

Precipitation extremes, their change with warming & with convective organization

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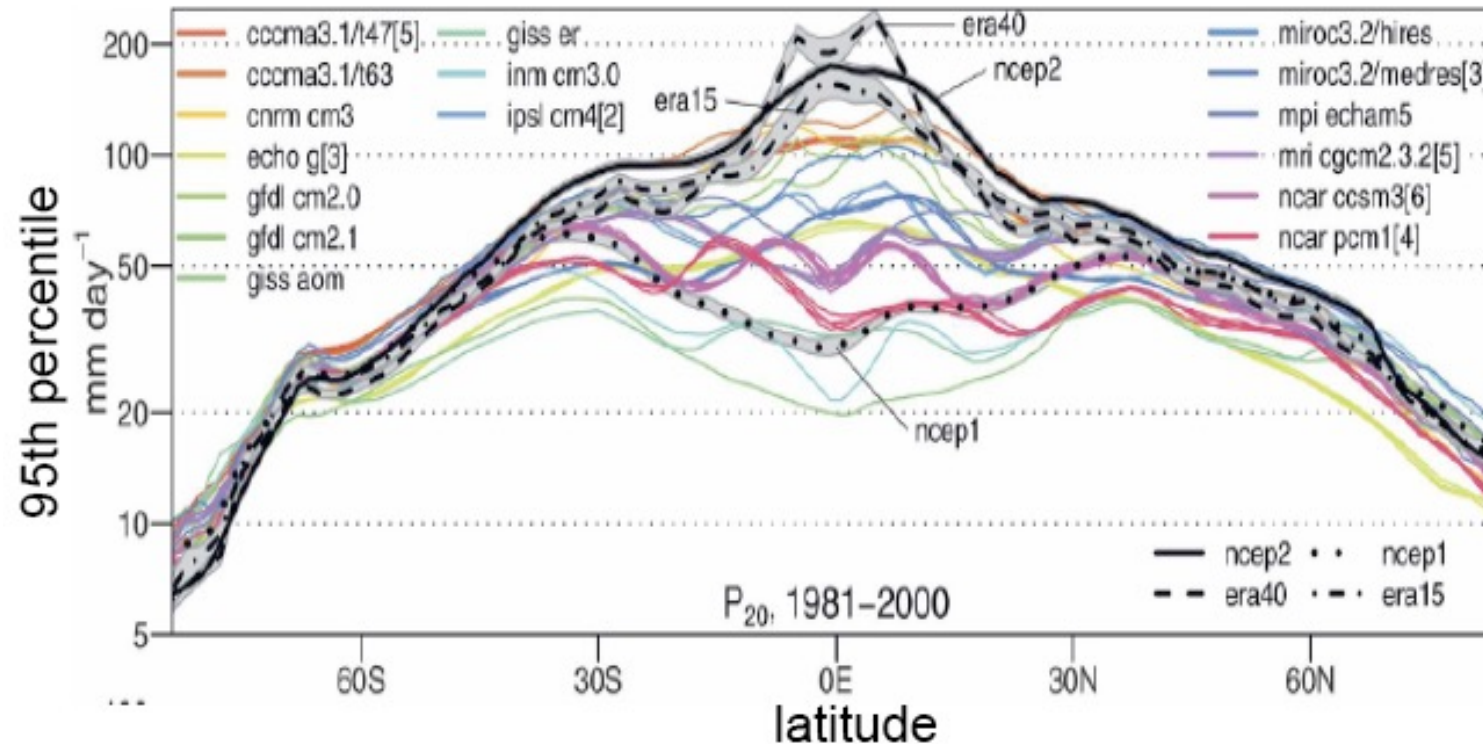
Yukari Takayabu

The university of Tokyo



Motivation: Tropical precipitation extremes

Precipitation extremes (95th precipitation percentile) in climate models



⇒ NOT consistent in tropics and subtropics [Kharin et al, J. Clim. 07]

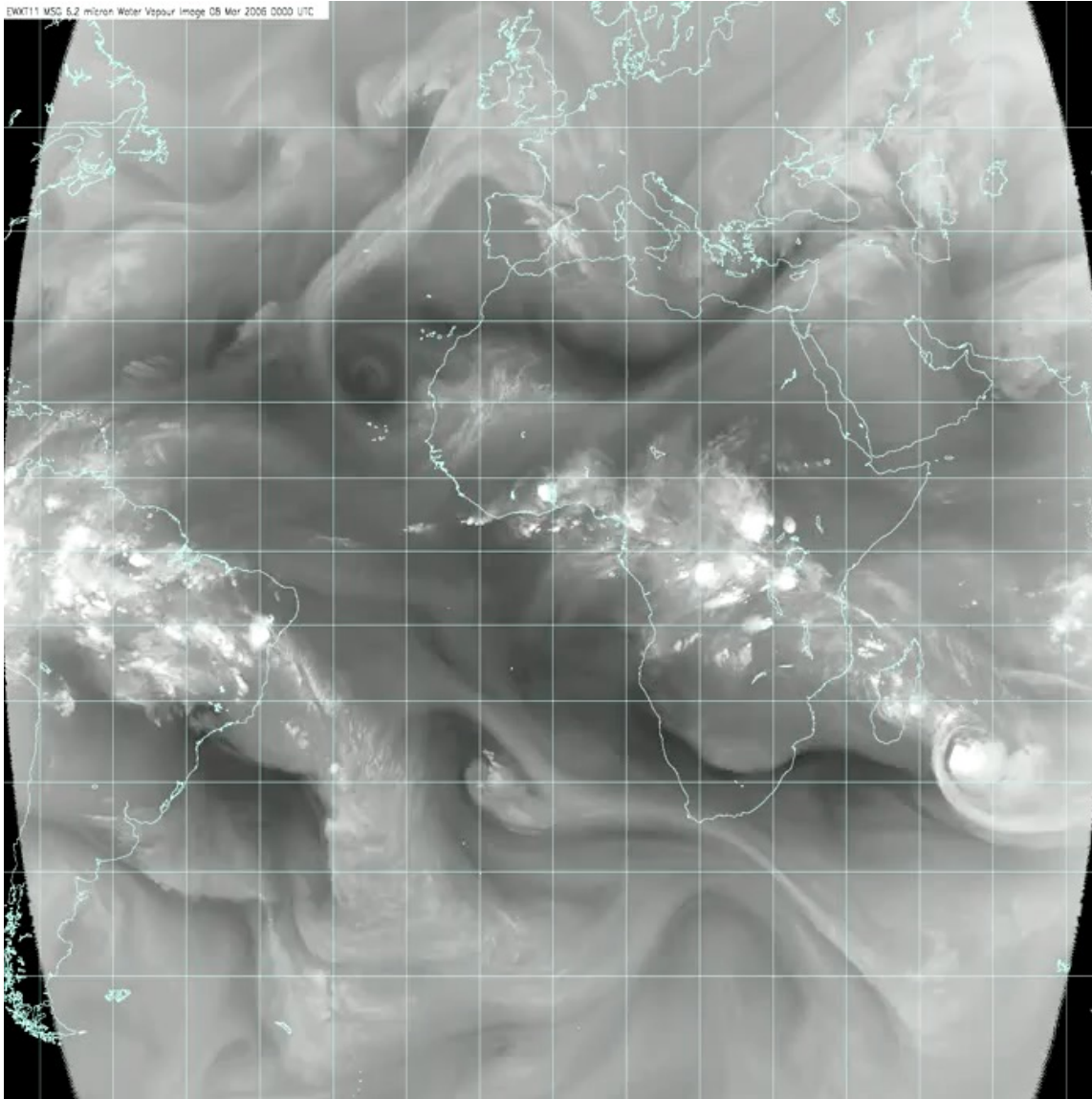
⇒ Not resolution, ⇒ due to cloud parametrizations

⇒ **Climate models disagree**

[O’Gorman&Schneider, 09; Sugiyama,Shiogama,Emori, 10; Pendergrass 2018]

Motivation: Tropical precipitation extremes

Water vapor from satellite

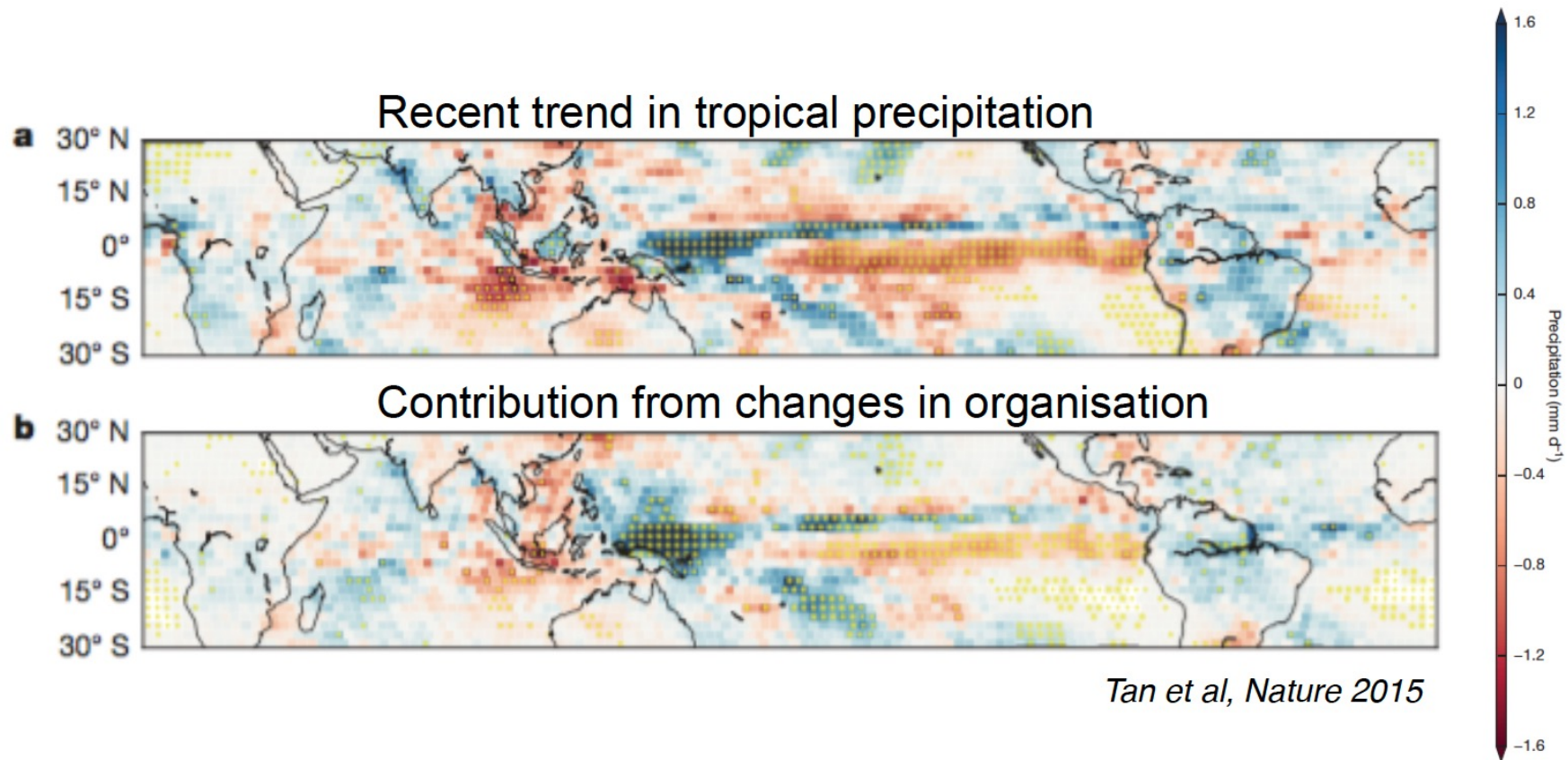


Tropical convection =
« pop corn » convection

Motivation: Tropical precipitation extremes

Extreme precipitation is often associated with organized cloud systems

Increased precipitation is associated with increased organized convection



O'Donnell & Wing: large uncertainty in response of extremes to warming in RCEmip, linked with convective organization

Precipitation extremes, their change with warming & with convective organization

⇒ GOAL HERE:

- 1) How do precipitation extremes change with **warming**?
- 2) How do precipitation extremes change with **convective organization**?
- 3) How does **organization** (& thus extremes) change with **warming**?

Precipitation extremes : theory



Courtesy : Octave Tessiot

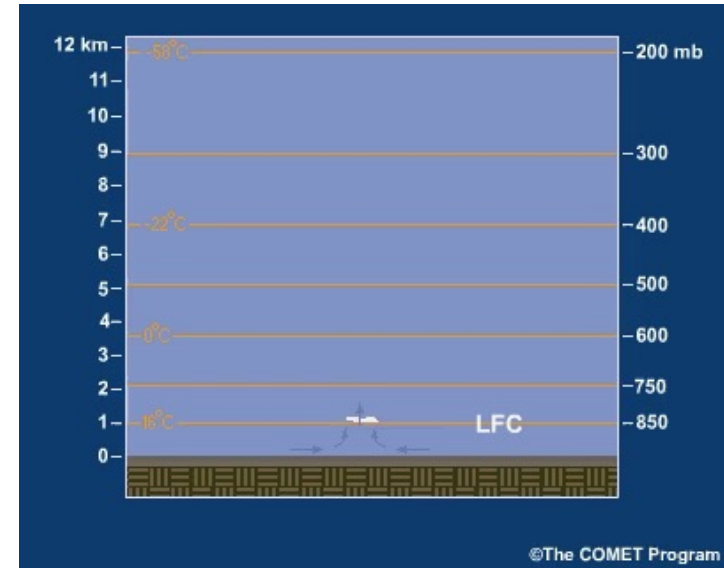
Precipitation extremes : theory

Main balance during precip extremes = “Scaling”

Precipitation efficiency Condensation rate

$$P \sim \epsilon_p \int \rho_w - \frac{\partial q_v}{\partial z} dz$$

Fraction of condensation
that makes it to the
ground as surface precip
« Microphysic »



[Muller O’Gorman Back 2011;
Muller & Takayabu 2020]

Similar to [Betts&Harshvardhan JGR 87; O’Gorman&Schneider PNAS 09] but derived from energetics, and at convective scale & with precip efficiency

Precipitation extremes : theory

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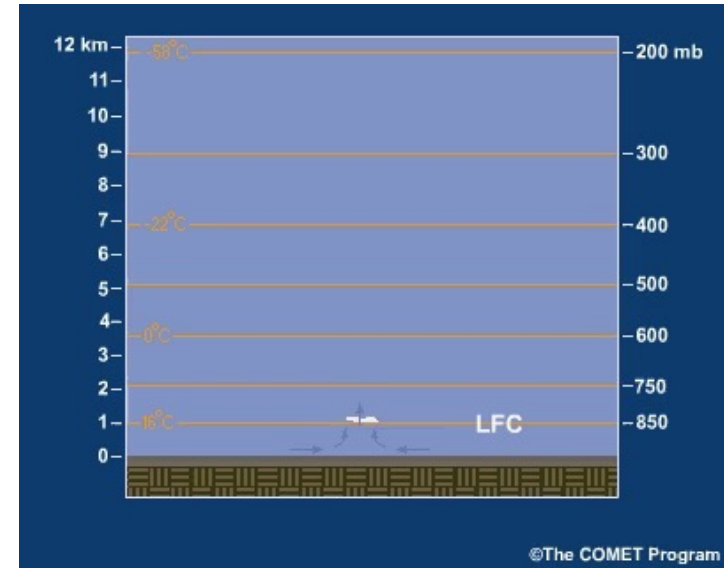
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Fraction of condensation that makes it to the ground as surface precip
« Microphysic »

Upward mass flux in the cloud
« Dynamic »

Water vapor profile
« Thermodynamic »



