

Parameterization of Cloud Microphysics – Update on Current Research –

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Environment
Canada

Environnement
Canada

RPN-CMC Seminar Series – October 22, 2010

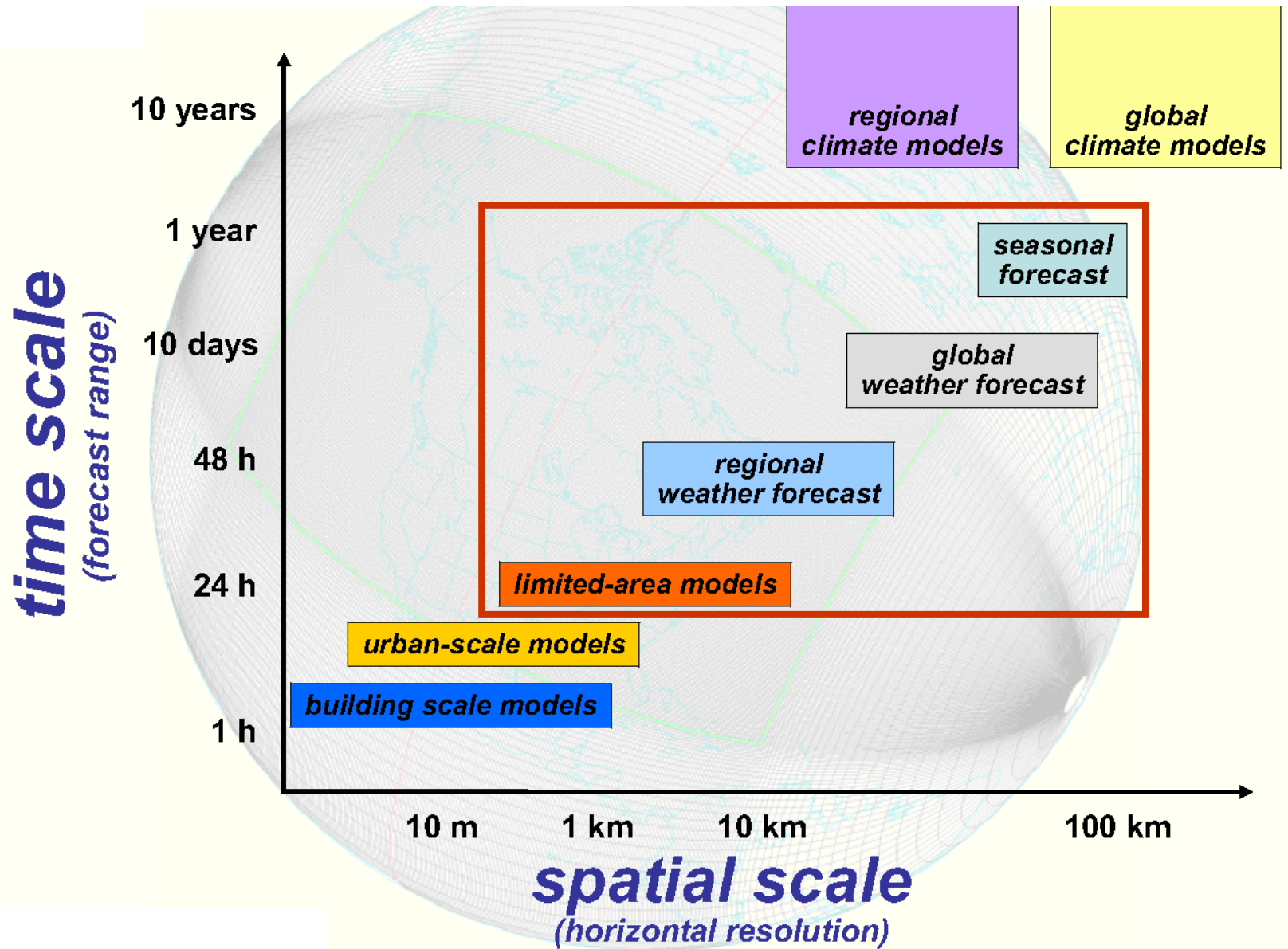


OUTLINE of PRESENTATION

- **Background**
- **Current research** on *bulk microphysics schemes* (BMS)
 1. Prognostic snow density
 2. Sedimentation-induced errors (in BMS)
 3. Comparison of 2-moment schemes



Modelling Systems and Applications at RPN/CMC



Physical Processes and Systems (PPS) Group

<https://wiki.cmc.ec.gc.ca/wiki/PPS>

ERPS

Extended Range Prediction System

(GEM-CLIM)

GDPS

Global Deterministic Prediction System

(GEM-Global)

RDPS

Regional Deterministic Prediction System

(GEM-REG)

HRDPS

High Resolution Deterministic Prediction System

(GEM-LAM 2.5)

Physical Processes and Systems (PPS) Group

<https://wiki.cmc.ec.gc.ca/wiki/PPS>

ERPS

Extended Range Prediction System

$\Delta x = 2$ deg (220 km)

STCOND:* Sundqvist

(GEM-CLIM)

GDPS

Global Deterministic Prediction System

$\Delta x = 33$ km

STCOND: Sundqvist

(GEM-Global)

RDPS

Regional Deterministic Prediction System

$\Delta x = 15$ km

STCOND: Sundqvist

(GEM-REG)

HRDPS

High Resolution Deterministic Prediction System

$\Delta x = 2.5$ km

STCOND: Milbrandt-Yau (1-moment)

(GEM-LAM 2.5)

***STCOND** = grid-scale condensation/precipitation scheme

Physical Processes and Systems (PPS) Group

<https://wiki.cmc.ec.gc.ca/wiki/PPS>

ERPS

Extended Range Prediction System

$\Delta x = 2 \text{ deg (220 km)}$

STCOND: Sundqvist

NEAR FUTURE

GDPS

Global Deterministic Prediction System

$\Delta x = 33 \text{ km}$

STCOND: Sundqvist

→ $\Delta x = 25 \text{ km (possibly)}$

→ **simplified 2-moment (M-Y)**

RDPS

Regional Deterministic Prediction System

$\Delta x = 15 \text{ km}$

STCOND: Sundqvist

→ $\Delta x = 10 \text{ km}$

→ **simplified 2-moment (M-Y)**

HRDPS

High Resolution Deterministic Prediction System

$\Delta x = 2.5 \text{ km}$

STCOND: Milbrandt-Yau (1-moment)

→ **2-moment (M-Y)**

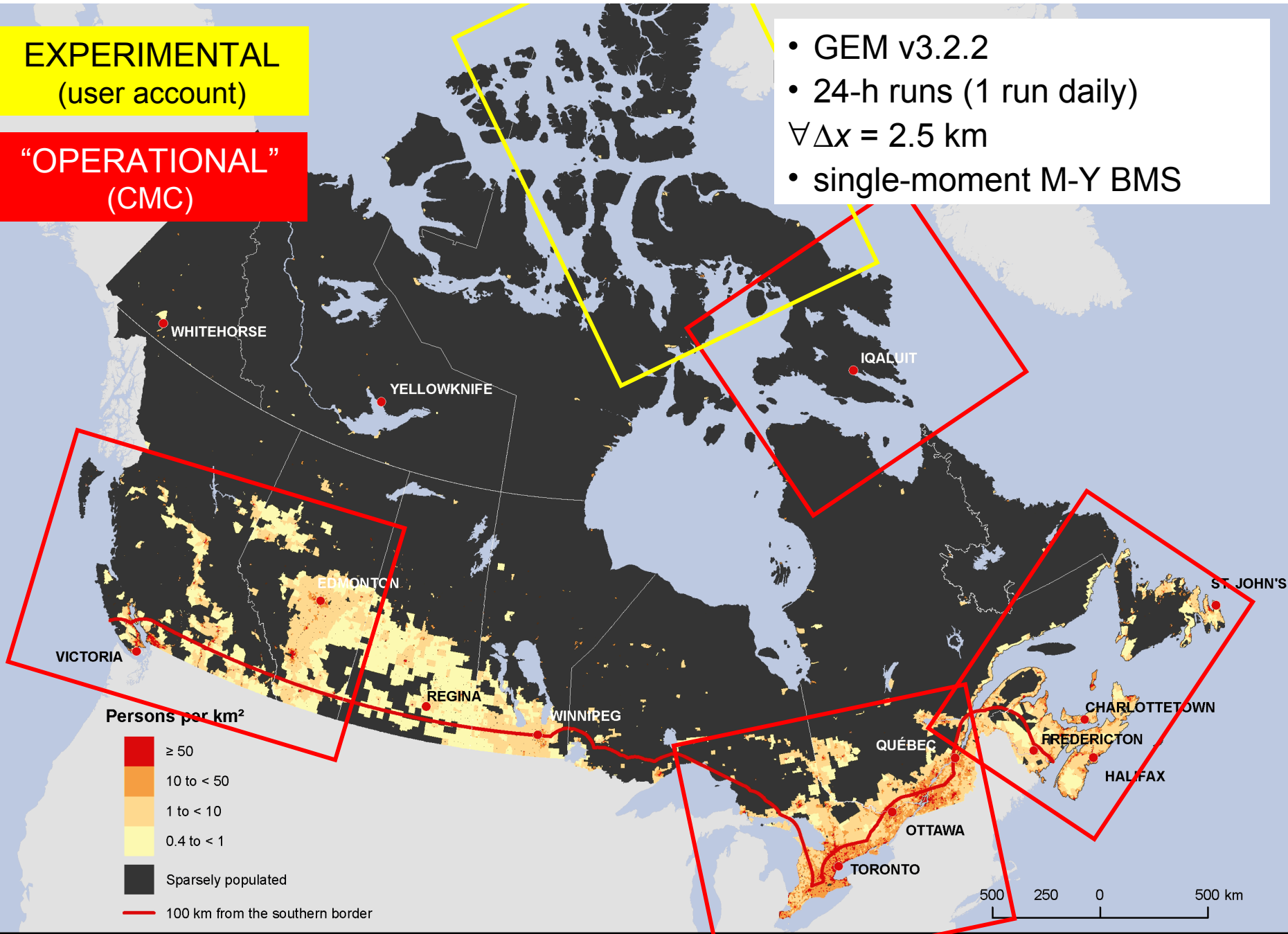
Role of BMS is increasing in EC modelling systems

HRDPS: Current Configuration

EXPERIMENTAL
(user account)

“OPERATIONAL”
(CMC)

- GEM v3.2.2
- 24-h runs (1 run daily)
- $\nabla\Delta x = 2.5 \text{ km}$
- single-moment M-Y BMS

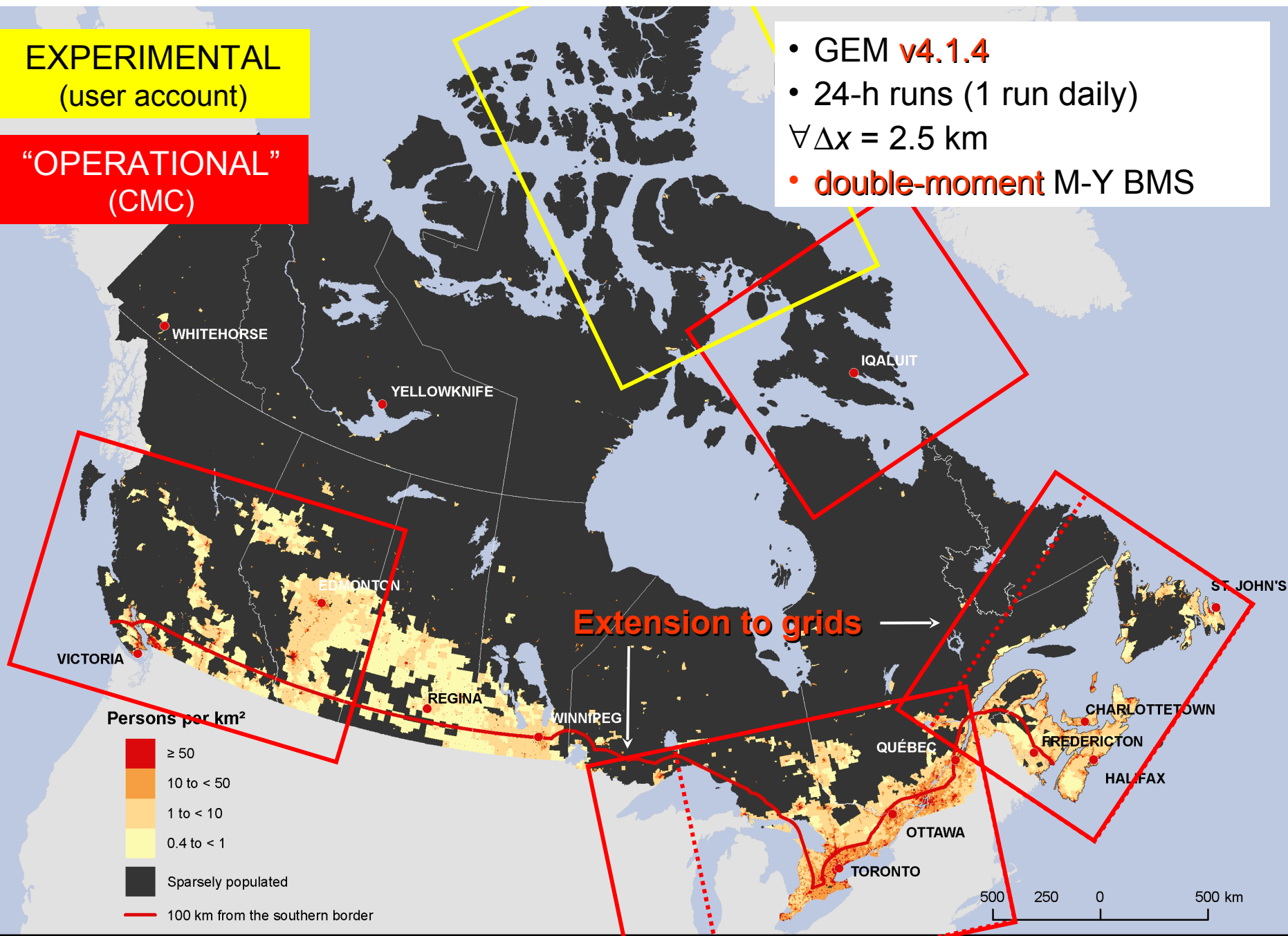


HRDPS: Next upgrade (January 2011)

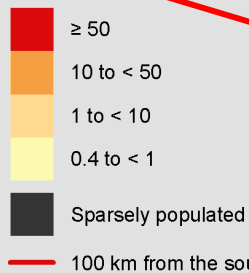
EXPERIMENTAL
(user account)

“OPERATIONAL”
(CMC)

- GEM v4.1.4
- 24-h runs (1 run daily)
- $\nabla\Delta x = 2.5 \text{ km}$
- double-moment M-Y BMS



Persons per km²



Extension to grids

500 250 0 500 km

Current Research in Microphysics Parameterization

1. Prognostic Snow Density
2. Sedimentation-Induced Errors
3. Comparison of 2-Moment Schemes

Current Research in Microphysics Parameterization

1. Prognostic Snow Density

2. Sedimentation-Induced Errors

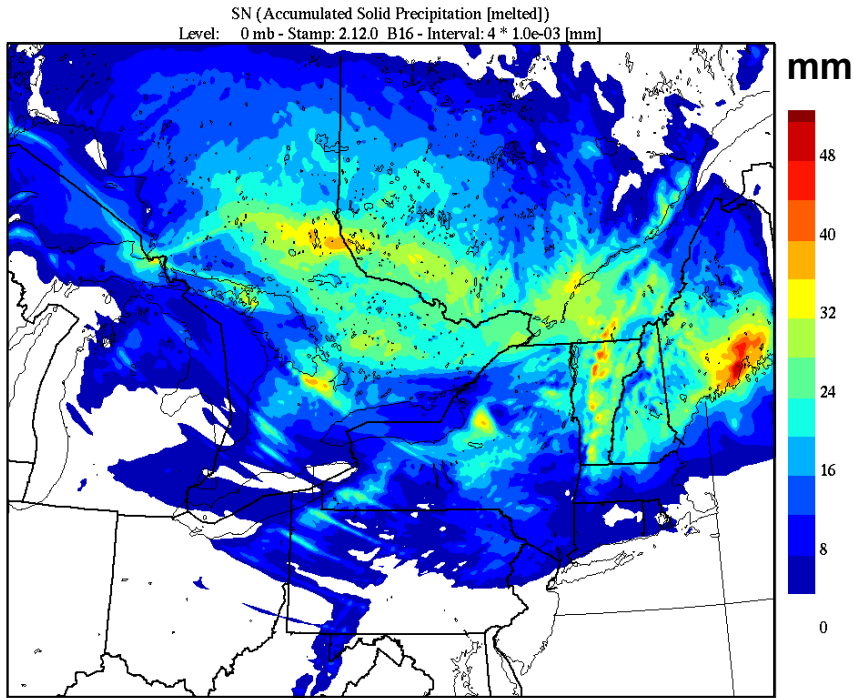
3. Comparison of 2-Moment Schemes

MOTIVATION:

How much snow will fall?



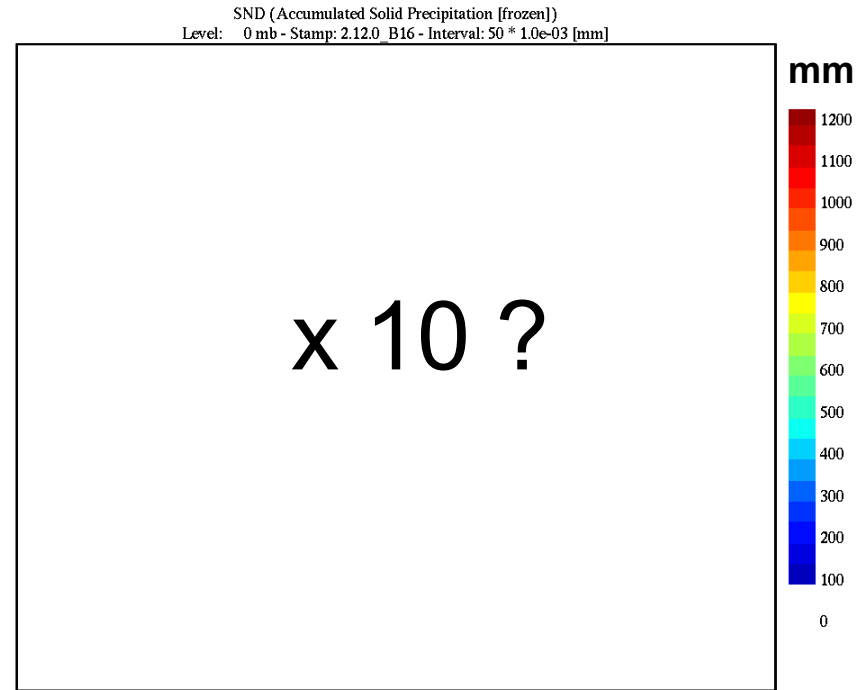
Standard forecast parameter:
(directly from model QPF)



48 hour fcst valid 06:00Z December 04 2007

Accumulated Precipitation
(Liquid-Equivalent)

Desired forecast parameter:



48 hour fcst valid 06:00Z December 04 2007

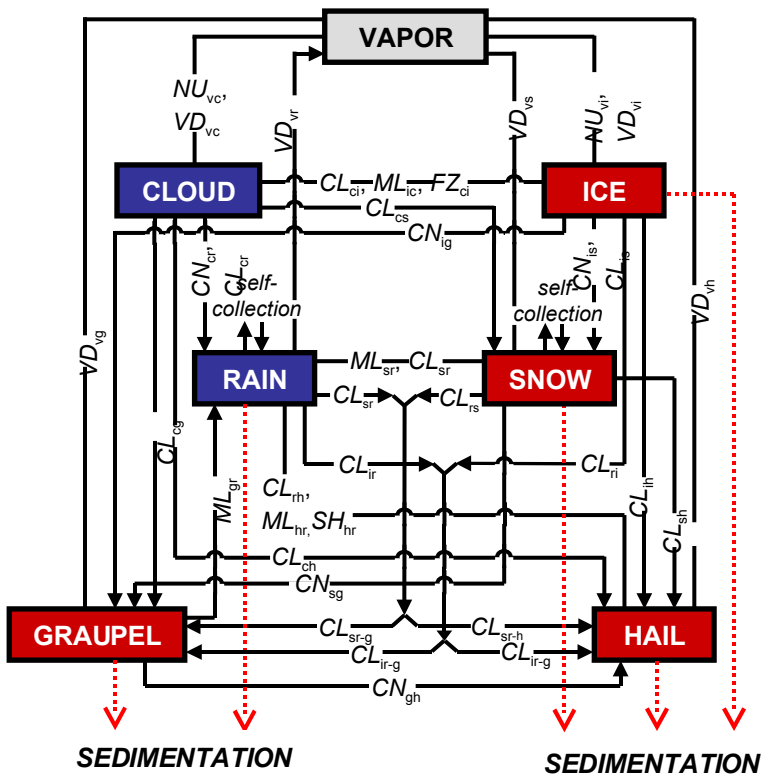
Accumulated Precipitation
(Unmelted - i.e. Snowfall Amount)

