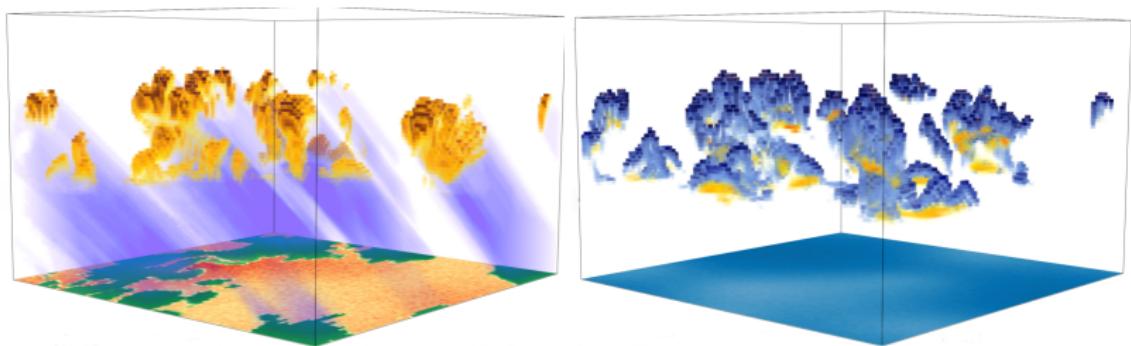


# 3D Radiative Transfer in Cloud Resolving Models

Fabian Jakub, Carolin Klinger

LMU - Meteorological Institute Munich



November 16, 2015

# Does 3D Radiative Transfer impact cloud evolution?

Earlier studies suggest radiation may affect

- ▶ cloud evolution and lifetime
- ▶ microphysical processes (condensation, nucleation)
- ▶ precipitation onset/amount
- ▶ convective organization

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Can we model radiative transfer in the atmosphere?



# $HD(CP)^2$

High definition clouds and precipitation  
for advancing climate prediction

- ▶ run hindcasts over Central Europe
- ▶ 100m horizontal resolution
- ▶ grids consisting of  $10.000 \times 15.000 \times 300$  voxels
- ▶ first develop a model capable of running it (ICON)
- ▶ ... with the goal to develop improved parameterizations for weather and climate predictions

# History of Radiative Transfer

Radiative Transfer theory well established

- ▶ radiative transfer equation (1960 Chandrasekhar)

$$\frac{dL}{k_{\text{ext}} \cdot ds} = -L + \frac{\omega_0}{4\pi} \int_{4\pi} p(\Omega', \Omega) L(\Omega') d\Omega' + (1 - \omega_0) B_{\text{Planck}}(T)$$

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# History of Radiative Transfer

Radiative Transfer theory well established

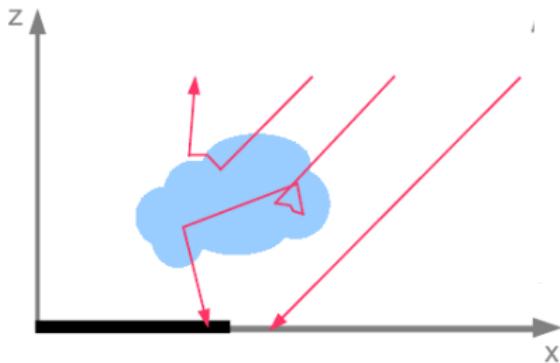
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- ▶ surprisingly well working 1D approximations
- ▶ sophisticated 3D models since the 90's (e.g. MonteCarlo)
- ▶ ... but orders of magnitude too slow to run in atmospheric models

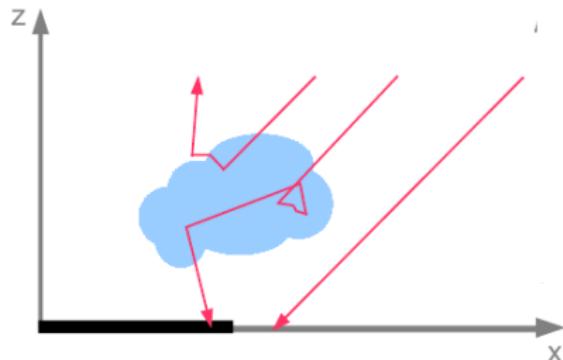
# Approximations for Radiative Transfer

Radiative transfer describes photon interactions with atmosphere.  
MonteCarlo modeling of scattering and absorption:



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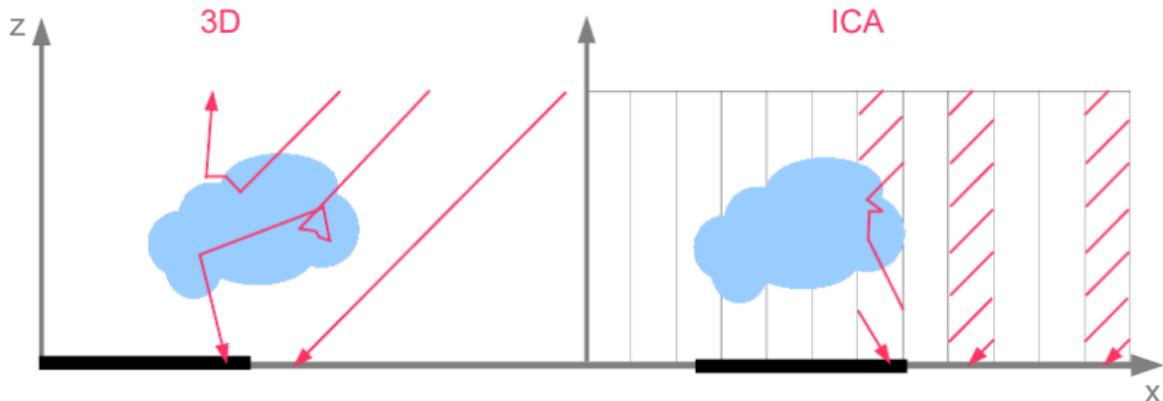


simplify to solve:

- ▶ Plane Parallel approx.
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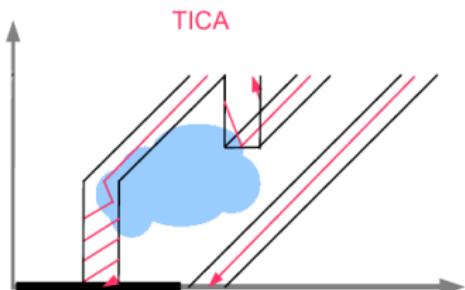


simplify to solve:

- ▶ Plane Parallel approx.
- ▶ Two-stream solvers
- ▶ Independent Column approx.
- ▶ diagonal band-matrix (5)

# A walk through the ages

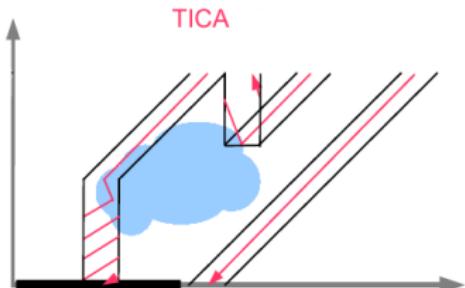
3D parameterizations – a tradition at MIM:



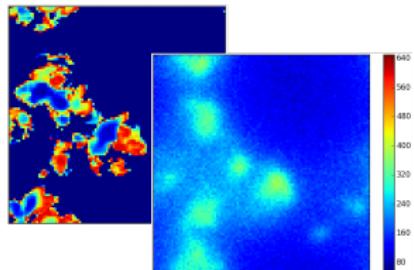
- ▶ Tilted-ICA (Gabriel and Evans 1996,  
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# A walk through the ages