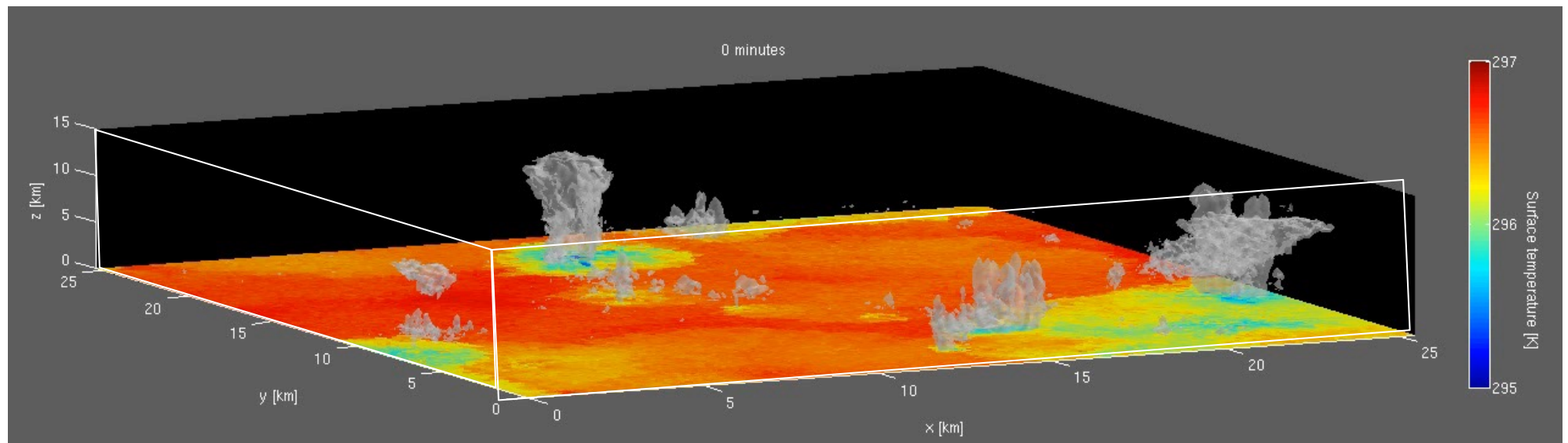
[Muller O’Gorman Back 2011;
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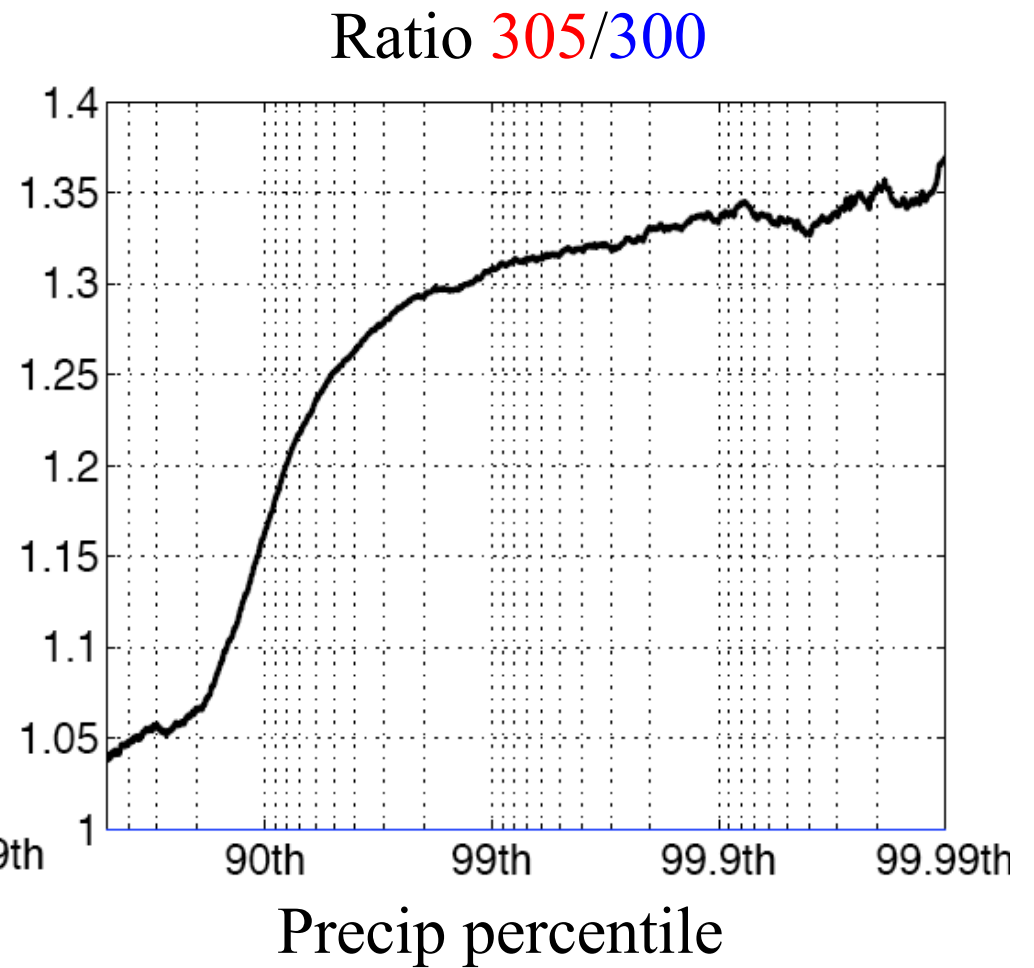
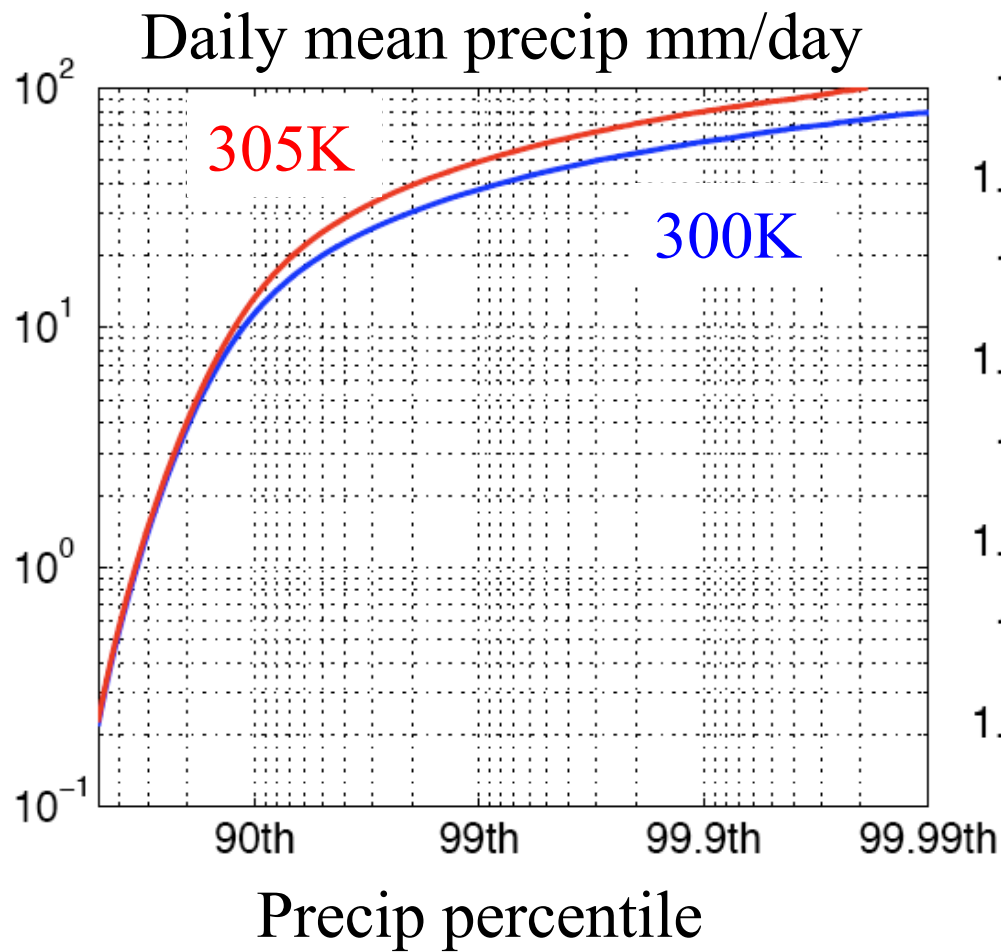
Scaling works in idealized cloud-resolving simulations?

- Cloud-Resolving Model “SAM” [*Khairoutdinov, M.F. and Randall, D.A., JAS 2003*]
Anelastic momentum, continuity and scalar conservation equations
Doubly-periodic domain, run to Radiative Convective Equilibrium (RCE)
- Fixed SST: 300K & 305K

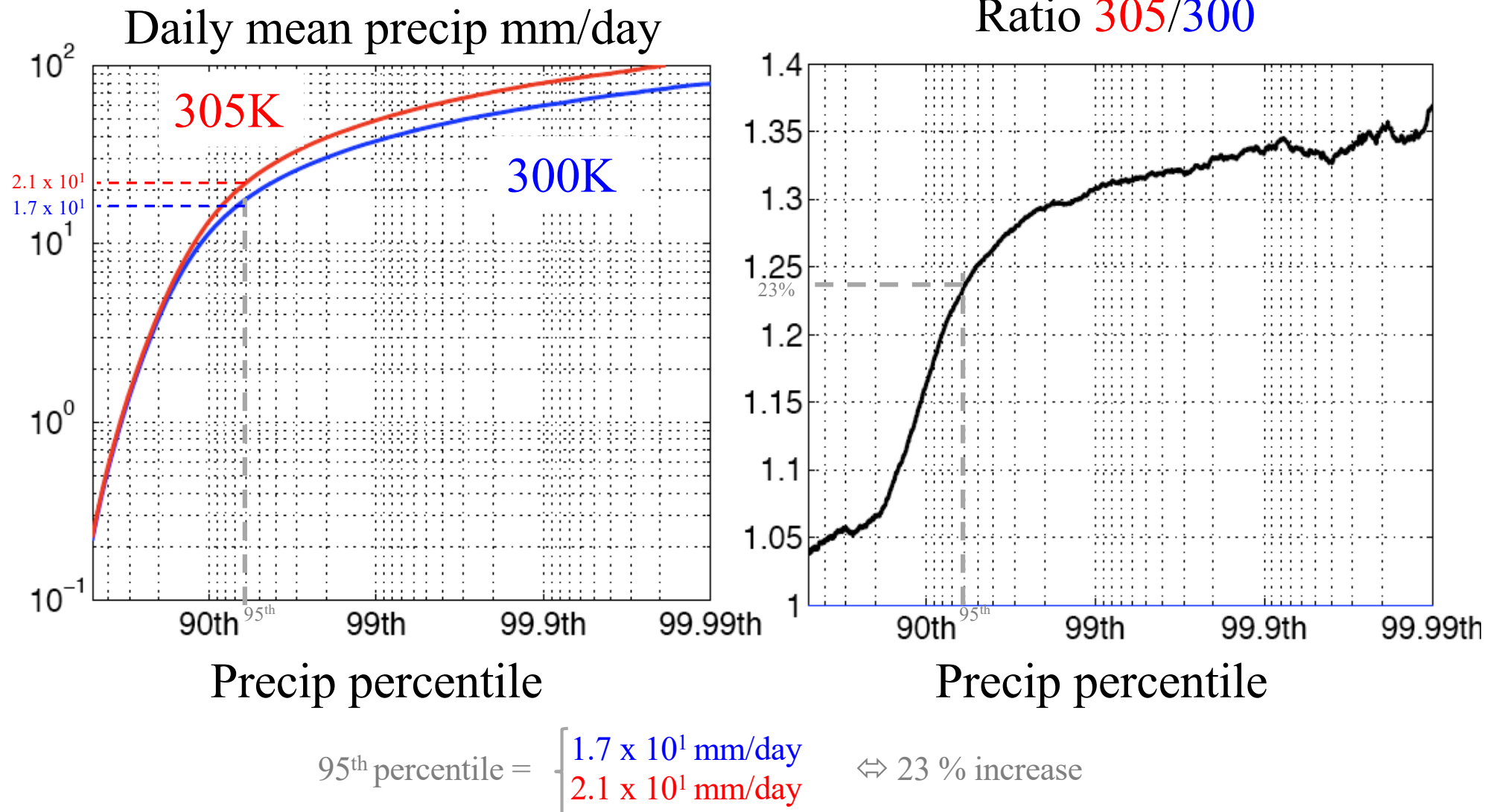
Clouds over near-surface temperature



Precipitation extremes in cloud-resolving simulations

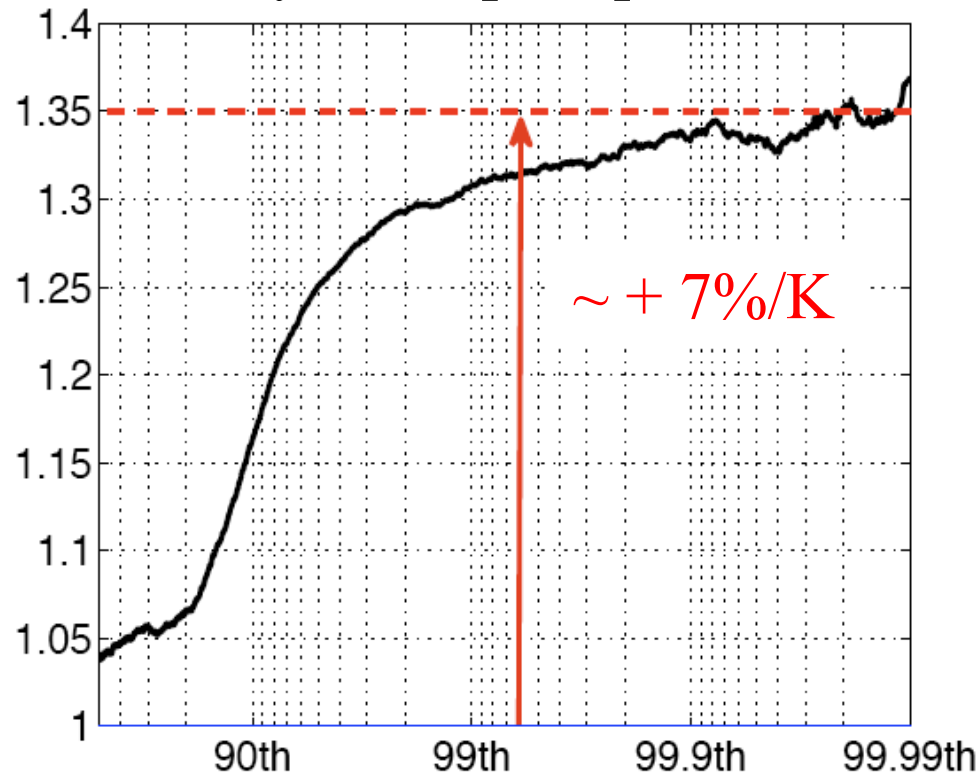


Precipitation extremes in cloud-resolving simulations



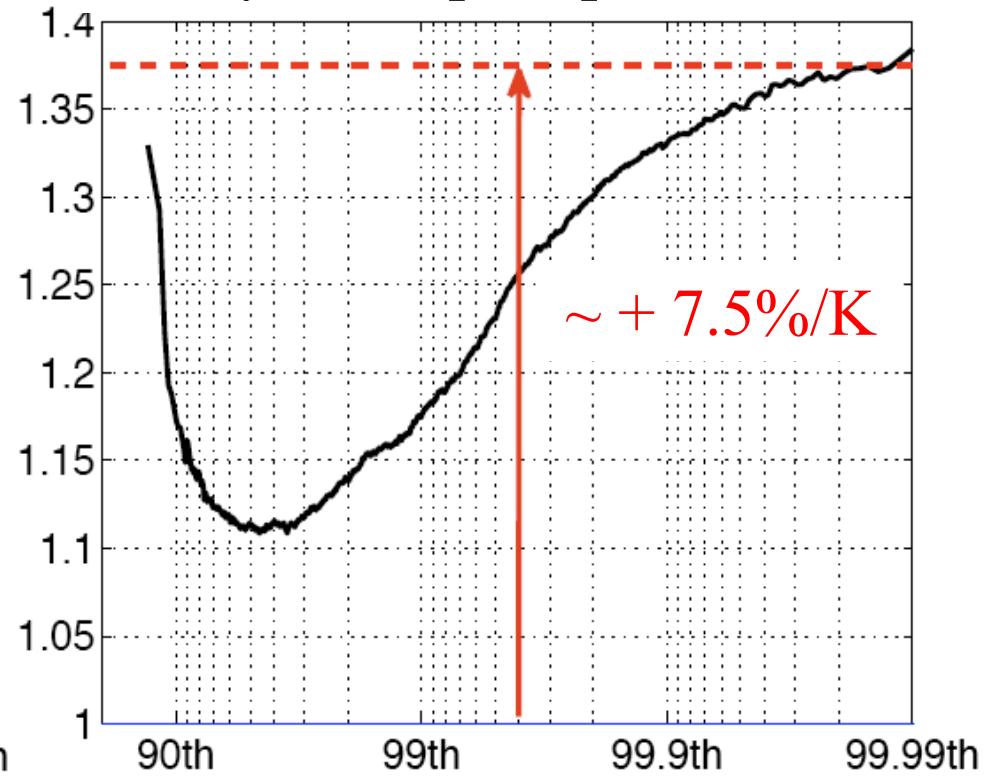
Precipitation extremes in cloud-resolving simulations

Daily mean precip 305/300



Precip percentile

Hourly mean precip 305/300



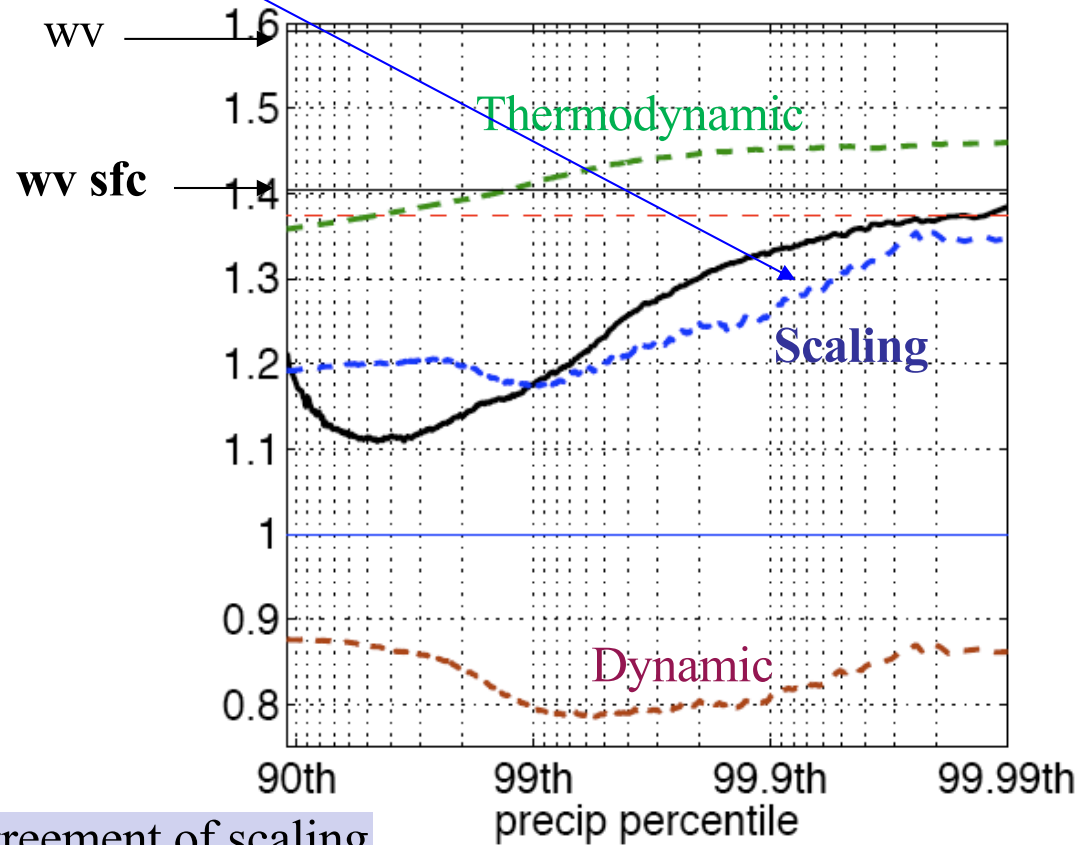
Precip percentile

=> Why 7%/K?