APPROACHES TO PREDICTION:

- 10:1 rule
- Climatology
- Neural network diagnostic (statistics of environmental conditions)
e.g. Roebber et al. (2003)
- Decision tree algorithm (based on physical principles and environment)
e.g. Dubé (2006)
- **Prognostic from the microphysics of a NWP model**

Cloud Microphysics Scheme:*

6 hydrometeor categories



Size distribution of each category x :

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

Prognostic quantities:

- mass mixing ratio (q_x)
- total number concentration (N_x)

* Milbrandt and Yau, 2005a,b (*J. Atmos. Sci.*)

Cloud Microphysics Scheme:

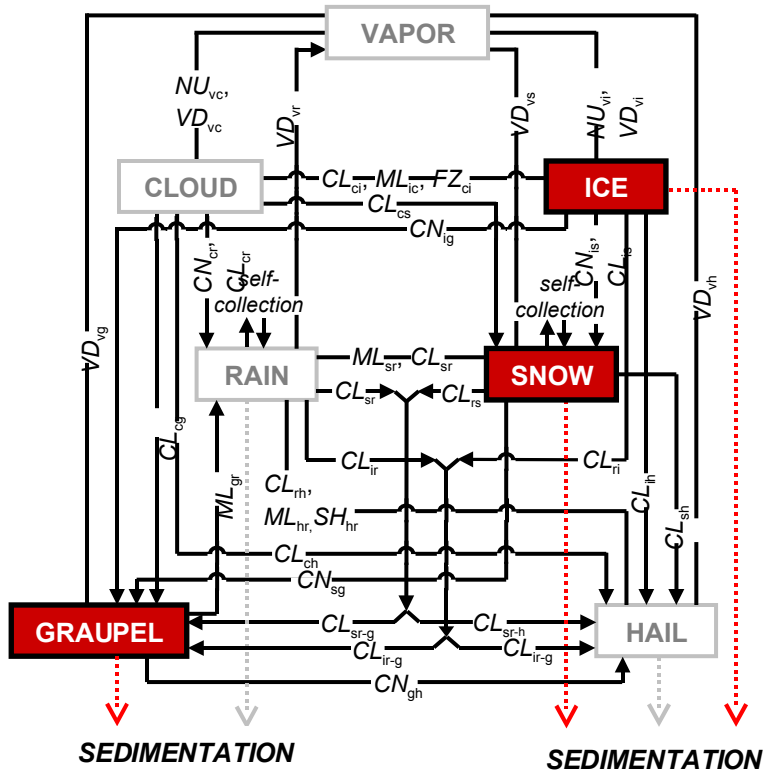
Representation of “snow”: (i.e. solid, white precipitation at ground)

Size distribution of each category x :

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

Prognostic quantities:

- mass mixing ratio (q_x)
- total number concentration (N_x)



“Snow” is represented by 3 categories:

ICE (pristine crystals)

SNOW (large crystals / aggregates)

GRAUPEL (heavily rimed crystals)

“Snow” is represented by 3 categories:

ICE (pristine crystals),

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

GRAUPEL (rimed crystals)

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

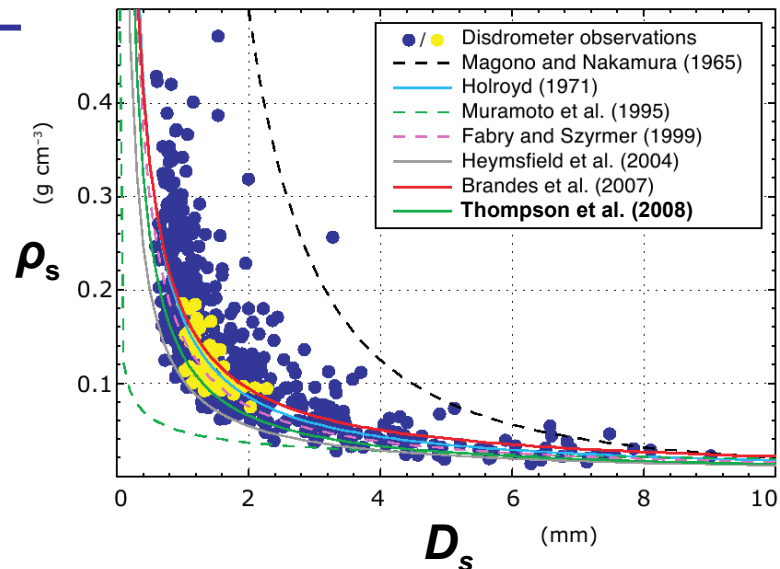
SNOW (large crystals / aggregates)

$$* \rho_s = f(D_s)$$

* For **SNOW**:

Use of $m_s(D) = cD_s^d$
 $\Rightarrow \rho_s(D) = eD_s^f$

(for the bulk density of an equivalent-mass sphere)



Approach:

For each category x ($x = i, g, s$):

Compute solid (unmelted) volume fluxes, F_{v_x}

$$\frac{F_{v_x}}{F_{m_x}} = \frac{\int_0^\infty V(D) \cdot \text{vol}(D) \cdot N(D) dD}{\int_0^\infty V(D) m(D) N(D) dD} = \frac{\int_0^\infty V(D) \cdot \frac{m(D)}{\rho(D)} \cdot N(D) dD}{\int_0^\infty V(D) m(D) N(D) dD} = \frac{\frac{1}{\rho_x} \int_0^\infty V(D) m(D) N(D) dD}{\int_0^\infty V(D) m(D) N(D) dD} = \frac{1}{\rho_x}$$

$$F_{v_x} = \frac{F_{m_x}}{\rho_x}$$

BUT – only true for constant ρ_x
(OK for *ICE* and *GRAUPEL*)

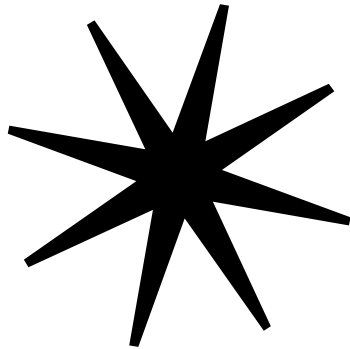
For *SNOW*, $\rho = \rho(D)$ - must compute F_v directly (from integral)

$$\longrightarrow F_{v_s} = \int_0^\infty V(D) \cdot \text{vol}(D) \cdot N(D) dD$$

Estimation of liquid fraction (during melting):

Actual model representation:

$$\rho_s = f(D_s) \quad \rho_L = 1000 \text{ kg m}^{-3}$$



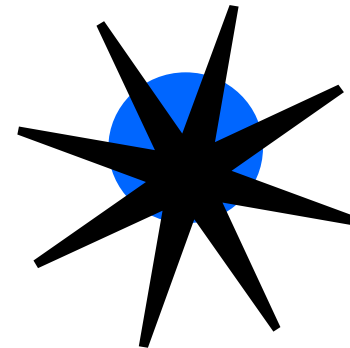
q_s



q_r

Conceptual view of melting snow:

$\rho_{s_melting}$



$$\frac{q_r}{q_r + q_s}$$

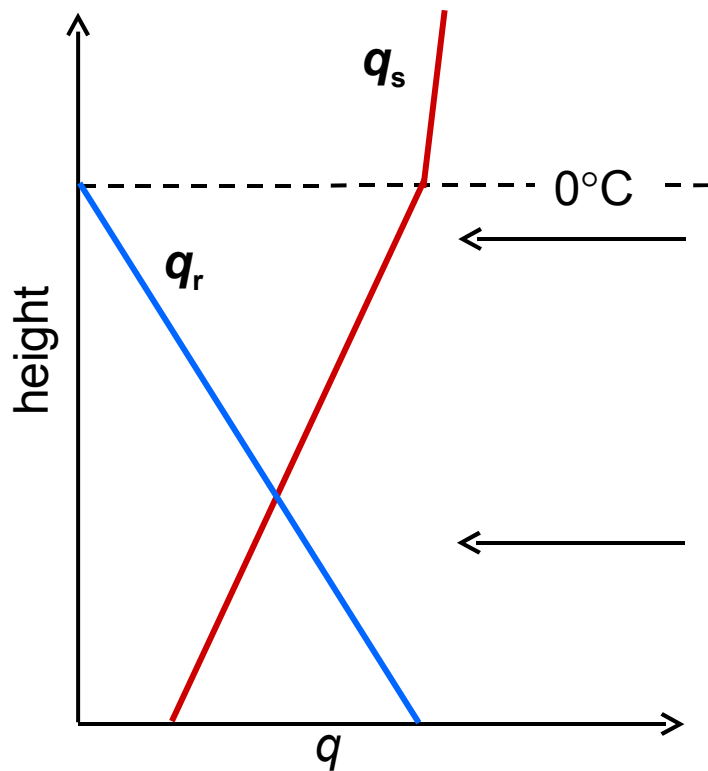
→ liquid fraction of melting snow

Adjustments:

if $T < 0^\circ\text{C}$:

$$f_{liq} = \frac{q_r}{q_r + (q_i + q_g + q_s)}$$

$$F_v = (1 - f_{liq}) \cdot F_v' + f_{liq} \cdot F_{v_{liq}}$$



e.g. Assume $D_s = 5 \text{ mm} \rightarrow \rho_s(D_s) = 26 \text{ kg m}^{-3}$:

$$\rho_{s_{melting}} = 0.95(26 \text{ kg m}^{-3}) + 0.05(1000 \text{ kg m}^{-3}) = 75 \text{ kg m}^{-3}$$



$$\rho_{s_{melting}} = 0.50(26 \text{ kg m}^{-3}) + 0.50(1000 \text{ kg m}^{-3}) = 513 \text{ kg m}^{-3}$$



Thus, instantaneous precipitation rates are given by:

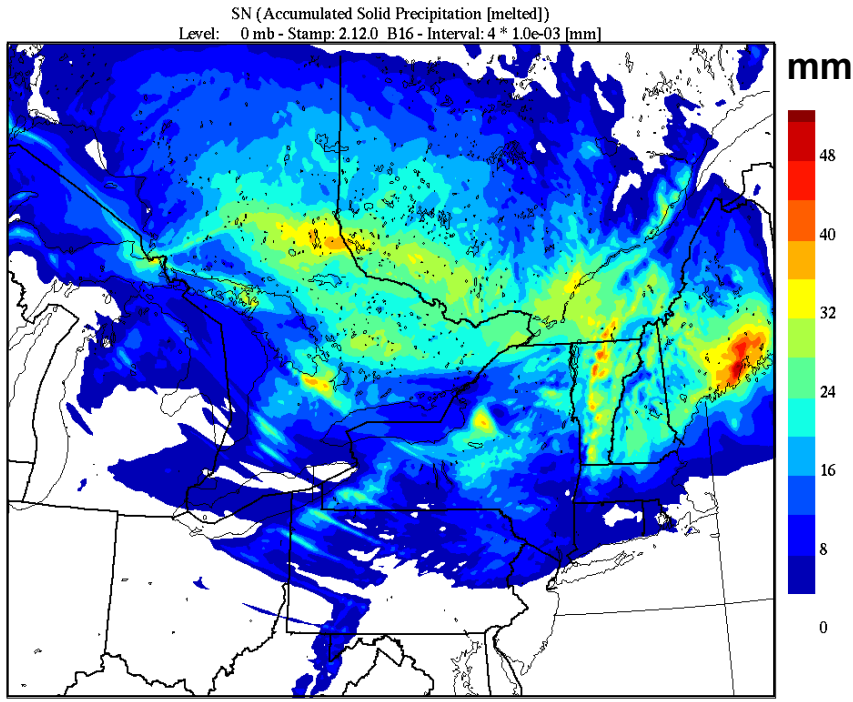
$$F_{v_{liq}} = \frac{F_{m_i}}{\rho_L} + \frac{F_{m_g}}{\rho_L} + \frac{F_{m_s}}{\rho_L}$$

→ total solid (liquid-equivalent) precipitation rate

$$F_{v'} = \frac{F_{m_i}}{\rho_i} + \frac{F_{m_g}}{\rho_g} + \int_0^{\infty} V_s(D) \cdot vol_s(D) \cdot N_s(D) dD$$

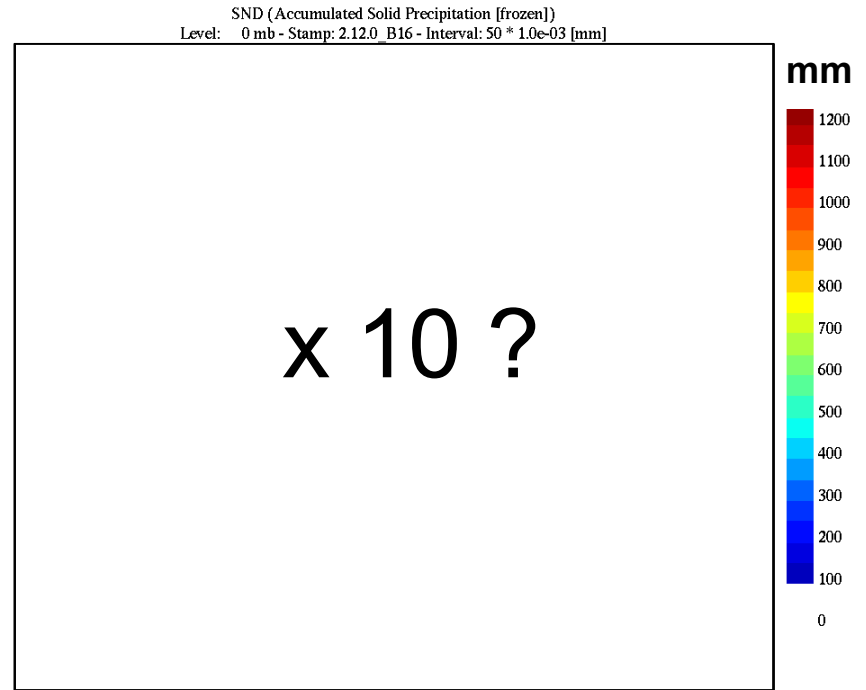
$$F_v = (1 - f_{liq}) \cdot F_{v'} + f_{liq} \cdot F_{v_{liq}} \quad (\text{if } T < 0^\circ\text{C})$$

$$\rightarrow \text{SOLID-to-LIQUID}_{inst} = \frac{F_v}{F_{v_{liq}}}$$



48 hour fcst valid 06:00Z December 04 2007

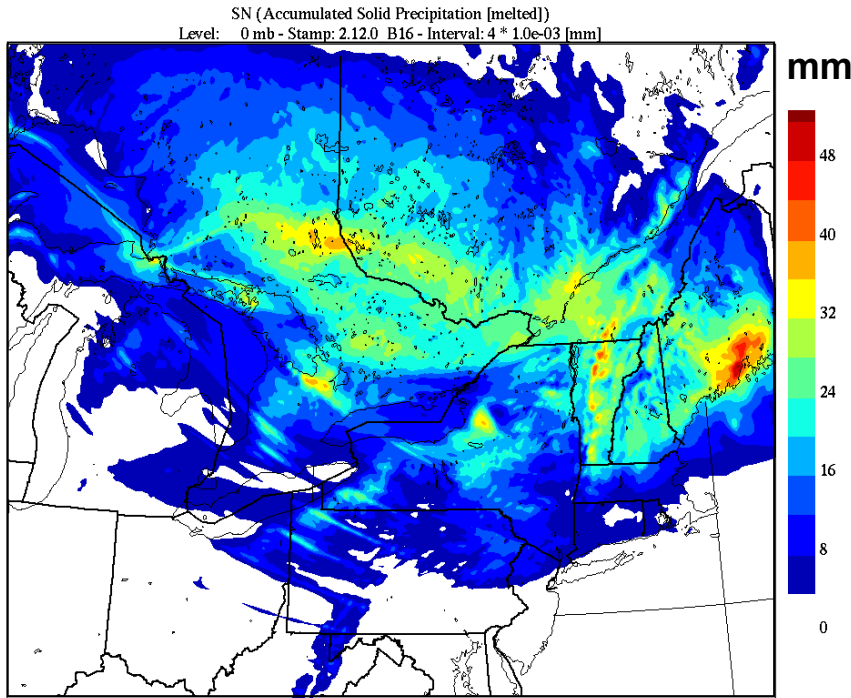
Accumulated Precipitation
 (liquid-equivalent)



48 hour fcst valid 06:00Z December 04 2007

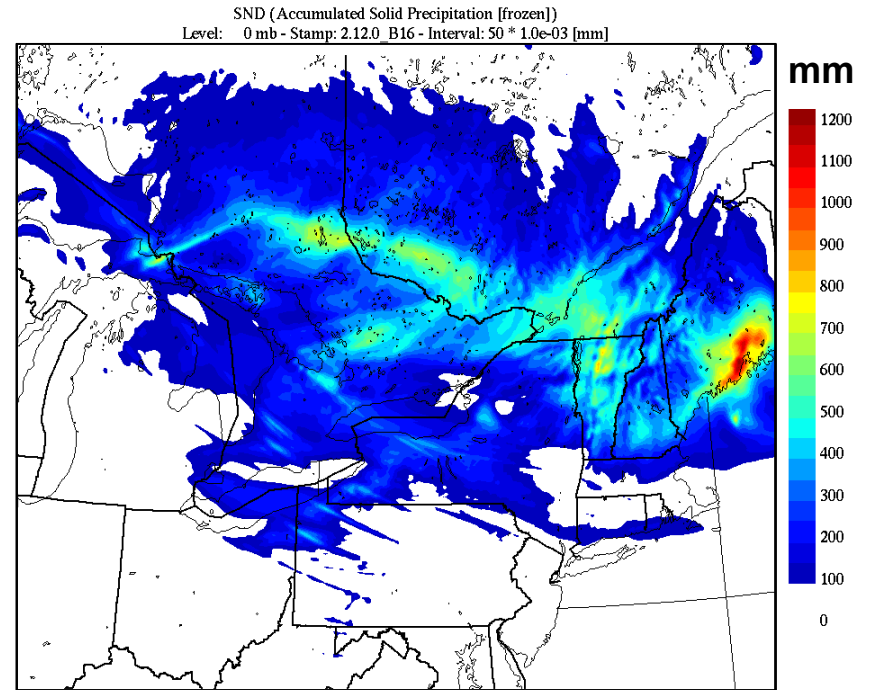
Accumulated Precipitation
 (unmelted)

- snowfall amount -



48 hour fcst valid 06:00Z December 04 2007

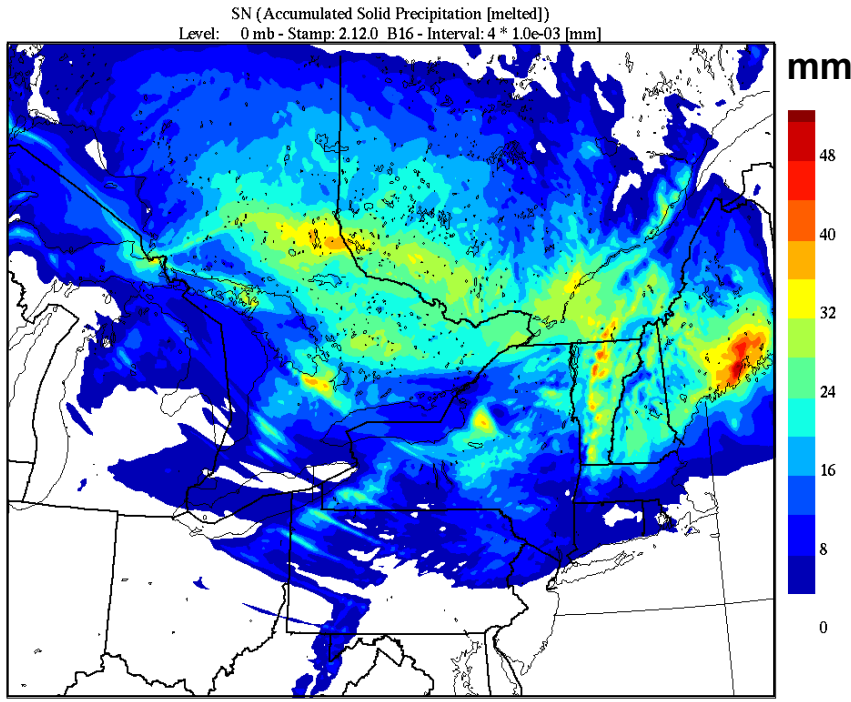
Accumulated Precipitation
 (liquid-equivalent)