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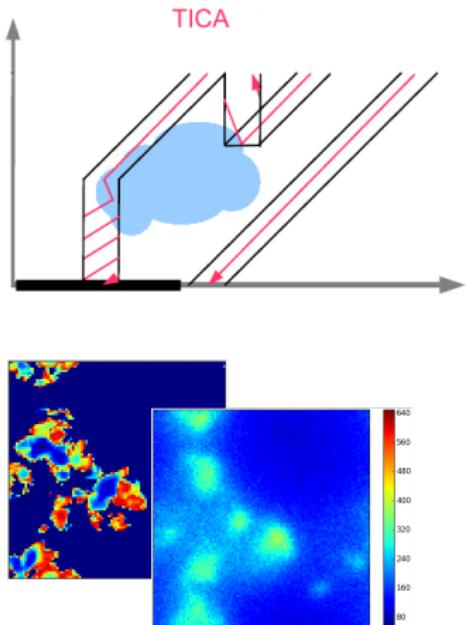


- ▶ Tilted-ICA (Gabriel and Evans 1996,  
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- ▶ Non-local ICA (Marshak 1998)



# A walk through the ages

3D parameterizations – a tradition at MIM:



- ▶ Tilted-ICA (Gabriel and Evans 1996, Varnai 1999)
- ▶ Non-local ICA (Marshak 1998)
- ▶ displaced shadow regions (Schumann 2002)
- ▶ TICA in EULAG (Wapler 2008)
- ▶ NICa with automatic kernel size (Wissmeier 2012)

# Why care for 3D radiation now? – a matter of resolution

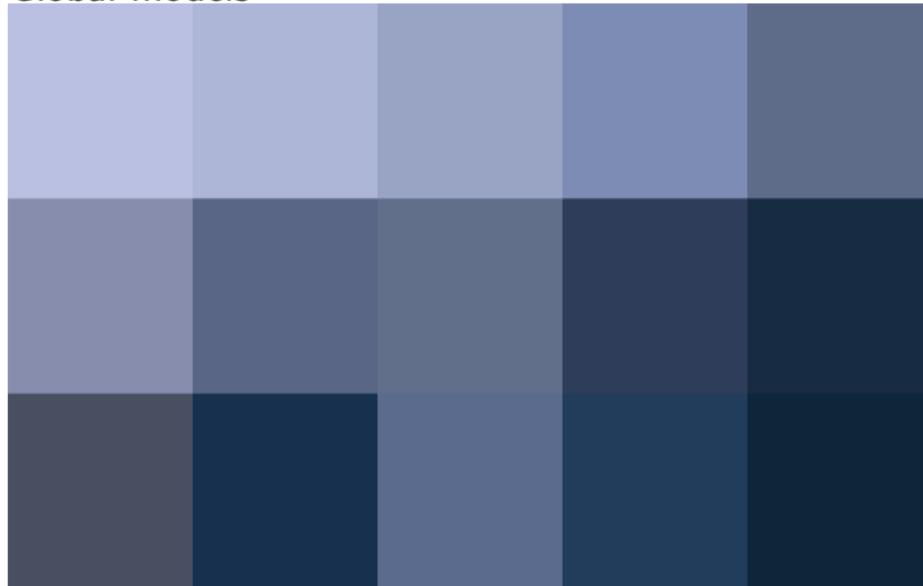
Complex cloud radiation interaction



Copyright: NASA. STS 41-B, February 1984. Picture #11-41-2347

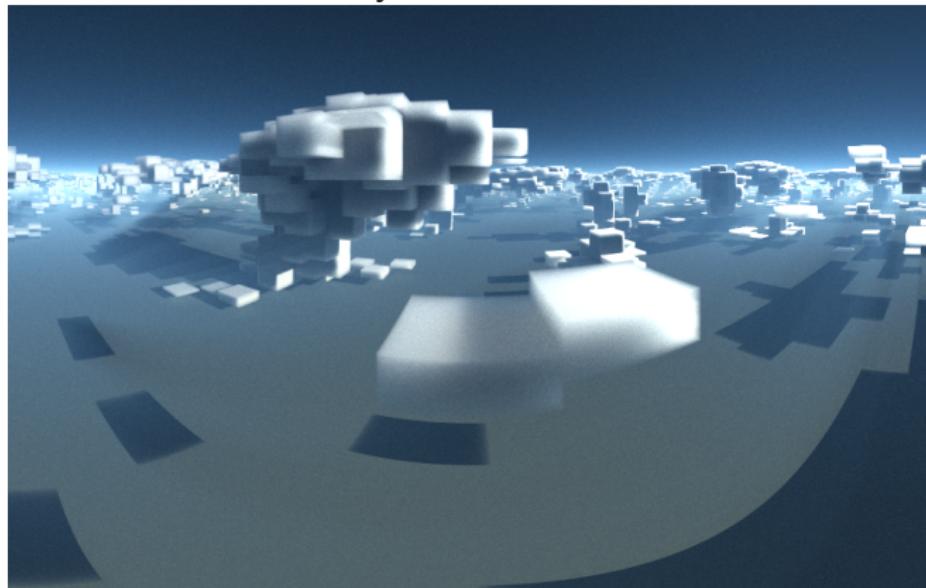
# Why care for 3D radiation now? – a matter of resolution

Global models



# Why care for 3D radiation now? – a matter of resolution

Weather models today



Visualization done with libRadtran.org/**MYSTIC** (Montecarlo code for the phYSically correct Tracing of photons In Cloudy atmospheres) Mayer, B., 2009. Radiative transfer in the cloudy atmosphere (EPJ Web of Conferences)

# Why care for 3D radiation now? – a matter of resolution

Next-gen models



Visualization done with libRadtran.org/**MYSTIC** (Montecarlo code for the phYSically correct Tracing of photons In Cloudy atmospheres) Mayer, B., 2009. Radiative transfer in the cloudy atmosphere (EPJ Web of Conferences)

# Why care for 3D radiation now? – a matter of resolution

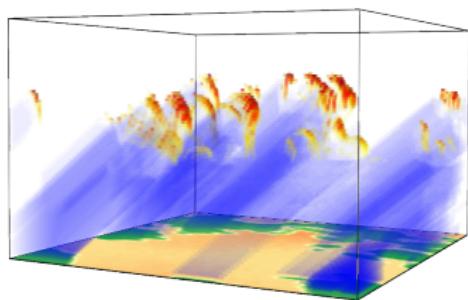
Next-gen models



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# The Tenstream solver

A new concept for a solver – what do we want?



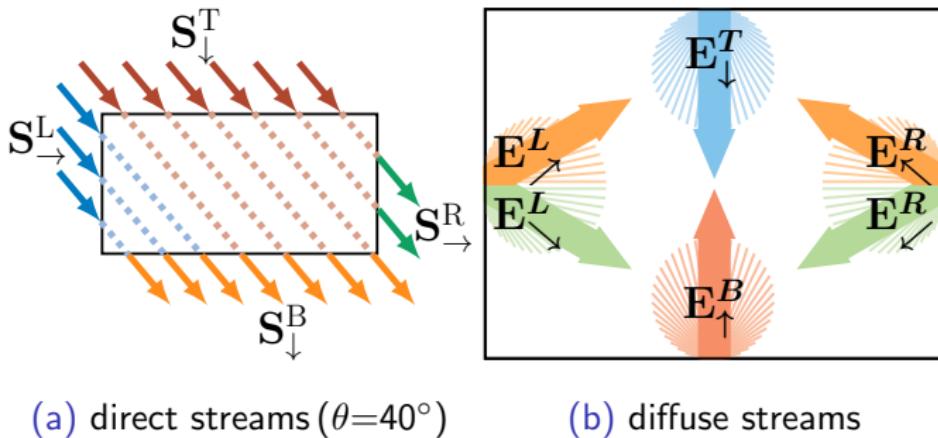
I3RC cloud scene, benchmark heating rate

calculation with MYSTIC (MonteCarlo code)

- ▶ accurately approximate 3D effects
- ▶ has to be several orders of magnitude faster than state of the art 3D solvers
- ▶ parallelizable on modern machines

