3 has some intrinsic limitations:

- it cannot represent more than one type of particle in the same point in time and space
- As a result, there is an inherent “**dilution problem**”; the properties of populations of particles of different origins get averaged upon mixing

LARGE GRAUPEL



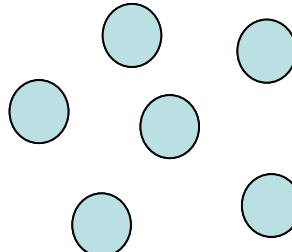
INITIATION  
(of small crystals)



+

=

SMALL GRAUPEL



*The large (mean) sizes have been lost due to dilution*

## Single-Category Version

Morrison and Milbrandt (2015) [P3, part 1]

All ice-phase hydrometeors represented by a single category,  
with  $Q_{dep}$ ,  $Q_{rim}$ ,  $N_{tot}$ ,  $B_{rim}$

Processes:

1. Initiation of new particles
2. Growth/decay processes
  - interactions with water vapor
  - interactions with liquid water
  - self-collection
3. Sedimentation

## Multi-Category Version

Milbrandt and Morrison (2015) [P3, part 3]  
(under review)

All ice-phase hydrometeors represented by a  **$nCat$  categories**,  
with  $Q_{dep}(n)$ ,  $Q_{rim}(n)$ ,  $N_{tot}(n)$ ,  $B_{rim}(n)$  [ $n = 1..nCat$ ]

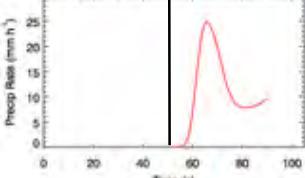
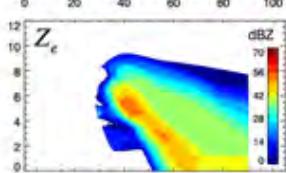
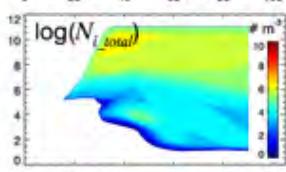
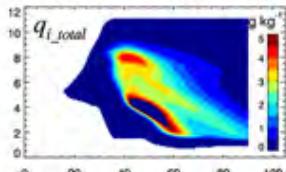
Processes:

1. Initiation of new particles → **determine destination category**
2. Growth/decay processes
  - interactions with water vapor
  - interactions with liquid water
  - self-collection
  - collection amongst other ice categories**
3. Sedimentation

# Inclusion of Hallet-Mossop (rime splintering) process with $nCat = 1$

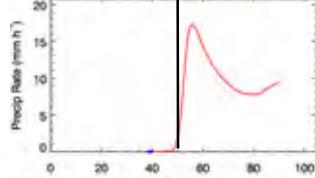
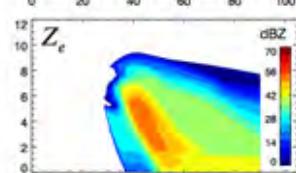
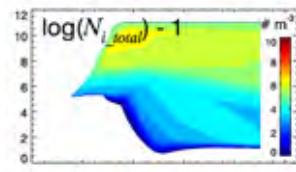
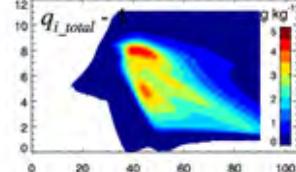
H-M on

$nCat = 1$



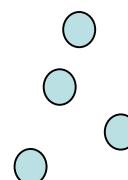
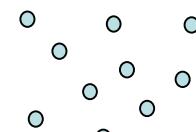
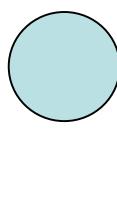
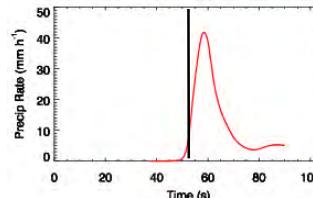
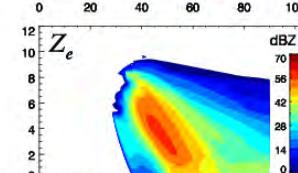
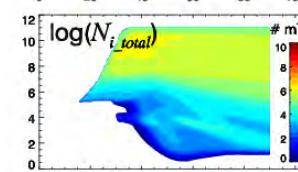
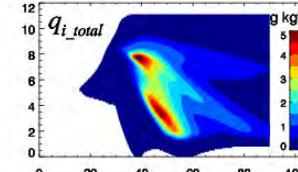
H-M off