Theoretical scaling in cloud-resolving simulations

$$P \sim \epsilon_p \int \rho w - \frac{\partial q_{\text{sat}}}{\partial z} dz$$

Hourly mean precip 305/300



⇒ Fairly good agreement of scaling

⇒ To first order, thermodynamic, closer to wv sfc than wv

⇒ Dynamics play 2ndary role, and tend to reduce P extremes

[Muller O’Gorman Back 2011]

Approx scaling for precip extremes – relationship to water vapor

If further assume that representative value of mass flux is its value at 500hPa,
scaling becomes:

$$\int \rho w \frac{-\partial q_v}{\partial z} dz \quad \sim \quad (\rho w)_{500} \int \frac{-\partial q_v}{\partial z} dz \quad \sim \quad (\rho w)_{500} q_{v,BL}$$

$$\Rightarrow P_e \sim (\rho w)_{500} q_{v,BL}$$

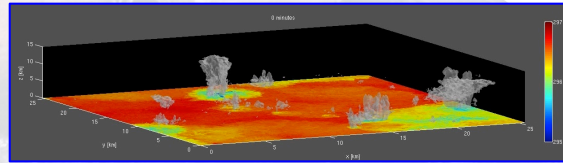
shows link to wv_{sfc}

[Muller 2013;
Abbott et al 2020]

Precipitation extremes, their change with warming & with convective organization

1) How do precipitation extremes change with **warming**?

⇒ Precipitation extremes increase



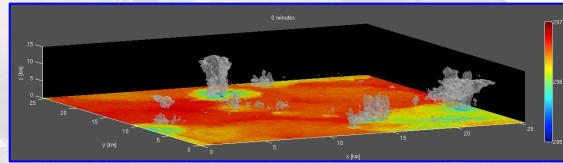
⇒ Follow Clausius-Clapeyron (near-surface humidity increase)

$$P \sim \epsilon_p \int \rho_w - \frac{\partial q_v}{\partial z} dz$$

Precipitation extremes, their change with warming & with convective organization

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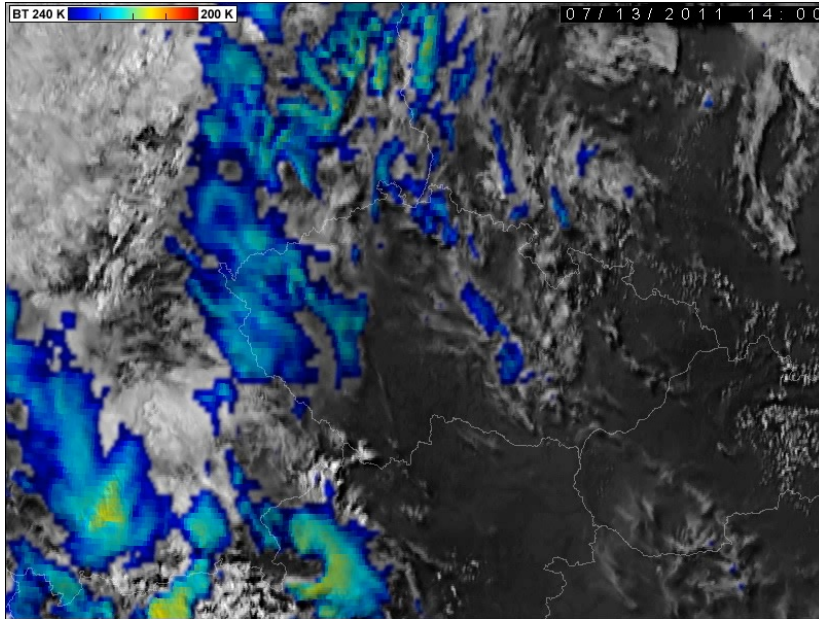
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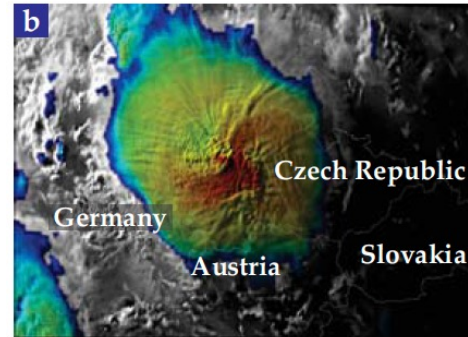
2) How do precipitation extremes change with **convective organization**?

3) How does **organization** (& thus extremes) change with **warming**?

Will look at 2 types of organization:



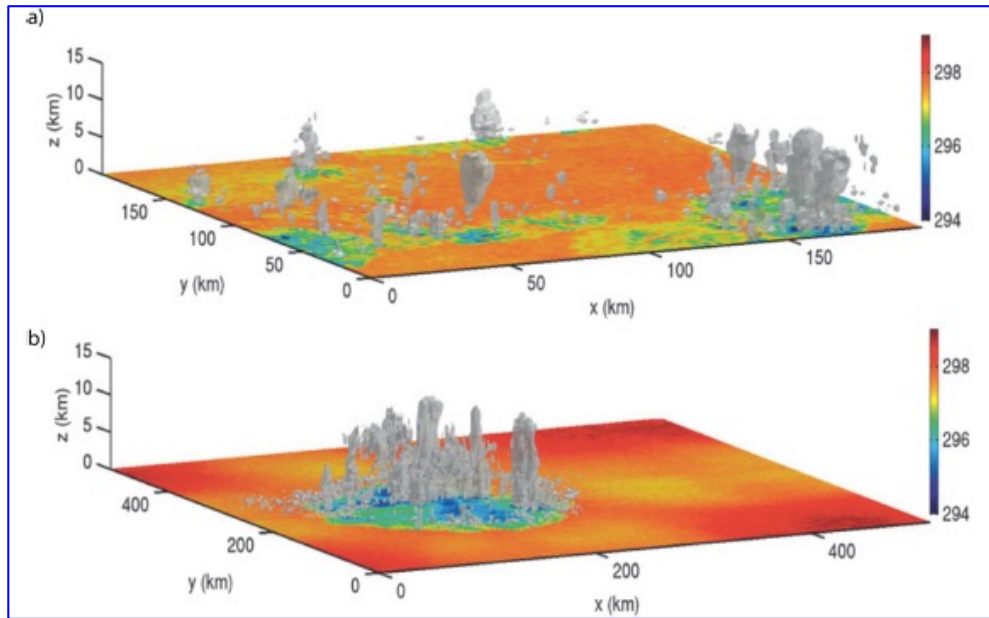
MCCs



Squall lines

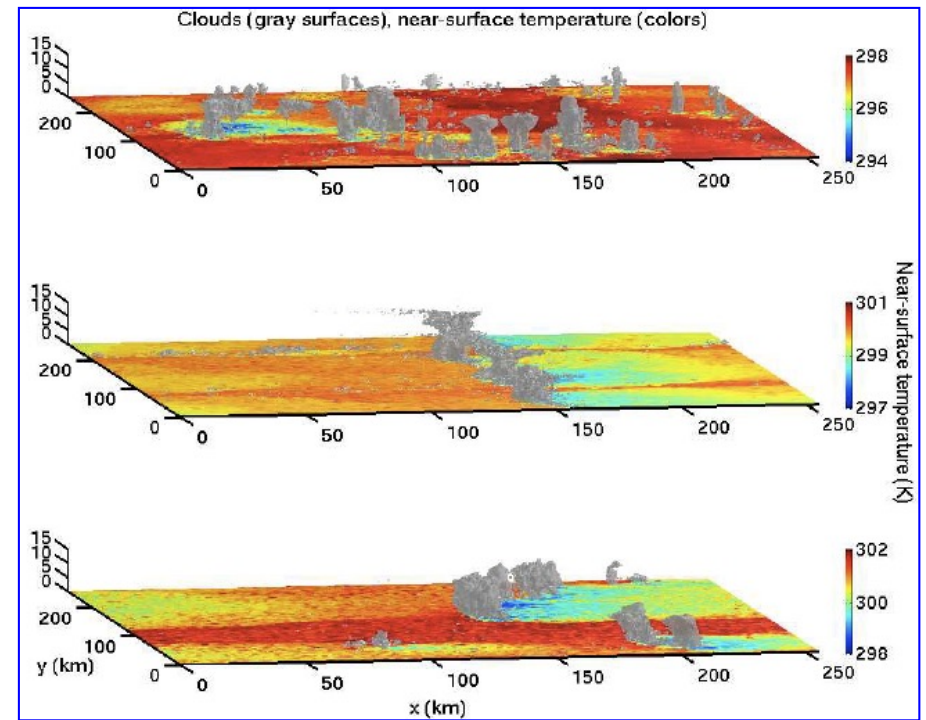


Will look at 2 types of organization:



Self-aggregation

Squall lines

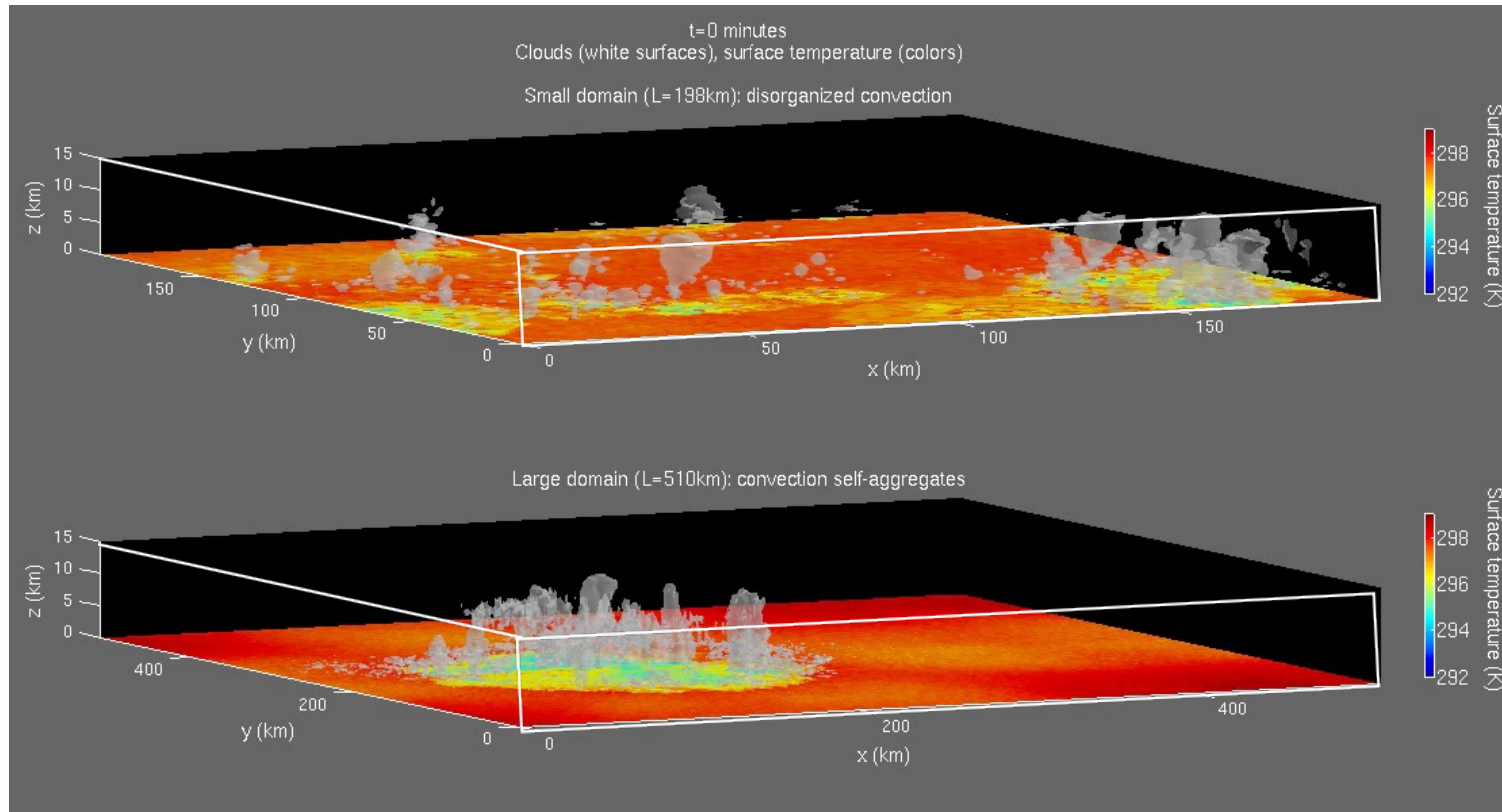


- SAM [Khairoutdinov & Randall 03]
- SST=300K uniform

- No Coriolis ($f=0$)
- In RCE ($dx \sim 1$ km; $Lx \sim 100$ s km)
- Doubly periodic

How do precipitation extremes change with self-aggregation?

Clouds over near-surface temperature in cloud-resolving model SAM



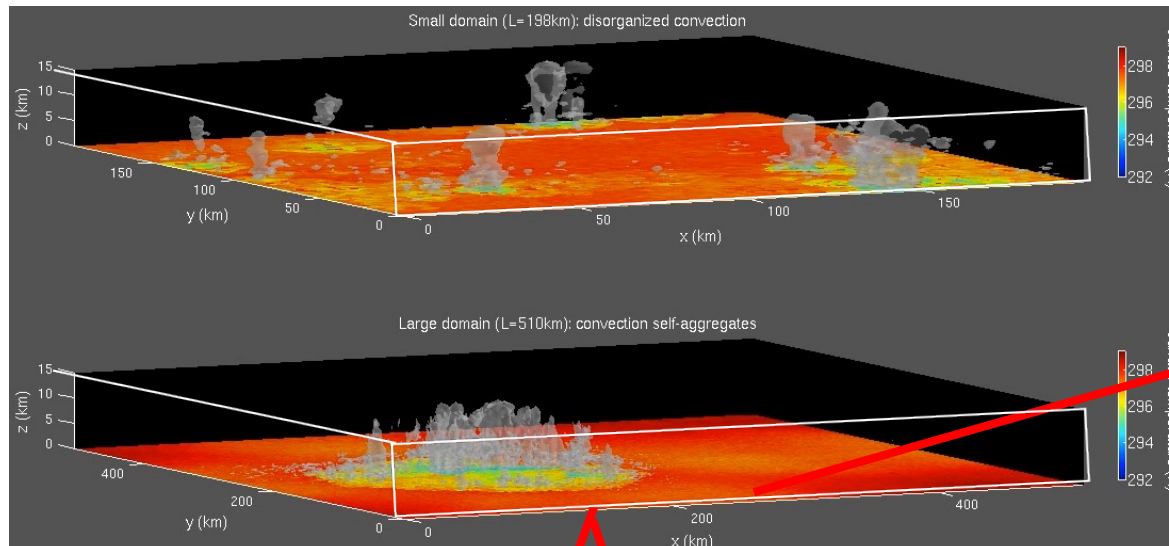
« pop corn »
convection

Self-aggregates

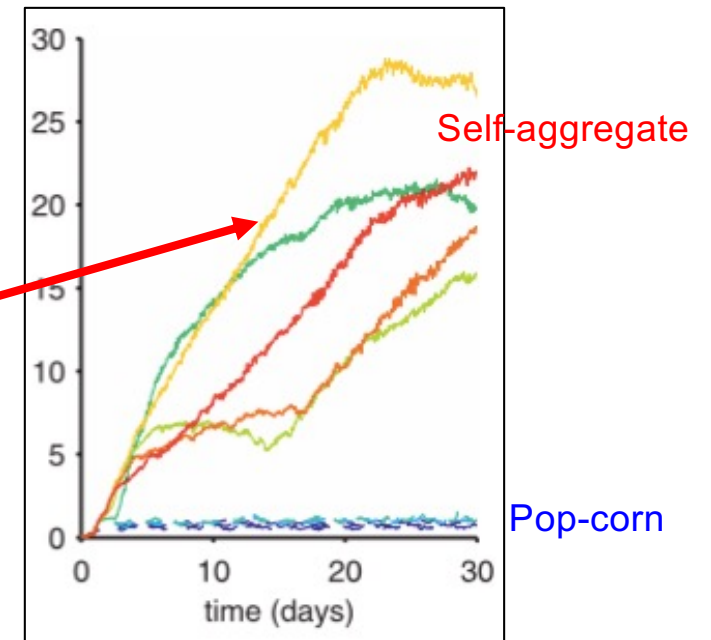
Self Aggregation = Instability of disorganized Radiative-Convective Equilibrium “pop corn” state

[Bretherton, Blossey, Khairoutdinov, 2005; Sobel, Bellon, Bacmeister 2007; Muller, Held 2012; Emanuel, Wing, Vincent 2013; Jeevanjee Romps 2013; Khairoutdinov Emanuel, 2013; Wing Emanuel 2014; Shi Bretherton 2014; Tobin, Bony, Roca, 2012; Tobin et al, 2013; Muller Bony 2015; Arnold Randall 2015; Coppin Bony 2015; Mapes 2016; Holloway Woolnough 2016; Tompkins Semie 2017; **Wing Holloway Emanuel Muller 2017**; Becker Bretherton Hohenegger Stevens 2018; Yang 2018; Muller Romps 2018; **Wing 2019**; **Muller et al 2022**;]

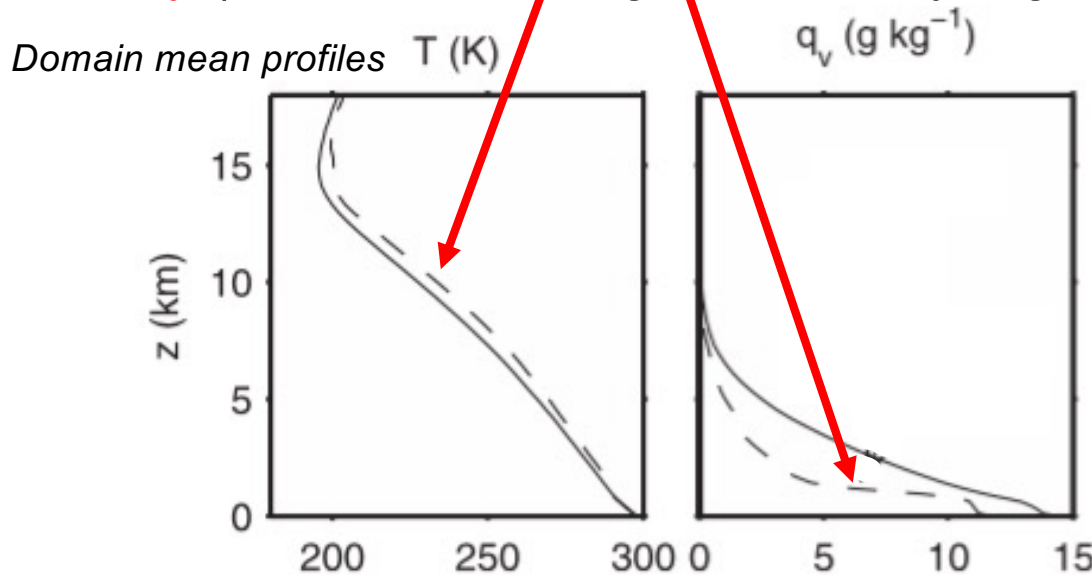
How do precipitation extremes change with self-aggregation?



