# Scaling and Intensification of Extreme Precipitation in Climate Change Simulations at Kilometer-Scale Resolution

## Nikolina Ban<sup>1</sup>, Jürg Schmidli<sup>2</sup> and Christoph Schär<sup>1</sup>

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GEWEX CPCM Workshop Sep 6-8, 2016

Introduction	Method	Evaluation	Climate Change	Summary
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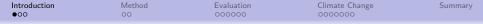
Moistening of the atmosphere is determined by Clausius-Clapeyron relation:

$$\frac{1}{e_{sat}}\frac{de_{sat}}{dT}\approx 6-7\%/{\cal K} \qquad \Longrightarrow \qquad \frac{1}{P_{extreme}}\frac{dP_{extreme}}{dT}\approx 6-7\%/{\cal K}$$

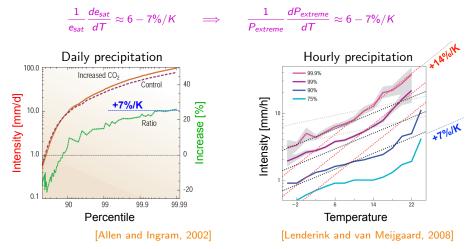
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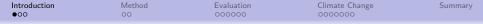
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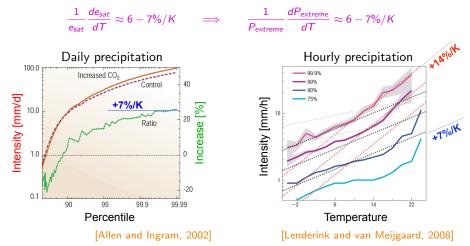


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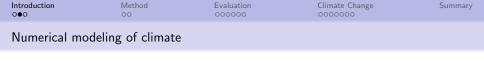




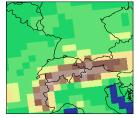
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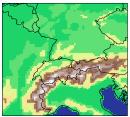
• Do heavy hourly precipitation events increase at adiabatic ( ${\sim}6\text{--}7\,\%/K$ ) or super-adiabatic ( ${\sim}14\,\%/K$ ) rate?



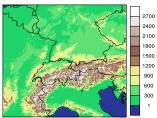




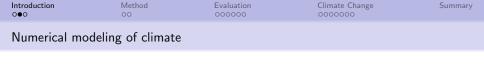
Regional climate model 12 km



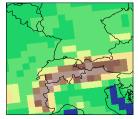
Convection-resolving model 2 km



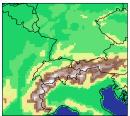
 CRM: Convection-resolving model enables explicit simulation of convection (e.g., thunderstorms, rain showers)



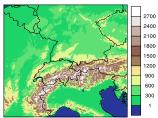




Regional climate model 12 km



Convection-resolving model 2 km



- CRM: Convection-resolving model enables explicit simulation of convection (e.g., thunderstorms, rain showers)
- CRM studies: Grell et al., 2000; Mass et al., 2002; Hohenegger et al., 2008; Knote et al., 2010; Kendon et al., 2012, 2014; Langhans et al., 2013; Prein et al., 2013; Rasmussen et al., 2011, 2014; Ban et al., 2014, 2015; Prein et al., 2015 (Rev. of Geophysics), Kendon et al., 2016 (BAMS), Leutwyler et al., 2016

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Outline				

- Does CRM improve representation of precipitation distribution and statistics?
- How do precipitation extremes scale with temperature? With Clausius-Clapeyron relation?

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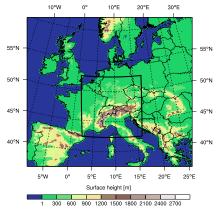
## **Climate Change**

- Difference between CRM and conventional climate models?
- Link between temperature change & precipitation change?

