Turbulence in Marine Cumulus and Stratocumulus Clouds: Observations and Large-Eddy Simulation

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Outline

- Motivation
- RICO: Cumulus (Cu)
- DYCOMS-II flight 1: Stratocumulus (Sc)
 - ▶ Temperature forcing due to evaporation/condensation
 - Advection: mpdata3/mpdatm3
 - $\blacktriangleright~\epsilon$ as a funtion of height and LWC (observations and grid-dependency)
- Conclusions

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Motivation

- Why are we interested in the dissipation rate of TKE in clouds?
 - An important scaling parameter:
 - $\blacktriangleright \ l \sim u^3/\epsilon$
 - $\eta = \left(\nu^3/\epsilon\right)^{1/4}$

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$$\lambda = \sqrt{\frac{\nu u^2}{\epsilon}}$$

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Motivation

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- \blacktriangleright etc.
- Parametrization of cloud processes, for example:
 - Entrainment at the top of Sc: $\epsilon \propto \frac{\sigma_w^3}{l_i}$ (Zeman and Tennekes, 1977)
 - ► Cumulus entrainment rate: $\lambda_{c} \simeq f(w, B, \epsilon)$ (Lu et al., 2016)
 - Microphysics, e.g., "eddy hopping" and droplet growth: $E = \left(\frac{L\epsilon}{C_E}\right)^{2/3}$ (Grabowski and Abade, 2017)
 - What is the value of ϵ ?

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High-resolution observational studies of ϵ in Sc and shallow Cu

Study	Reported values of $\epsilon [\mathrm{m^2 s^{-3}}]$	Comments
Siebert et al. (2006), BBC2	$10 \times 10^{-3} (2 \times 10^{-3})$	Cu, $z = 760 \pm 20$ m, values are based on 1-sec segments in (outside) clouds.
Siebert et al. (2006), INSPECTRO2	$5 \times 10^{-3} \ (8 \times 10^{-3})$	Cu, $z = 1540 \pm 40$ m, as above.
Ma et al. 2018, RICO	$3.9 \times 10^{-3} \ (0.4 \times 10^{-3})$	Cu, values are based on all flight legs in (outside) clouds.
Siebert et al. (2010), Kiel 07	0.29×10^{-3}	MSc, ~ 30 m below cloud top.
Katzwinkel et al. (2012), Kiel 07	~10 ⁻³	MSc, porpoises through cloud top (see their figure 3 for vertical profiles).
Fang et al. (2014)	1.2×10^{-3}	CSc (see their figures 4 and 5 for vertical profiles and di- urnal variation of ϵ).
Jen-La Plante et al. (2016), POST	$0.81 \times 10^{-3} \ (0.19 \times 10^{-3})$	MSc, values from CTMSL (TISL) averaged over 8 flights.

Ma et al. 2018 (in preparation) analyse measurements from ASTEX, DYCOMS-II, EPIC, RICO, and POST with focus on ϵ .

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RICO - marine shallow cumulus Snapshot from EULAG simulation (t = 24 h)



• Standard RICO setup $(100 \times 100 \times 40 \text{ m}^3, \text{ as in van Zanten et al., 2011}).$

- "TKE" subgrid-scale model and no precipitation.
- Modified temperature forcing (F_{θ}) .

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RICO - marine shallow cumulus



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Temperature forcing due to condensation/evaporation

$$\theta' = \theta - \theta_e$$

	Original	Modified
1.	$\theta'=\theta'+{\rm F}_{\theta'}{\rm \Delta t}$	$\theta' = \theta' + \mathbf{F}_{\theta'} \Delta \mathbf{t}$
2.	$\theta' = \texttt{mpdata}(\theta')$	$egin{aligned} & heta' = heta' + {f F}_{ heta'} \Delta t \ & heta' = {f mpdata}(heta') \end{aligned}$
3.	$\boldsymbol{\theta} = \texttt{mpdata}(\boldsymbol{\theta}) + \texttt{mpdata}(\mathtt{F}_{\boldsymbol{\theta}}) \ast \Delta \mathtt{t}$	
4.	$\Delta q_c = f(\theta,)$	$\begin{split} \Delta \mathbf{q}_{\mathrm{c}} &= \mathbf{f}(\boldsymbol{\theta}' + \boldsymbol{\theta}_{\mathrm{e}}, \ldots) \\ \mathbf{F}_{\boldsymbol{\theta}'} &= \Delta \mathbf{q}_{\mathrm{c}} \frac{\mathbf{L} \boldsymbol{\theta}_{\mathrm{e}}}{c_{\mathrm{p}} \mathbf{T}_{\mathrm{e}}} * \frac{1}{\Delta t} \end{split}$
5.	$F_{\theta} = \Delta q_{c} \frac{L\theta_{\theta}}{c_{p} T_{e}} * \frac{1}{\Delta t}$	$F_{\theta'} = \Delta q_c \frac{L\theta_{\theta}}{c_p T_{\theta}} * \frac{1}{\Delta t}$
6.	$ heta= heta+{f F}_{ heta}*\Delta{f t}$	
7.	$ heta'= heta'+{ t F}_ heta*\Delta{ t t}$	$\theta' = \theta' + {\bf F}_{\theta'} * \Delta {\bf t}$
8.	$F_{ heta'} = F_{ heta}$	
9.	$\begin{split} \theta' &= \theta' + F_{\theta'} \Delta t \\ \theta' &= mpdata(\theta') \\ \theta &= mpdata(\theta) + mpdata(F_{\theta}) * \Delta t \\ \Delta q_c &= f(\theta, \ldots) \\ F_{\theta} &= \Delta q_c \frac{L\theta_e}{c_p T_e} * \frac{1}{\Delta t} \\ \theta &= \theta + F_{\theta} * \Delta t \\ \theta' &= \theta' + F_{\theta} * \Delta t \\ F_{\theta'} &= F_{\theta} \\ \theta &= \theta' + \theta_e \end{split}$	