48 hour fcst valid 06:00Z December 04 2007

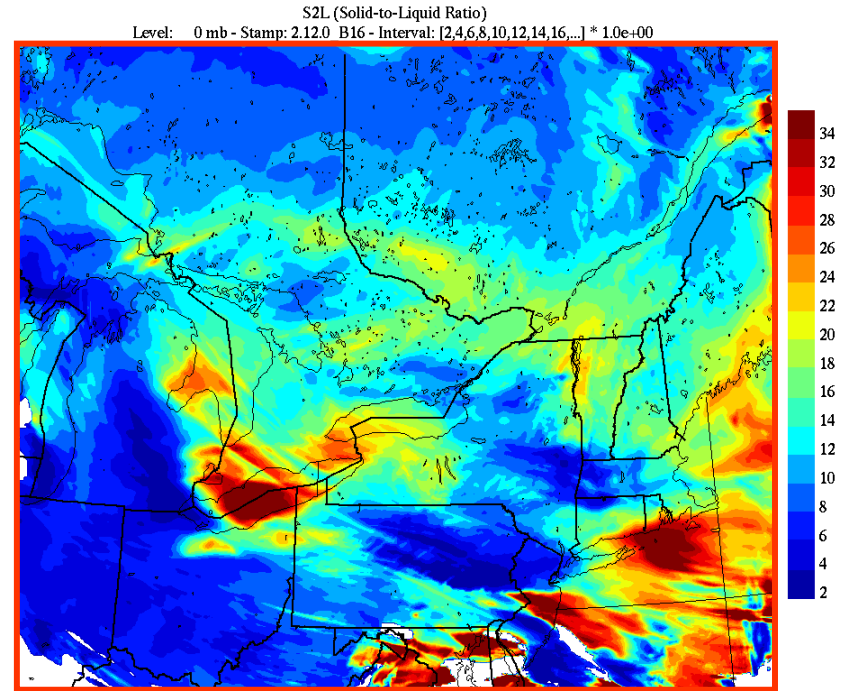
Accumulated Precipitation
 (unmelted)

- snowfall amount -



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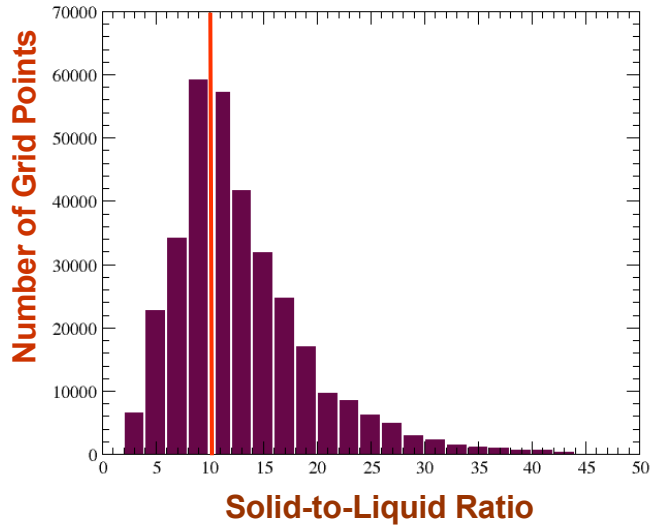
Accumulated Precipitation (liquid-equivalent)



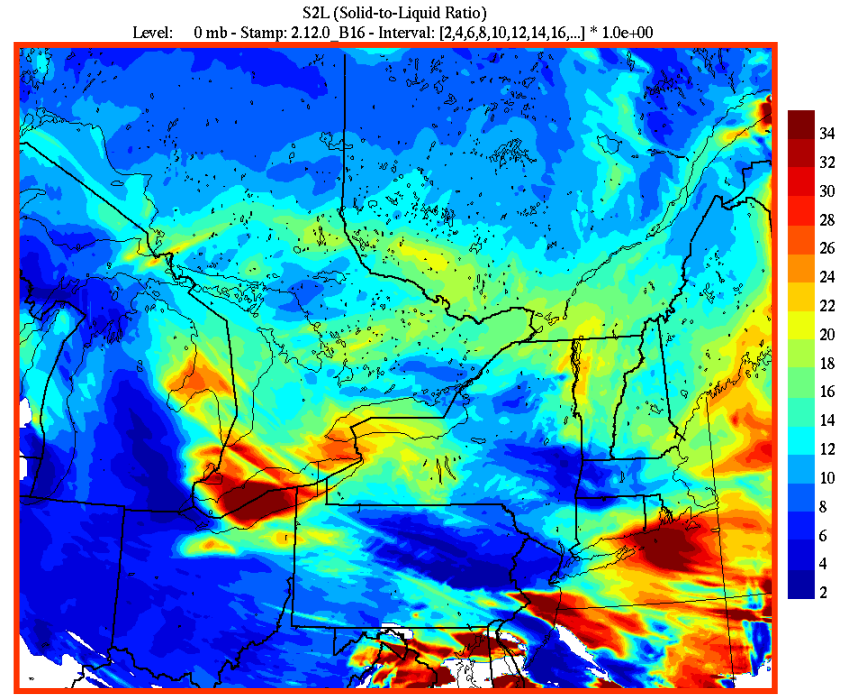
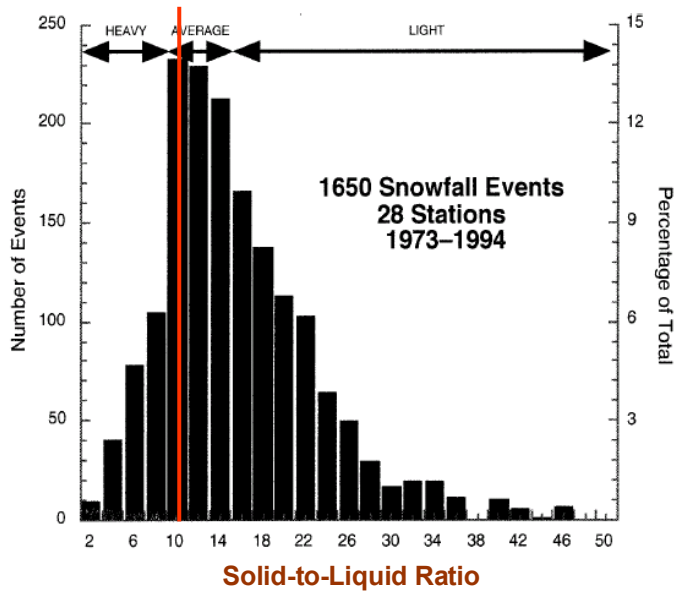
48 hour fcst valid 06:00Z December 04 2007

Solid-to-Liquid Ratio

10:1



10:1

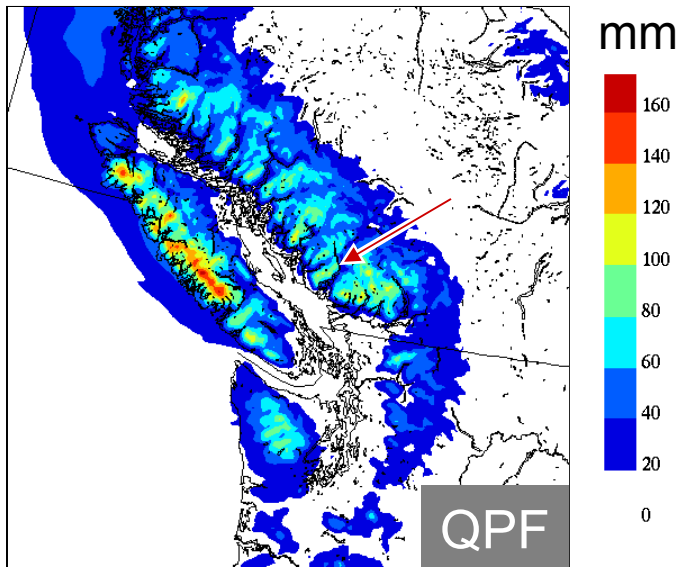


48 hour fcst valid 06:00Z December 04 2007

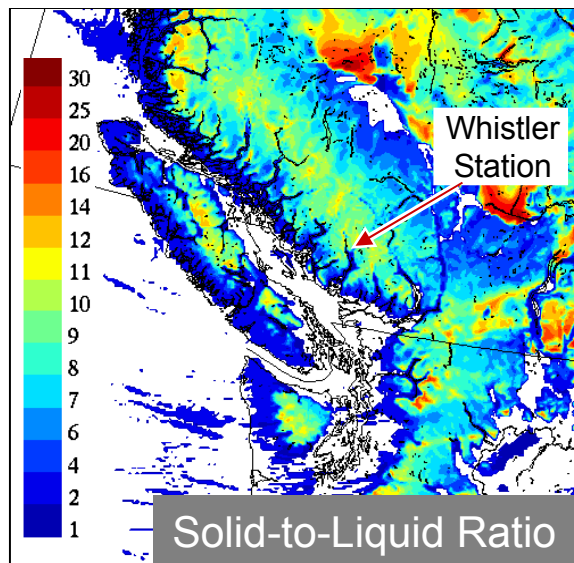


grid area

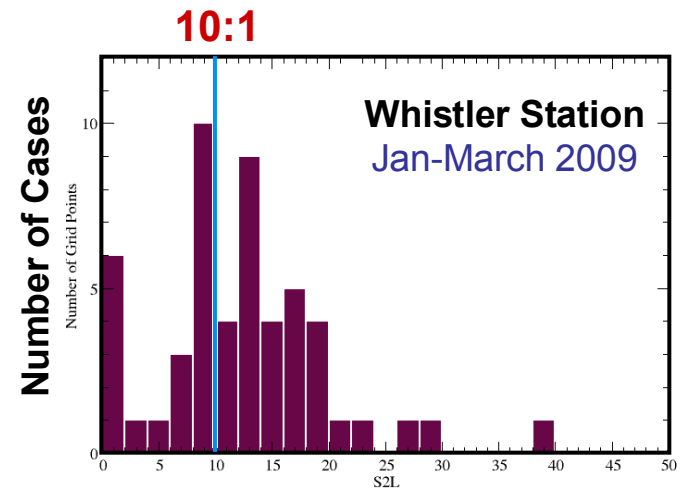
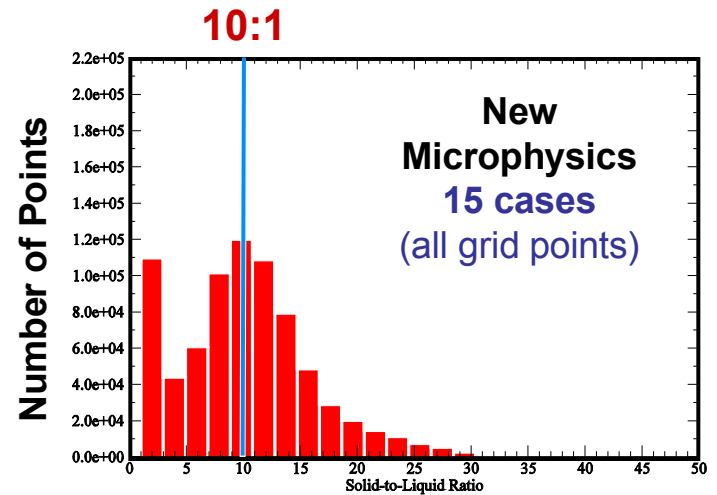
Source: Roebber et al. (2003), *Weather and Forecasting*



Case: 12 March 2009 (00 z)



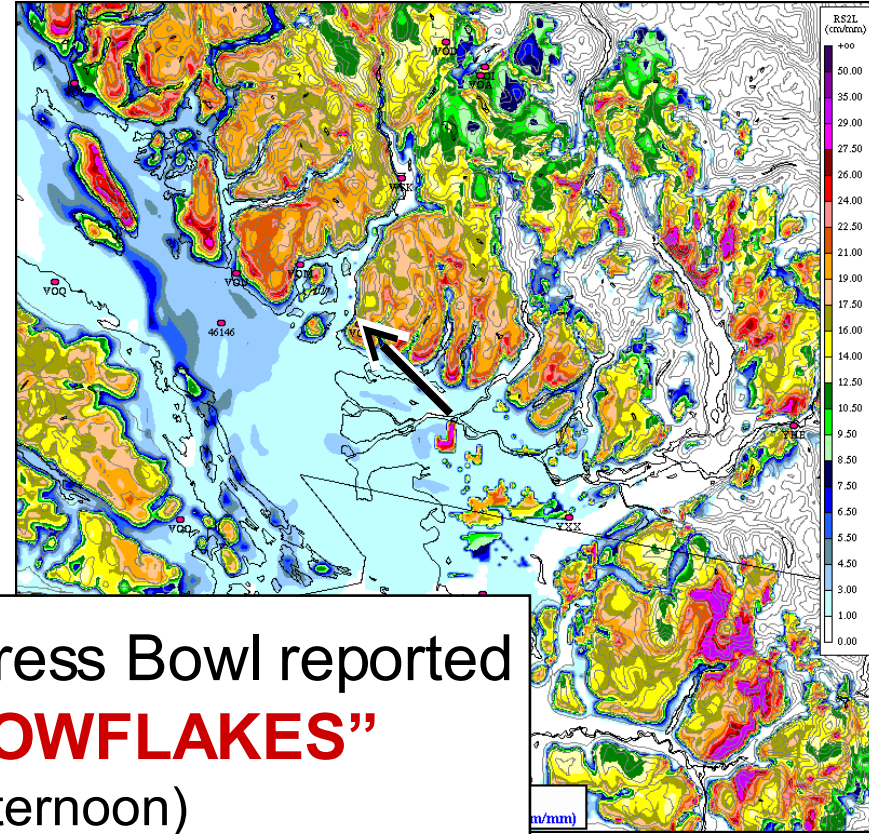
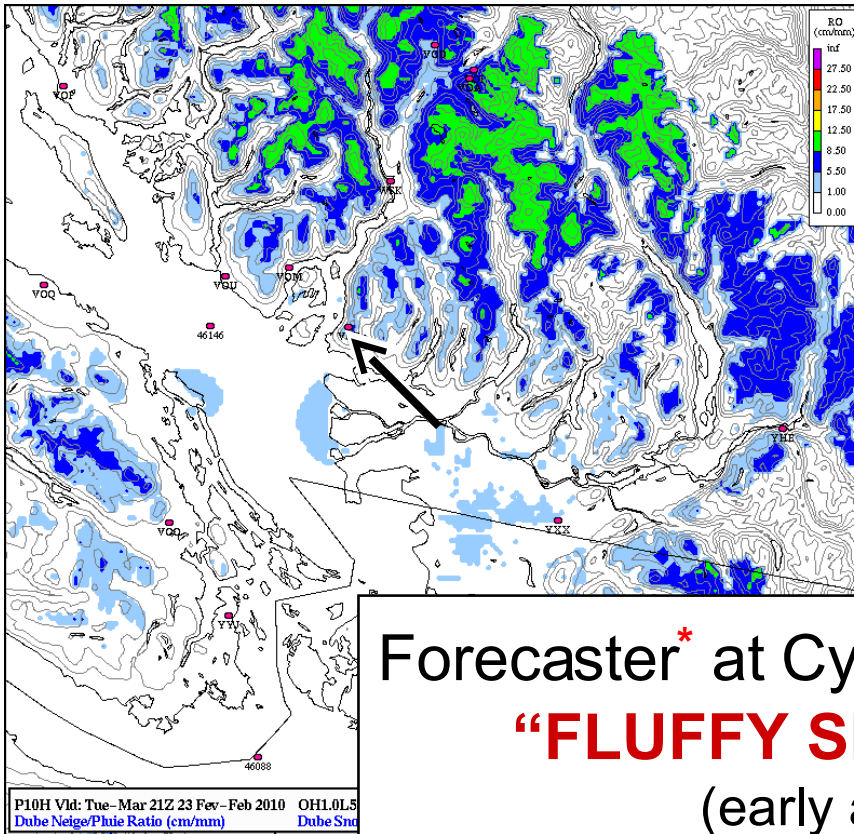
Solid-to-Liquid Ratio



Solid-to-Liquid Ratio

Diagnostic
(Dubé algorithm)

Explicit
(Milbrandt-Yau)



Forecaster* at Cypress Bowl reported
“FLUFFY SNOWFLAKES”
(early afternoon)

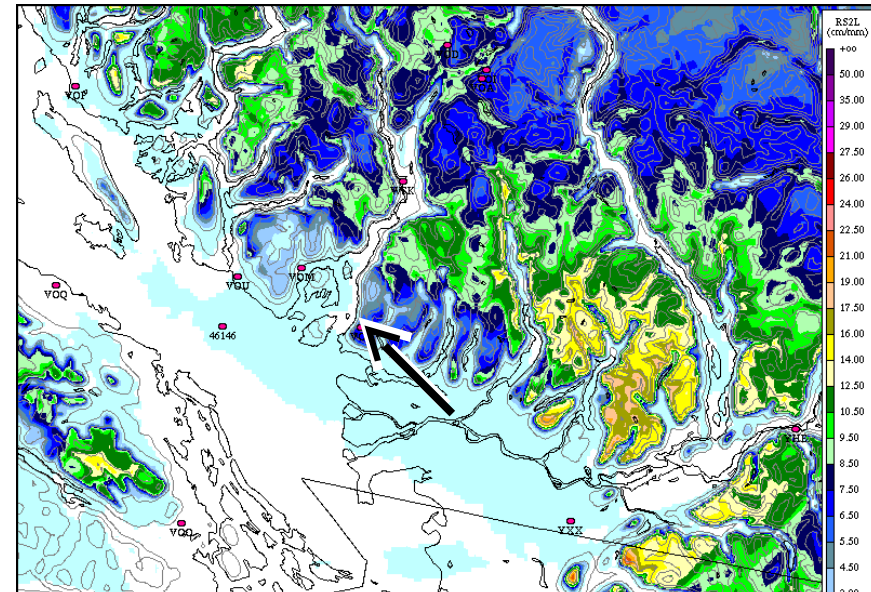
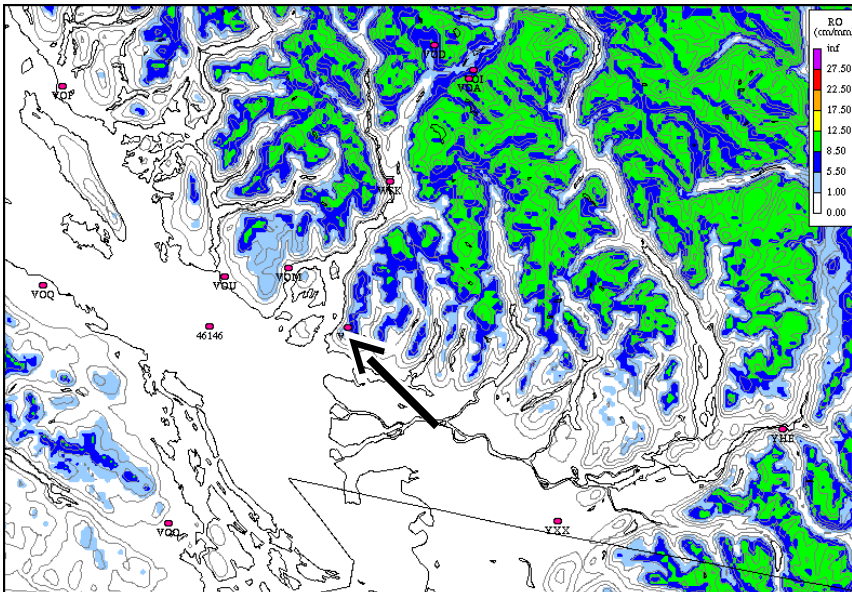
*Michael Gélinas
2010 Olympics forecaster

2100 UTC (3:00 pm)
23 Feb 2010

Solid-to-Liquid Ratio

Diagnostic
(Dubé algorithm)

Explicit
(Milbrandt-Yau)



Forecaster* at Cypress Bowl reported
“FAST-FALLING (LIKE RAIN) SNOW PELLETS”
(early evening)