Introduction	Method	Evaluation	Climate Change	Summary
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Setup				

Two-step one-way nesting:  $BC \Rightarrow CPM12 \Rightarrow CRM2$ 

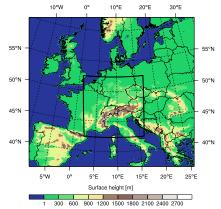
- CPM12 and CRM2 use COSMO-CLM v4.14
- Boundary Conditions: ERA-Interim reanalysis & MPI-ESM-LR (RCP8.5)
- CPM12: Convection–Parameterizing Model
  - △x,y=12 km (0.11°)
  - XxYxZ=260x228x60
- CRM2: Convection–Resolving Model
  - △x,y=2.2 km (0.02°)
  - XxYxZ=500x500x60



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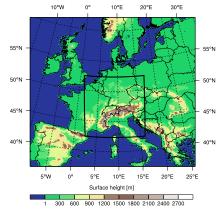
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  - Deep convection explicitly resolved
  - Shallow convection: Tiedtke



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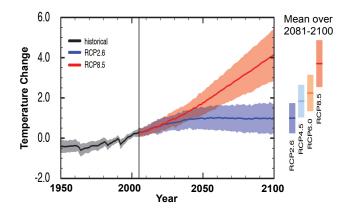
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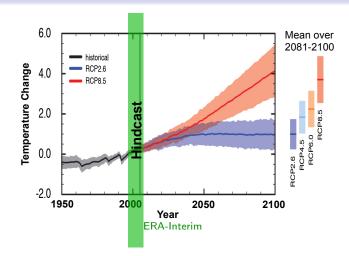


The numerical simulations have been performed on the CRAY XT5 and CRAY XE6 at the Swiss National Supercomputing Center (CSCS)

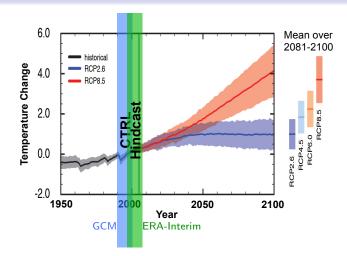
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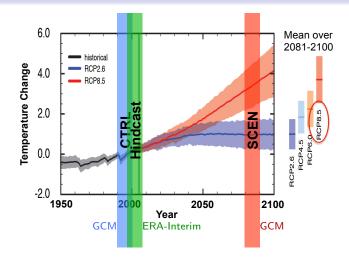
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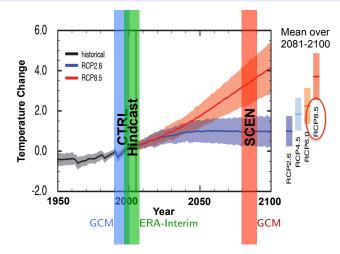
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• Wallclock time: 1×10y CRM2  $\rightarrow$  ≈4-8months

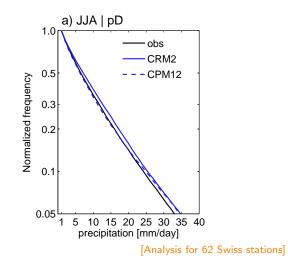
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## Evaluation of Precipitation in Present-Day Climate

• ERA-Interim driven simulations (1998-2007)

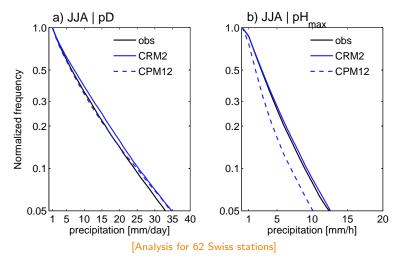
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Frequency-Intensity Distribution of Precipitation (JJA)



Introduction	Method	Evaluation	Climate Change	Summary
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Evolution of the Hourly Precipitation (July 12-14, 2006)

 $Obs \rightarrow Combined radar and rain gauge observations (Wüest et al., 2010)$   $CRM2 \rightarrow Explicit convection (\triangle x, y=2.2km)$  $CPM12 \rightarrow Parametrized convection (\triangle x, y=12km)$ 

Introduction	Method	Evaluation	Climate Change	Summary
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## Evaluation of Precipitation – Average across 62 Swiss Stations

Summer (JJA)					
	mean	freq1d	int1d	freq1h	int1h
Obs	4.11	0.38	10.8	0.12	1.41
CRM2	4.64	0.39	11.28	0.12	1.57
CPM12	4.43	0.41	10.55	0.15	1.21