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RICO - marine shallow cumulus



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RICO - marine shallow cumulus



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Calculation of dissipation rate ϵ (cloudy segments)

$$E_w(k) = C_1 \epsilon^{2/3} k^{-5/3}$$



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Vertical profiles of TKE and ϵ (cloudy segments) Observations and LES $(100 \times 100 \times 40 \text{ m}^3)$



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Turbulence in Cu and Sc clouds

<□ ト < □ ト < □ ト < 三 ト < 三 ト 三 のへで 30.05.2018 13 / 29 Vertical profiles of TKE and ϵ (cloudy segments) Observations and LES (100 × 100 × 40 m³ and 50 × 50 × 20 m³)



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Dissipation rate vs. liquid water content



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DYCOMS-II flight 1 - marine stratocumulus Snapshot from EULAG simulation (t = 0 min, cloud cover = 100%)



• Standard setup $(35 \times 35 \times 5 \text{ m}^3)$, as in Stevens et al., 2005).

- "TKE" subgrid-scale model and no precipitation.
- Modified temperature forcing.

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DYCOMS-II flight 1 - marine stratocumulus Snapshot from EULAG simulation (t = 60 min, cloud cover = 96%)



- Standard setup $(35 \times 35 \times 5 \text{ m}^3)$, as in Stevens et al., 2005).
- "TKE" subgrid-scale model and no precipitation.
- Modified temperature forcing.

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DYCOMS-II flight 1 - marine stratocumulus Snapshot from EULAG simulation (t = 120 min, cloud cover = 92%)



- Standard setup $(35 \times 35 \times 5 \text{ m}^3)$, as in Stevens et al., 2005).
- "TKE" subgrid-scale model and no precipitation.
- Modified temperature forcing.

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Turbulence in Cu and Sc clouds

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DYCOMS-II flight 1 - marine stratocumulus Snapshot from EULAG simulation (t = 240 min, cloud cover = 83%)



- Standard setup $(35 \times 35 \times 5 \text{ m}^3)$, as in Stevens et al., 2005).
- "TKE" subgrid-scale model and no precipitation.
- Modified temperature forcing.

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DYCOMS-II flight 1 - marine stratocumulus



Vertical profiles of TKE and ϵ Observations and LES $(35 \times 35 \times 5 \text{ m}^3)$



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DYCOMS-II flight 1 - marine stratocumulus



Vertical profiles of TKE and ϵ Observations and LES $(35 \times 35 \times 5 \text{ m}^3 \text{ and } 17.5 \times 17.5 \times 5 \text{ m}^3)$



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Turbulence in Cu and Sc clouds

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DYCOMS-II flight 1 - marine stratocumulus



Vertical profiles of TKE and ϵ Observations and LES (with and without subsidence)



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DYCOMS-II flight 1 - marine stratocumulus



Vertical profiles of TKE and ϵ Observations and LES (mpdata LES and mpdata/mpdatm ILES)



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Turbulence in Cu and Sc clouds

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• Agreement with previously published Cu LES results (e.g. RICO and BOMEX) is obtained with modified F_{θ} . The modification has no clear impact on Sc-results.

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- Overestimation of in-cloud RICO dissipation rate can be reduced by decreasing the grid spacing (horizontal and vertical).

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- Reasonable agreement between observed and simulated LWC-dependency of ϵ (in RICO case).

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- ${\circ}\,$ Simulations underestimate LWP and ϵ in DYCOMS case.

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- Improvement regarding ϵ can be obtained by switching from LES to ILES and by using the infinite-gauge version of mpdata for velocity components.

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Turbulence in Cu and Sc clouds

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Thank you for your attention

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