P17H Vid: Wed-Mer 04
Dubé Neige/Pluie Ratio

*Michael Gélinas
2010 Olympics forecaster

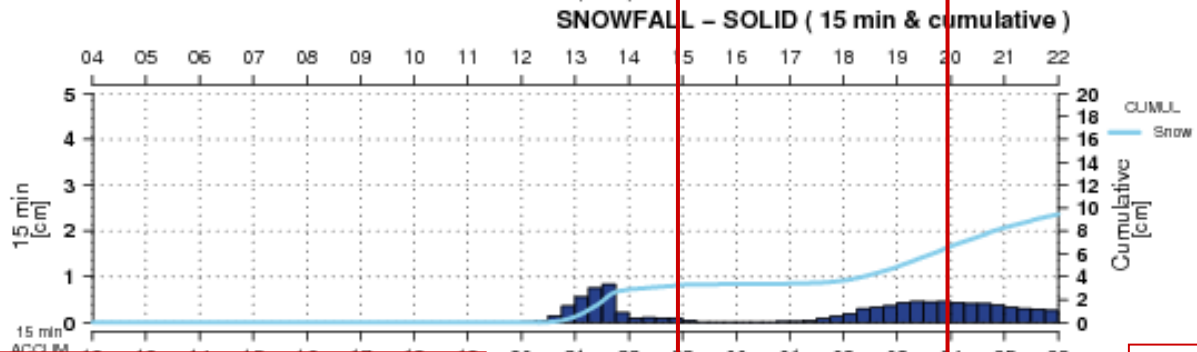
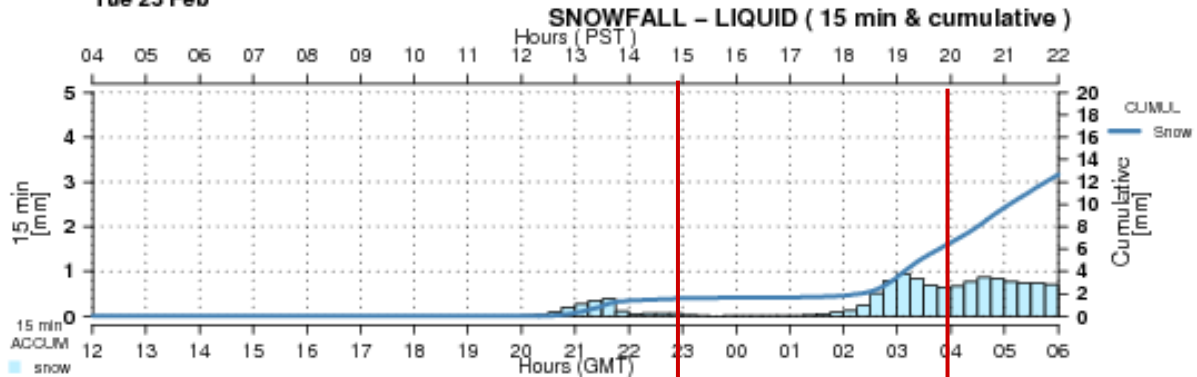
0400 UTC (8:00 pm)
23 Feb 2010

1.0km LAM Model 18 hour Solid Precipitation Meteogram issued 23 February 2010, 12 UTC (04:00 AM local)

Cypress Bowl – South (wind)

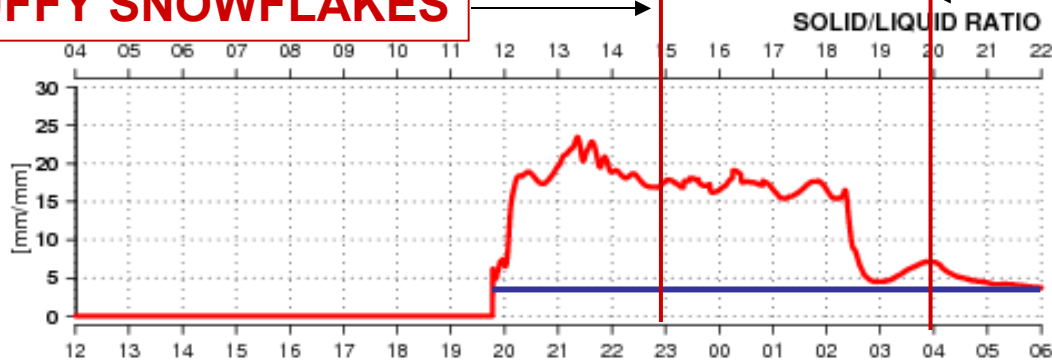
TC ID: VOG LAT: 49.38 N LON: -123.19 W ELEV: 960 m

Tue 23 Feb



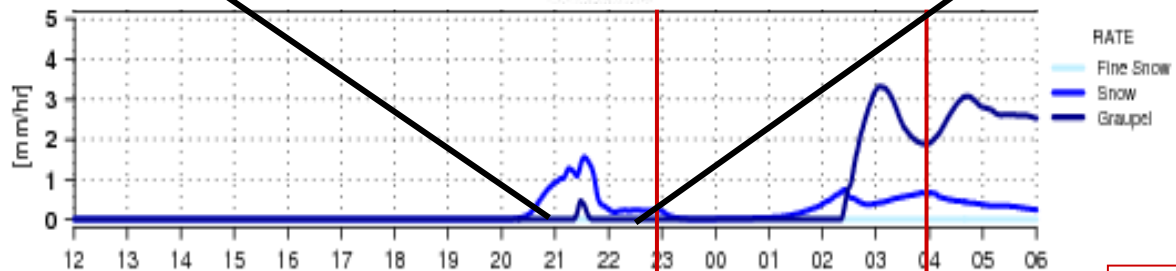
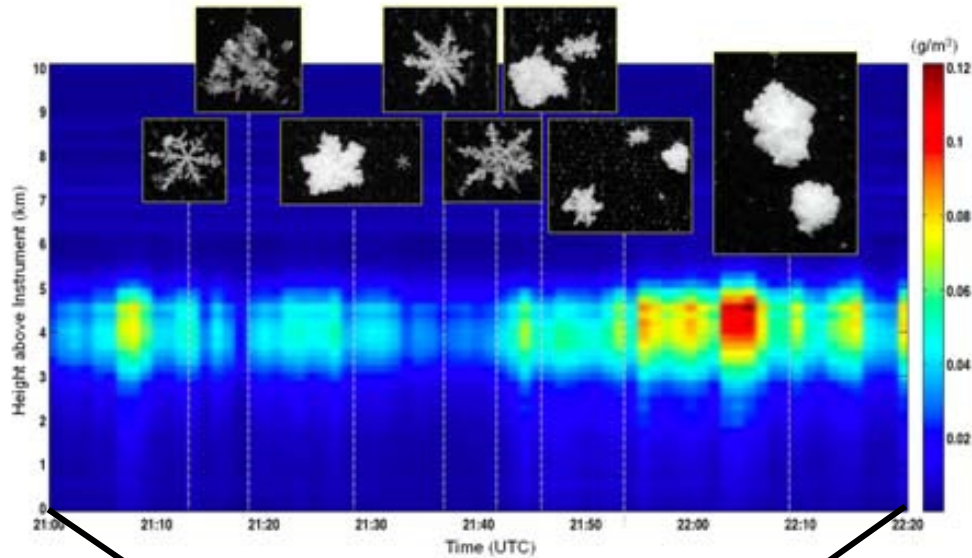
FLUFFY SNOWFLAKES

SNOW PELLETS



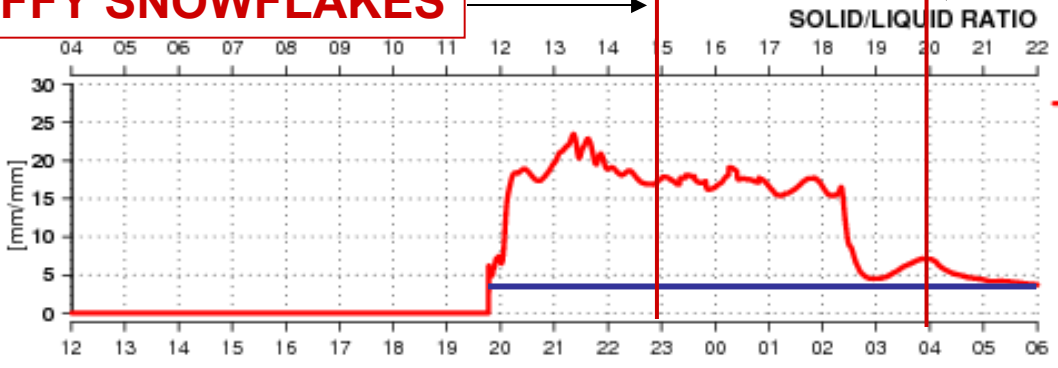
Explicit

Diagnostic



FLUFFY SNOWFLAKES

SNOW PELLETS



Explicit
Diagnostic

CONCLUSION – Part 1

- The cloud microphysics scheme predicts the individual quantities and size distributions of pristine crystals, aggregates, graupel
- This information can be exploited to compute the **instantaneous solid (unmelted) precipitation rate** → it need not be simply inferred (or diagnosed)
- Real-time simulations (during 2010 Olympics) indicate that this method produces a realistic results

Current Research in Microphysics Parameterization

1. Prognostic Snow Density
- 2. Sedimentation-Induced Errors**
3. Comparison of 2-Moment Schemes

MOTIVATION

1. To propose a method to quantify the **sedimentation-induced errors** in bulk microphysics schemes
2. To examine alternatives to the “standard” two-moment approach

BULK MICROPHYSICS SCHEMES

COMPUTATION OF SEDIMENTATION

$$\left. \frac{\partial q_x}{\partial t} \Big|_{SEDI} = \frac{\partial (\rho q_x \bar{V}_{xq})}{\partial z} \right\}$$

* $\bar{V}_{xq} =$ mass-weighted fall velocity

1-moment

* $\bar{V}_{xq} = \frac{\int_0^\infty V_x(D_x) m_x(D_x) N_x(D_x) dD_x}{\int_0^\infty m_x(D_x) N_x(D_x) dD_x}$

2-moment

$$\frac{\partial N_x}{\partial t} \Big|_{SEDI} = \frac{\partial (N_x \bar{V}_{xN})}{\partial z}$$

$\bar{V}_{xN} =$ number-weighted fall velocity

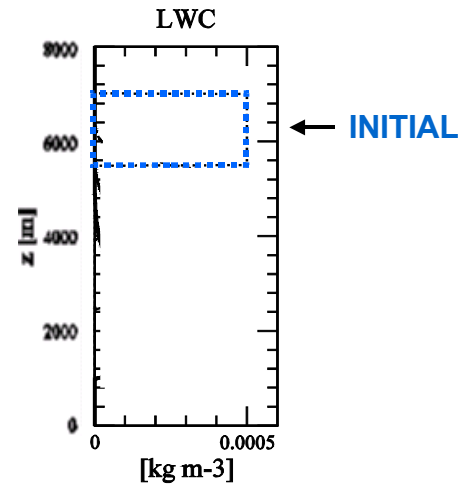
3-moment

$$\frac{\partial Z_x}{\partial t} \Big|_{SEDI} = \frac{\partial (Z_x \bar{V}_{xZ})}{\partial z}$$

$\bar{V}_{xZ} =$ reflectivity-weighted fall velocity

BULK MICROPHYSICS SCHEMES

Sedimentation: 1-MOMENT scheme



$$M_3$$
$$(\rho q_r)$$

Initial Conditions:

$$\rho q = 0.5 \text{ g m}^{-3}$$

$$N_0 = 8 \times 10^6 \text{ m}^{-4}$$

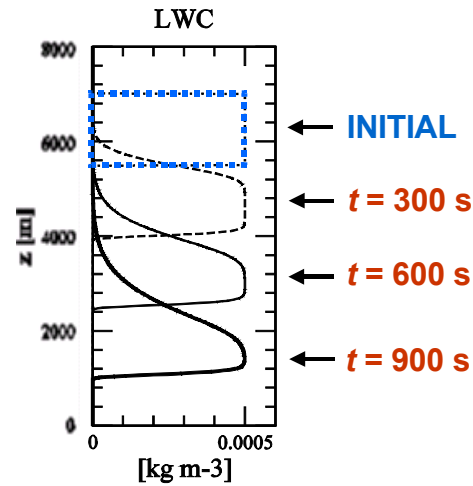
$$\mu = 0$$

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

* Wacker and Lüpkes (2009)

BULK MICROPHYSICS SCHEMES

Sedimentation: 1-MOMENT scheme



$$M_3$$
$$(\rho q_r)$$

Initial Conditions:

$$\rho q = 0.5 \text{ g m}^{-3}$$

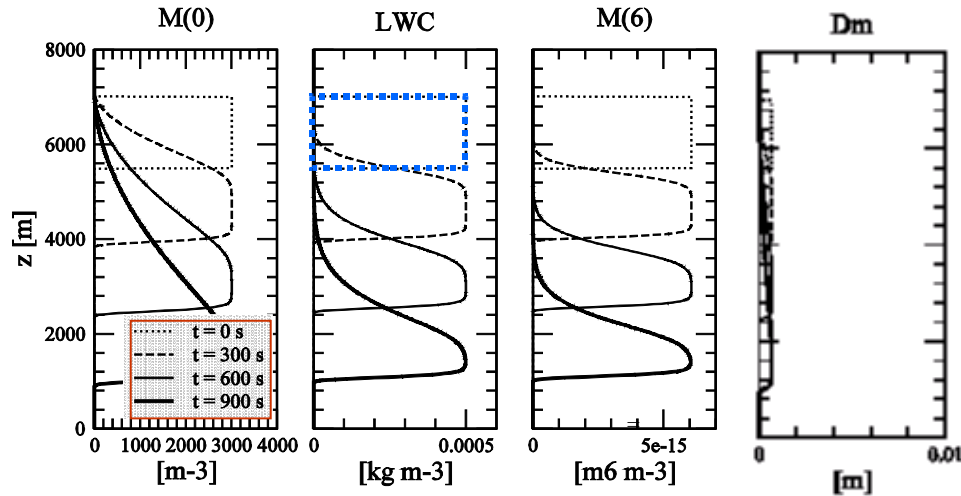
$$N_0 = 8 \times 10^6 \text{ m}^{-4}$$

$$\mu = 0$$

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

BULK MICROPHYSICS SCHEMES

Sedimentation: 1-MOMENT scheme



$$M_0$$

$$(N_{Tr})$$

$$M_3$$

$$(\rho q_r)$$

$$M_6$$

$$(Z_r)$$

$$D_m = \left[\frac{M_3}{M_0} \right]^{\frac{1}{3}}$$

Initial Conditions:

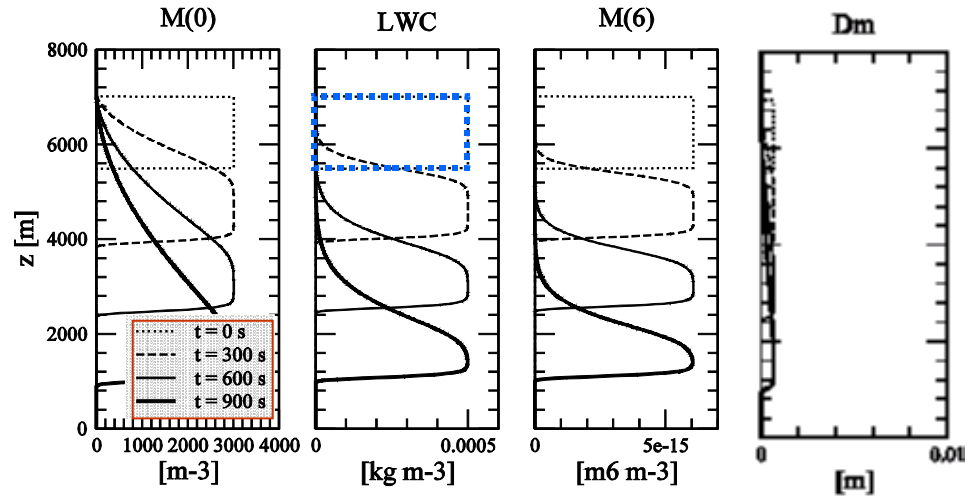
$$\rho q = 0.5 \text{ g m}^{-3}$$

$$N_0 = 8 \times 10^6 \text{ m}^{-4}$$

$$\mu = 0$$

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

BULK MICROPHYSICS SCHEMES



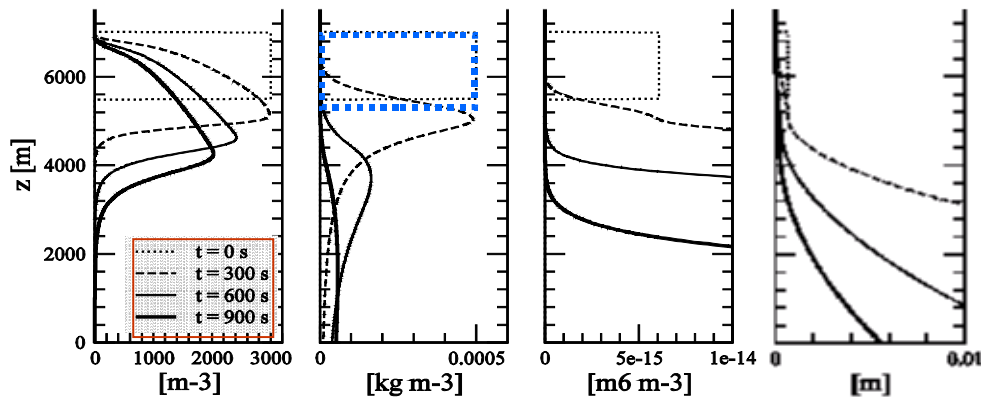
Initial Conditions:

$$\rho q = 0.5 \text{ g m}^{-3}$$

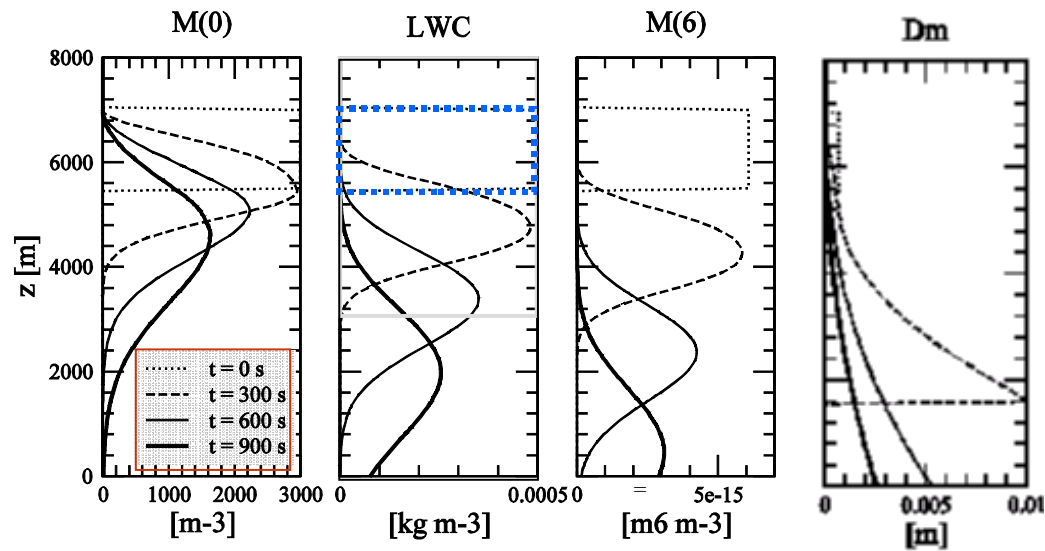
$$N_0 = 8 \times 10^6 \text{ m}^{-4}$$

$$\mu = 0$$

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



Analytic bin model calculation: (1D column)



$$M_0$$

$$(N_{Tr})$$

$$M_3$$

$$(\rho q_r)$$

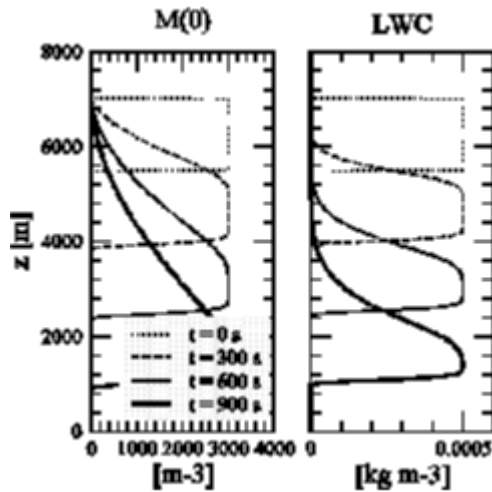
$$M_6$$

$$(Z_r)$$

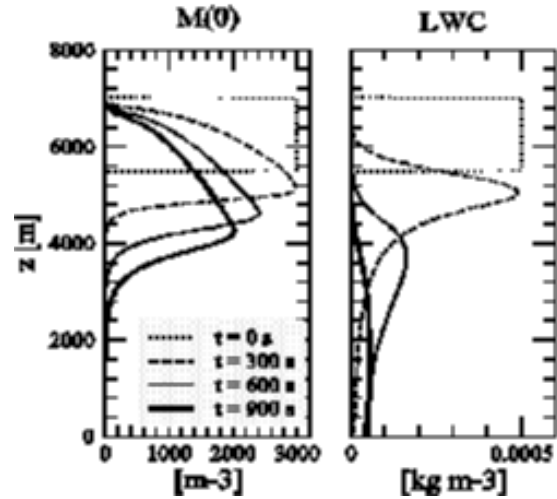
$$D_m = \left[\frac{M_3}{M_0} \right]^{\frac{1}{3}}$$

Evaluation approach: COMPARE PROFILES of prognostic moments

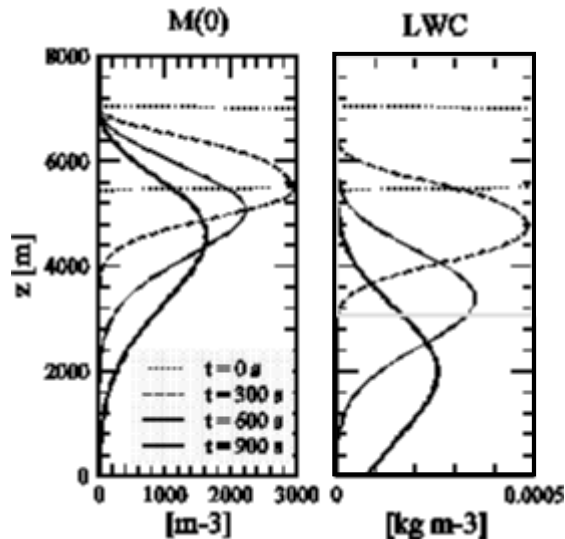
1-MOMENT



2-MOMENT



ANALYTIC



Useful information,
BUT ...