# The TenStream solver

Finite Volume formalism:  
Discretization of energy transport – spatially and by angle



# The TenStream solver

Setup equation system for one voxel:

$$\begin{bmatrix} E_{\uparrow}^T \\ E_{\downarrow}^B \\ E_{\swarrow}^L \\ E_{\searrow}^R \\ E_{\nwarrow}^L \\ E_{\nearrow}^R \\ S_{\downarrow}^B \\ S_{\rightarrow}^R \end{bmatrix} = \begin{bmatrix} \gamma_1 & \gamma_2 & \gamma_3 & \gamma_3 & \gamma_4 & \gamma_4 & \beta_{01} & \beta_{11} \\ \gamma_2 & \gamma_1 & \gamma_4 & \gamma_4 & \gamma_3 & \gamma_3 & \beta_{02} & \beta_{12} \\ \gamma_5 & \gamma_6 & \gamma_7 & \gamma_8 & \gamma_9 & \gamma_{10} & \beta_{03} & \beta_{13} \\ \gamma_5 & \gamma_6 & \gamma_8 & \gamma_7 & \gamma_{10} & \gamma_9 & \beta_{04} & \beta_{14} \\ \gamma_6 & \gamma_5 & \gamma_9 & \gamma_{10} & \gamma_7 & \gamma_8 & \beta_{05} & \beta_{15} \\ \gamma_6 & \gamma_5 & \gamma_{10} & \gamma_9 & \gamma_8 & \gamma_7 & \beta_{06} & \beta_{16} \\ 0 & 0 & 0 & 0 & 0 & 0 & \alpha_{00} & \alpha_{10} \\ 0 & 0 & 0 & 0 & 0 & 0 & \alpha_{01} & \alpha_{11} \end{bmatrix} \begin{bmatrix} E_{\uparrow}^B \\ E_{\downarrow}^T \\ E_{\swarrow}^R \\ E_{\searrow}^L \\ E_{\nwarrow}^R \\ E_{\nearrow}^L \\ S_{\downarrow}^T \\ S_{\rightarrow}^L \end{bmatrix}$$

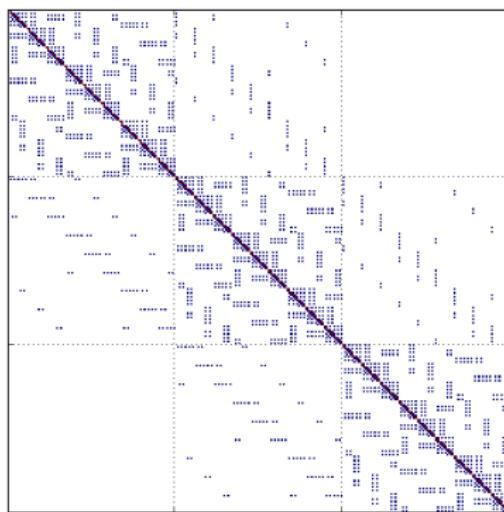
# The TenStream solver

Setup equation system for one voxel:

... gives huge but sparse matrix.

$$\begin{bmatrix} E_T^\uparrow \\ E_B^\downarrow \\ E_L^\swarrow \\ E_R^\searrow \\ E_L^\nwarrow \\ E_R^\nearrow \\ S_B^\downarrow \\ S_R^\rightarrow \end{bmatrix} = \begin{bmatrix} \gamma_1 & \gamma_2 & \gamma_3 & \gamma_3 & \gamma_4 & \gamma_4 & \beta_{01} & \beta_{11} \\ \gamma_2 & \gamma_1 & \gamma_4 & \gamma_4 & \gamma_3 & \gamma_3 & \beta_{02} & \beta_{12} \\ \gamma_5 & \gamma_6 & \gamma_7 & \gamma_8 & \gamma_9 & \gamma_{10} & \beta_{03} & \beta_{13} \\ \gamma_5 & \gamma_6 & \gamma_8 & \gamma_7 & \gamma_{10} & \gamma_9 & \beta_{04} & \beta_{14} \\ \gamma_6 & \gamma_5 & \gamma_9 & \gamma_{10} & \gamma_7 & \gamma_8 & \beta_{05} & \beta_{15} \\ \gamma_6 & \gamma_5 & \gamma_{10} & \gamma_9 & \gamma_8 & \gamma_7 & \beta_{06} & \beta_{16} \\ 0 & 0 & 0 & 0 & 0 & 0 & \alpha_{00} & \alpha_{10} \\ 0 & 0 & 0 & 0 & 0 & 0 & \alpha_{01} & \alpha_{11} \end{bmatrix} \begin{bmatrix} E_B^\uparrow \\ E_T^\downarrow \\ E_R^\swarrow \\ E_L^\searrow \\ E_L^\nwarrow \\ E_R^\nearrow \\ E_L^\swarrow \\ S_T^\downarrow \\ S_L^\rightarrow \end{bmatrix}$$

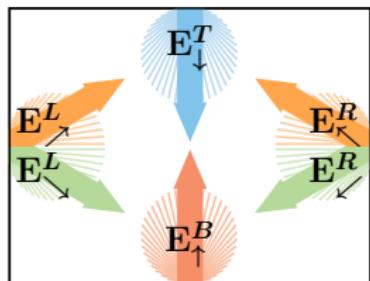
Coupling voxels in 3 dimensions...



⇒ solve with PETSc!

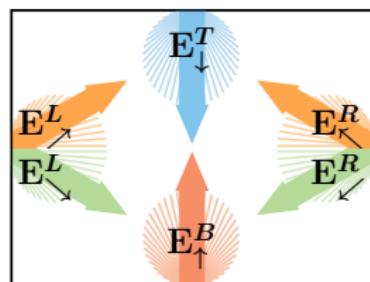
# Energy transport coefficients

We need to determine the energy transport from one stream to another:

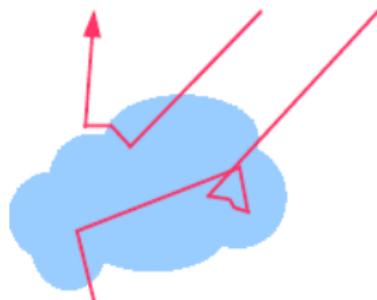


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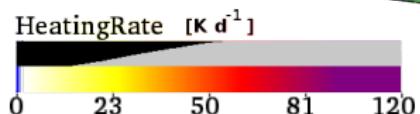
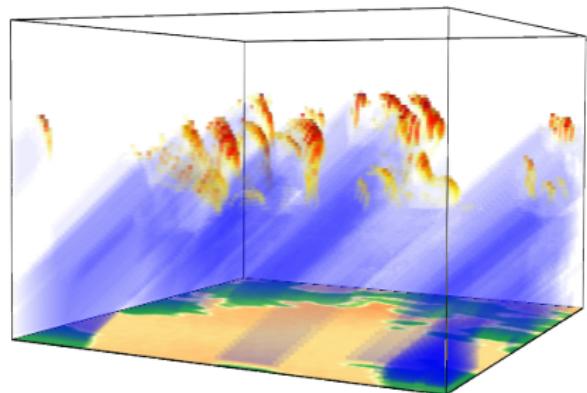
→ solve radiative transfer equation with MonteCarlo method



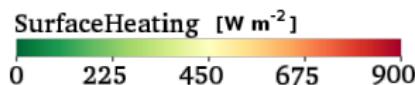
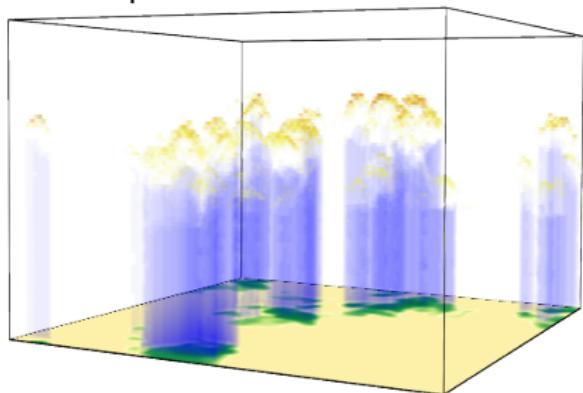
... and put them into LookUpTable

