# Convective aggregation in idealized stochastic models

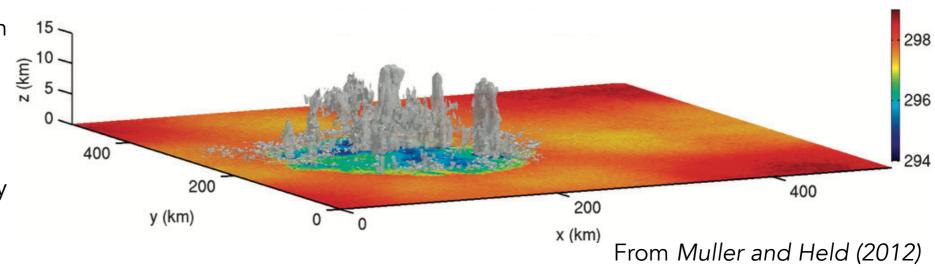
Giovanni Biagioli<sup>1,2</sup> and Adrian Mark Tompkins<sup>2</sup>

<sup>1</sup>Università degli Studi di Trieste, Italy <sup>2</sup>Abdus Salam International Centre for Theoretical Physics (ICTP), Italy



### The point of contention: scattered vs organized convection in CRM simulations

In cloud-resolving models (CRMs) run in radiative-convective equilibrium (RCE), tropical convection can spontaneously aggregate into one single localized moist region if the domain is sufficiently large, even despite homogeneous boundary conditions.



CRM simulations identify some of the physical mechanisms driving convective clustering...

So far so good...But there is a "but"





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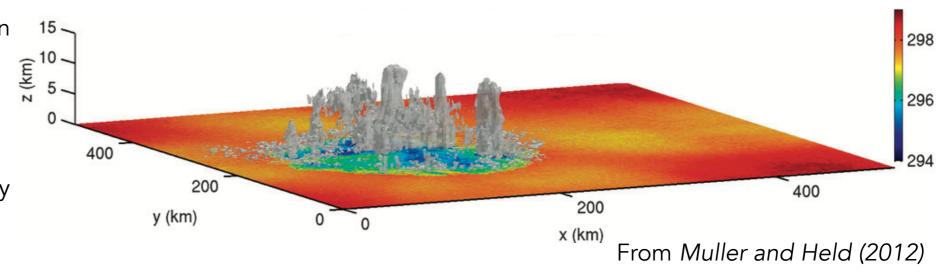
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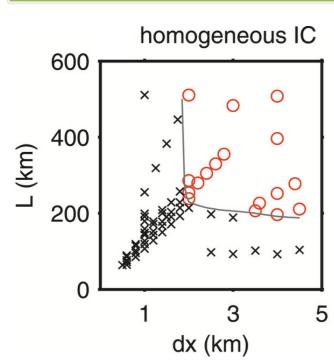
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- ullet The occurrence of organization may depend on the model physics, setup (e.g., L,  $\Delta x$ ) and parameterizations.
- Models do not often agree on the nature and details of organization

### $\P$ So why not using simpler models reproducing aspects of the more complex ones?

If a simple, idealized model provides robust results, then we may try to use them to understand and explain the sensitivities detected in CRM simulations.

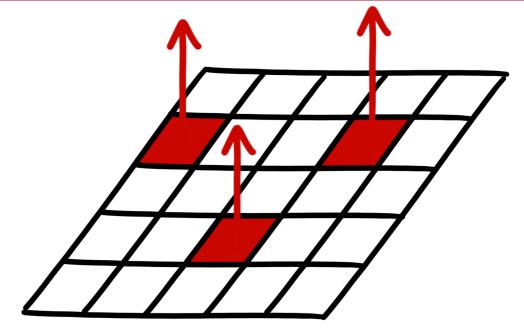


From Muller and Held (2012)

### Our simple model of tropical convection

- The model is based on the work by Craig and Mack (2013), but enriched with important novelties.
- In each column of the domain, the budget of column (total water) relative humidity (CRH),  $R = R(\mathbf{x}, t)$ , is modeled as

$$\frac{\partial R}{\partial t} = \frac{1}{\tau_{\rm C}} (R_{\rm cl} - R) 1_{\rm C} (p_{\rm C}(R)) + \underbrace{K \nabla^2 R}_{\text{new!!!}} - \underbrace{\frac{R}{\tau_{\rm sub}}}_{\text{subsidence}}$$



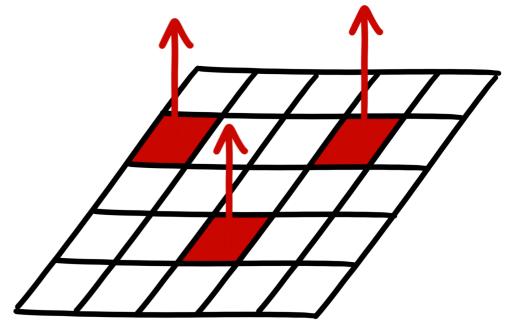
 $\uparrow$  Only where the indicator function  $1_{\rm C}=1$ , is convection occurring.

WHERE, WHEN AND HOW IS THE INDICATOR FUNCTION SWITCHED ON?