... other moments are important for microphysical growth rates

e.g. continuous collection of cloud water (CL_{cx}):

$$\left. \frac{dq_x}{dt} \right|_{CL} = \int_0^{\infty} \left. \frac{dm(D)}{dt} \right|_{CL} N(D) dD$$

$$\left. \frac{dm(D)}{dt} \right|_{CL} = \frac{\pi D^2}{4} V(D) E_{xc} \rho q_c = \left(\frac{\pi}{4} E_{xc} \rho q_c \right) D^{2+b_x}$$

$$\left. \frac{dq_x}{dt} \right|_{CL} = \left(\frac{\pi}{4} E_{xc} \rho q_c \right) \int_0^{\infty} D^{2+b_x} N(D) dD$$

→ $\left. \frac{dq_x}{dt} \right|_{CL} \propto M_{2+b_x}$

$$\left[M_x(p) \equiv \int_0^{\infty} D^p N_x(D) dD \right]$$

The p^{th} moment of $N_x(D)$

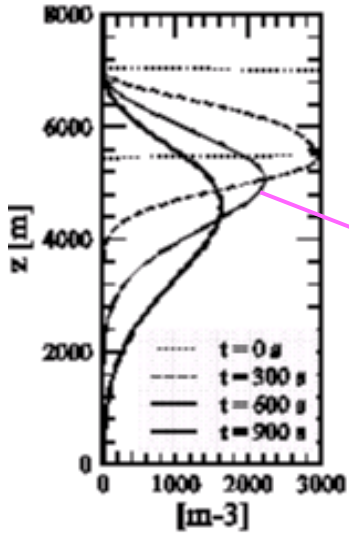
... etc. for other processes.

Most processes depend on moments between M_0

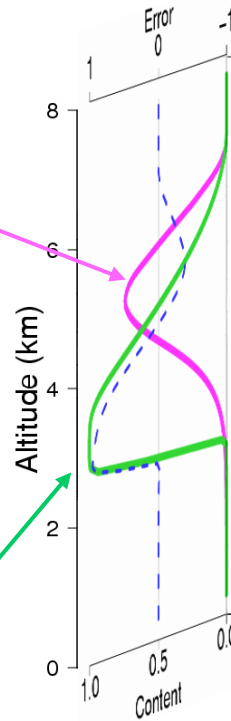
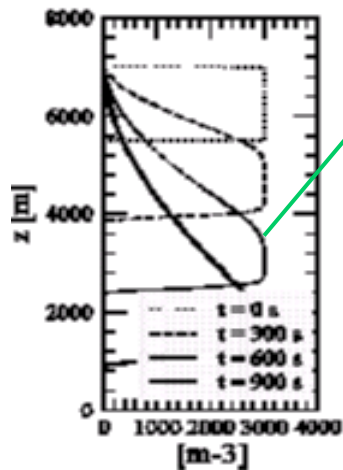
and M_{3+b}

Comparisons of profiles of a given moment: M_0

ANALYTIC



1-MOMENT

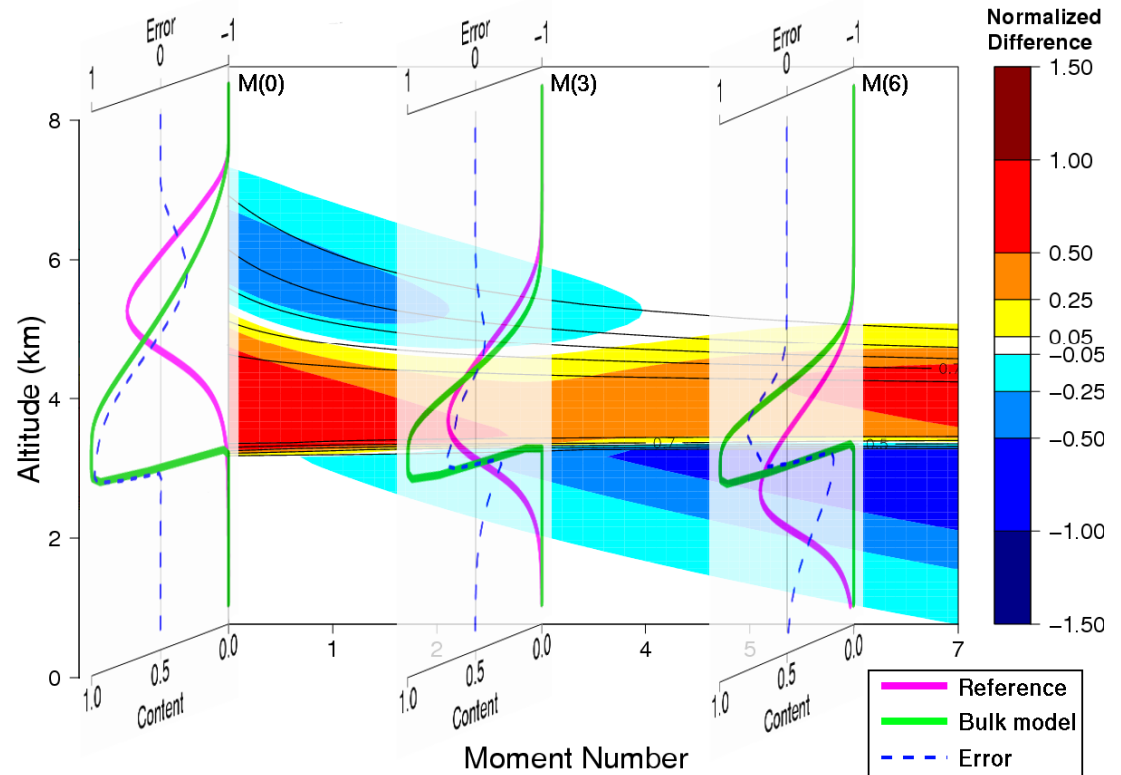


For a given time:

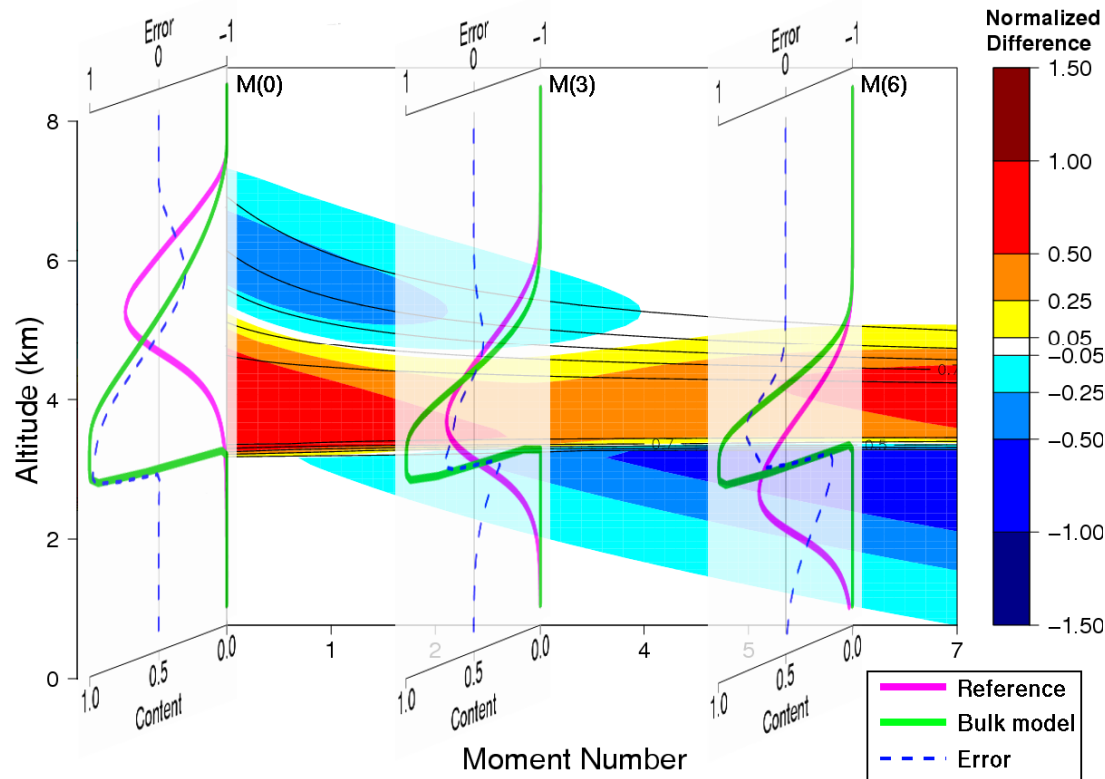
- sedimentation profiles are plotted (for both **analytic** and **bulk** models)
- **errors** (differences, normalized against the initial value) are computed

Error plots for a range of computed moments: $M_0 - M_7$ (for a given time)

Normalized Errors are
POSITIVE / **NEGATIVE**



“Standard” * 1-MOMENT Scheme:



*

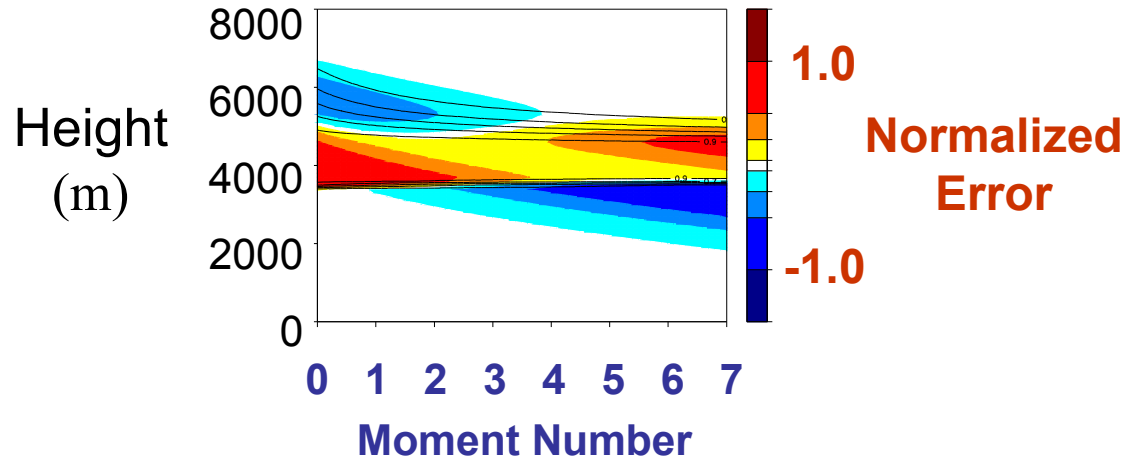
$$N_x(D) = N_{0x} D^{\mu_x} e^{-\lambda_x D}$$

Prognostic $M_3(q)$

Fixed N_0

Fixed $\mu = 0$

“Standard”^{*} 1-MOMENT Scheme:



*

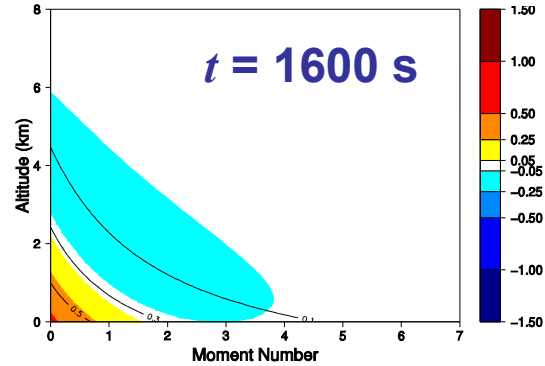
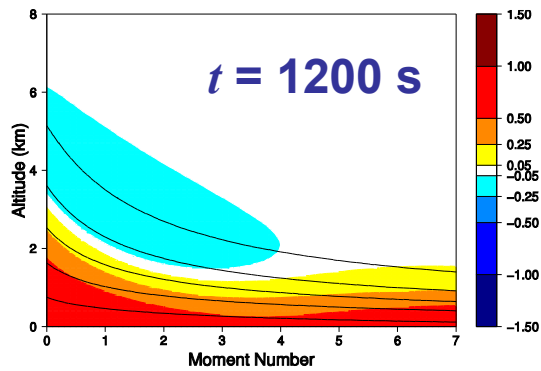
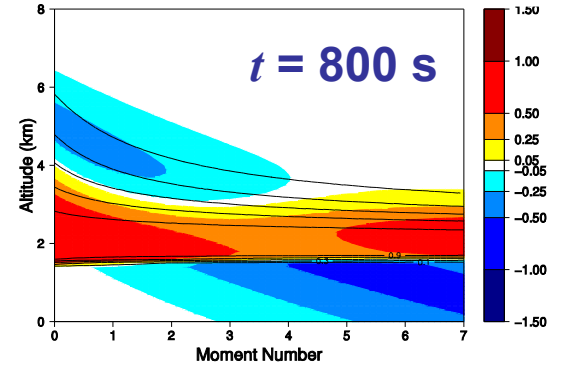
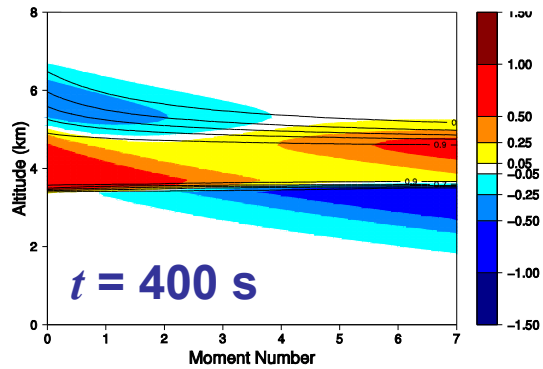
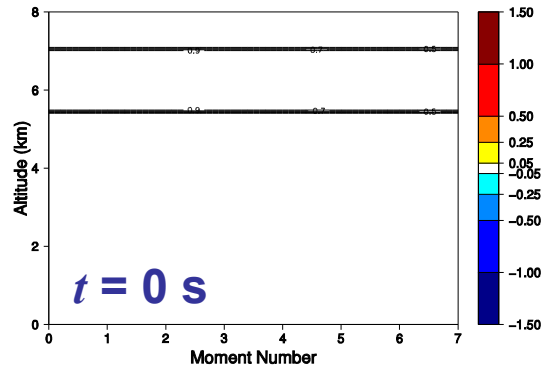
$$N_x(D) = N_{0x} D^{\mu_x} e^{-\lambda_x D}$$

Prognostic $M_3(q)$

Fixed N_0

Fixed $\mu = 0$

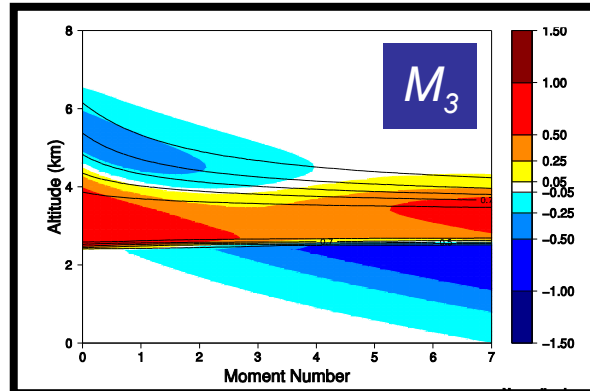
“Standard” 1-MOMENT Scheme:



“Standard” Bulk Schemes

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

1-moment:

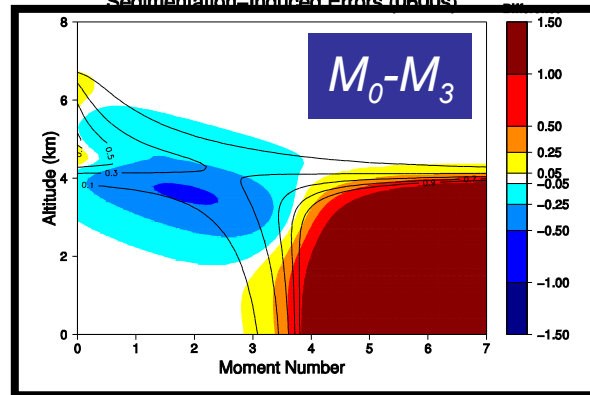


Prognostic $M_3(q)$

Fixed N_0

Fixed $\mu = 0$

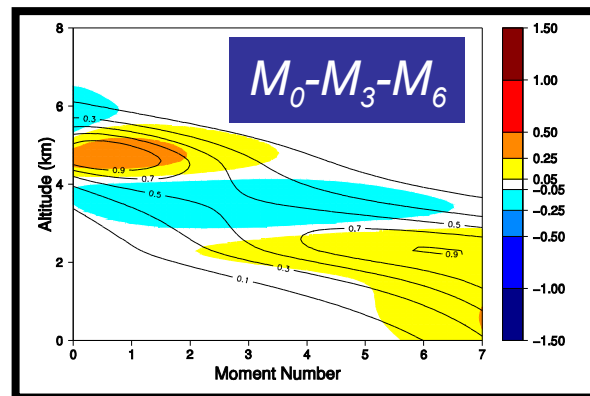
2-moment:



Prognostic $M_0(N_T), M_3(q)$

Fixed $\mu = 0$

3-moment:



Prognostic

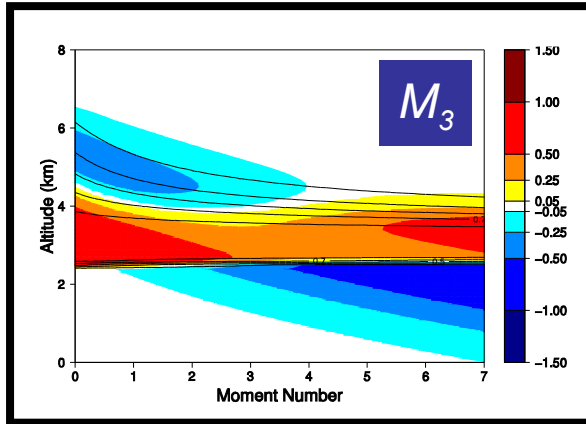
$M_0(N_T), M_3(q), M_6(Z)$

$t = 600 \text{ s}$

Prognostic Moment(s)

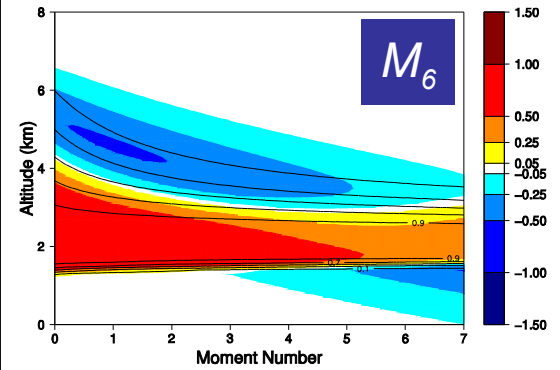
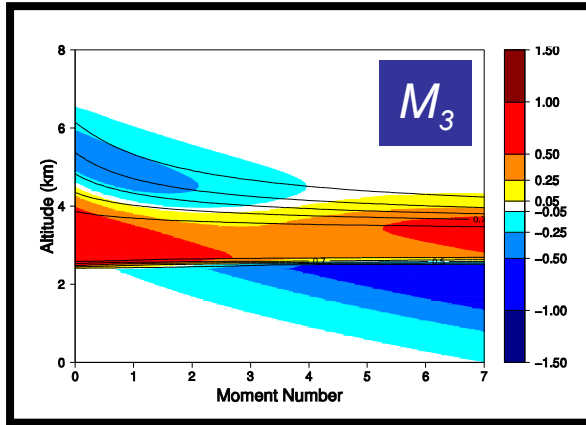
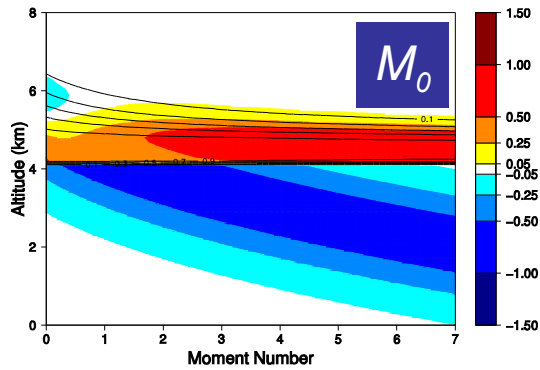
Alternative Choices of Prognostic Moments:

1-MOMENT schemes



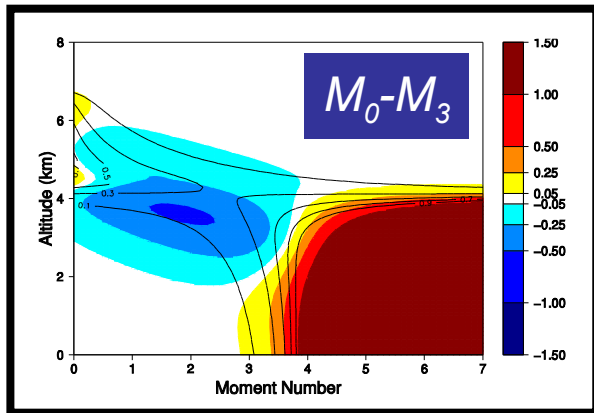
Alternative Choices of Prognostic Moments:

1-MOMENT schemes



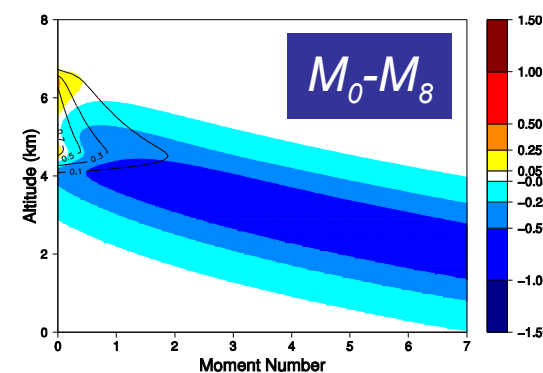
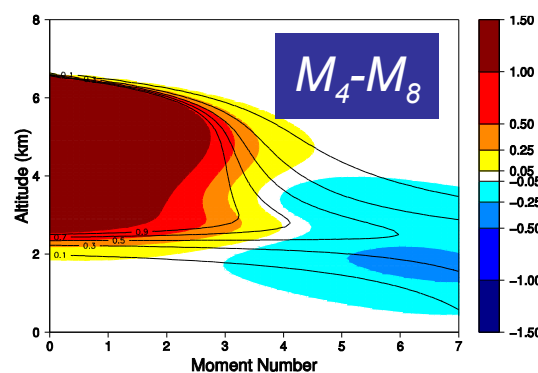
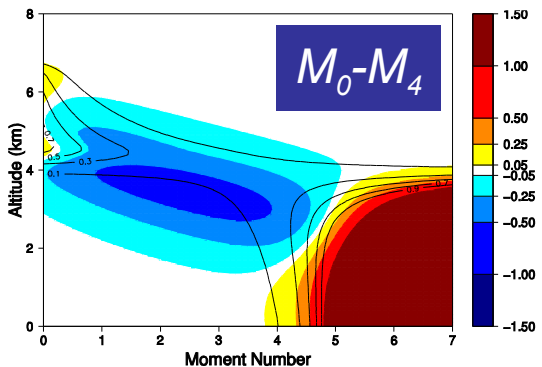
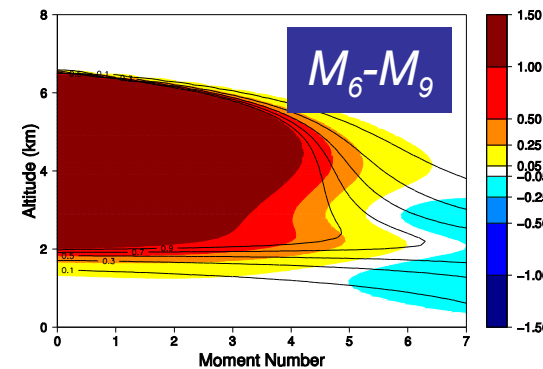
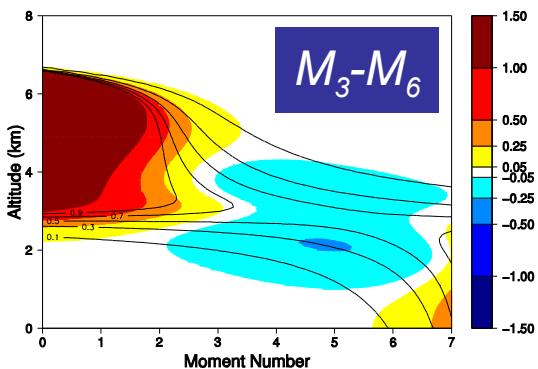
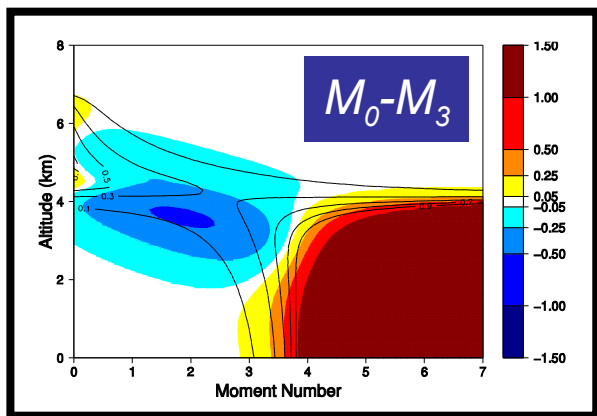
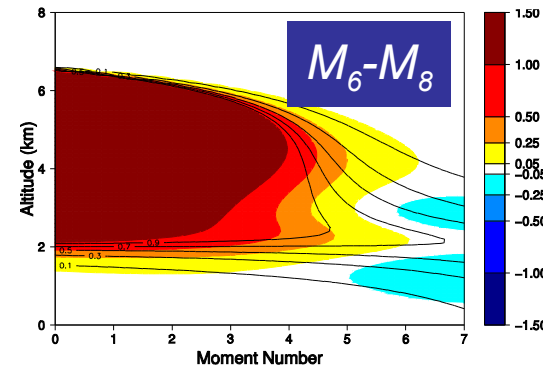
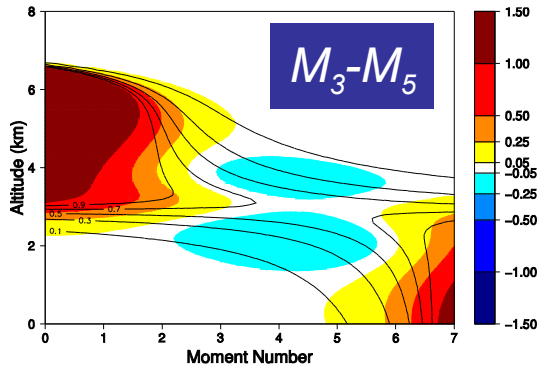
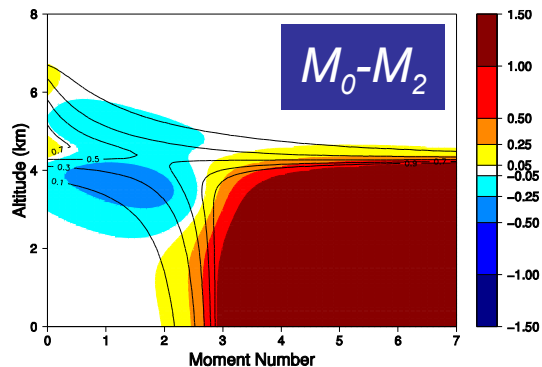
Alternative Choices of Prognostic Moments:

2-MOMENT schemes



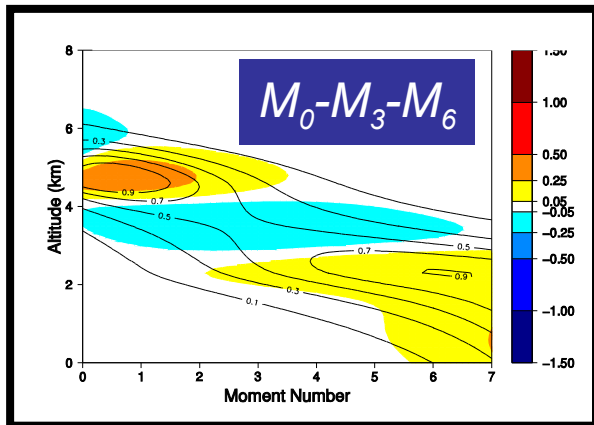
Alternative Choices of Prognostic Moments:

2-MOMENT schemes



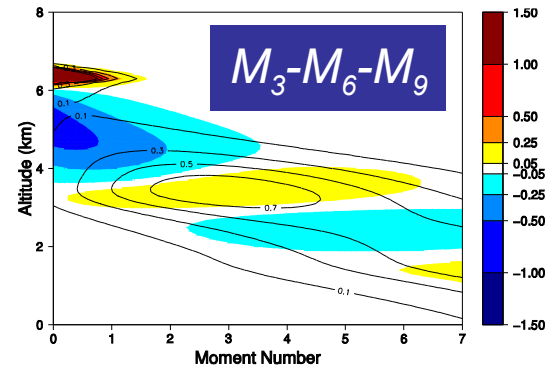
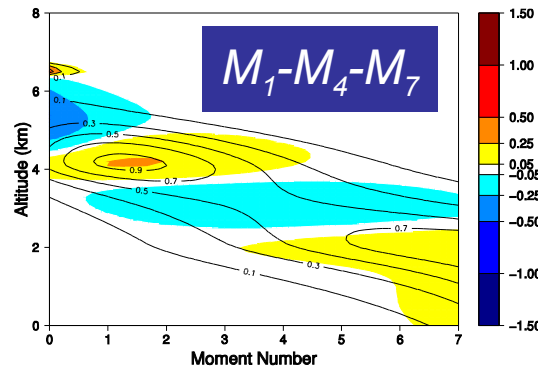
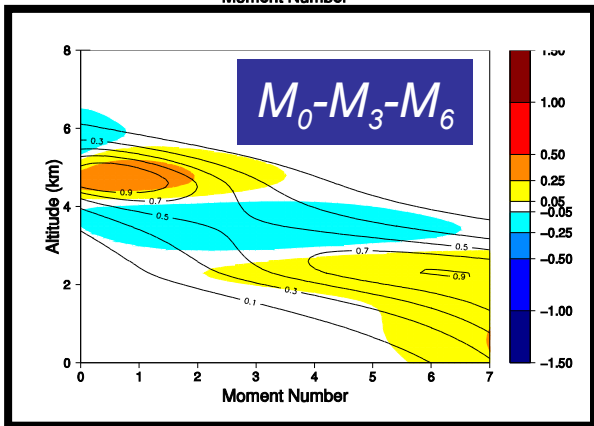
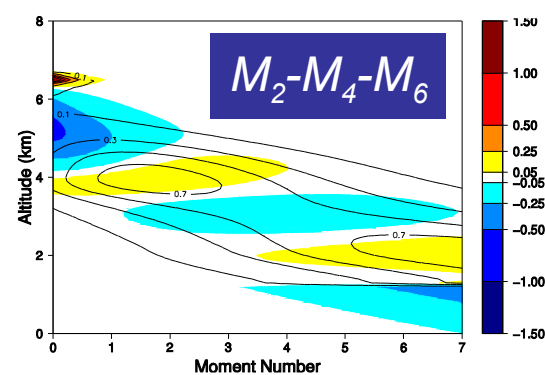
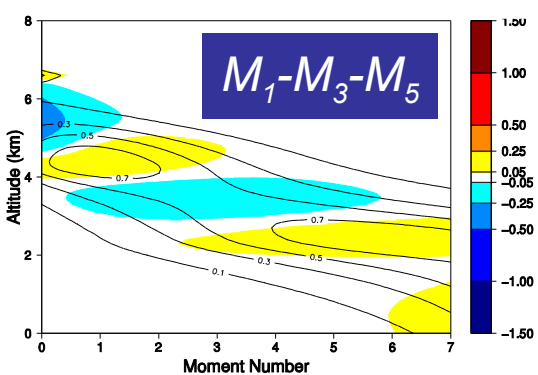
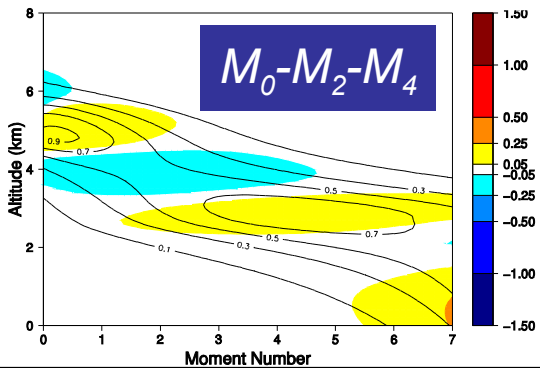
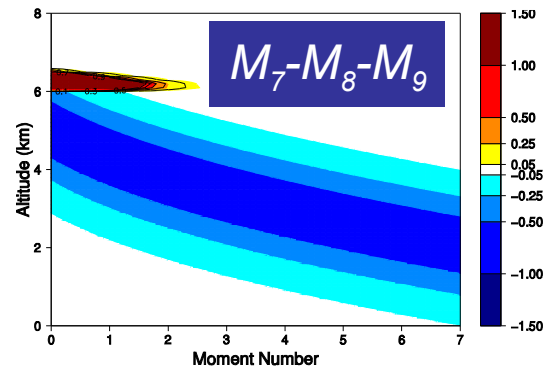
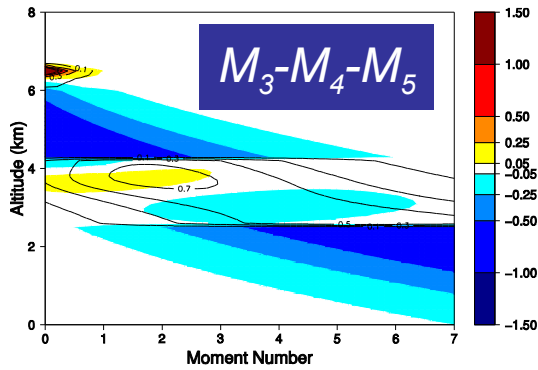
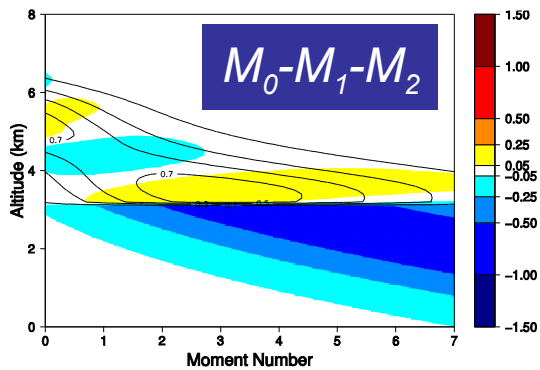
Alternative Choices of Prognostic Moments:

3-MOMENT schemes



Alternative Choices of Prognostic Moments:

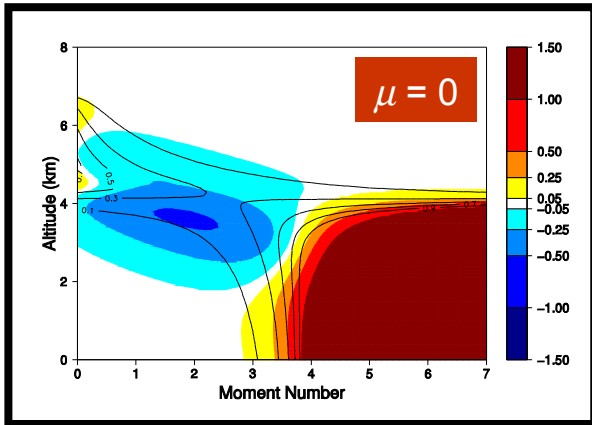
3-MOMENT schemes



Alternative treatment of the shape parameter:

2-MOM schemes

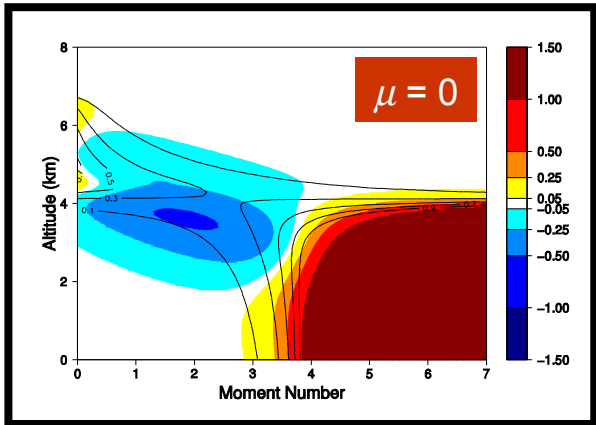
$M_0 - M_3$



Alternative treatment of the shape parameter:

2-MOM schemes

$M_0 - M_3$

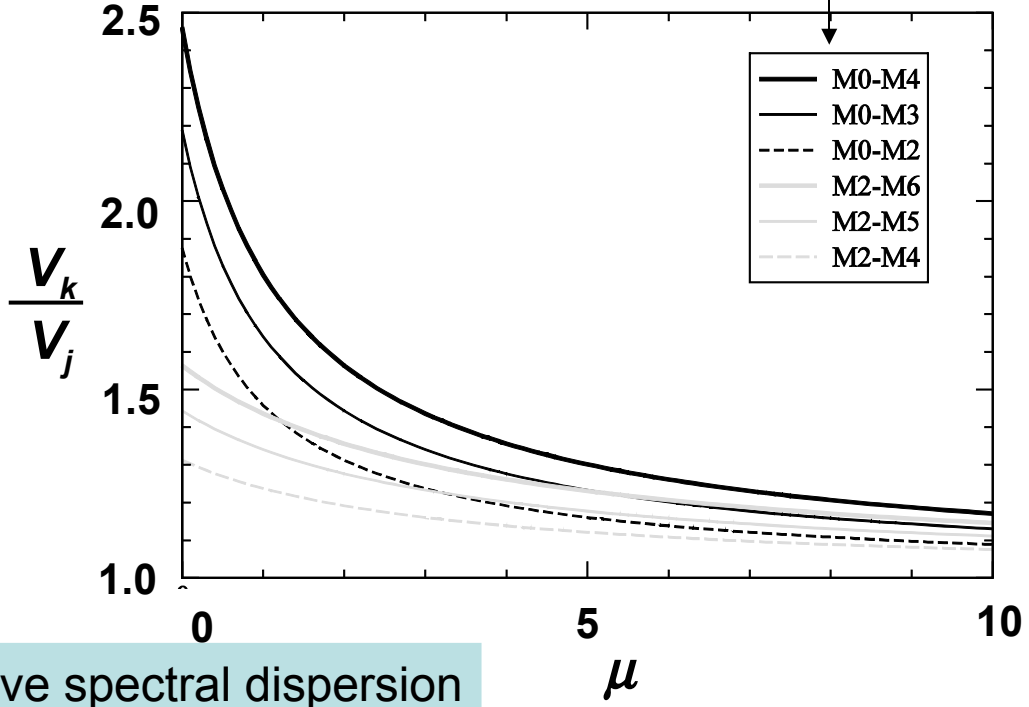


$$N_x(D) = N_{0x} D^{\mu_x} e^{-\lambda_x D}$$

Different pairs of moments, k and j

Rate of size-sorting is proportional to ratio V_k/V_j .