# Does it work?

3D MYSTIC



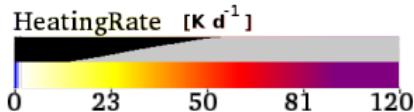
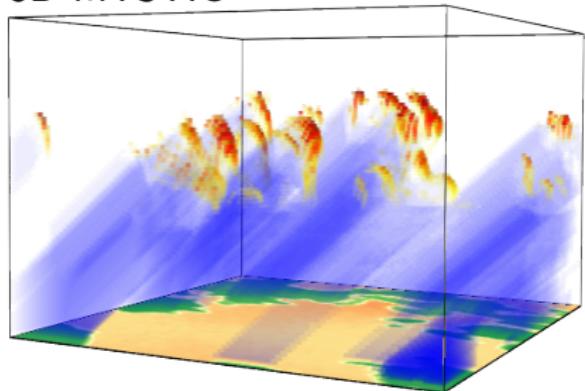
1D independent-column Twostream



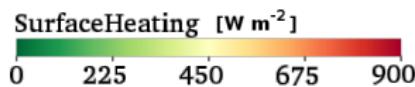
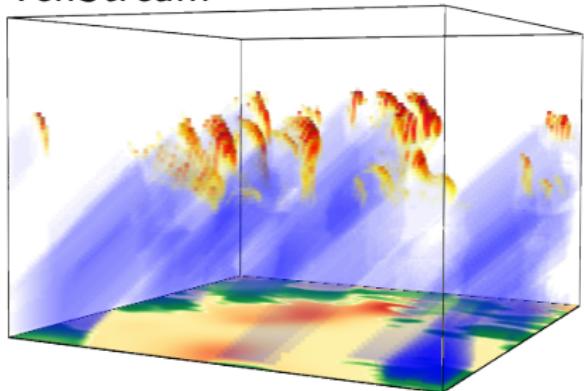
Computations done with libRadtran (Library for Radiative Transfer, [libradtran.org](http://libradtran.org))

# Does it work?

3D MYSTIC

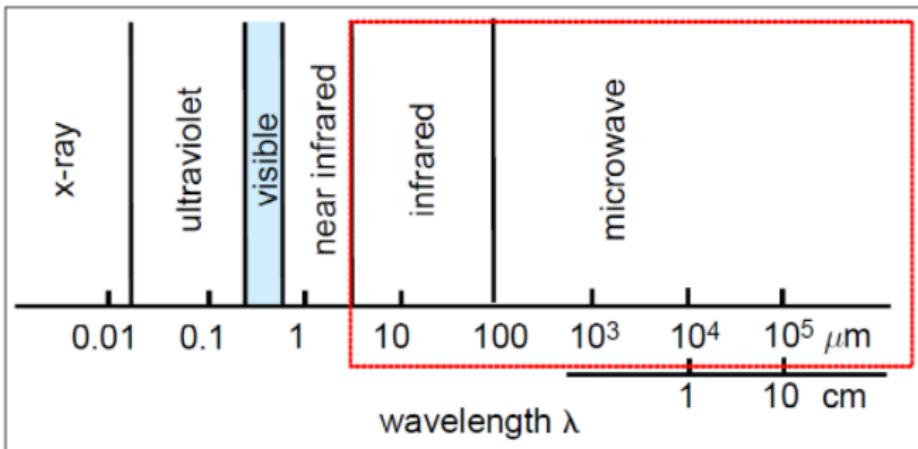


TenStream



Computations done with libRadtran (Library for Radiative Transfer, [libradtran.org](http://libradtran.org))

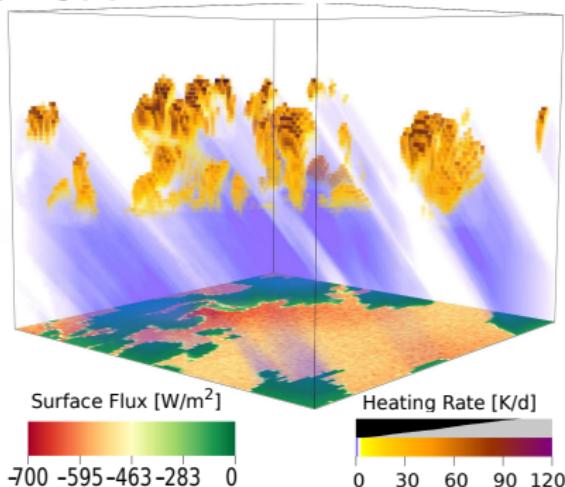
# Thermal Radiative Transfer



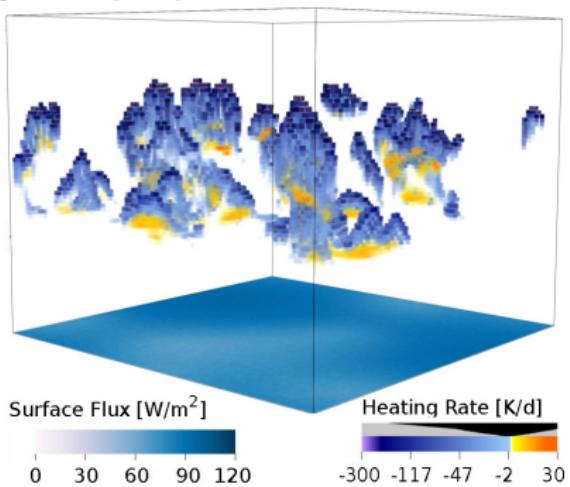
Thermal spectral range (Wallace and Hobbs 2006, p.114).

# 3D Solar vs. Thermal Radiative Transfer

3D Solar



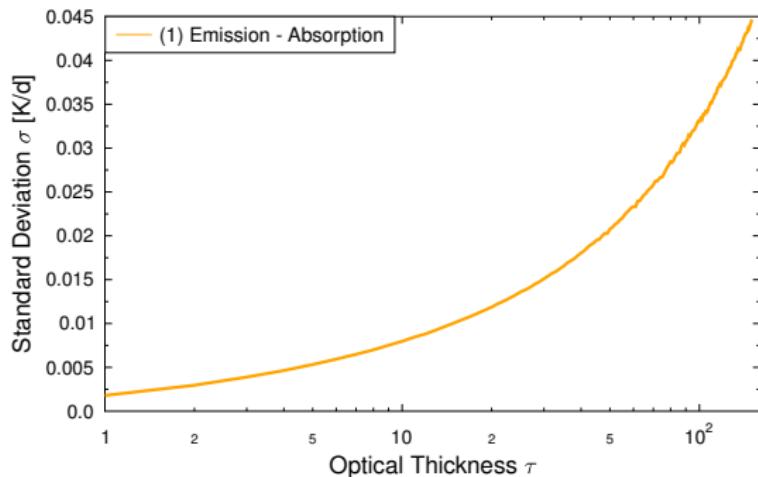
3D Thermal



# Monte Carlo Variance Reduction Techniques

## Emission–Absorption

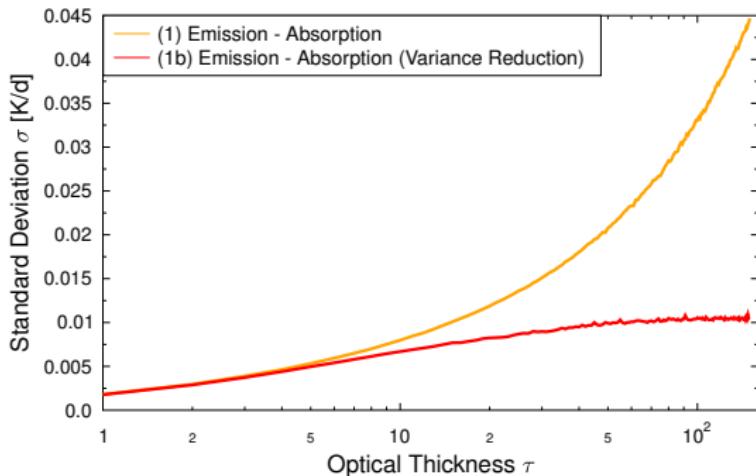
$$\frac{dT}{dt} = -\frac{1}{\rho c_p} (\dot{q}_{em} - \dot{q}_{abs})$$