Variance of precipitable water (mm) in simulations



Self-aggregation leads to **enhanced moisture variability** (moister moist region, drier dry region)



- Overall **drying**
- Overall **warming** (warmer moist adiabat)

How do precipitation extremes change with convective organization?

What can we expect?

$$\delta P \sim \delta \left[\overset{\text{Microphysic}}{\underbrace{\varepsilon_p}_{\text{Dynamic}}} \int \underbrace{\rho w}_{\text{Dynamic}} \underbrace{\left(-\frac{\partial q_{\text{sat}}}{\partial z} \right)}_{\text{Thermodynamic}} dz \right]$$

- Increased water vapor, as more moisture is confined to the moist region with aggregation
⇒ **Increased thermodynamic** contribution ?

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- Increased precipitation efficiency, less rain evaporation in moister near-cloud conditions.
⇒ **Increased microphysic** contribution ?

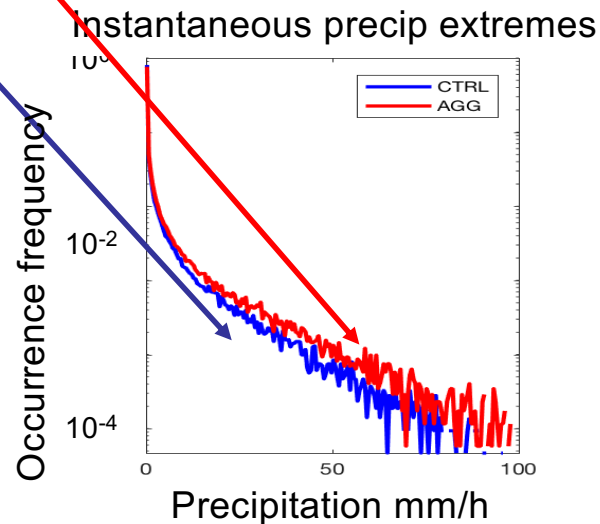
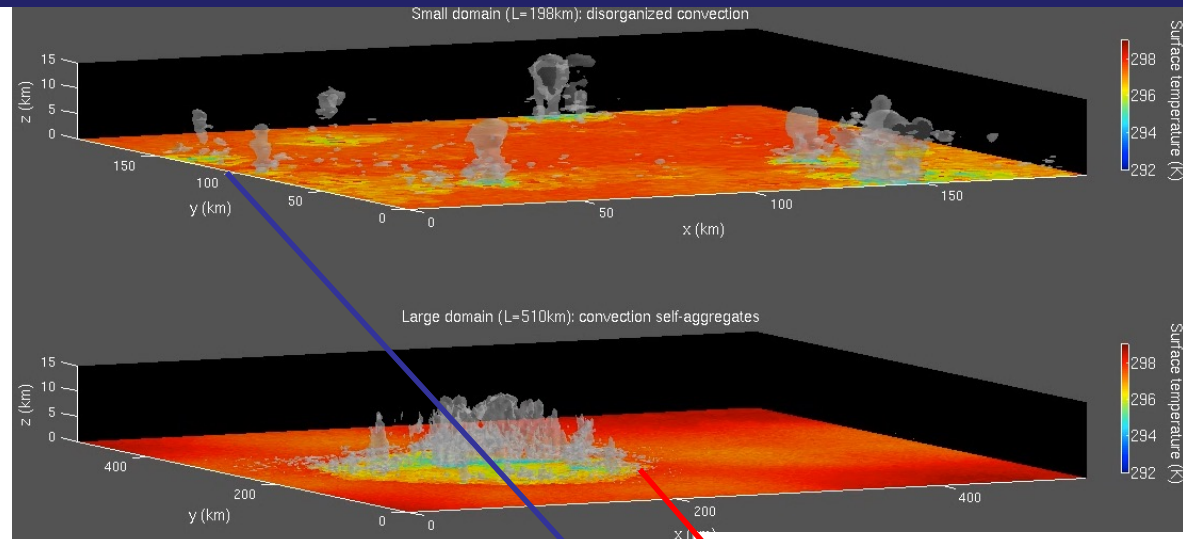
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- Increased water vapor, as more moisture is confined to the moist region with aggregation
⇒ **Increased thermodynamic** contribution ?
- Increased precipitation efficiency, less rain evaporation in moister near-cloud conditions.
⇒ **Increased microphysic** contribution ?
- Decreased atmospheric instability (CAPE), as frequent convection in organized systems consumes CAPE, thus instability does not have time to grow (low CIN in the moist convecting region => instability is removed fast), leading to less CAPE and weaker updrafts.
⇒ **Decreased dynamic** contribution ?

Precipitation extremes with self-aggregation



Self-aggregation => more rain accumulation => stronger 3-hourly precip [Bao Sherwood 2019]

=> BUT increased instantaneous precipitation extremes as well +30%!

Why 30%?

[Da Silva, Muller, Shamekh, Fildier 2021]

How do precipitation extremes change with self-aggregation?

Precip efficiency *Condensation rate « CR » = Dynamic + Thermodynamic*

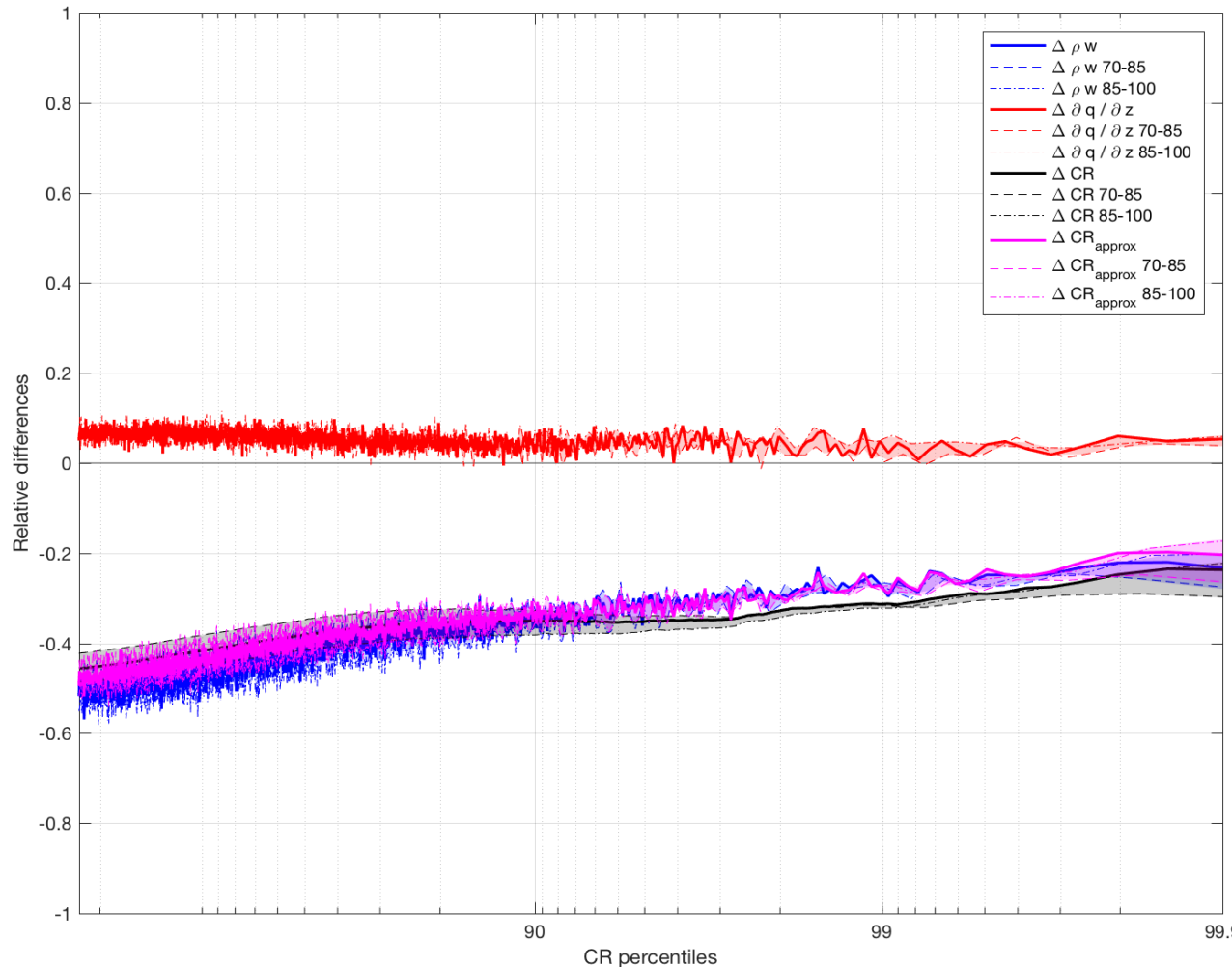
$$\boxed{+30\%} \quad \delta P \sim \delta \left[\underbrace{\varepsilon_p}_{\text{Precip efficiency}} \underbrace{\int \rho w \frac{-\partial q_{\text{sat}}}{\partial z} dz}_{\text{Condensation rate « CR » = Dynamic + Thermodynamic}} \right]$$

[Da Silva, Muller, Shamekh, Fildier 2021]

How do precipitation extremes change with self-aggregation?

Precip efficiency Condensation rate « CR » = Dynamic + Thermodynamic

$$\delta P \sim \delta \left(\underbrace{\varepsilon_p}_{+30\%} \int \underbrace{\rho w - \frac{\partial q_{\text{sat}}}{\partial z}}_{-20\%} dz \right) = \underbrace{-25\%}_{\text{Dynamic}} + \underbrace{+5\%}_{\text{Thermodynamic}}$$



Thermodynamic + 5%

Condensation rate -20%

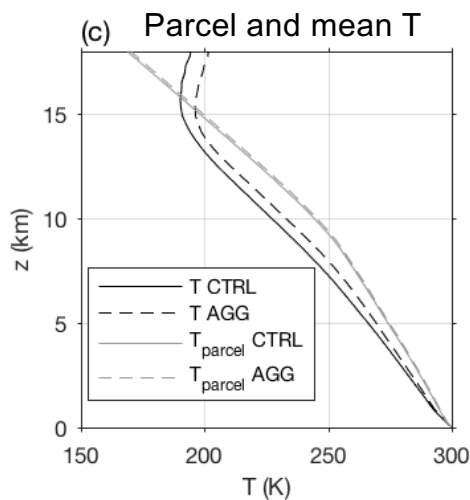
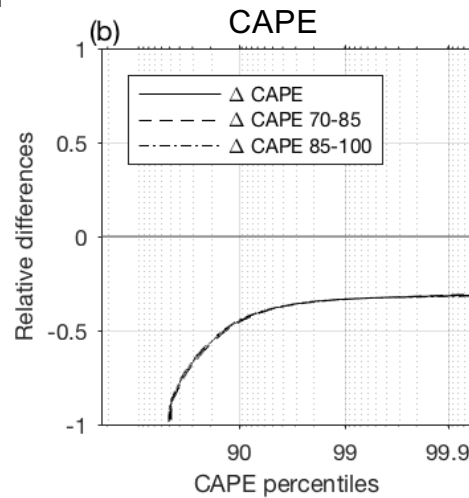
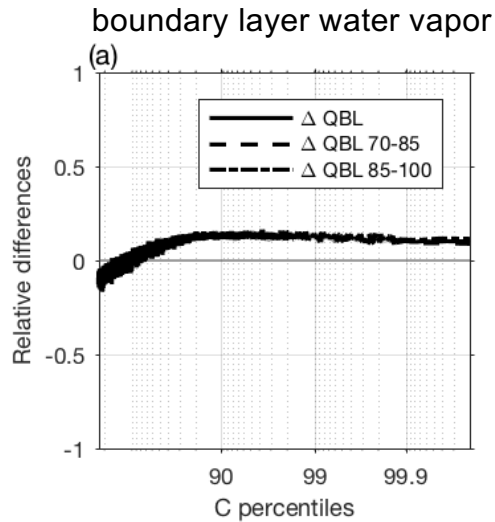
Dynamic -25%

[Da Silva, Muller, Shamekh, Fildier 2021]

How do precipitation extremes change with self-aggregation?

Precip efficiency Condensation rate « CR » = Dynamic + Thermodynamic

$$\delta P \sim \delta \left(\underbrace{\epsilon_p}_{+30\%} \int \rho w \left[\underbrace{-\frac{\partial q_{\text{sat}}}{\partial z}}_{-20\%} \right] dz \right) = \underbrace{-25\%}_{\text{Dynamic}} + \underbrace{+5\%}_{\text{Thermodynamic}}$$



Thermodynamic:

Increase due to moister boundary layer water vapor in cloudy regions

Positive but small contribution

Dynamic:

Decrease due to decreased instability
-30% CAPE \Leftrightarrow -15% w

Qualitatively consistent with dynamic decrease -25%

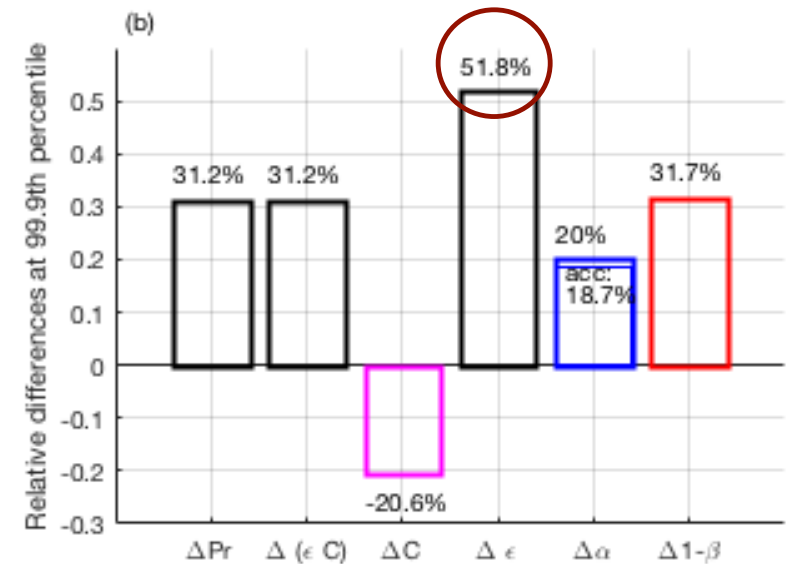
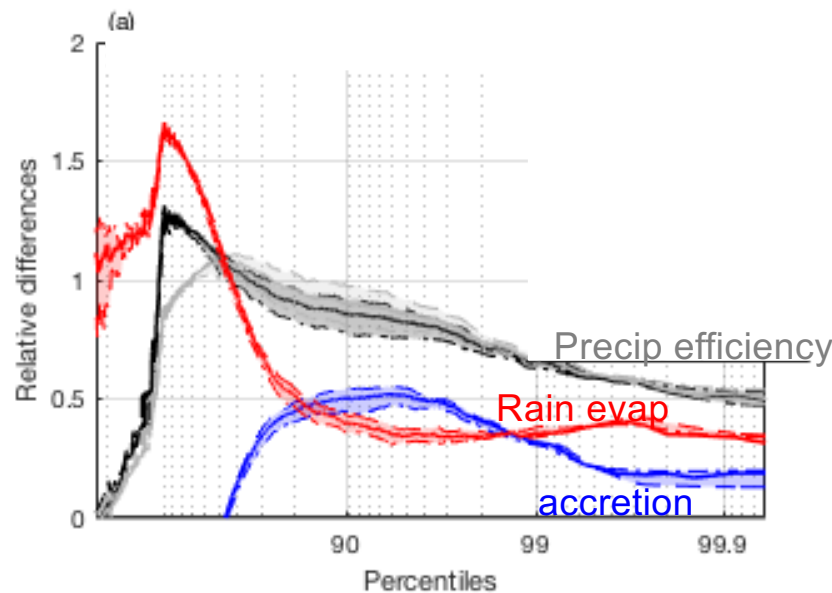
[Da Silva, Muller, Shamekh, Fildier 2021]

How do precipitation extremes change with self-aggregation?

+50%!! *Precip efficiency* *Condensation rate « CR » = Dynamic + Thermodynamic*

$$\delta P \sim \delta \left(\underbrace{\epsilon_p}_{+30\%} \int \rho w \frac{-\partial q_{\text{sat}}}{\partial z} dz \right) = \underbrace{-20\%}_{\text{Condensation rate}} = \underbrace{-25\%}_{\text{Dynamic}} + \underbrace{+5\%}_{\text{Thermodynamic}}$$

Split further into microphysical processes [Lutsko Cronin 2018]



*accr (collection of cloud into precip)
 + (autoconversion) (cloud into precip)*

*evaporates (fraction β)
 or reaches surface*



⇒ **Mainly reduced rain evaporation** (due to moister conditions)

[Da Silva, Muller, Shamekh, Fildier 2021]

How do precipitation extremes change with convective organization?

What can we expect?

$$\delta P \sim \delta \left[\overset{\text{Microphysic}}{\underbrace{\varepsilon_p}_{\text{Dynamic}}} \int \underbrace{\rho w}_{\text{Dynamic}} \underbrace{\left(-\frac{\partial q_{\text{sat}}}{\partial z} \right)}_{\text{Thermodynamic}} dz \right]$$

⇒ **Increased thermodynamic** contribution ?

⇒ **Increased microphysic** contribution ?

⇒ **Decreased dynamic** contribution ?