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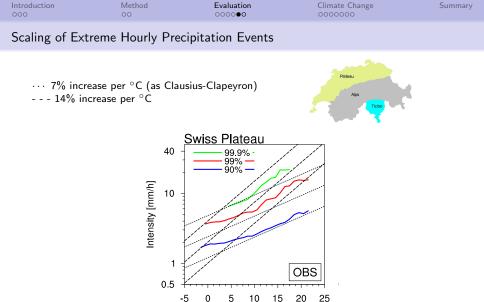
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bias	8%	8%	-2%	25%	-14%
Winter (DJF)					
	mean	freq1d	int1d	freq1h	int1h
Obs	2.31	0.28	8.12	0.13	0.73
CRM2	3.19	0.36	8.65	0.18	0.72
bias	38%	29%	6.5%	38%	-1.2%
CPM12	3.3	0.38	8.49	0.2	0.68
bias	43%	36%	4.5%	52%	-7.2%

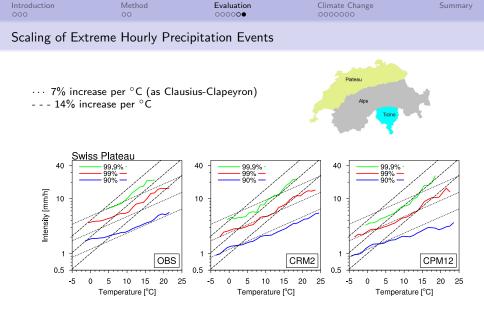
 $\rightarrow$  CRM2 improves the simulation of precipitation in the winter (DJF) and summer (JJA) season



Nikolina Ban : CRM Climate Change Simulations

(Ban et al., 2014 JGR)

Temperature [°C]



Super-adiabatic scaling is captured by both models

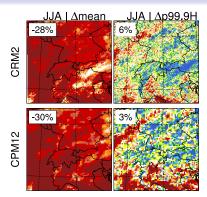
<sup>(</sup>Ban et al., 2014 JGR)

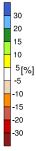
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# Projections of precipitation

• based on GCM-driven scenarios for 2081-2090 (RCP8.5) versus 1991-2000





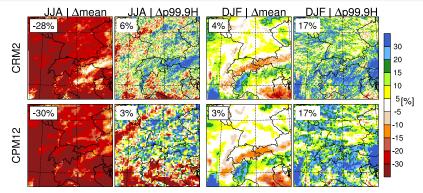


Summer (JJA):

- Increase in heavy precipitation despite an overall drying
- Decrease in large-scale, and increase in convective precipitation (Giorgi et al., 2016, Nature Geoscience)

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Projections of Mean and Heavy Precipitation



Summer (JJA):

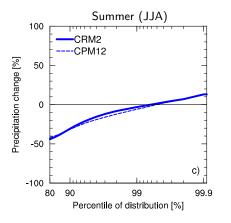
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Winter (DJF):

CRM2 and CPM12 show similar changes

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## Relative Changes of Precipitation on Daily Timescales

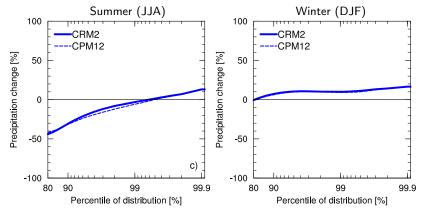


[Average across the CRM2 domain]

Close agreement of CRM2 and CPM12

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## Relative Changes of Precipitation on Daily Timescales

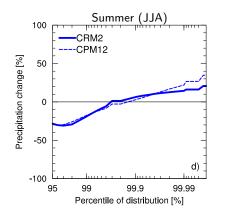


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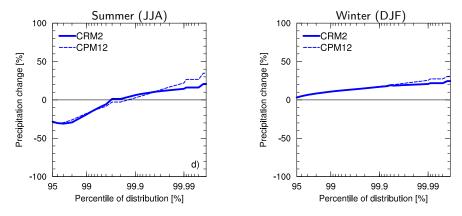
Relative Changes of Precipitation on Hourly Timescales