# Monte Carlo Variance Reduction Techniques

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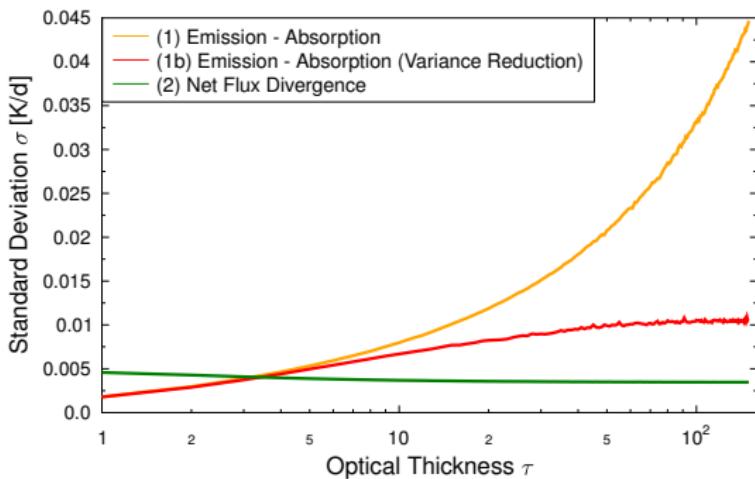
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# Monte Carlo Variance Reduction Techniques