This ratio is a function of μ ; therefore, the value of μ controls the rate of size-sorting

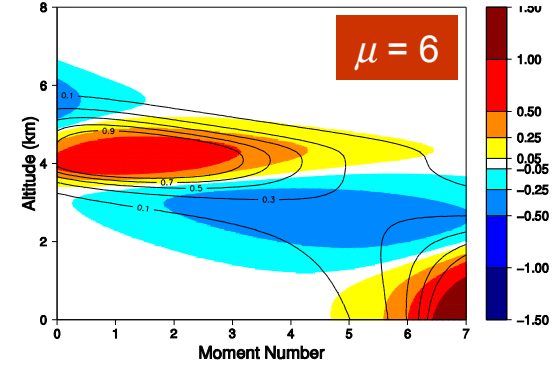
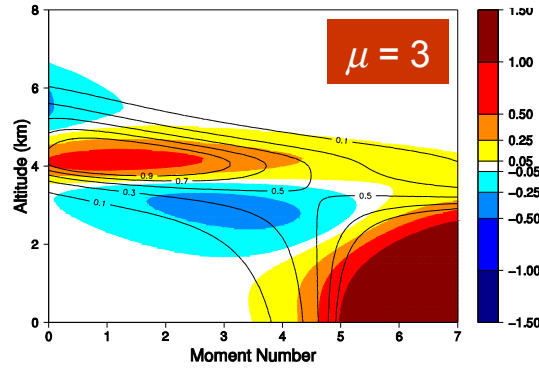
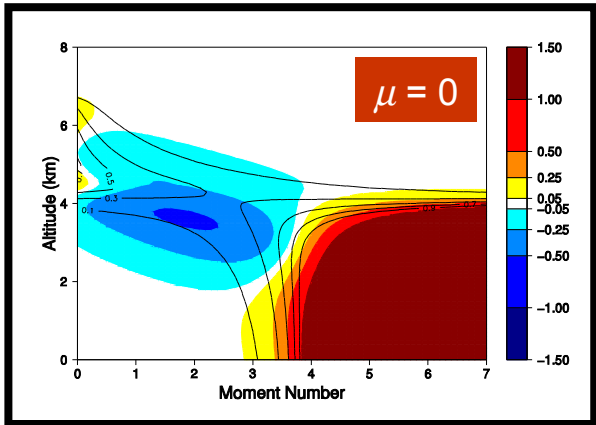


NOTE: μ is a measure of the relative spectral dispersion

Alternative treatment of the shape parameter:

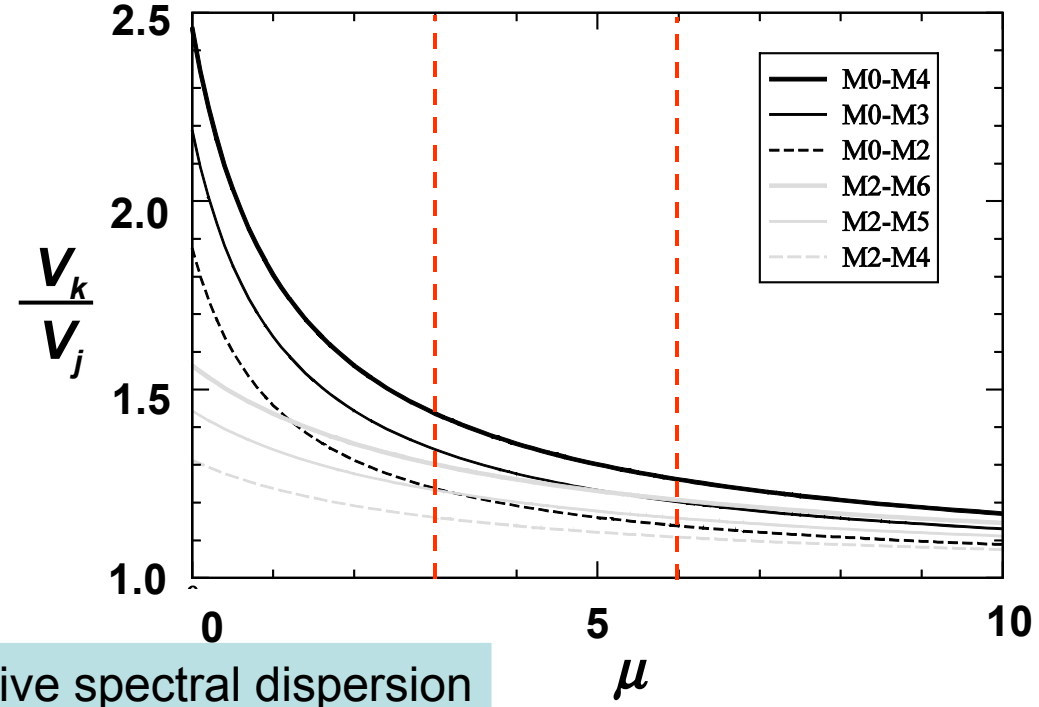
2-MOM schemes

$M_0 - M_3$



Rate of size-sorting is proportional to ratio V_k/V_j .

This ratio is a function of μ ; therefore, the value of μ controls the rate of size-sorting

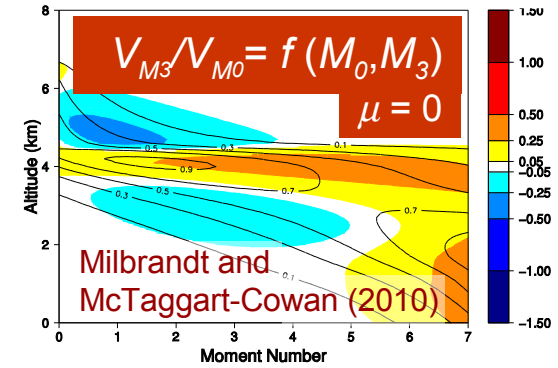
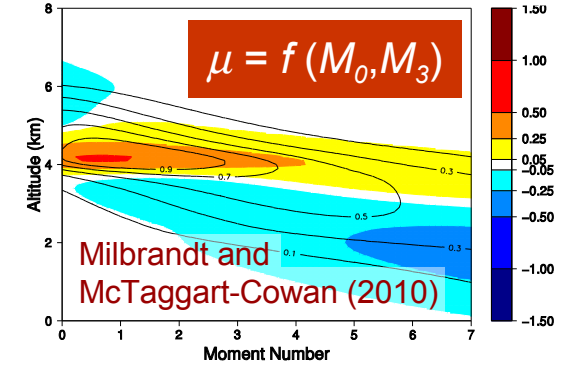
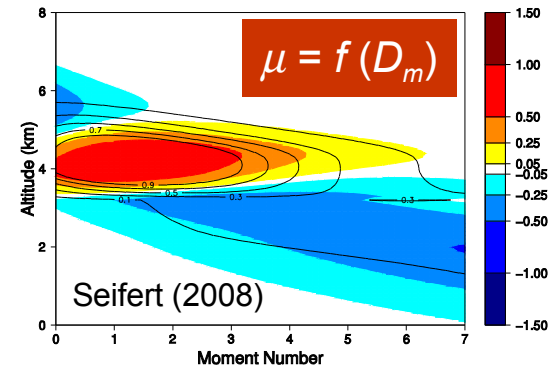
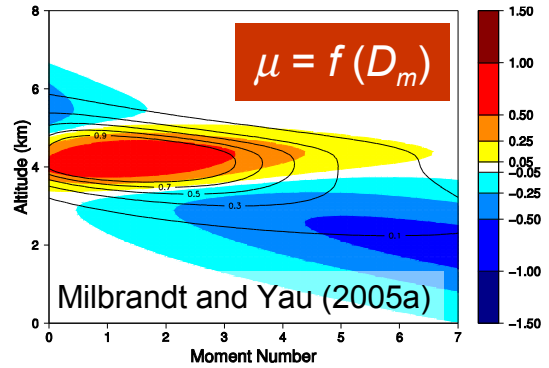
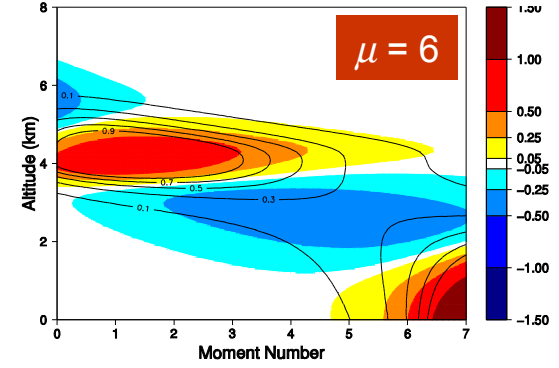
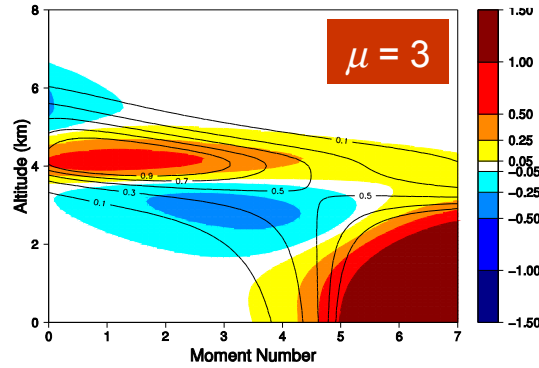
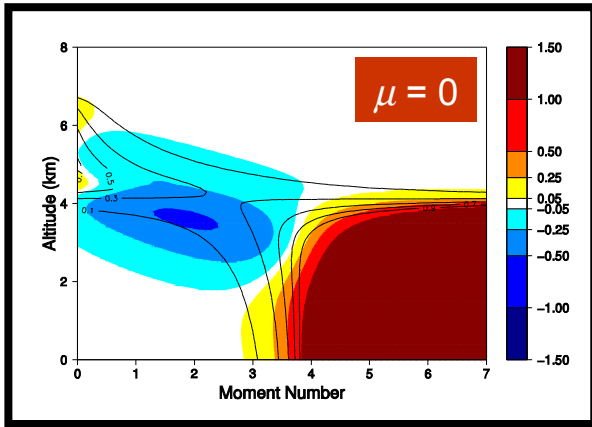


NOTE: μ is a measure of the relative spectral dispersion

Alternative treatment of the shape parameter:

2-MOM schemes

$M_0 - M_3$



(Generalized for any M_j, M_k combo)

CONCLUSION – Part 2

1. Minimizing the sedimentation-induced errors in “computed” moments is important
2. Errors can be shifted to different ranges of moments by choosing different prognostic moment(s)
3. 3-moment schemes are generally superior to 2-moment schemes in terms of reducing sedimentation-induced errors
4. **Existing 2-moment schemes can be dramatically improved by controlling excessive size sorting that results with a fixed DSD dispersion (shape parameter, μ)**

For more details: [Milbrandt and McTaggart-Cowan \(2010\)](#)
J. Atmos. Sci. (in press)

Current Research in Microphysics Parameterization

1. Prognostic Snow Density
2. Sedimentation-Induced Errors
- 3. Comparison of 2-Moment Schemes**

PREMISE:

- 1-moment BMSs suffer from the need to specify DSD parameters; 2-moment BMSs predict DSD more feely
- 2-moment BMSs can better represent certain processes (e.g. sedimentation, self-collection, drop breakup)
- **Implication:** Increasing complexity of a BMS tends towards truth

MOTIVATING QUESTIONS:

- Do similar 2-moment schemes produce similar results?
- What are the major sensitivities in 2-moment BMSs?

METHODOLOGY:

- Use similar 2-moment BMSs in a common modeling framework
- Conduct simulations (with each scheme) and compare results
- Identify, through sensitivity tests, the reasons for any major differences

METHODOLOGY:

- BMSs: **Morrison*** (MOR) and **Milbrandt-Yau**** (MY)
- Model: WRF (v3.1)
- Case: Idealized supercell (1-km, initial warm/moist bubble)

MOR

- + 2-moment (all categories*)
- + cloud, rain, ice, snow, graupel
- + fixed shape parameters (0)
- + $*N_c = 250 \text{ cm}^{-3}$

MY

- + 2-moment (all categories*)
- + cloud, rain, ice, snow, graupel, **hail**
- + fixed shape parameters (0)
- + $*N_c = 250 \text{ cm}^{-3}$

- similar fall velocity parameters
- similar warm rain coalescence parameterizations
- similar ice initiation
- different raindrop breakup parameterizations

*** As tested in this study ***

* Morrison et al. (2009), *Mon. Wea. Rev.*

** Milbrandt and Yau (2005), *J. Atmos. Sci.*

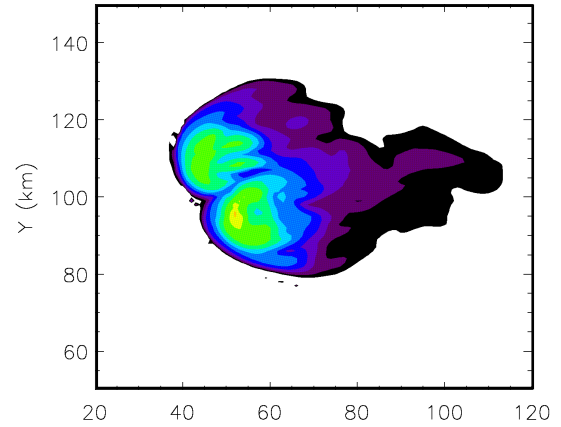
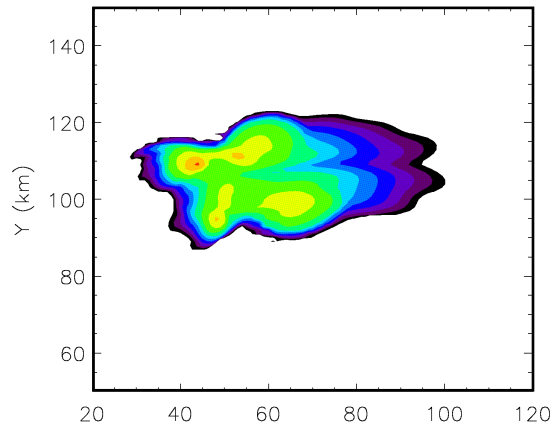
BASELINE (CONTROL) SIMULATIONS

Radar Reflectivity

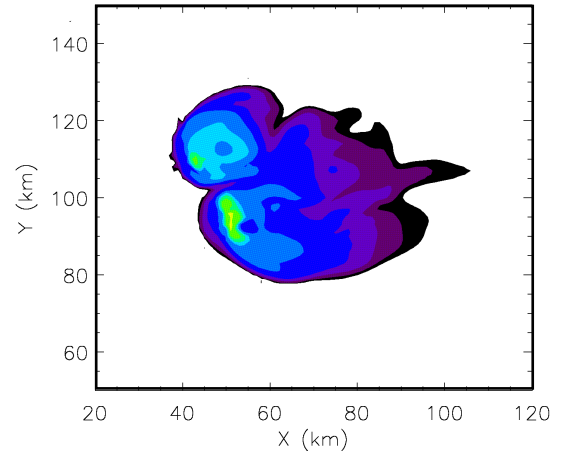
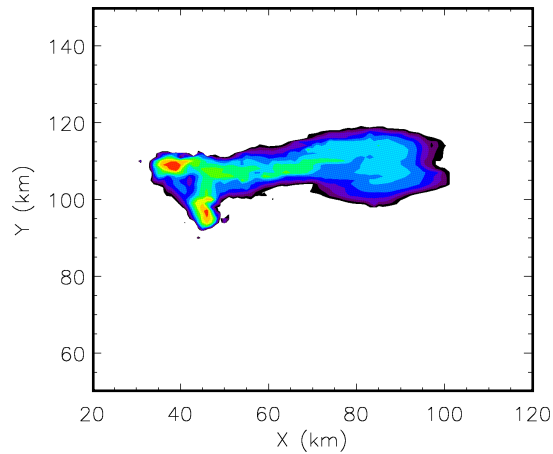
$z = 0.25$ km

$z = 11.6$ km

Morrison:
2-moment



Milbrandt-Yau:
2-moment



$t = 60$ min

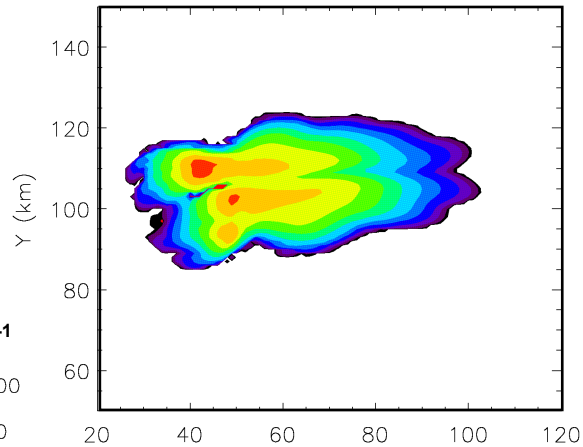
BASELINE (CONTROL) SIMULATIONS

Evaporative cooling rates

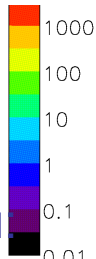
Cold Pool Strength* (θ')

$z = 0.25$ km

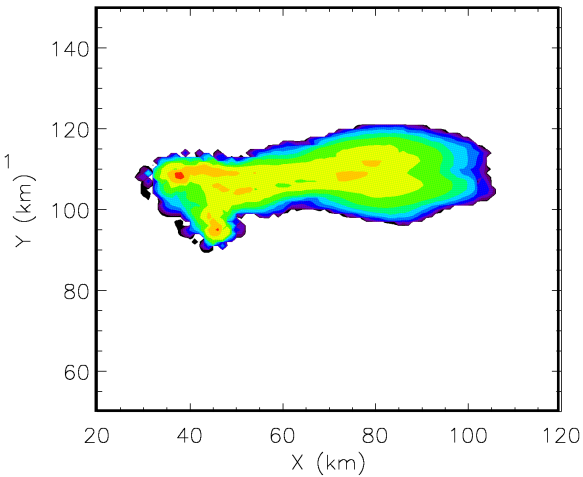
Morrison:
2-moment



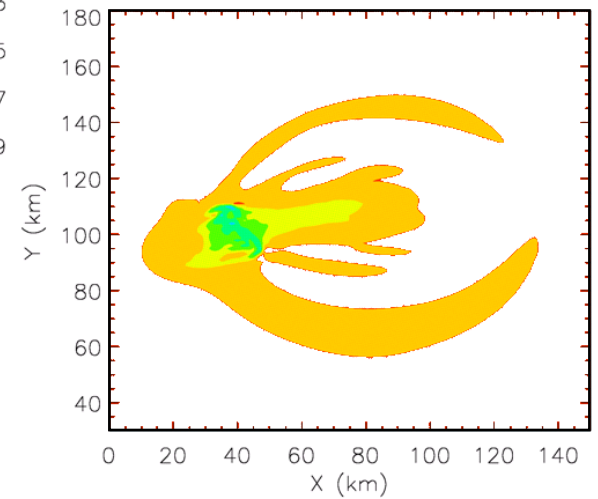
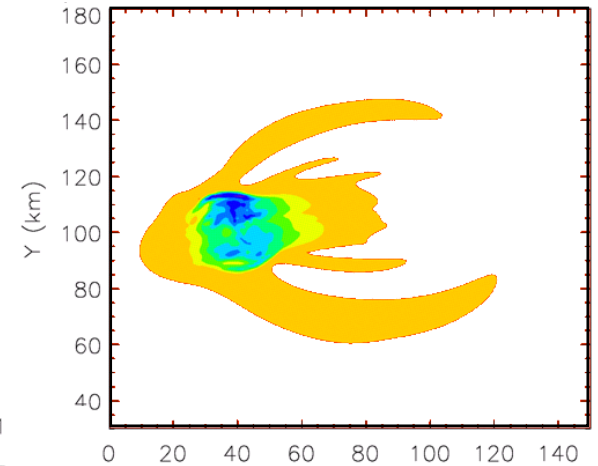
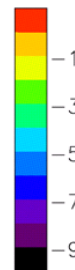
K day⁻¹



Milbrandt-Yau
2-moment



K



BASELINE (CONTROL) SIMULATIONS

Vertical Velocity

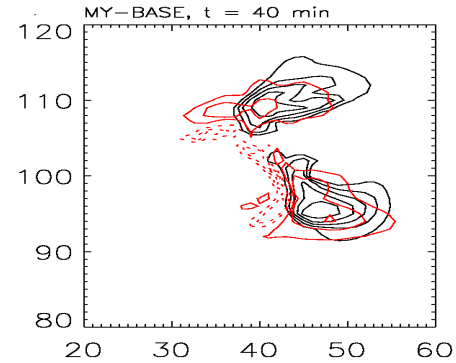
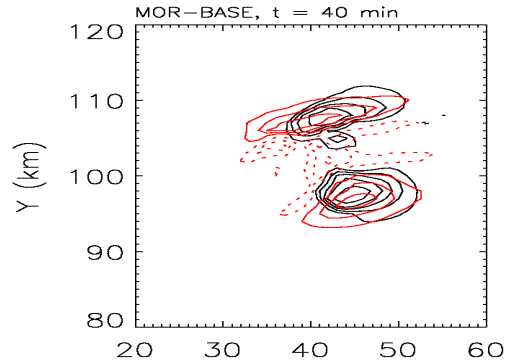
$z = 0.8 \text{ km}$