$nCat = 1$



H-M on

$nCat = 4$

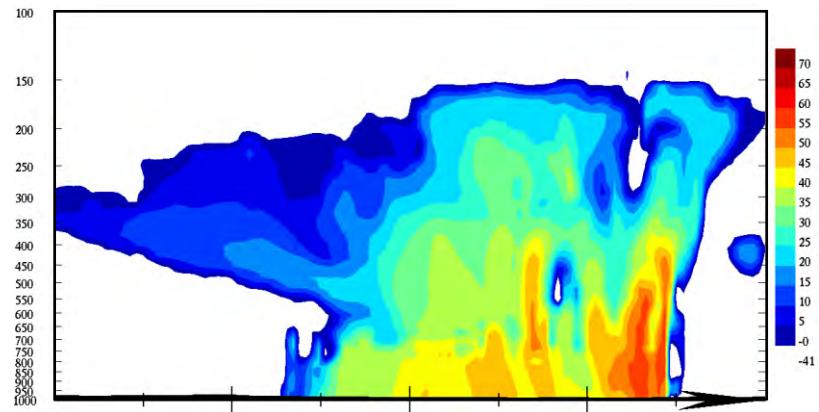


→ With  $nCat = 1$ , the Hallet-Mossop process results in excessive dilution

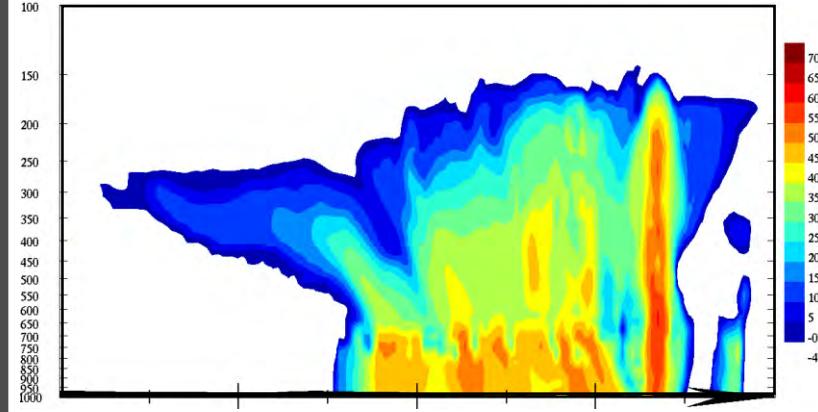
GEM (2.5 km), P3

# Reflectivity

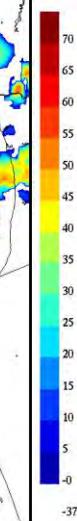
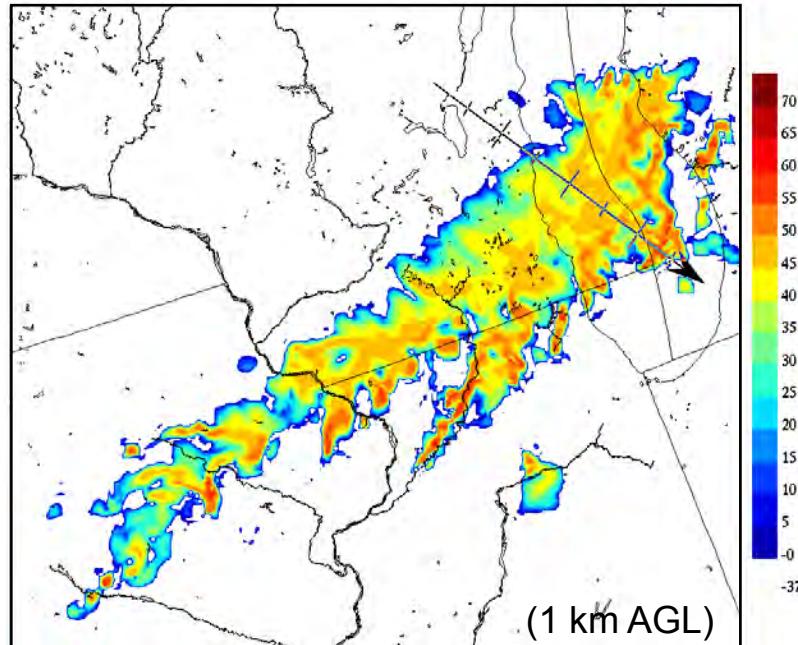
***nCat = 1***