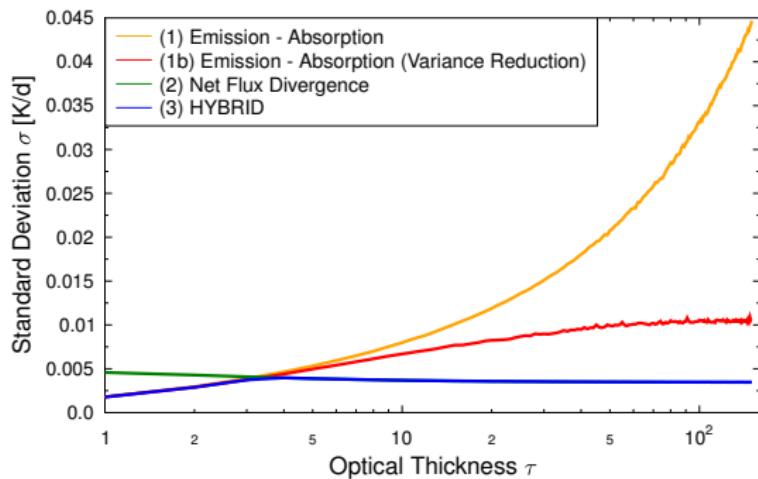
## Net Flux Divergence

$$\frac{dT}{dt} = -\frac{1}{\rho c_p} \nabla \vec{E}_{\text{net}}$$

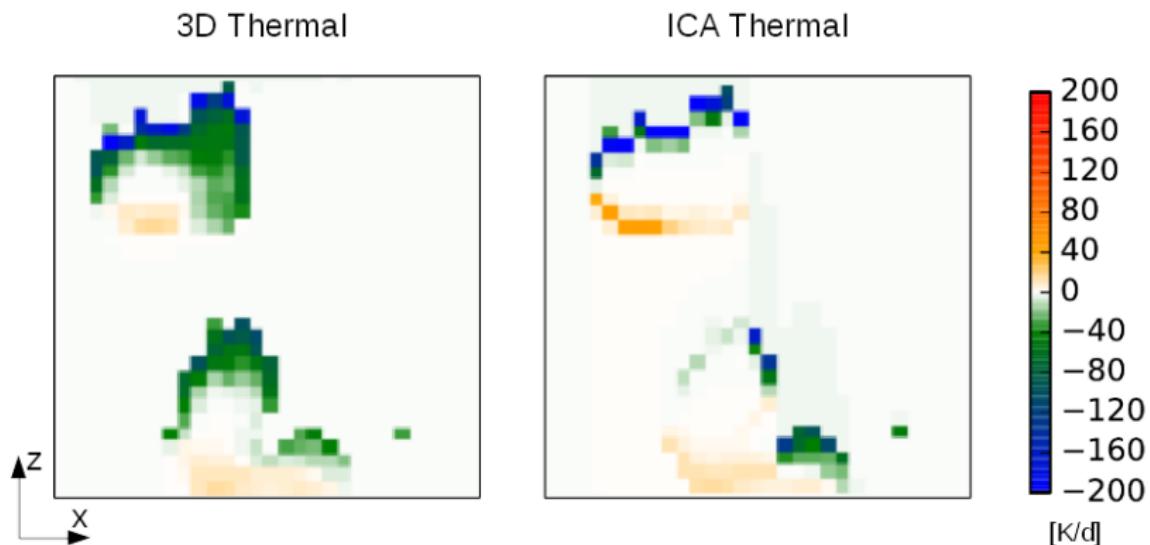


# Monte Carlo Variance Reduction Techniques

Combining  
Emission–Absorption  
and Net Flux  
Divergence to  
HYBRID

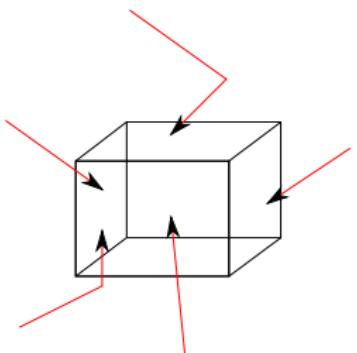


# 3D vs. 1D Thermal Radiative Transfer

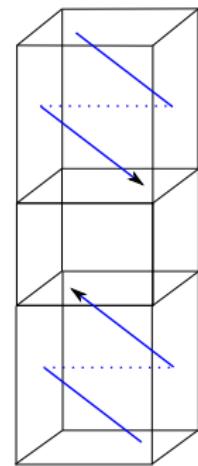


# Neighboring Column Approximation NCA

MYSTIC



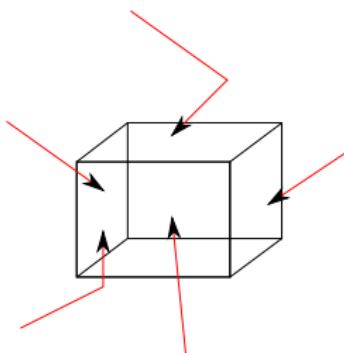
NCA



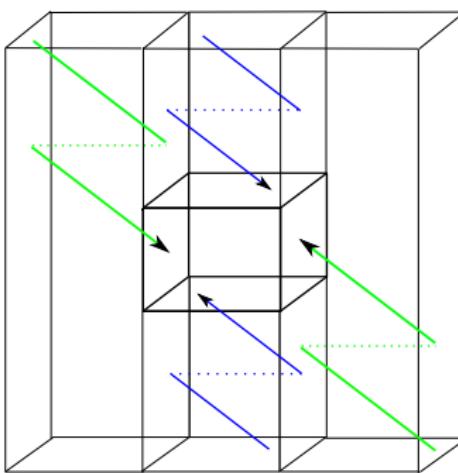
ICA

# Neighboring Column Approximation NCA

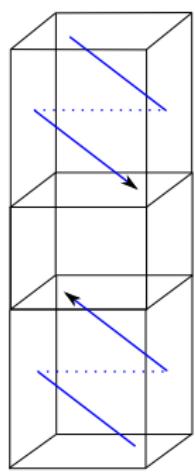
MYSTIC



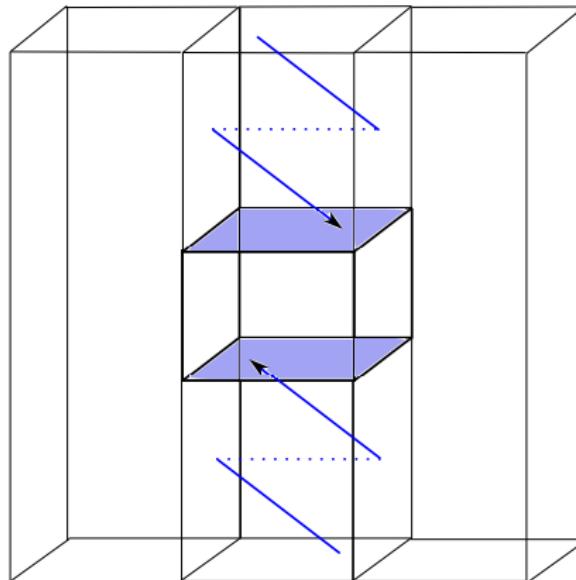
NCA



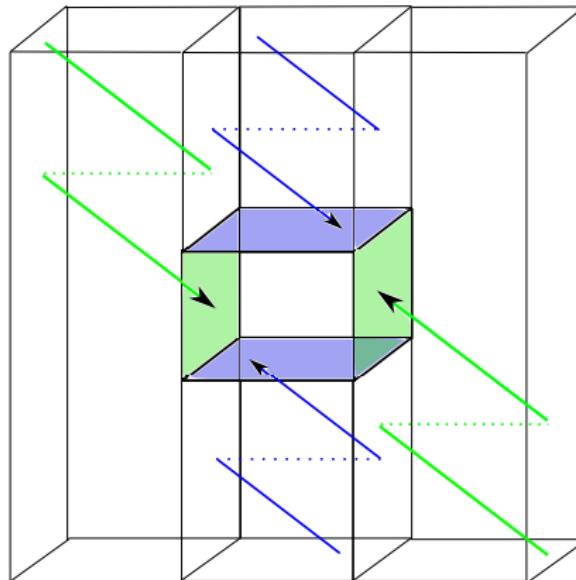
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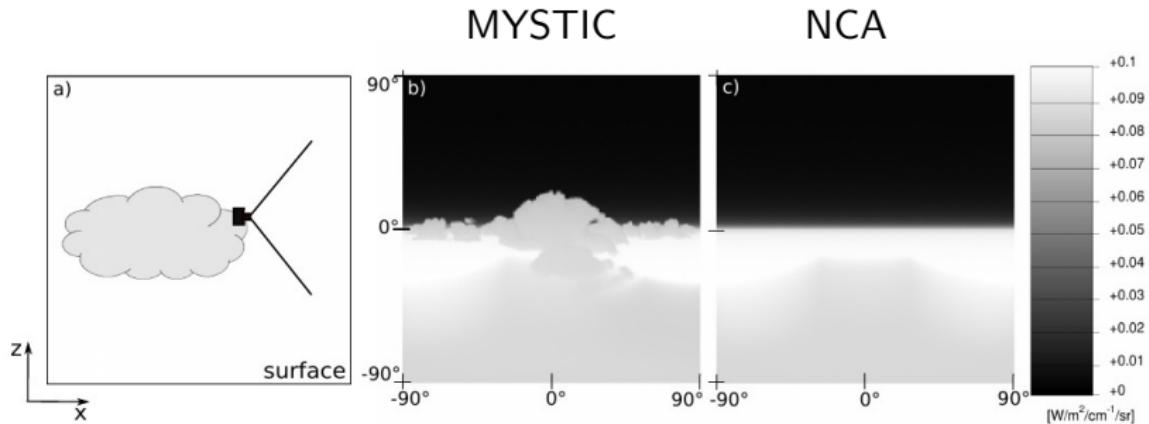
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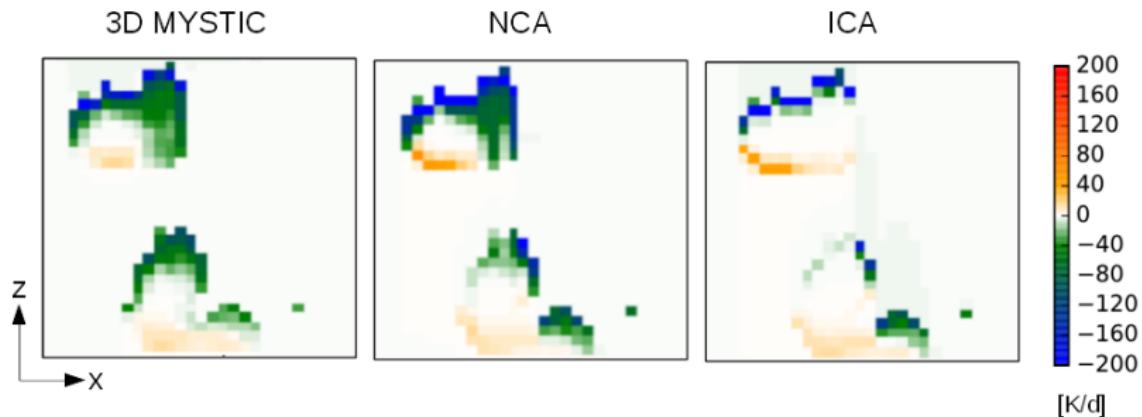
$$L_{\text{abs,bc1}} = \frac{1}{\Delta z} B_{i-1} (c - b) \quad (3.44)$$

$$L_{\text{abs,bc2}} = -\frac{1}{\Delta z} (L_{s1} - B_{i-1}) \frac{\cos \theta}{\beta_{\text{abs},i-1}} \left[ \exp \left( -\beta_{\text{abs},i-1} \frac{c}{\cos \theta} \right) - \exp \left( -\beta_{\text{abs},i-1} \frac{b}{\cos \theta} \right) \right] \quad (3.45)$$

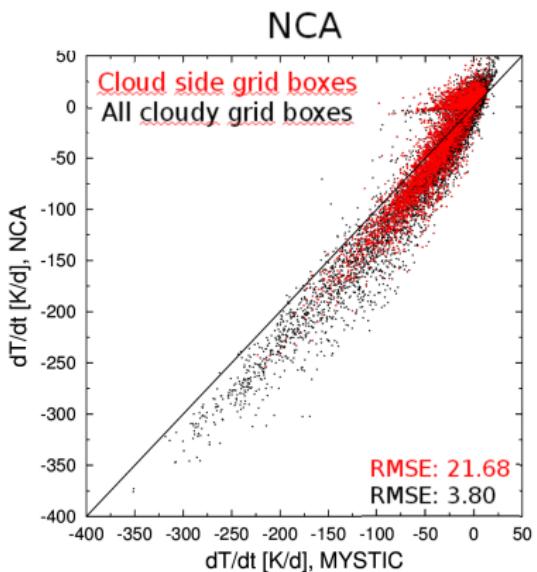
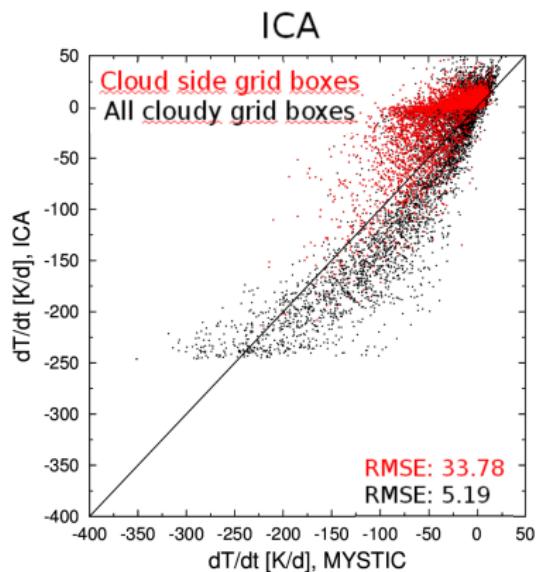
$$\begin{aligned} L_{\text{abs,bc3}} &= -\frac{1}{\Delta z} (L_{s1} - B_{i-1}) \frac{\cos \theta}{\beta_{\text{abs},i} - \beta_{\text{abs},i-1}} \\ &\quad \exp \left( -\beta_{\text{abs},i} \frac{\Delta z}{\cos \theta} \right) \left[ \exp \left( \frac{(\beta_{\text{abs},i} - \beta_{\text{abs},i-1})(c-b)}{\cos \theta} \right) \right] \end{aligned} \quad (3.46)$$