$z = 4.7 \text{ km}$

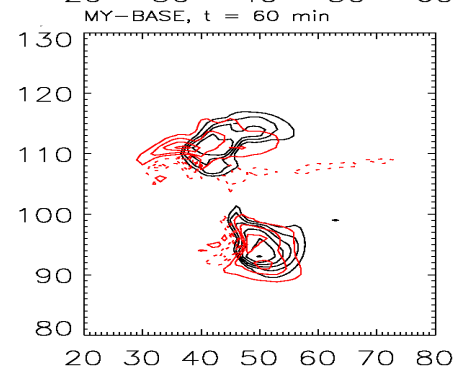
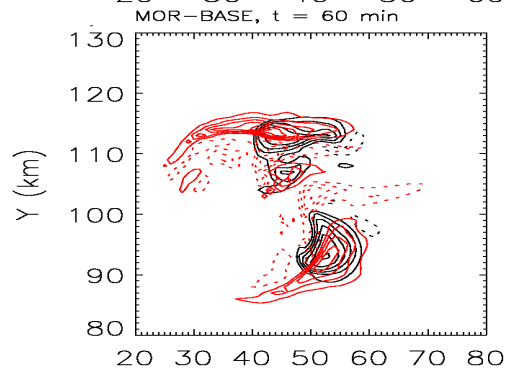
Morrison:

Milbrandt-Yau:

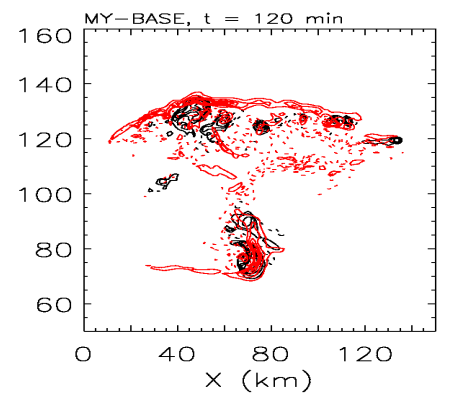
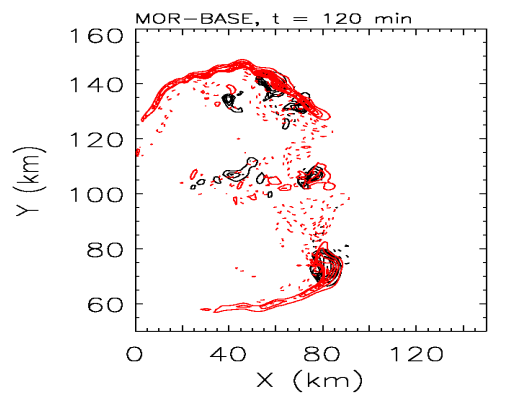
$t = 40 \text{ min}$



$t = 60 \text{ min}$



$t = 120 \text{ min}$



SENSITIVITY EXPERIMENTS: 1. GRAUPEL vs. HAIL

Morrison:

category $x = \textit{graupel}$	$\rightarrow \rho_g = 400 \text{ kg m}^{-3}$ $V_g \sim 1 - 3 \text{ m s}^{-1}$	}	medium-density GRAUPEL
OR			
category $x = \textit{hail}$	$\rightarrow \rho_g = 900 \text{ kg m}^{-3}$ $V_g \sim 10 - 40 \text{ m s}^{-1}$	}	high-density HAIL
\rightarrow with a switch to toggle between types			

Milbrandt-Yau:

category $x = \textit{graupel}$	$\rightarrow \rho_g = 400 \text{ kg m}^{-3}$ $V_g \sim 1 - 3 \text{ m s}^{-1}$	}	medium-density GRAUPEL
AND			
category $x = \textit{hail}$	$\rightarrow \rho_h = 900 \text{ kg m}^{-3}$ $V_h \sim 10 - 40 \text{ m s}^{-1}$	}	high-density HAIL
\rightarrow with switches to shut OFF either category			

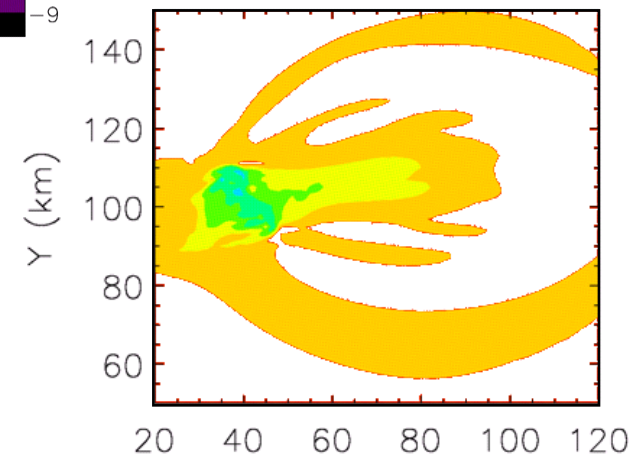
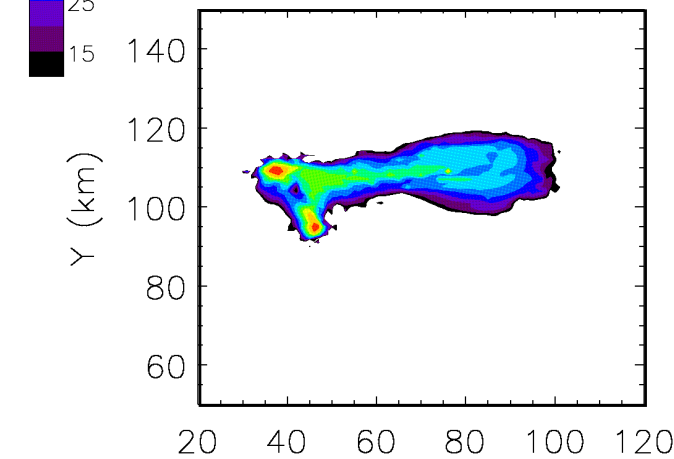
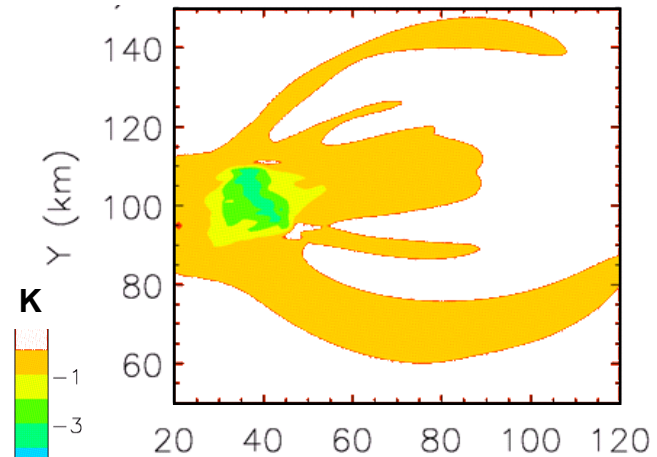
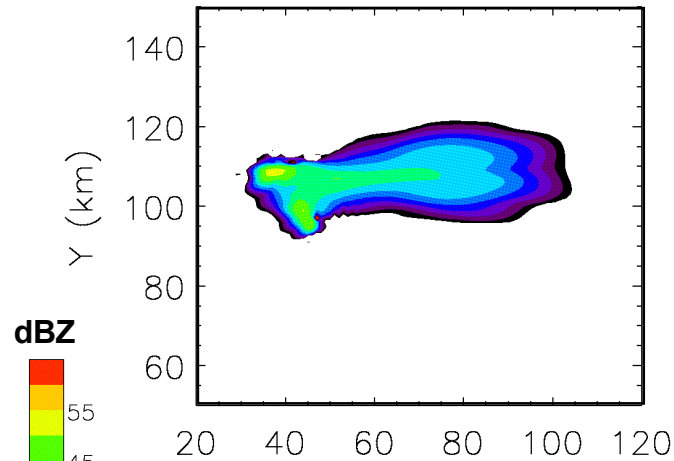
SENSITIVITY EXPERIMENTS: 1. GRAUPEL vs. HAIL

Morrison:
GRAUPEL - only

Milbrandt-Yau:
GRAUPEL - only

Radar Reflectivity

Cold Pool Strength* (θ')



$z = 0.25$ km

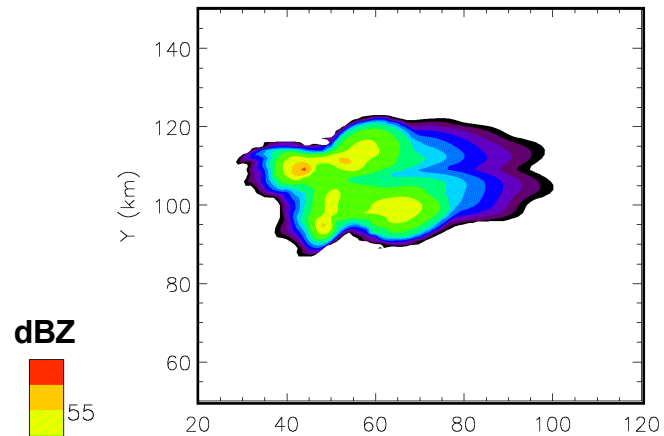
SENSITIVITY EXPERIMENTS: 1. GRAUPEL vs. HAIL

Morrison:
HAIL - only
(BASELINE)

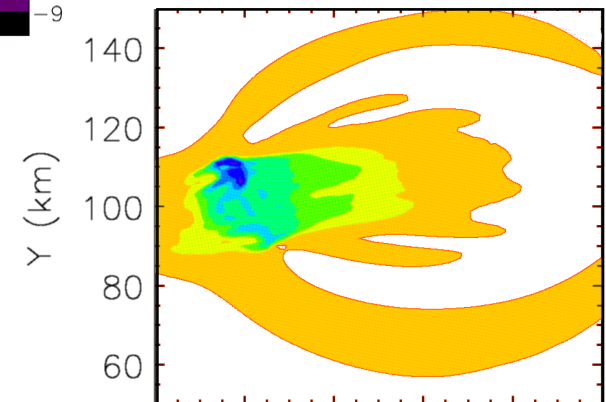
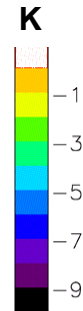
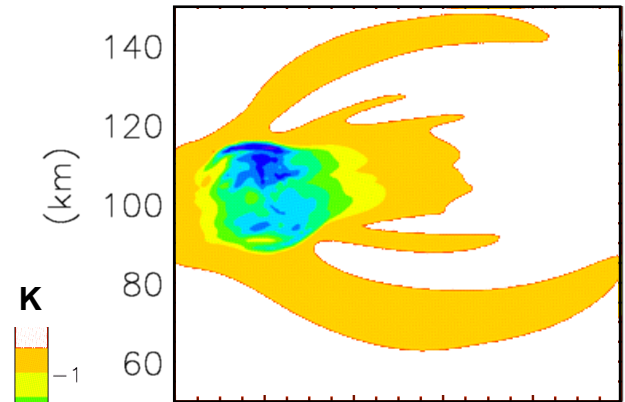
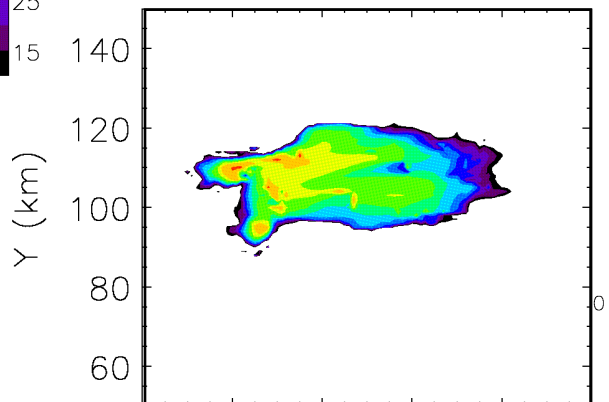
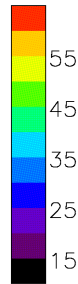
Milbrandt-Yau:
HAIL - only

Radar Reflectivity

Cold Pool Strength* (θ')



dBZ

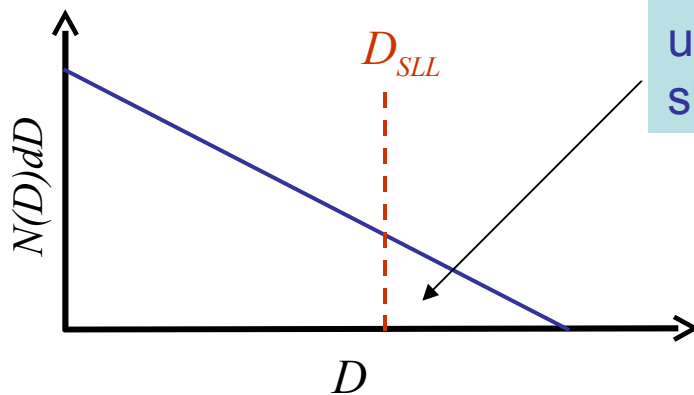


$z = 0.25$ km

CONVERSION of *GRAUPEL* to *HAIL*

- When a frozen particle growing by accretion first reaches the Shumann-Ludlam limit (*SLL*), it is termed a hailstone (Young, 1993)
- The size of a particle at the *SLL* is a function of the ambient T , LWC , and IWC :

$$D_{SLL} = 0.01 \exp\left(\frac{-T_c}{1 \times 10^4 \rho (q_c + q_r) - 1.3 \times 10^3 \rho q_i + 10^{-3}}\right)$$



This portion of *GRAUPEL* is undergoing wet growth and should therefore convert to *HAIL*

***GRAUPEL* size distribution**

Strictly, the incomplete gamma distribution ($D_{SLL} \rightarrow \infty$) should be evaluated

Currently in Milbrandt-Yau scheme:

$$\rightarrow CN_{gh} = \frac{D_{mg}}{2D_{SLL}} (CL_{cg} + CL_{rg} + CL_{ig})$$

SENSITIVITY EXPERIMENTS: 2. PARAMETERIZATION OF DROP BREAKUP

Raindrop breakup is parameterized by:

1. Imposing a drop size-limiter (maximum D_{r_mean})

MORRISON: $D_{r_max} = 0.9 \text{ mm}$

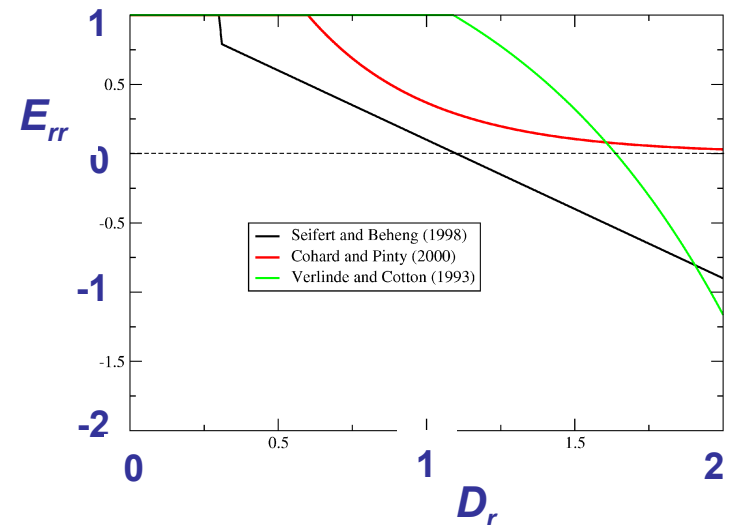
MILBRANDT-YAU: $D_{r_max} = 5.0 \text{ mm}$

2. Reduction of collection efficiency in rain self-collection equation

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

MORRISON: none

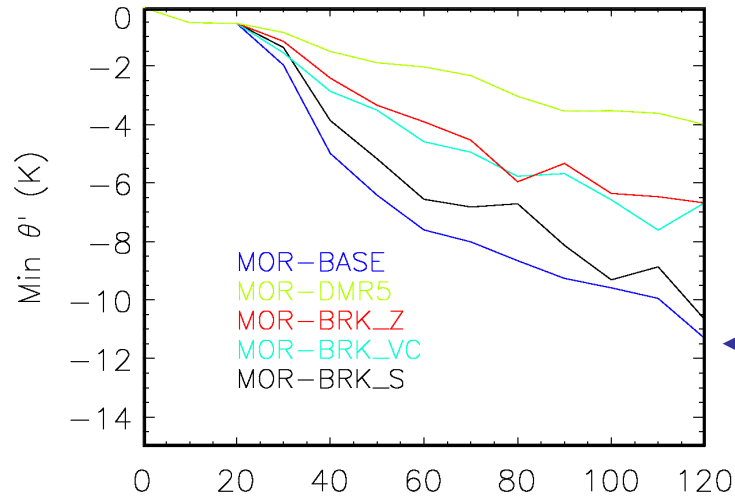
MILBRANDT-YAU: Ziegler (1985)



SENSITIVITY EXPERIMENTS: 2. PARAMETERIZATION OF DROP BREAKUP

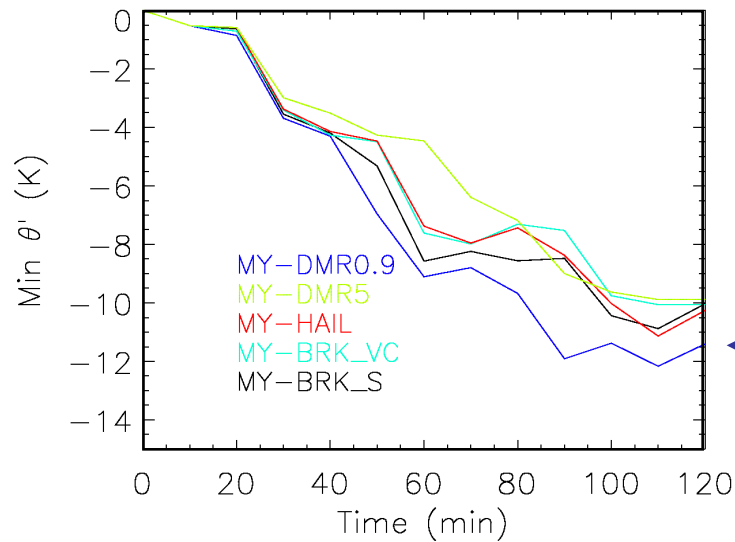
Cold Pool Strength* (min. θ')

Morrison:
2-moment



← MOR-Baseline

Milbrandt-Yau:
2-moment



← MY- $D_{max} = 0.9$ mm

All runs with HAIL-only

CONCLUSION – Part 3

1. The simulation of deep convection can be sensitive to the parameterization of graupel/hail in a 2-moment BMS
2. The simulation of deep convection can be very sensitive to the parameterization of raindrop breakup (depending on how the ice-phase results in big/little drops)
3. **Increasing complexity in a BMS does not necessarily lead to convergence**

For more details: Morrison and Milbrandt (2010)
Mon. Wea. Rev. (accepted)

CONCLUSION – Part 3

1. The simulation of deep convection can be sensitive to the parameterization of graupel/hail in a 2-moment BMS
2. The simulation of deep convection can be very sensitive to the parameterization of raindrop breakup (depending on how the ice-phase results in big/little drops)
3. **Increasing complexity in a BMS does not necessarily lead to convergence**

Continued research: (collaboration with NCAR)

→ To examine the sensitivity of the parameterization of specific processes in 2-moment schemes – though sensitivity studies and comparison to observation – towards understanding the behavior of these schemes and of the microphysics of storm systems

Current Research and Development

1. Upgrade of 2-moment (M-Y) scheme for HRDPS

- diagnostic μ_r and μ_h
- new parameterization for hail initiation

2. Development of simplified version for RDPS

- reduction to essential categories and processes
- time-splitting for microphysics

3. Development* of version for GDPS

- cloud (and precipitation) fraction
- * current research of Frederick Chosson ([McGill University](#))

An aerial photograph of a vast, flat landscape, likely a coastal plain or delta, with scattered white clouds and a winding river or canal visible in the distance. The text "THANK YOU" is overlaid in large, bold, blue letters with a black outline.

THANK YOU

Acknowledgments

LAM-V10 Development Team (RPN and CMDN)

Ron McTaggart-Cowan (RPN)

Hugh Morrison (NCAR)

Milbrandt-Yau* Multi-Moment Scheme

- Six hydrometeor categories:
 - 2 liquid: **cloud** and **rain**
 - 4 frozen: **ice**, **snow**, **graupel** and **hail**
 - Each size spectrum described by a 3-parameter gamma distribution function
→ **Full version has 17 prognostic variables**
- $N_x(D) = N_{0x} D^{\alpha_x} e^{-\lambda_x D}$
- ~ 50 distinct microphysical processes
- **Diagnostic- α_x** relations added for 2-moment version
- **Predictive equations for Z_x** added for 3-moment version

* Milbrandt and Yau (2005a,b) *J. Atmos. Sci.*

Milbrandt-Yau* Multi-Moment Scheme

Applications of Scheme: (since 2005)

- Implementation of 1-moment version for **GEM-LAM-2.5** system
- Implementation of 3-moment version into **ARPS** (U of Oklahoma)
- 2-moment version used for 2010 Vancouver Olympics (**1-km LAM**)
- 2-moment version implemented into official **WRF_v3.2**
- 2-moment version to be implemented into **HRDPS**

* Milbrandt and Yau (2005a,b) *J. Atmos. Sci.*