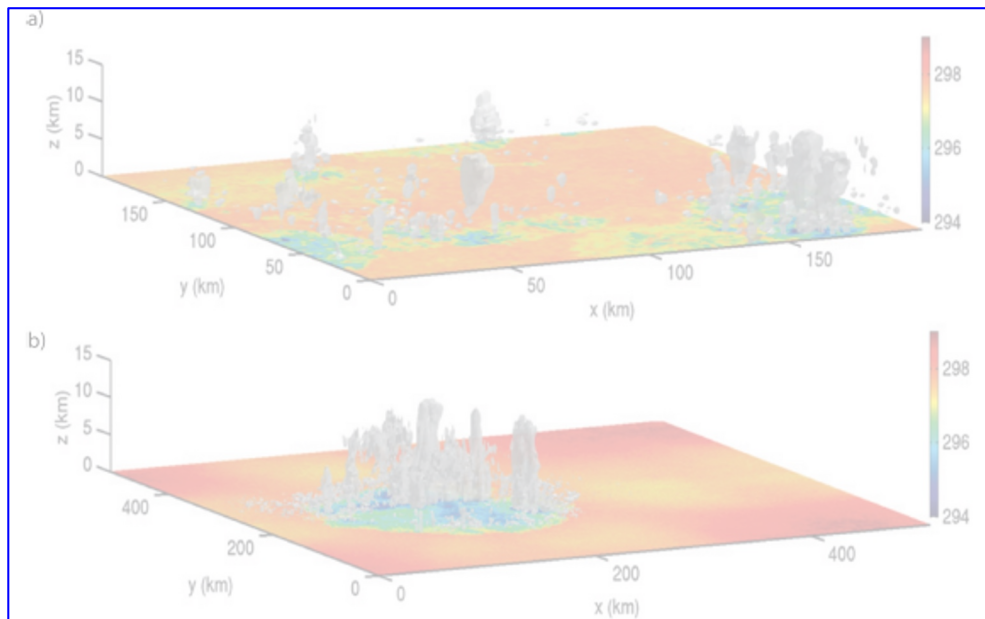


With Aggregation: Microphysic contribution dominates amplification of precipitation extremes

Due to less rain evaporation, higher precipitation efficiency

[Da Silva, Muller, Shamekh, Fildier 2021]

Will look at 2 types of organization:

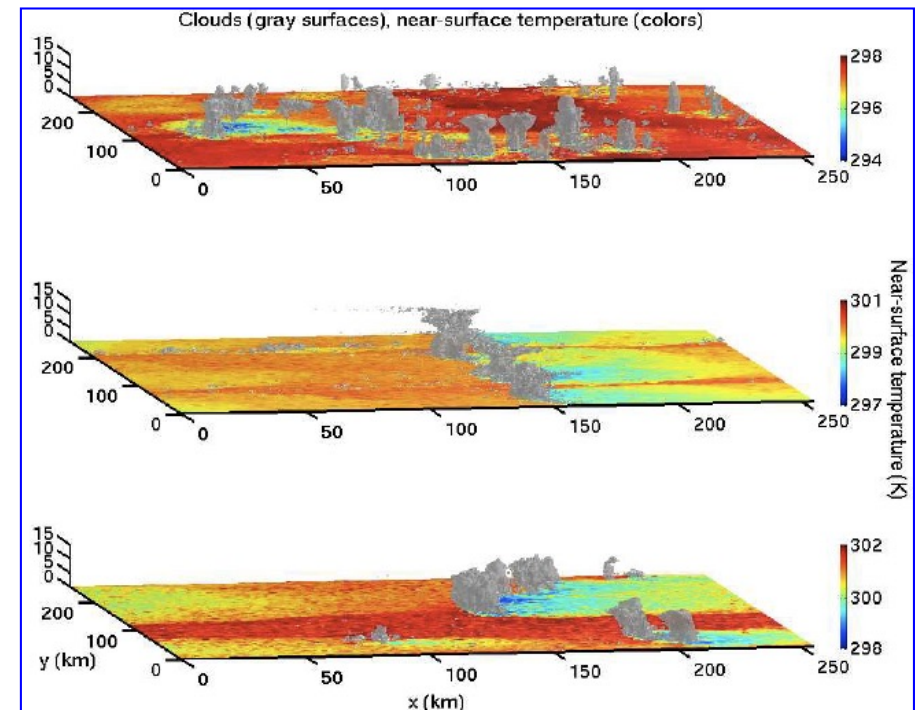


Self-aggregation

Microphysic contribution dominates amplification of precipitation extremes

Due to less rain evaporation => higher precipitation efficiency

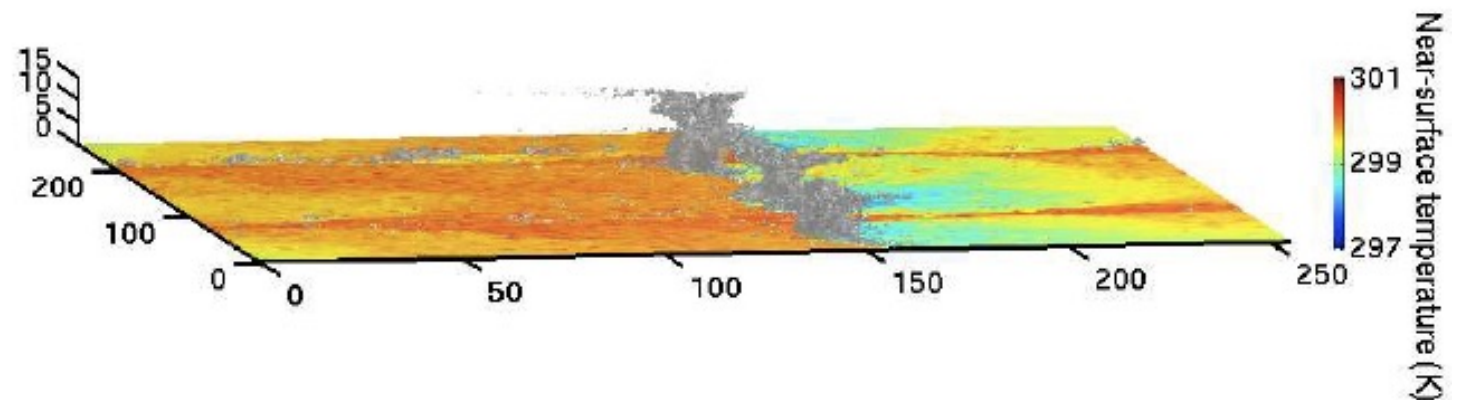
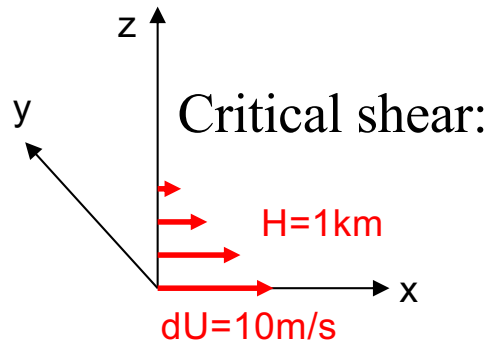
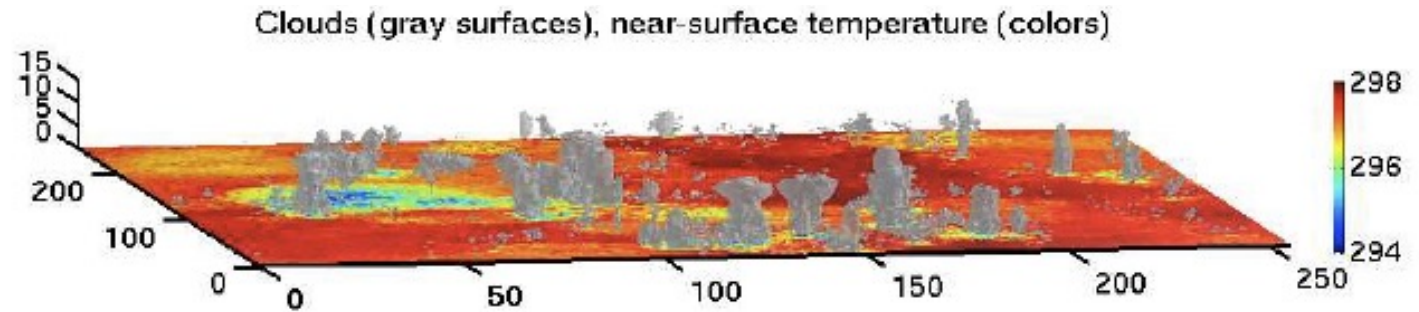
Squall lines



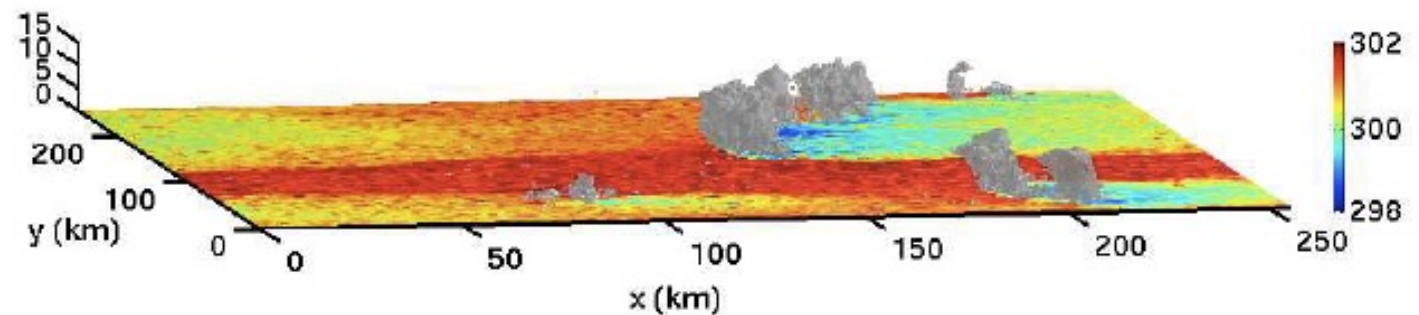
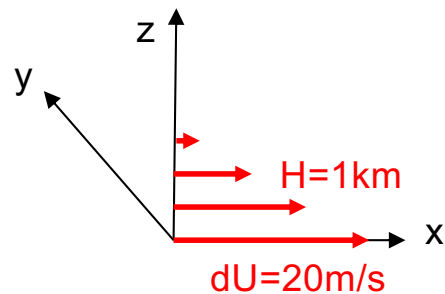
Precipitation extremes in squall lines?

Squall lines (use vertical shear to organize the convection into arcs)

No shear:



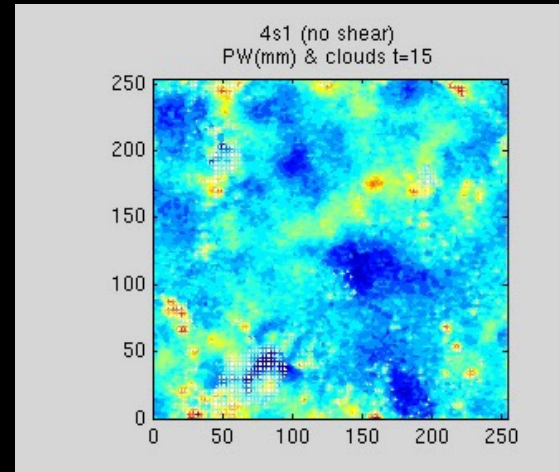
Supercritical shear:



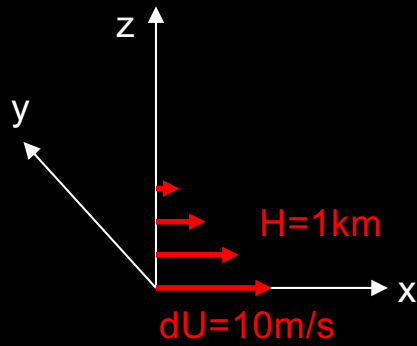
Precipitation extremes in squall lines?

Top view

Color: PW



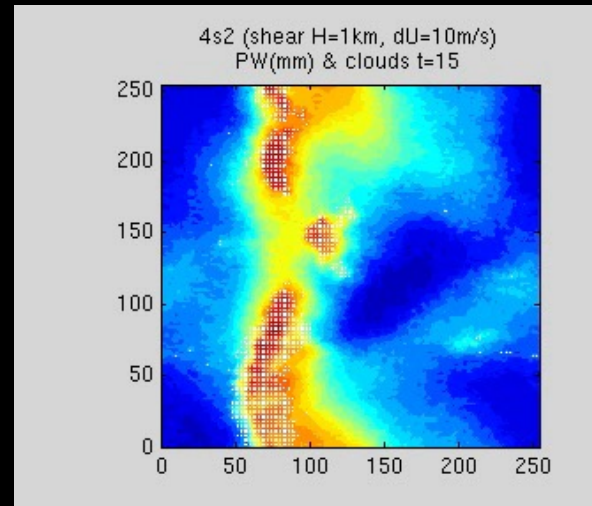
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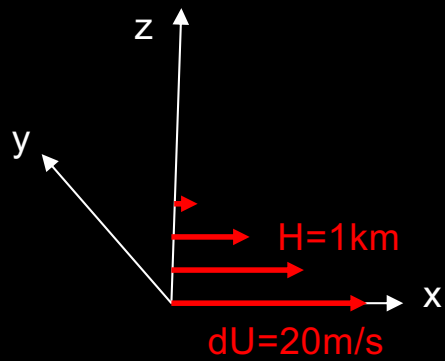
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Top view



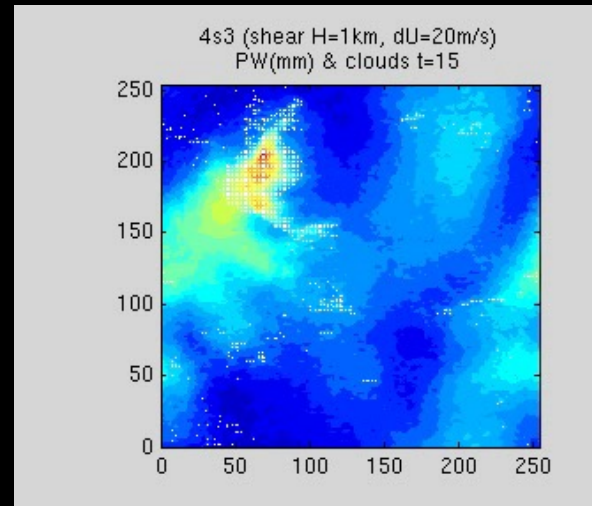
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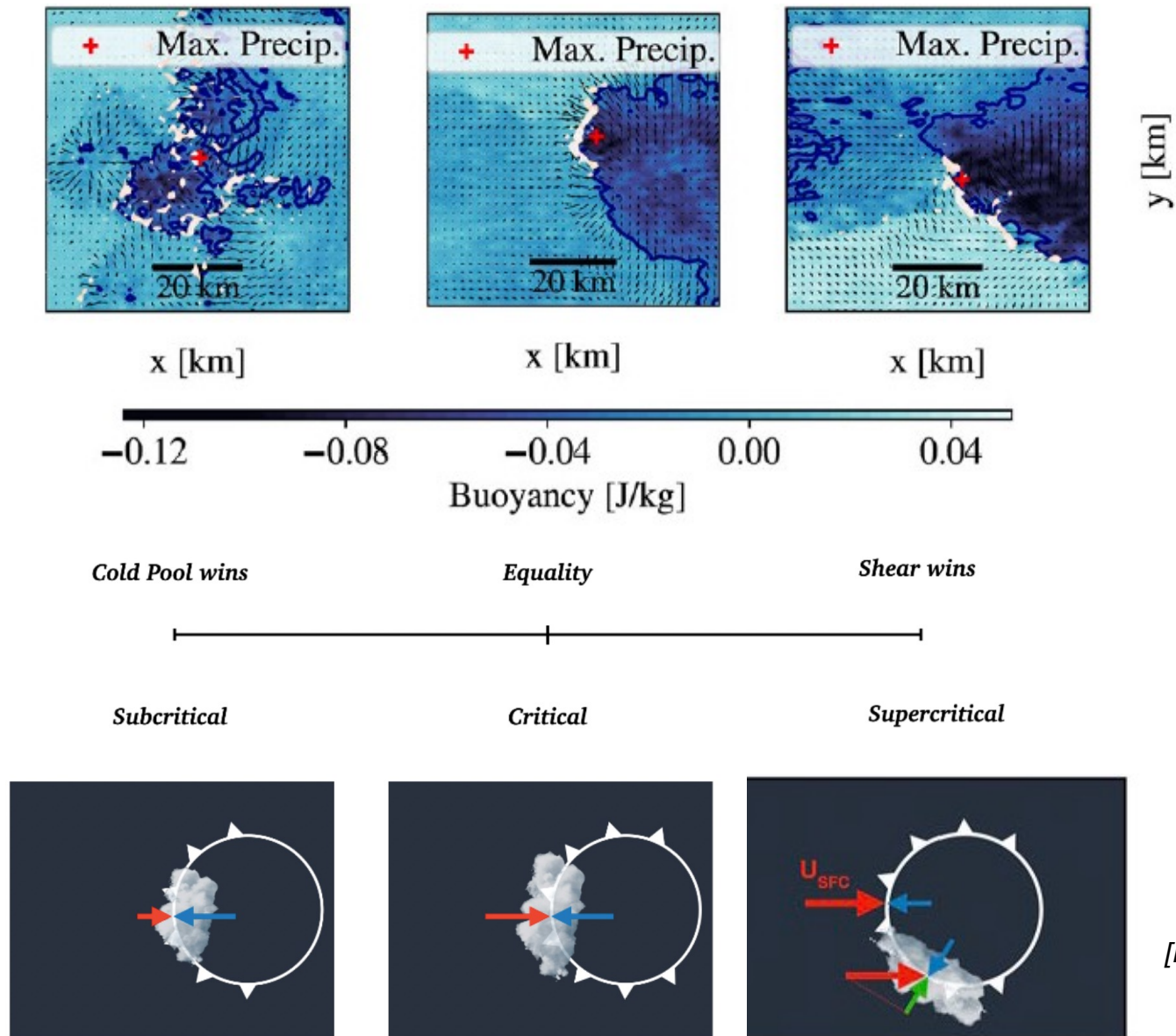


Top view



Precipitation extremes in squall lines?