$$L_{\text{abs,bc4}} = -\frac{1}{\Delta z} B_{i-1} \frac{\cos \theta}{\beta_{\text{abs},i}} \exp \left( -\beta_{\text{abs},i} \frac{\Delta z}{\cos \theta} \right) \left[ \exp \left( \frac{c \beta_{\text{abs},i}}{\cos \theta} \right) - \exp \left( \frac{b \beta_{\text{abs},i}}{\cos \theta} \right) \right] \quad (3.47)$$

# NCA vs. 1D - NCA vs. 3D MYSTIC



# NCA vs. 1D - NCA vs. 3D MYSTIC



# Couple Paramterizations to Atmospheric Model

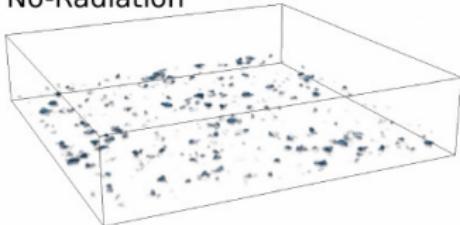
TenStream solver and NCA coupled to the UCLA-LES

- ▶ use LES to model atmospheric flow with resolutions from 10 m to 1 km
- ▶ consider dynamics, turbulence, microphysics and radiation
- ▶ TenStream solver increases total model runtime by factor 3-5
- ▶ NCA only factor 1.5-2 more expensive

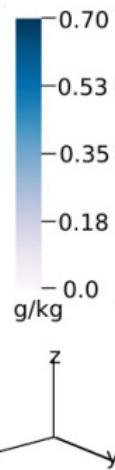
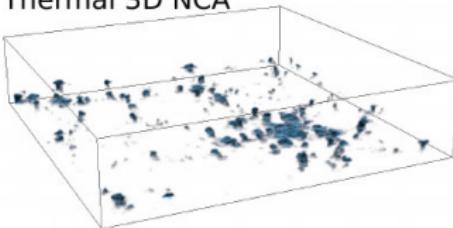
# Cloud Evolution With 3D Thermal Radiation

## Shallow Cumulus Cloud Field

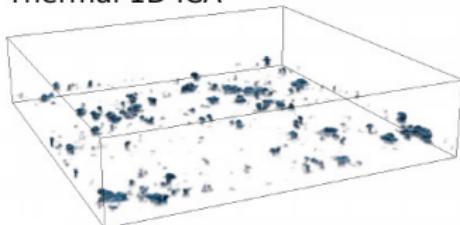
No-Radiation



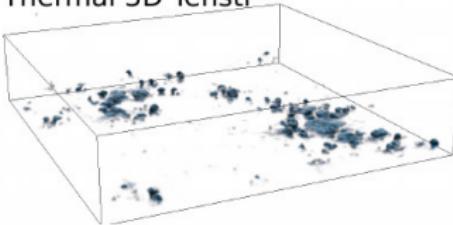
Thermal 3D NCA



Thermal 1D ICA

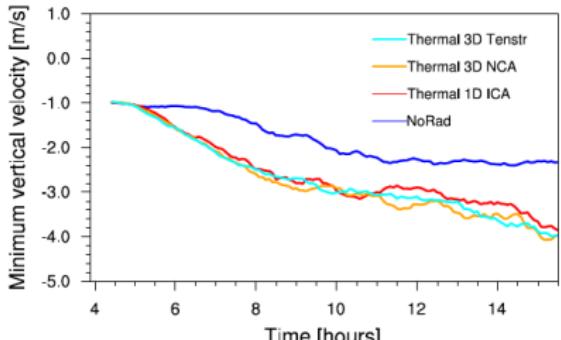
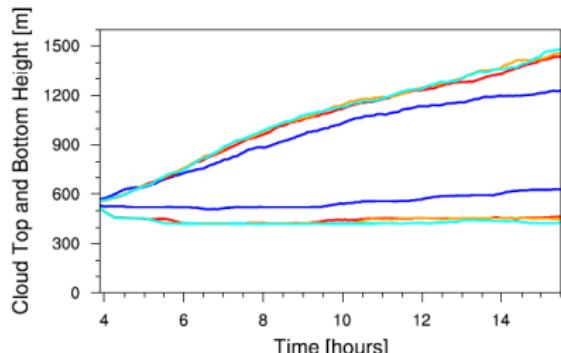
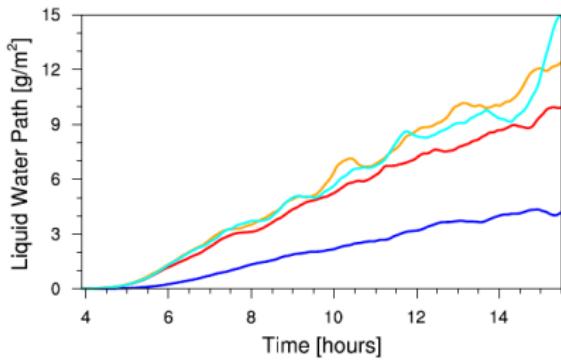
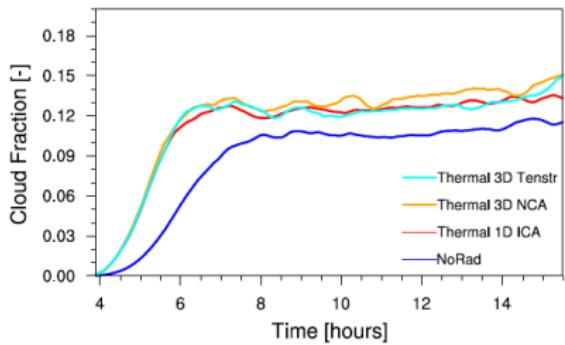


Thermal 3D Tenstr



# Cloud Evolution With 3D Thermal Radiation

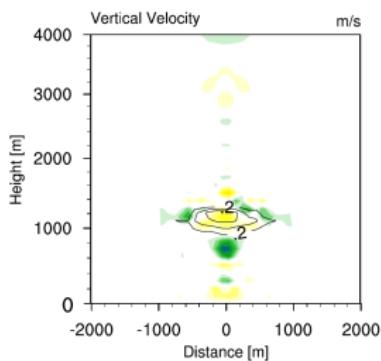
## Shallow Cumulus Cloud Field



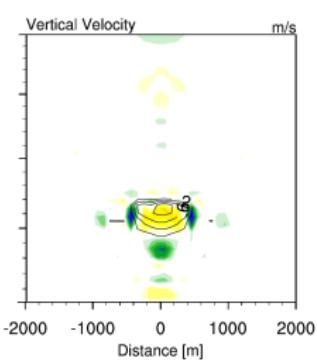
# Cloud Evolution With 3D Thermal Radiation