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#### WHERE, WHEN AND HOW IS THE INDICATOR FUNCTION SWITCHED ON?

- The number  $N_{\rm C}=N_{\rm C}(t)$  of active convective locations per time step is imposed as an external constraint.
- The time-averaged convective population size is provided by a scaling argument by Tompkins and Craig (1998): to obey continuity, the cumulus fraction  $\sigma$  must satisfy

$$(1 - \sigma) w_{\text{sub}} + \sigma w_{\text{C}} = 0 \Rightarrow \sigma = \frac{|w_{\text{sub}}|}{w_{\text{C}}} = \frac{h}{\tau_{\text{sub}}} \frac{1}{w_{\text{C}}} \Rightarrow \bar{N}_{\text{C}} = \left(\frac{L}{\Delta x}\right)^2 \frac{h}{\tau_{\text{sub}}} \frac{1}{w_{\text{C}}}.$$

• Are the  $N_{\rm C}$  cells sampled completely at random? No!, according to a PDF based on the moisture-precipitation relationship by Bretherton et al. (2004):

$$p_{\mathsf{C}}(R) = C \exp\left(\mathbf{a}_{\mathsf{d}}R\right).$$

This means that the model contains the feedback between convection and water vapour.

### The model manages to mimic convective clustering

#### **TYPICAL EXPERIMENTAL SETUP**

- Doubly periodic domain with size L=300 km and spacing  $\Delta x=2$  km. Horizontally homogeneous initialization,  $R_0=0.8$ .
- $K = \mathcal{O}(10^4) \text{ m}^2\text{s}^{-1}$ ,  $\tau_{\text{sub}} = \mathcal{O}(20)$  days,  $a_d = 14.72$  (TRMM retrieval version 7).

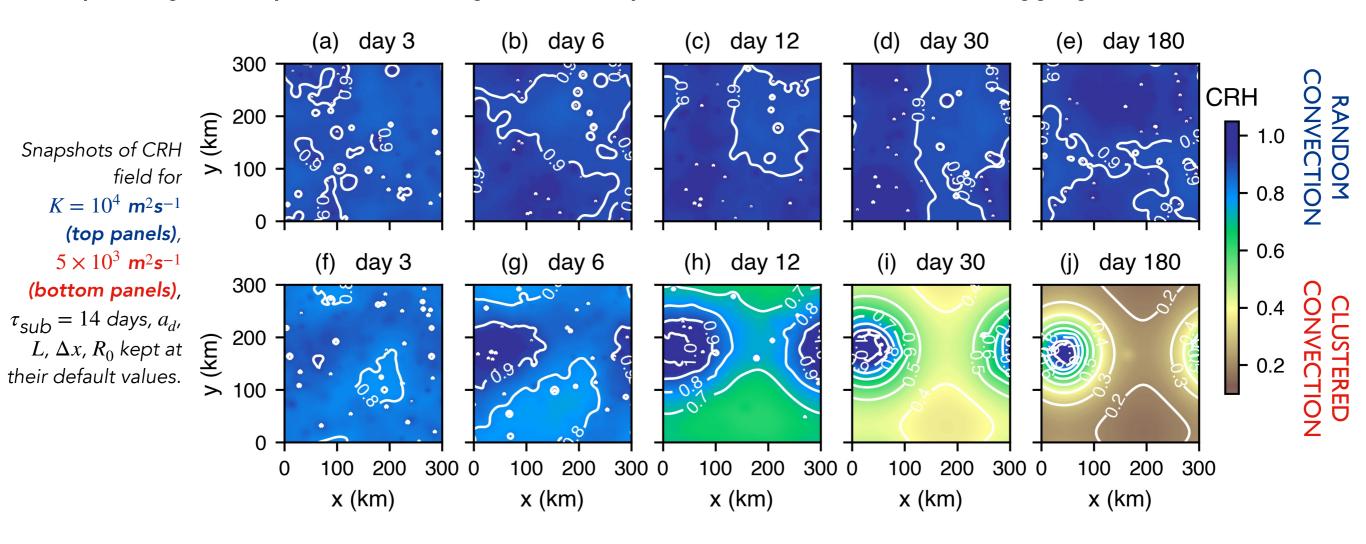
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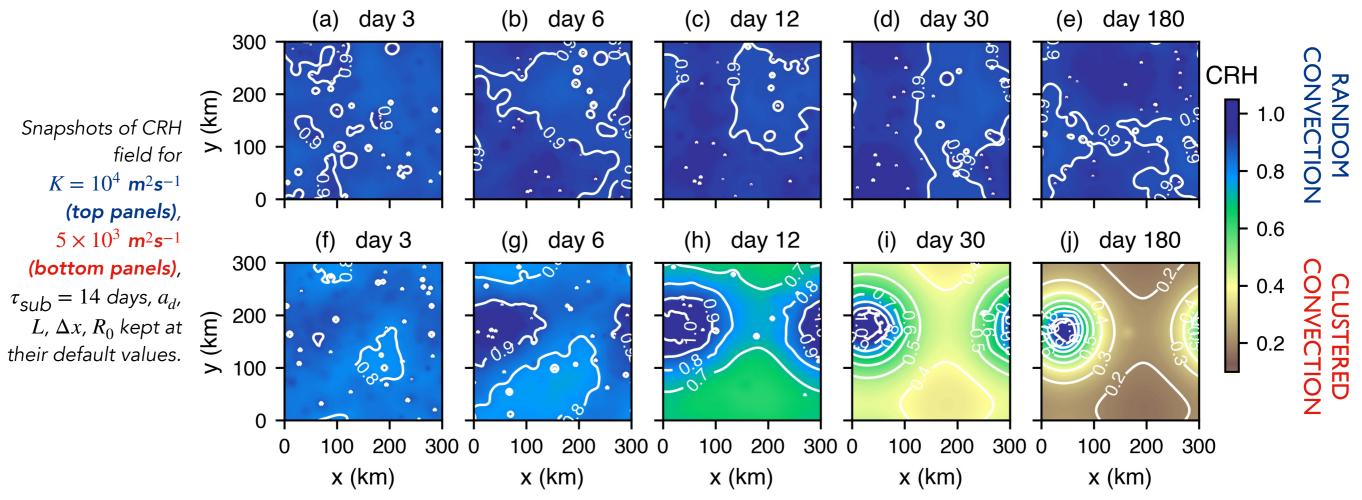