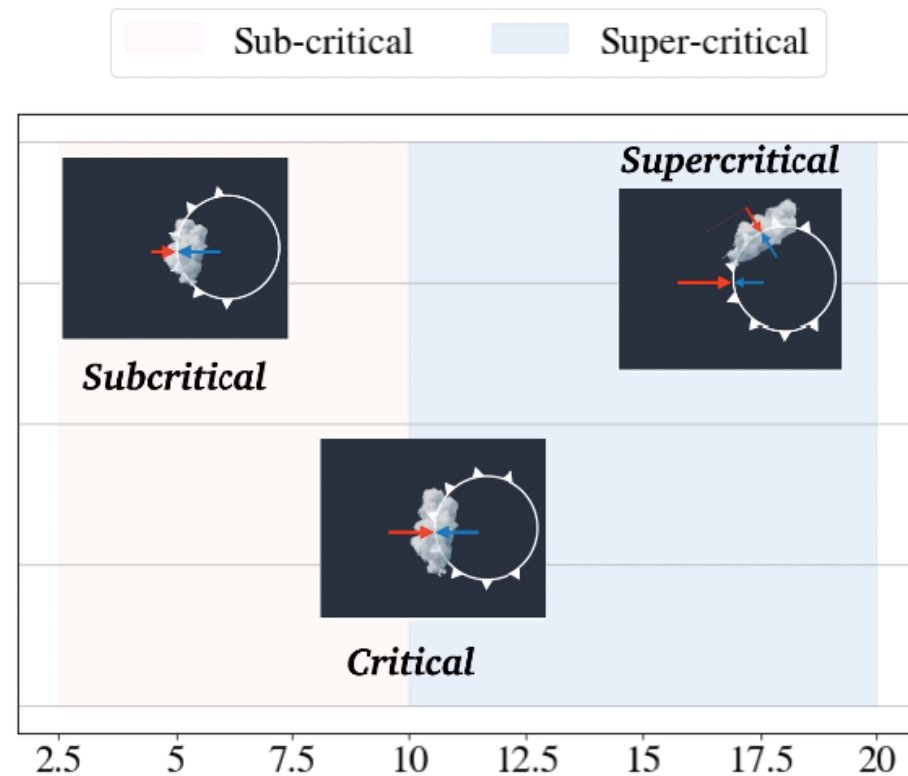
Squall line regimes



[Rotunno Klemp Weisman 1988;
Rober Emanuel 2011;
Abramian Muller Risi 2021]

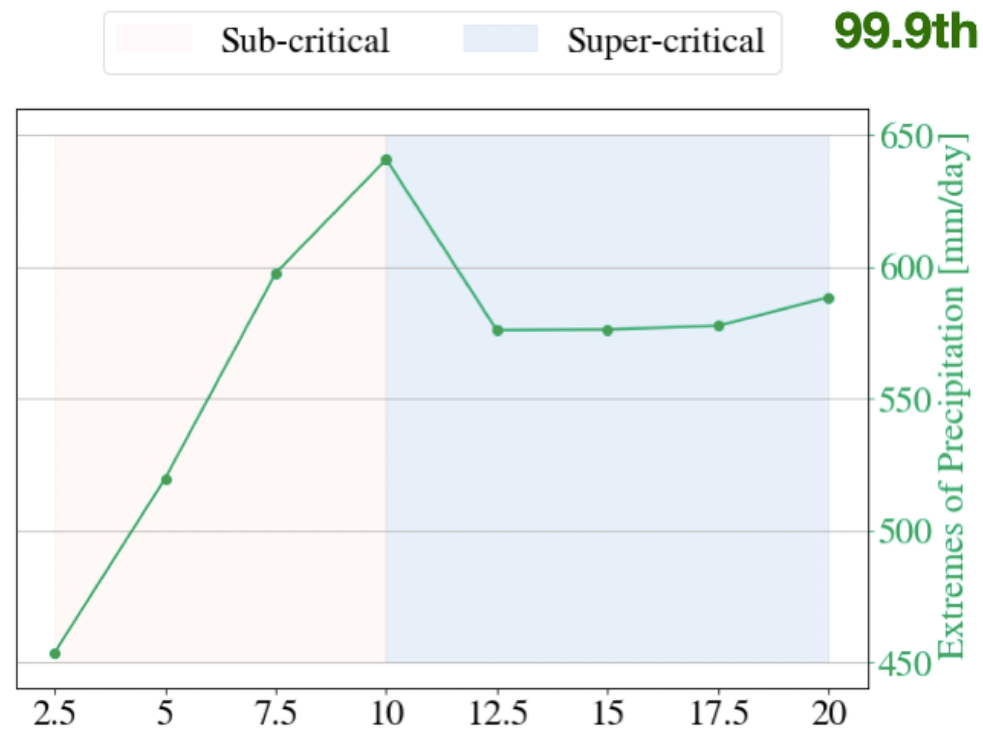
Precipitation extremes in squall lines?

How do Extremes of Precipitation evolve with Squall Lines regime ?



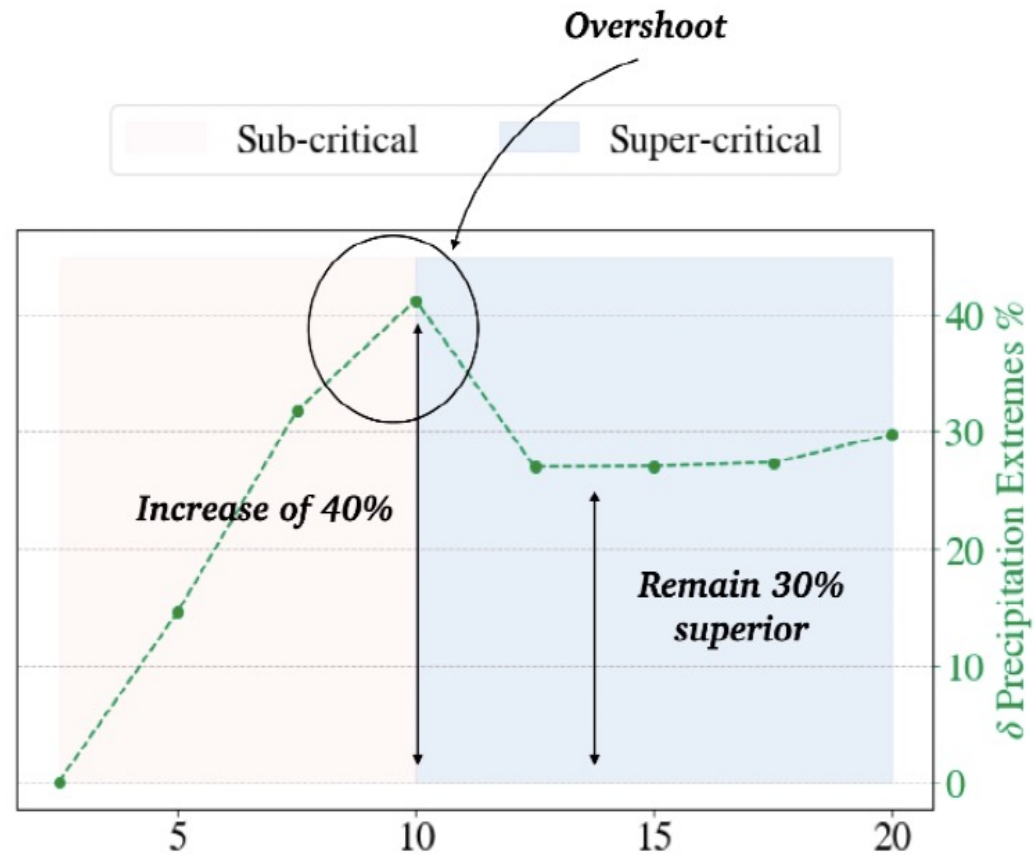
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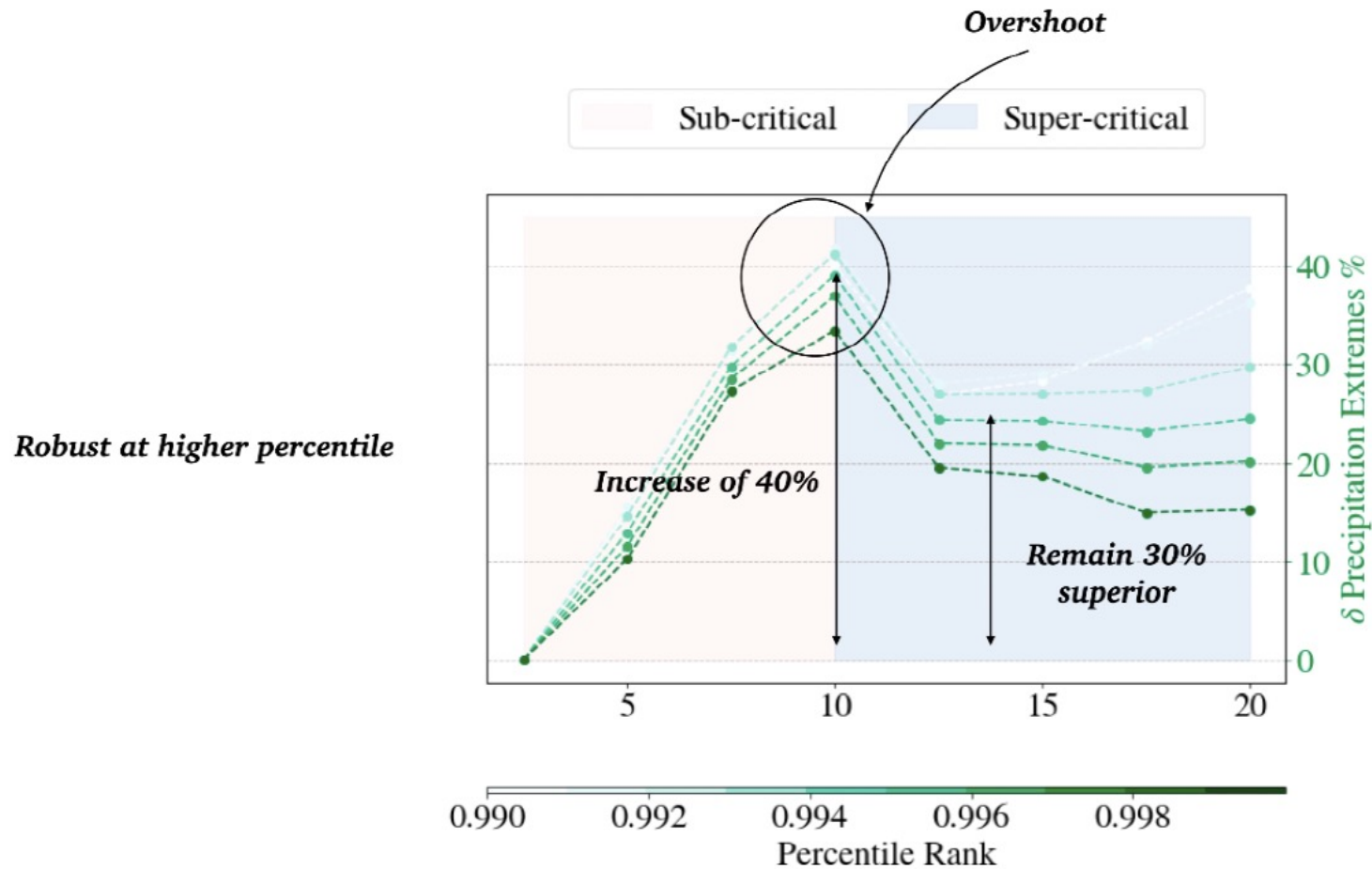
Precipitation extremes in squall lines?

Relative Evolution Extremes of Precipitation



Precipitation extremes in squall lines?

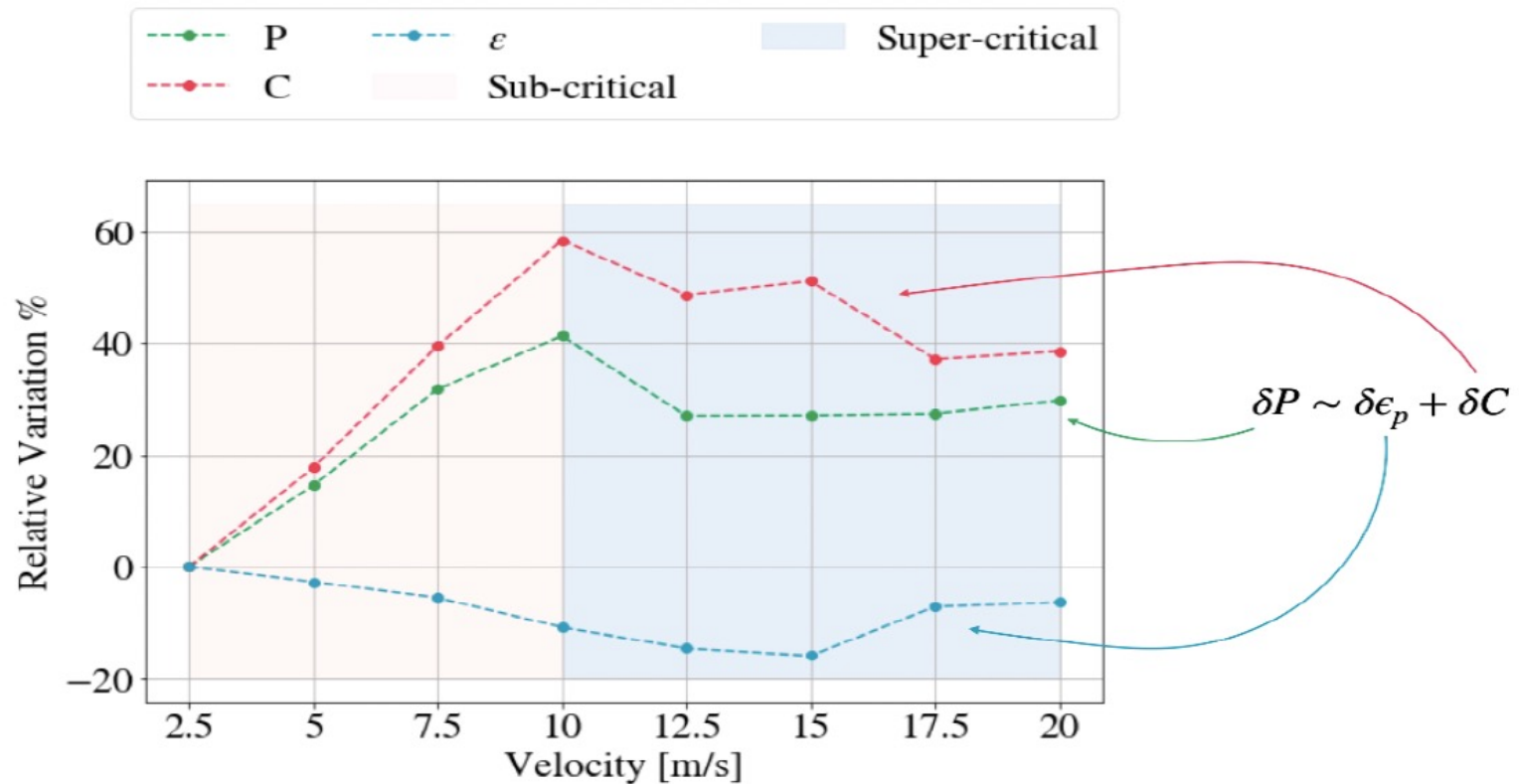
Relative Evolution Extremes of Precipitation



→ Why ?

Precipitation extremes in squall lines?

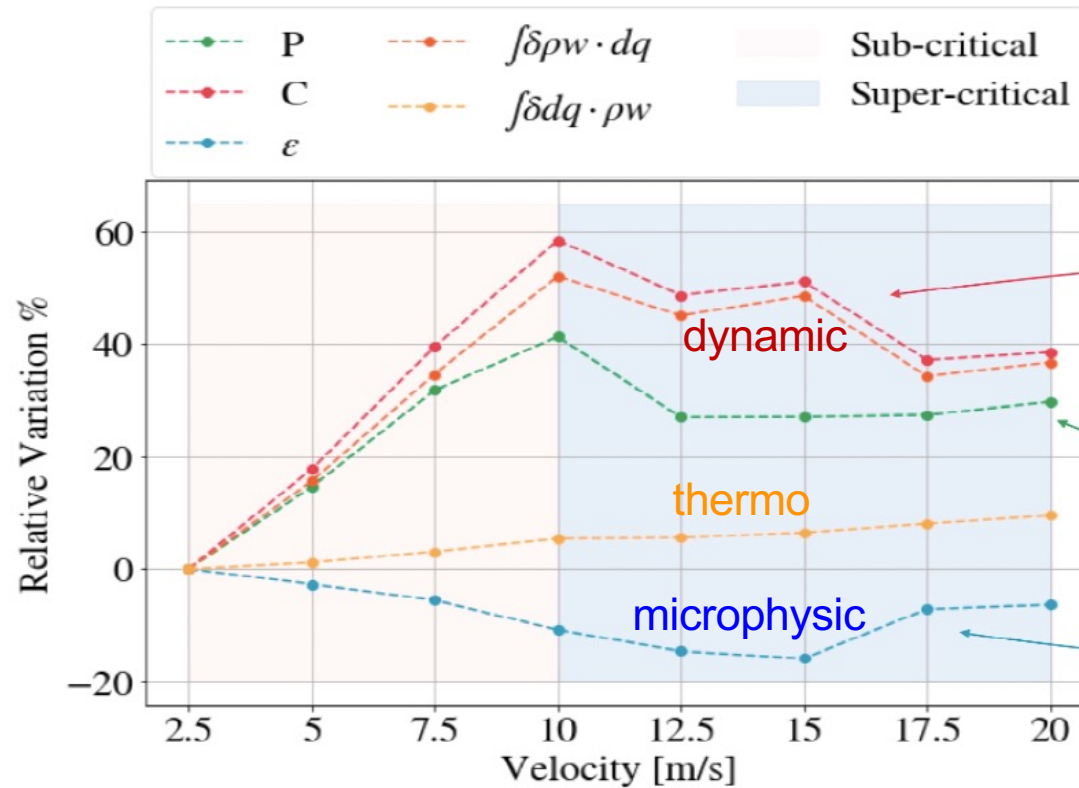
Scaling decomposition



⇒ Condensation is sensitive to squall line regime

Precipitation extremes in squall lines?

Scaling decomposition



$$\delta P \sim \delta \epsilon_p + \delta C$$

$$\delta P \sim \delta \epsilon_p + \int \delta \rho w dq + \int \delta dq \rho w$$

⇒ Dominated by dynamic contribution!