#### [Average across the CRM2 domain]

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#### Relative Changes of Precipitation on Hourly Timescales

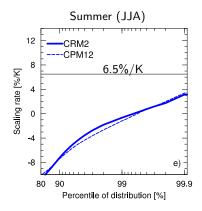


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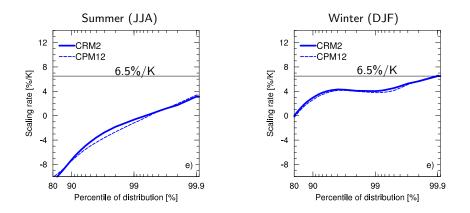
CRM2 exhibits smaller changes than CPM12

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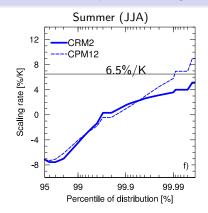


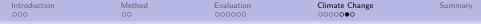
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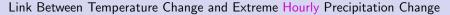


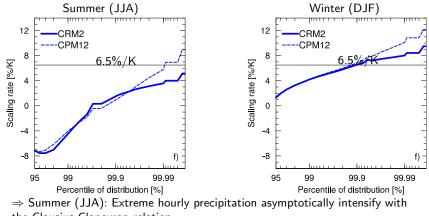
 $\Rightarrow$  Extreme daily precipitation asymptotically intensify with the Clausius-Clapeyron relation

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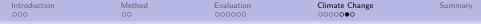


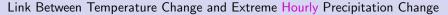


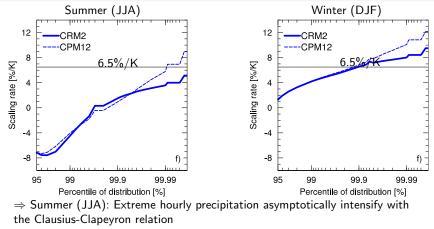




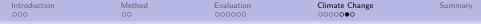
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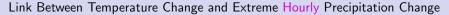


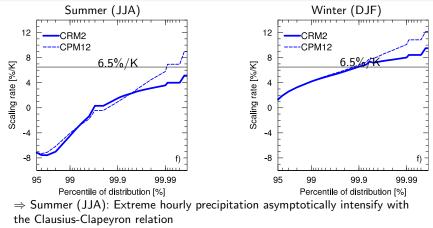




 $\Rightarrow$  Winter (DJF): Changes in extreme hourly precipitation exceeds the Clausius-Clapeyron rate





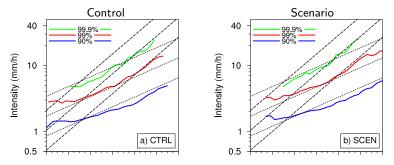


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Although...

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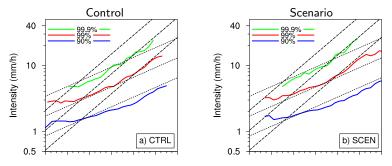




...CRM2 exhibits super-adiabatic scaling for extreme warm-season precipitation, and adiabatic for cold-season precipitation in both Control and Scenario simulations

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...CRM2 exhibits super-adiabatic scaling for extreme warm-season precipitation, and adiabatic for cold-season precipitation in both Control and Scenario simulations

 $\Rightarrow$  Indicates that scaling of extreme precipitation with temperature in present-day climate can not be extrapolated into the future

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Summary				

- CRM2 improves the simulation of precipitation in all seasons and on all time scales (especially on the sub-daily)
- CRM2 exhibits super-adiabatic and adiabatic scaling for hourly warm-season precipitation, while only adiabatic for hourly cold-season precipitation (in accordance with observations)

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## **Climate Change**

- Close agreement of CRM2 and CPM12 regarding the changes in daily precipitation; for hourly extreme precipitation CRM2 exhibits smaller changes than CPM12
- Changes in extreme summer precipitation qualitatively scale with the Clausius-Clapeyron rate. In winter the change exceeds the Clausius-Clapeyron rate for short-term extreme precipitation

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## Thank you for your attention!