## Single Cloud

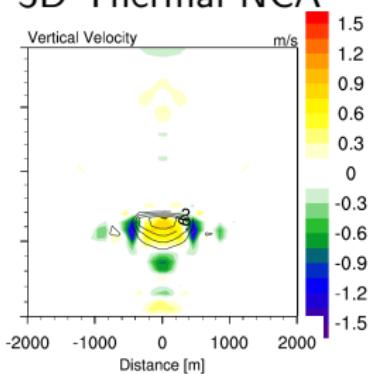
### No Radiation



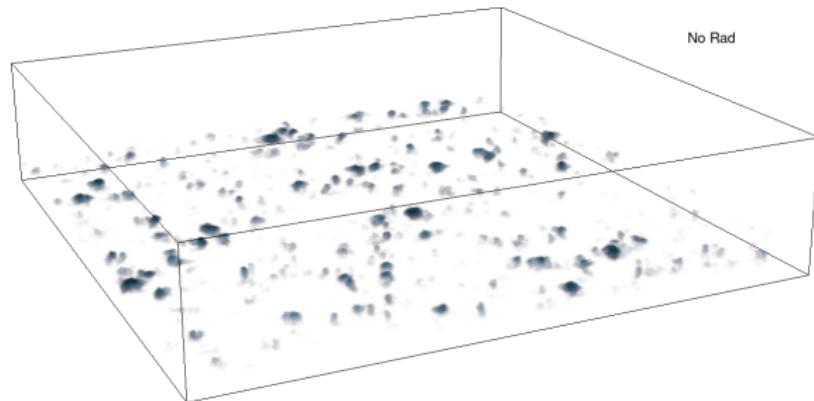
### 1D Thermal ICA



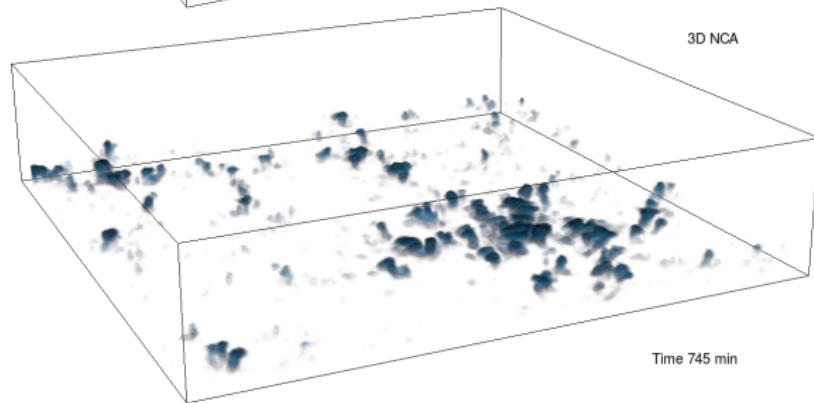
### 3D Thermal NCA



# Cloud Evolution With 3D Thermal Radiaton



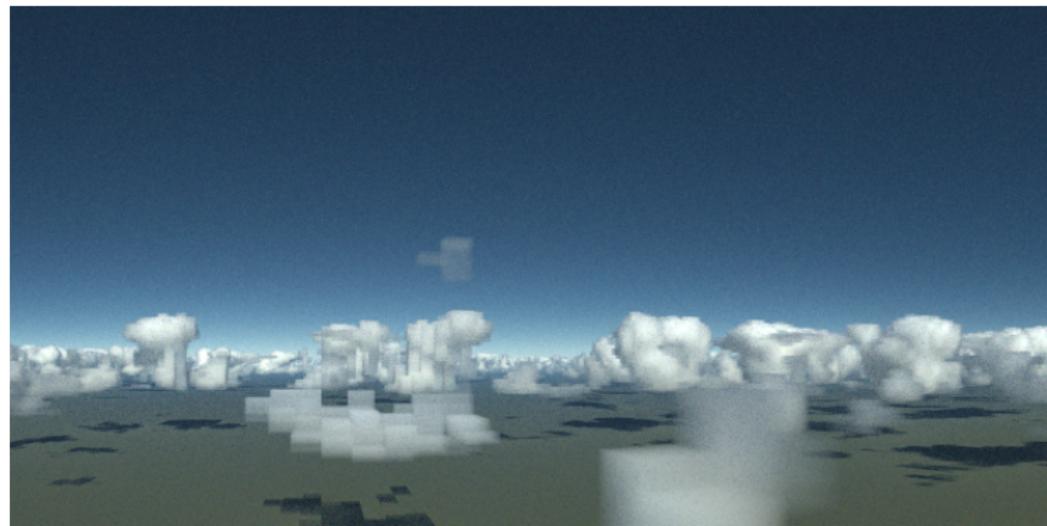
No Rad



3D NCA

Time 745 min

# Flying through a Cloud Field



# Current state and a glimpse at whats to come..

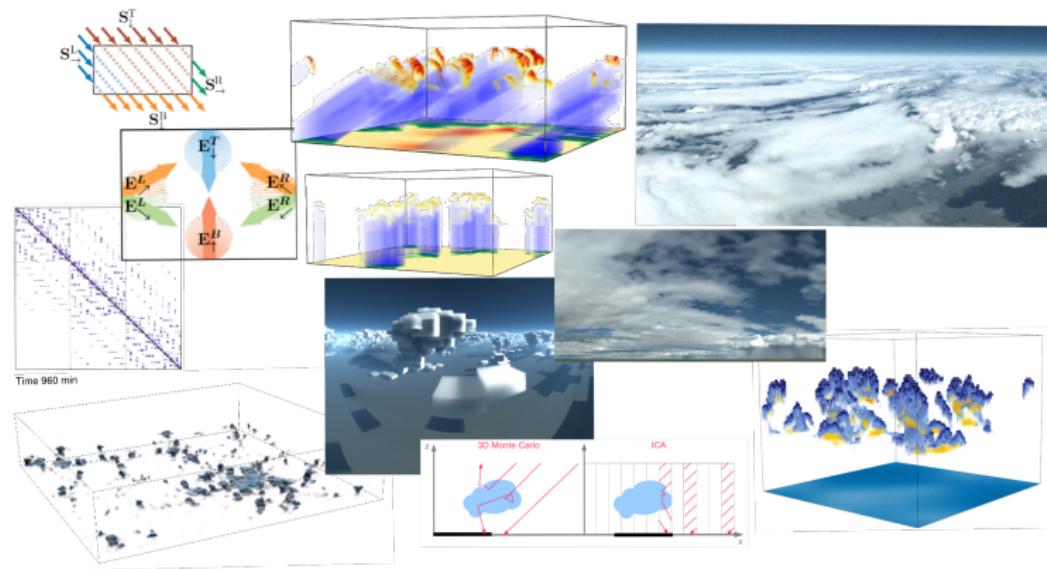
## Conclusions

- ▶ Development of 2 parallel solvers
- ▶ Implemented in UCLA-LES
- ▶ Unprecedented large and extensive simulations

## Outlook

- ▶ Further investigation of simulations (cloud organization)
- ▶ RCE simulations
- ▶ Get ready for large scale computations in ICON – HD(CP)<sup>2</sup>-Project
- ▶ Systematic analysis of 3D effects and impact on large scale flow – W2W-Project

# Thank you!



Carolin Klinger and Bernhard Mayer, 2014. Three-dimensional Monte Carlo calculation of atmospheric thermal heating rates (JQSRT)

Fabian Jakub and Bernhard Mayer, 2015. A three-dimensional parallel radiative transfer model for atmospheric heating rates for use in cloud resolving models – The TenStream solver (JQSRT)

Carolin Klinger and Bernhard Mayer, 2015. The Neighboring Column Approximation (NCA) - A fast approach for the calculation of 3D thermal heating rates in cloud resolving models (JQSRT)

Fabian Jakub and Bernhard Mayer, 2015. 3-D radiative transfer in large-eddy simulations - experiences coupling the TenStream solver to the UCLA-LES (GMDD)