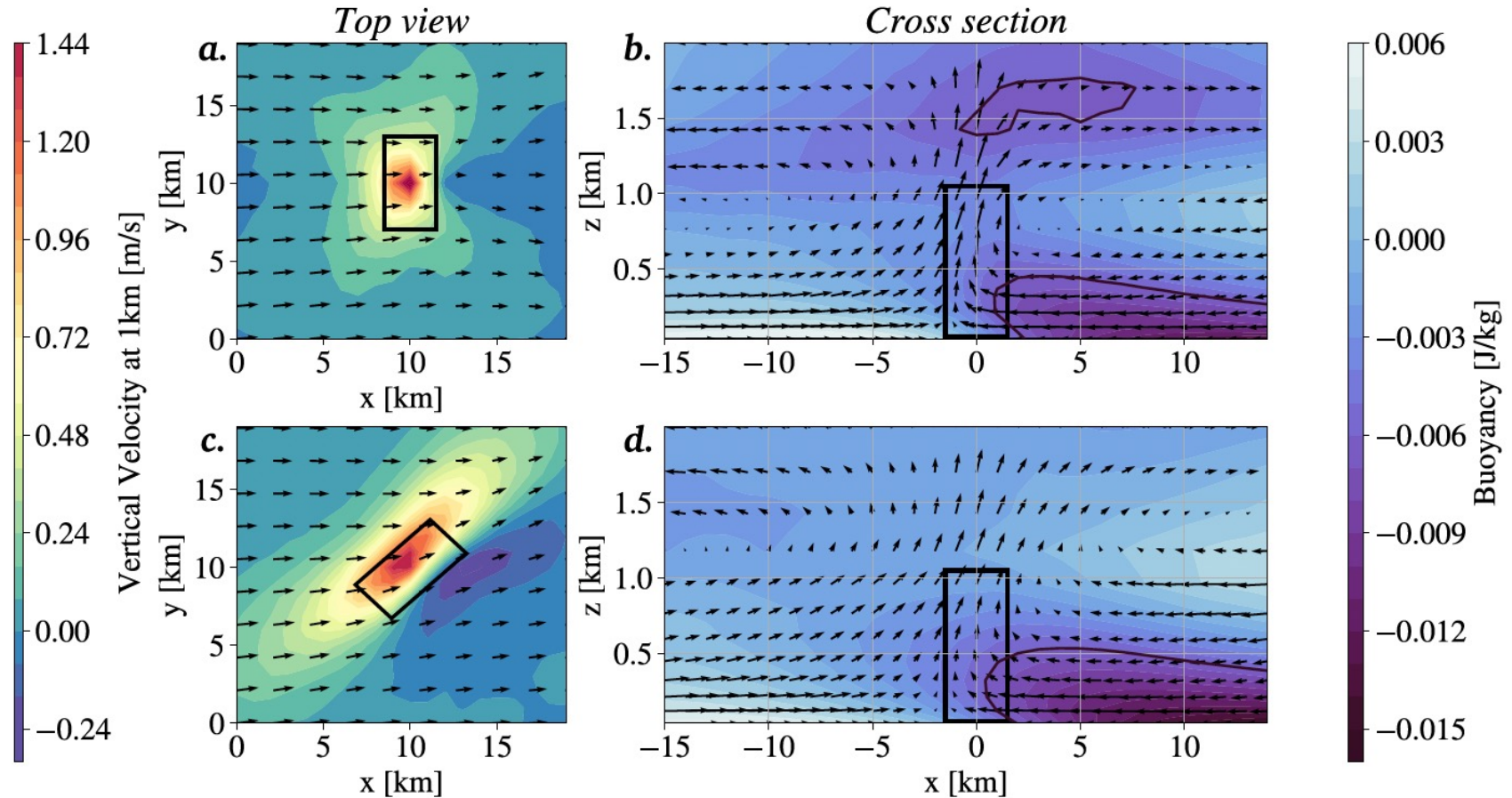
Precipitation extremes in squall lines?

Why? CAPE changes are small...

[Abramian Muller Risi 2023]

Precipitation extremes in squall lines?

Why? CAPE changes are small...



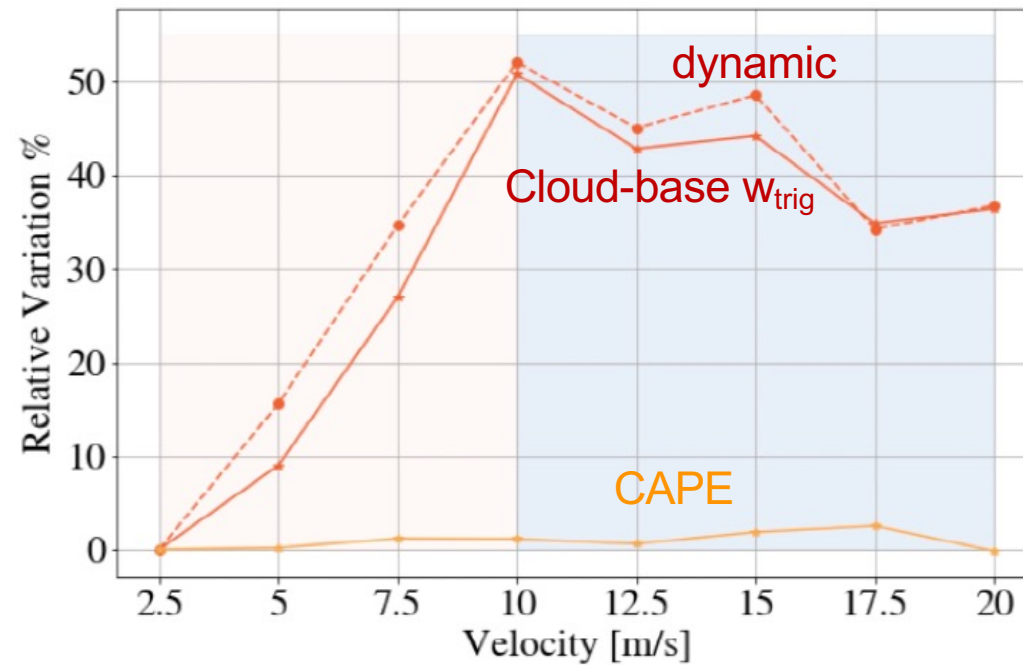
[Abramian Muller Risi 2023]

Precipitation extremes in squall lines?

Convective triggering dominates dynamics

$$dw \sim \int w_{trig} \frac{\Delta w_{trig}}{w} + \int \frac{\Delta CAPE}{w}$$

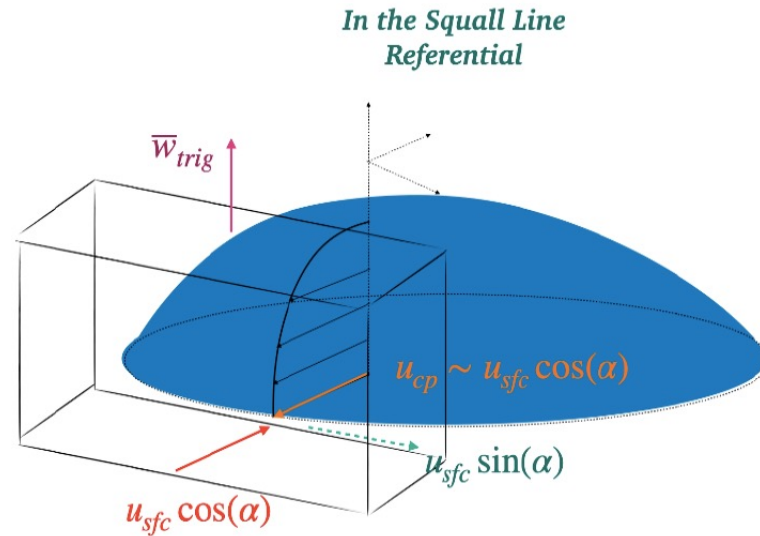
$\int \delta \rho w \cdot dq$ $\int \delta \rho w_{trig} dq$ $\int \delta \rho CAPE dq$



[Abramian Muller Risi 2023]

Precipitation extremes in squall lines?

A model for convective triggering ?

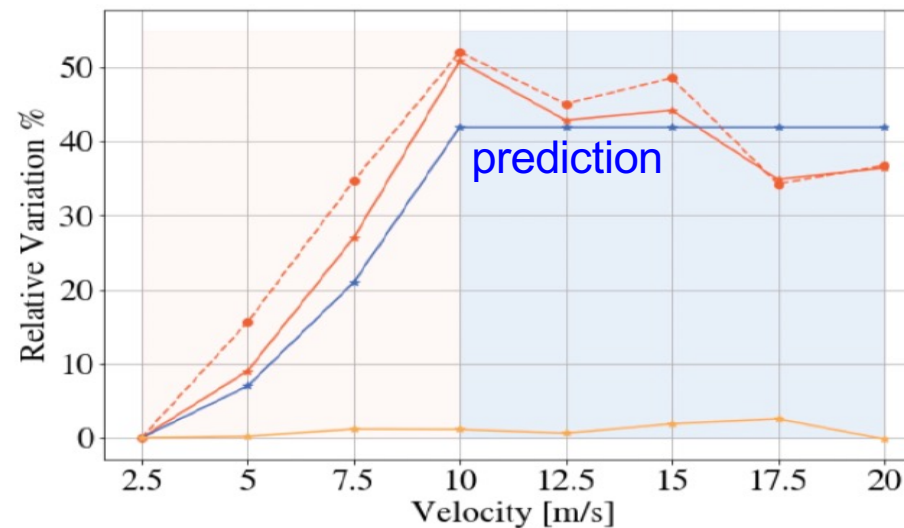
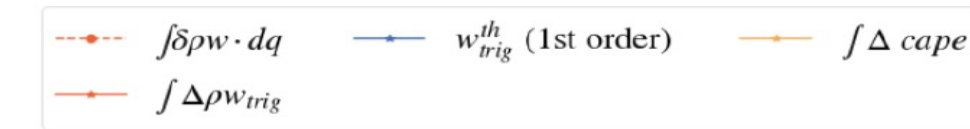


Mass Balance

$$\underline{\underline{div(\rho \vec{u}) = 0}}$$

1st order

$$\bar{w}_{trig} \sim r \frac{u_{sfc} \cos(\alpha)}{6}$$



[Abramian Muller Risi 2023]

Precipitation extremes in squall lines?

- ⇒ Extremes of precipitation are sensitive to squall line regime
- ⇒ Explained by a change in dynamics with the orientation of the line
- ⇒ In particular, the triggering vertical velocity depends on convergence between cold pool spreading and projected wind shear
- ⇒ We derive a simple model for triggering velocity that fits the variation of the dynamic term



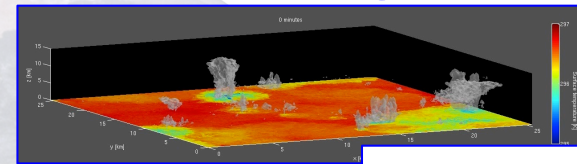
[Abramian Muller Risi 2023]

Precipitation extremes, their change with warming & with convective organization

1) How do precipitation extremes change with **warming**?

⇒ Precipitation extremes increase with warming

⇒ Following Clausius-Clapeyron (near-surface humidity increase)



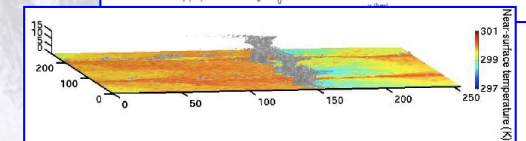
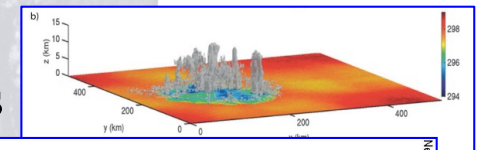
$$P \sim \epsilon_p \int \rho_w - \frac{\partial q_v}{\partial z} dz$$

2) How do precipitation extremes change with **convective organization**?

⇒ Precipitation extremes increase in organized convection

⇒ With self-aggregation, increased precipitation efficiency dominates

⇒ In squall lines, increased updraft velocities dominate

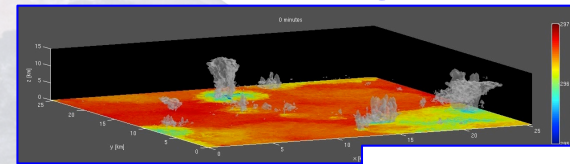


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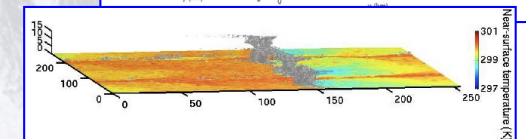
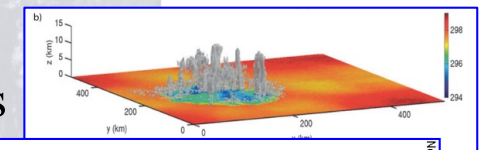
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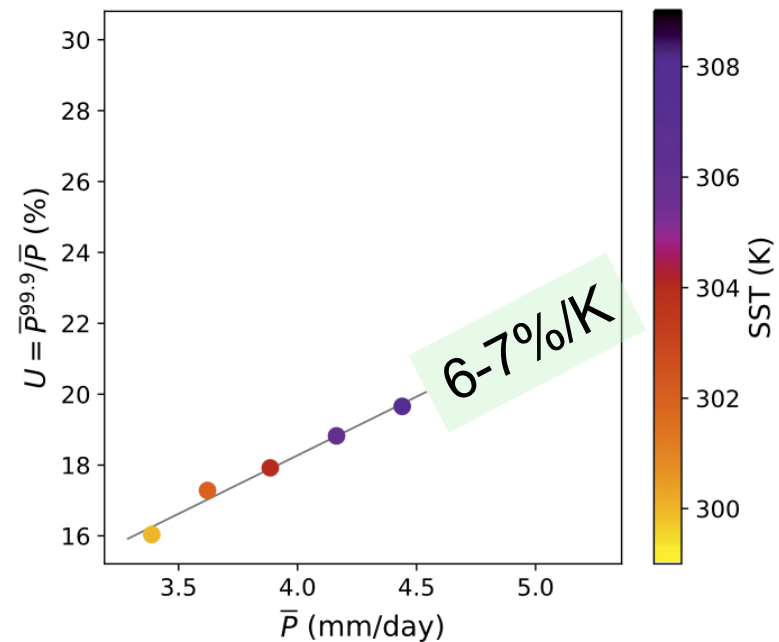
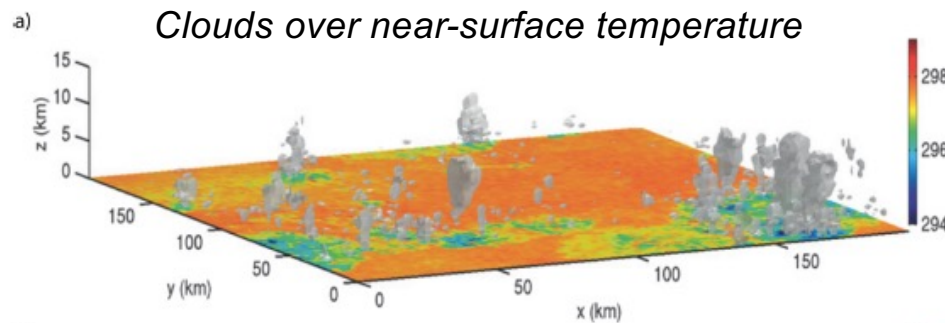


3) How does **organization** (& thus extremes) change with **warming**?

Precipitation extremes, organization and warming

Local (convective scale) precipitation extremes increase following surface water vapor $\sim 6-7\%/K$

Cloud-Resolving Model (CRM) "SAM" [Khairoutdinov, M.F. and Randall, D.A., JAS 2003]



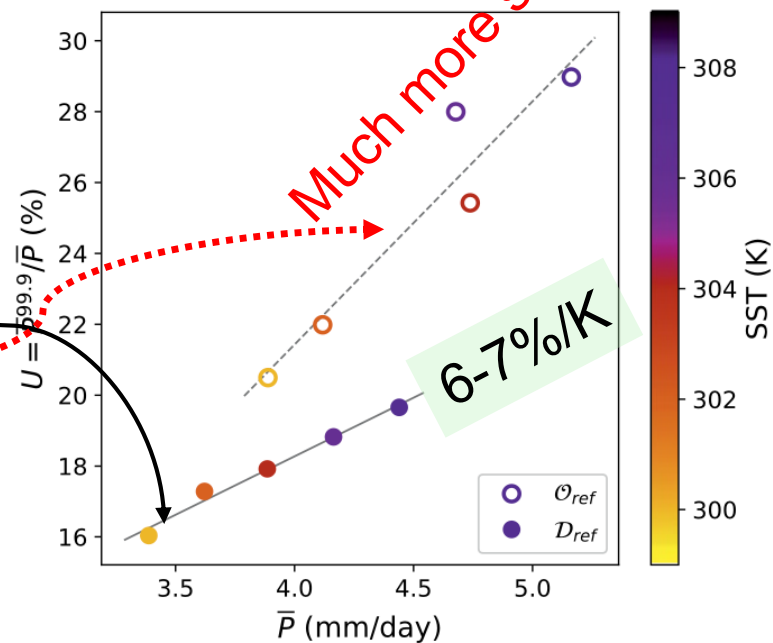
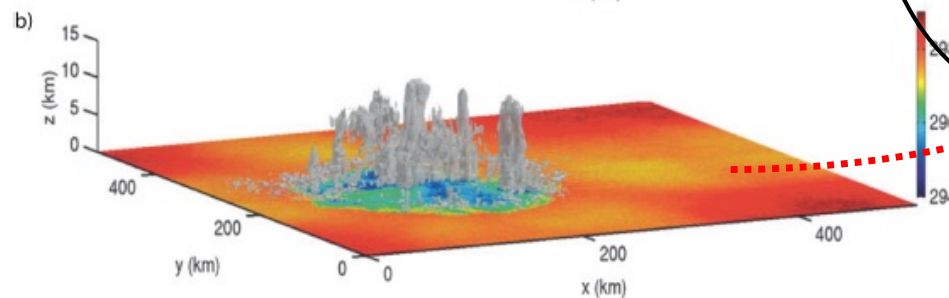
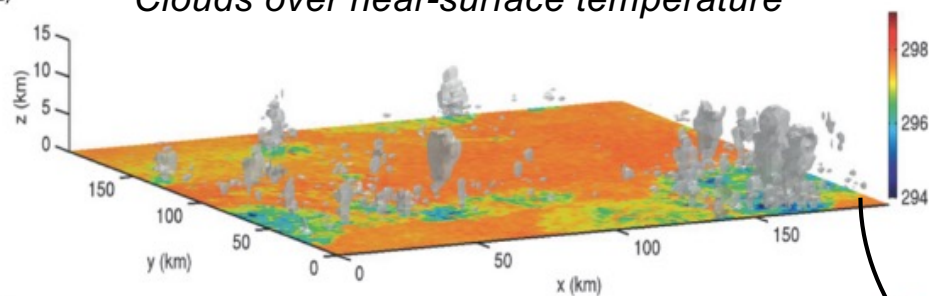
Precipitation extremes, organization and warming