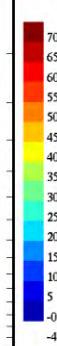
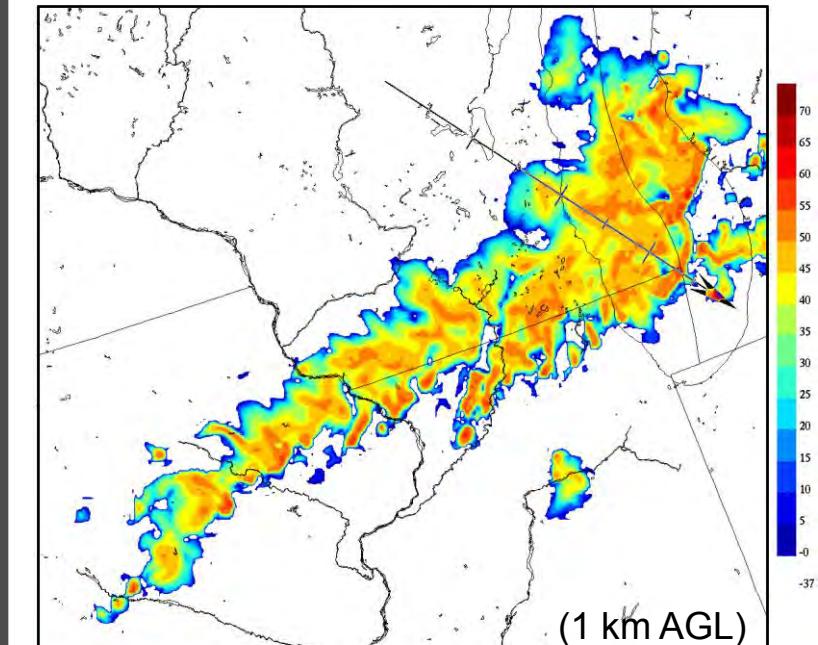
***nCat = 2***



(1 km AGL)



(1 km AGL)



# Further Development of P3

1. Rigorously test in operational NWP context
2. Additional predicted properties
  - spectral dispersion (triple-moment)
  - liquid fraction
  - others...
3. Subgrid-scale cloud fraction
4. Optimized advection

Morrison et al. (2015 – to be submitted)

e.g. P3, 3-moment, prognostic  $f_{liq}$ ,  $nCat = 2$ :

- 14 prognostic variables,
- cost of advection  $\sim 4$  prognostic variables

# Summary thoughts

1. Detailed BMSs are playing an increasingly important role in NWP
2. For continued advancement, developers should embrace the new paradigm of representing ice-phase hydrometeors: *abandon the use of pre-defined categories*
3. There remain mainly uncertainties in parameterizing microphysics (e.g. ice nucleation) – ensemble systems will always play an important role (w.r.t. microphysics)

# **Comments to “young scientists”**

1. Learn from – and profit from – stupid mistakes
2. Never take for granted the implicit wisdom in  
“because that’s the way it has always been done”

# **THANKS!**

**Annual Seminar 2015:  
Physical Processes in Present and Future Large-Scale Models**



Environment  
Canada      Environnement  
Canada

ECMWF, 1-4 September 2015