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What is this telling us? The occurrence of organization is sensitive to the value of K!!!

#### WHICH ARE THE INGREDIENTS TO EXPLAIN THE TRANSITION?

- The key parameters K,  $\tau_{\text{sub}}$ ,  $a_d$  (aggregation favored by lower diffusion/more vigorous subsidence/stronger feedback).
- Details of the experimental configuration L,  $\Delta x$  (clustering facilitated by larger domains/coarser resolutions).

## A dimensionless parameter to explain the state transition

...before deriving it, it is important to say that...

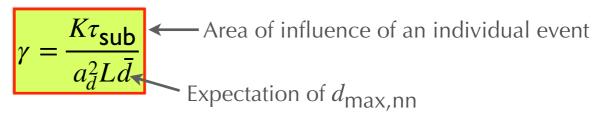
...the maximum distance between updrafts  $d_{\text{max,clr}}$  (or, relatedly, the maximum inter-convective NN distance  $d_{\text{max,nn}}$ ) in the pre-organized stage could be important and can explain the sensitivities to both L and  $\Delta x$ . It can be easily calculated assuming the initial random sampling of points as the restriction of a homogeneous Poisson process to a compact set.

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• Using scaling arguments and fits from empirical data, we introduce the parameter, termed aggregation number,

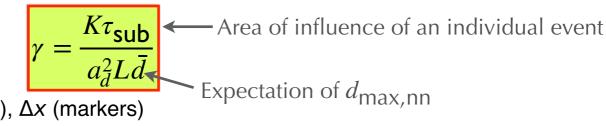


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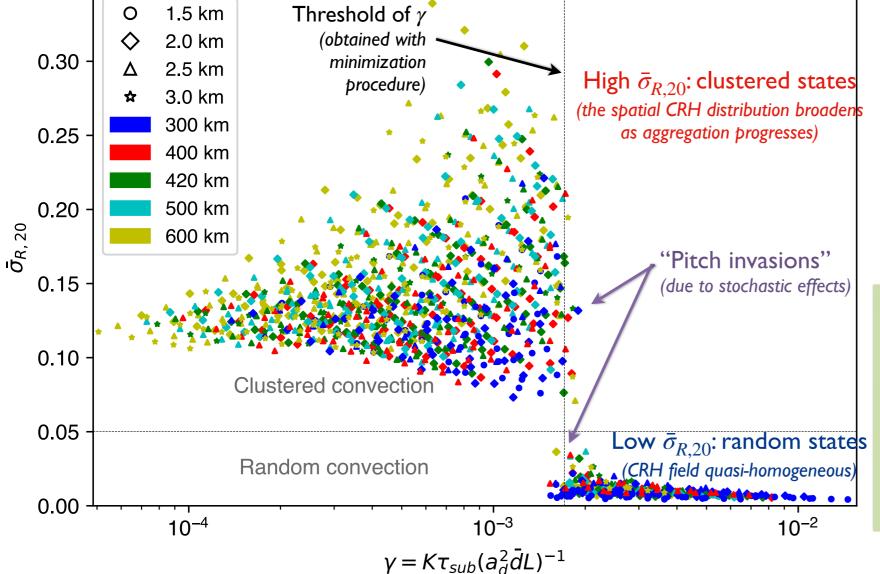
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End climate for different values of K,  $\tau_{sub}$ ,  $a_d$ , L (colors),  $\Delta x$  (markers)



Runs with different values of the parameter  $\gamma$ , each associated with the corresponding value of  $\bar{\sigma}_{R,20}$ , i.e., the spatial CRH std averaged over the last 20 (out of 180) days of simulation.

- The parameter incorporates the model processes, domain size and resolution
- The value of  $\gamma$  robustly indicates whether a specific model and experiment setup would result in self-organized state (that is, when  $\gamma < 1.7 \times 10^{-3}$ ).