Local (convective scale) precipitation extremes increase following surface water vapor $\sim 6-7\%/K$

- ⇒ BUT more sensitive to warming if organized
- ⇒ Need to understand mesoscale systems & link with precip extremes

Cloud-Resolving Model (CRM) "SAM" [Khairoutdinov, M.F. and Randall, D.A., JAS 2003]

a) Clouds over near-surface temperature



[Fildier Collins Muller 2021]

Precipitation extremes in GSRMs

Global storm resolving models (GSRMs)

- High resolution (<5km), global domain
- Realistic conditions (forcing, with rotation)
- With large-scale circulation

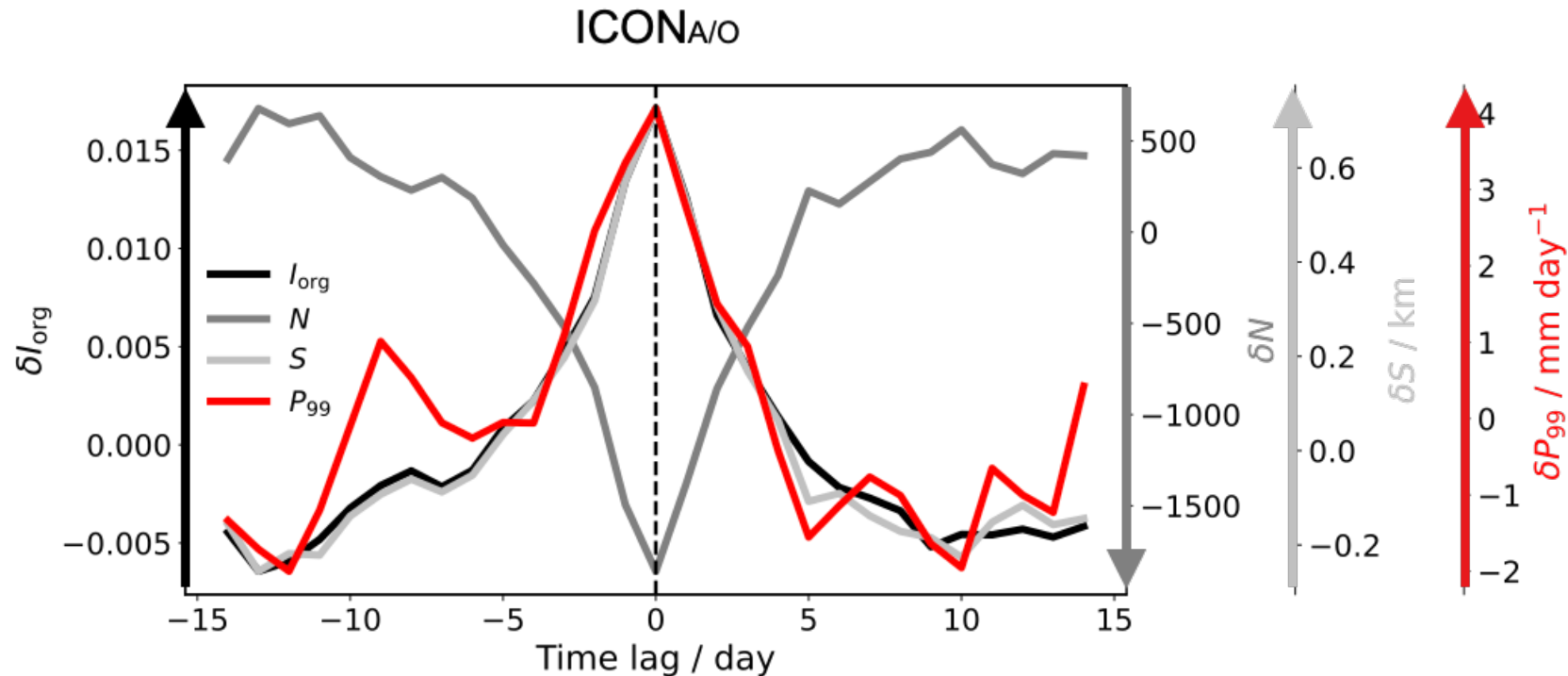


ICON 1 km visualization (MPI-M&DKRZ)
Hohenegger et al. 2023

Precipitation extremes in GSRMs

In current climate:

Time evolution of organisation and precipitation extremes during the composite peak organization events



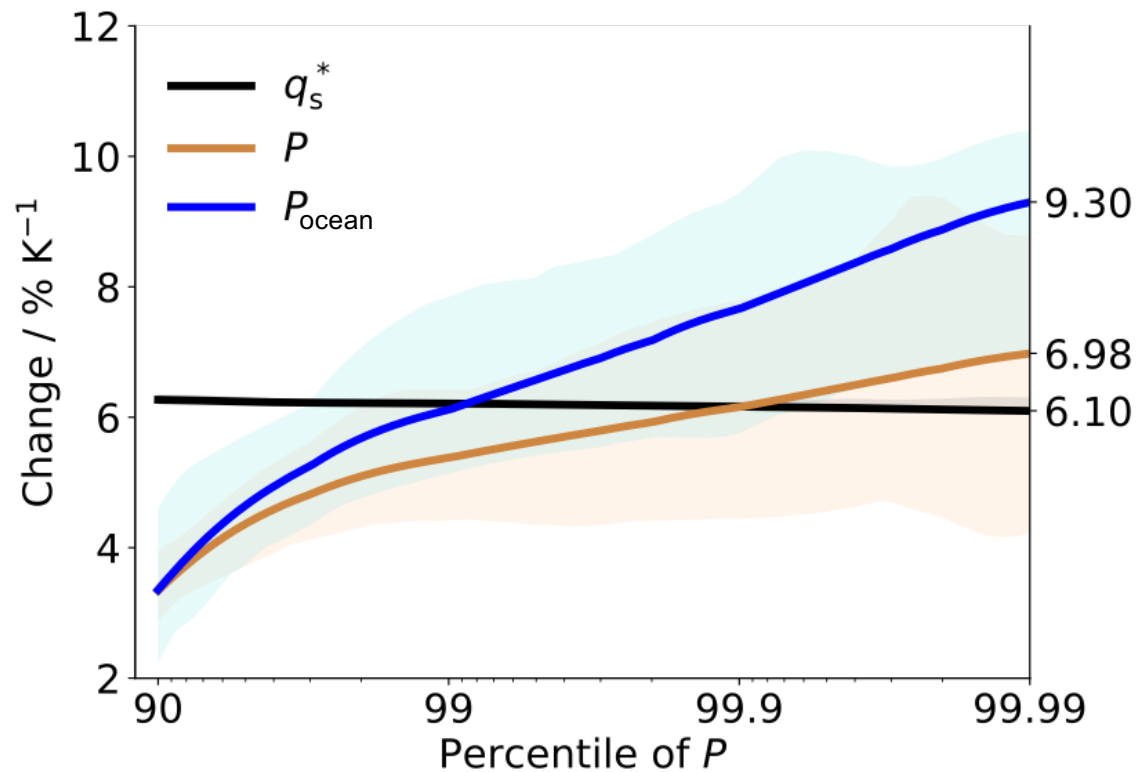
⇒ Precipitation extremes & I_{org} related

Bao Stevens Kluft Muller, *Science Advances* (2024)

Precipitation extremes in GSRMs

In future climate:

Change in daily precipitation extremes in 2070 relative to 1850 from ICON_A



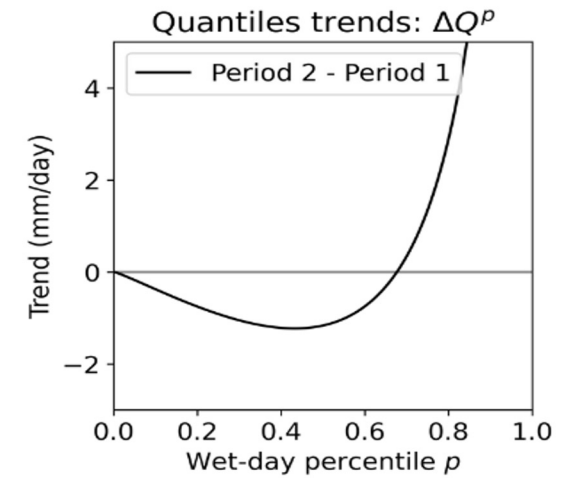
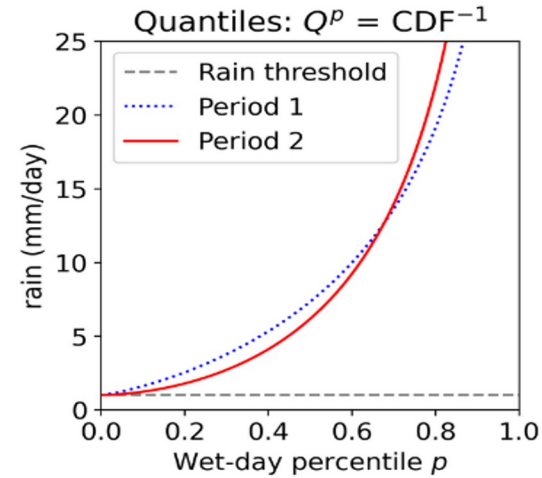
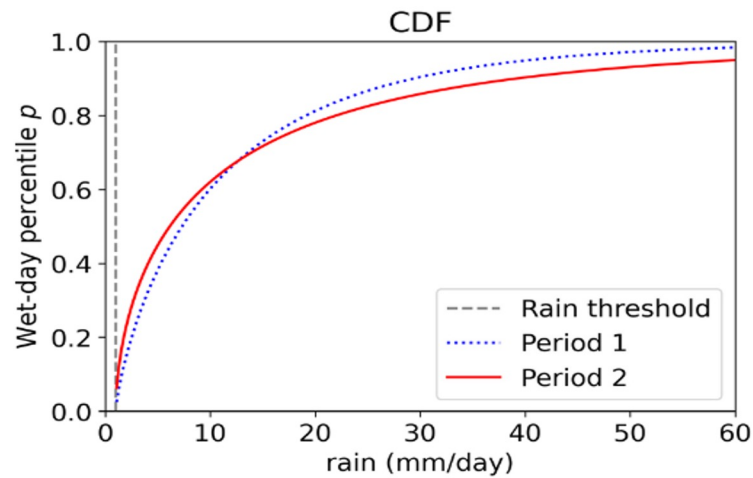
⇒ Precip extremes amplify beyond CC

⇒ Due to increased organization

Bao Stevens Kluft Muller, *Science Advances* (2024)

Precipitation extremes projects

Project : Framework to look at whole precip pdf (not just mean or extremes)



Andre et al 2024

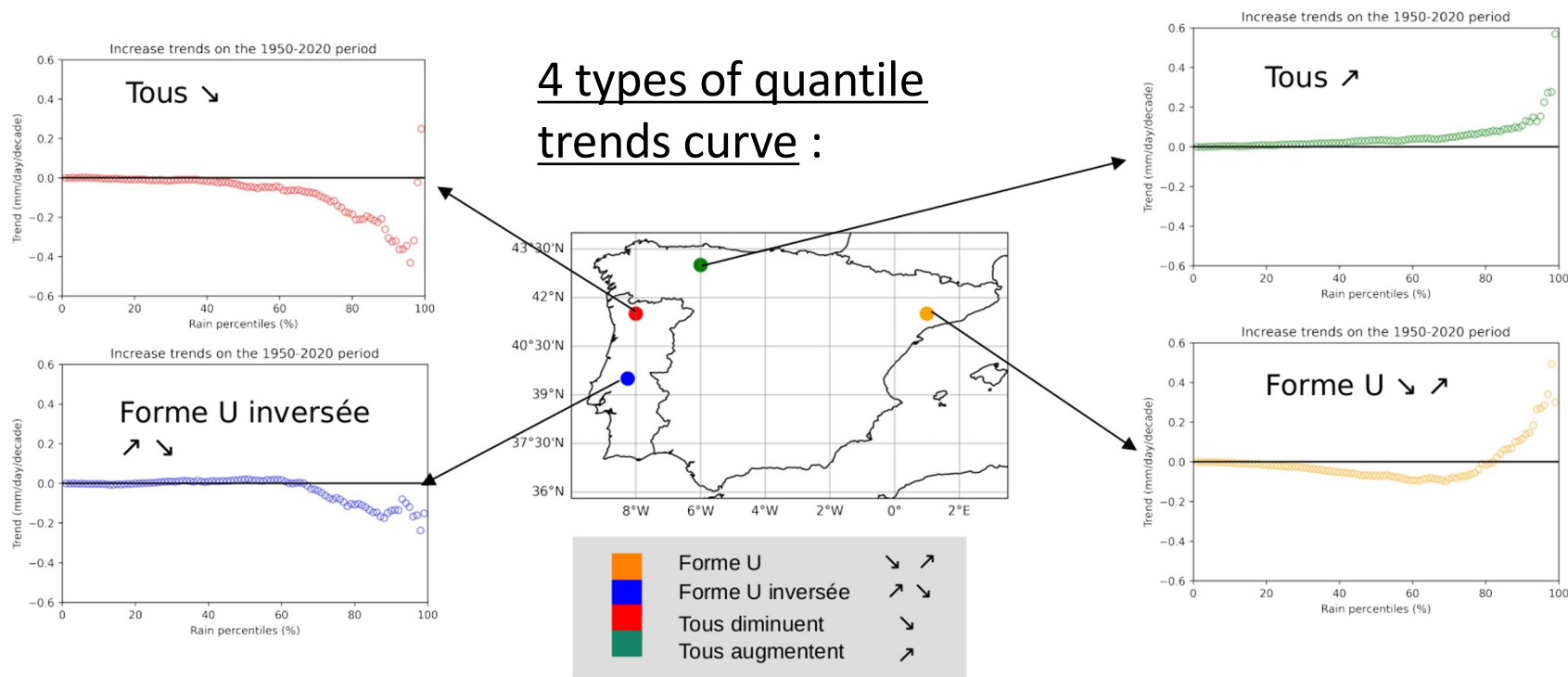
Precipitation extremes projects

A distribution approach on ERA5 data

Dataset = ERA5 precipitation, 0.25°, daily

Wet-days = if more than 1 mm/day (recommendation ETCCDI)

Trends = change between periods 1950-1980 and 1990-2020.



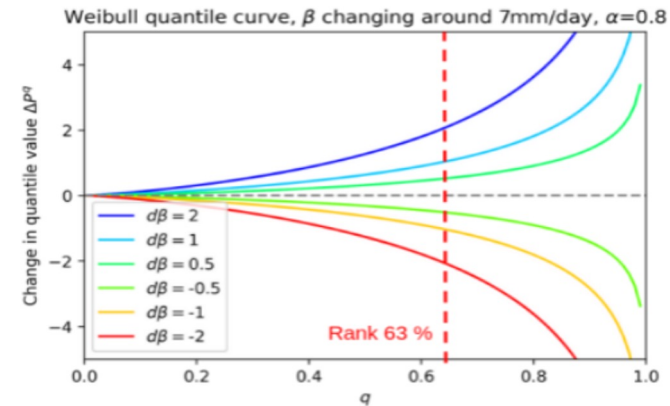
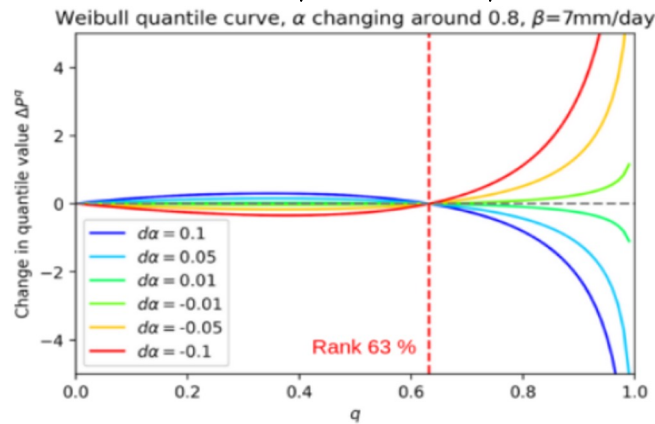
Andre et al 2024

Precipitation extremes projects

Approximate pdf: a Weibull model ($\beta \sim$ median, $1/\alpha \sim$ variance)

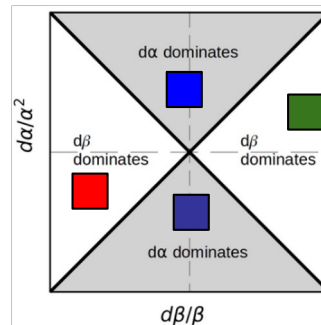
Theoretical change of quantile:

$$\forall p \in (0, 1), \Delta Q(p) \approx \underbrace{\frac{\partial Q}{\partial \alpha}(p)} \Delta\alpha + \underbrace{\frac{\partial Q}{\partial \beta}(p)} \Delta\beta$$



\Rightarrow U-shape iif $\Delta\alpha < 0$ and if: $\left| \frac{\Delta\alpha}{\alpha^2} \right| \gg \left| \frac{\Delta\beta}{\beta} \right|$

\Rightarrow Theoretical limits for the 4 regimes



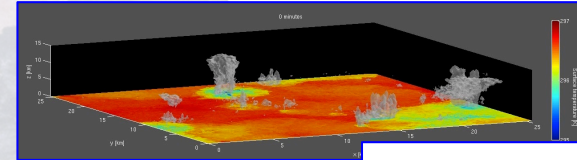
$\Rightarrow (\alpha, \beta)$ and their changes are key !

Andre et al 2024

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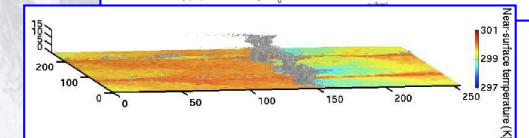
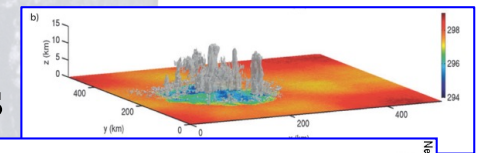
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