

1 Article

# 2 Hydrometeorological extremes in a warmer climate. 3 A local scale assessment for the island of Crete.

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10 **Abstract:** A future warmer atmosphere indicates that precipitation will increase as a consequence  
11 of the higher humidity concentrations. According to the Clausius-Clapeyron relationship  
12 precipitation increase by a factor of 7% per degree of warming. However, recent studies have shown  
13 that increase in precipitation extremes can exceed this scaling rate. In this regard we focus on the  
14 flash flood prone area of Crete by analysing high resolution precipitation records from a dense  
15 network of meteorological stations to see if the relationship of precipitation and dew point  
16 temperature lies within the Clausius-Clapeyron theory. We then use simulation outputs of a  
17 “present day event” from a set of very high resolution (about 2 km grid spacing) convective  
18 permitting regional climate models (CPRCM) to see if the models are able to capture intense  
19 convection and thus accurately simulate extreme precipitation events over Crete. A second set of  
20 simulations for the present day event, but with a perturbation of +2°C, was used to examine intensity  
21 changes and to see what similar events might look like in a future weather. We finally focus on a  
22 high impact flash flood event occurred on 17 October 2006 and we study changes in hydrological  
23 impacts. The developed information can advance local scale knowledge in the context of climate  
24 change adaptation and appropriate risk management.

25 **Keywords:** hydrological extremes; flash floods; climate change; precipitation; peak discharge

26 **PACS:** J0101

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## 28 1. Introduction

29 One of the staple findings in the Fifth Assessment Report of the Intergovernmental Panel on  
30 Climate Change (IPCC) [1] is that the warming of the climate system is unequivocal, with many of  
31 the recently observed changes to be unprecedented over decades to millennia. It has been discussed  
32 that the global annual mean precipitation is constrained by the energy balance in the atmosphere [2].  
33 However, with an increasing global mean temperature trend over the 21st century, it is virtually  
34 certain (probability > 99%) that in the long term, global precipitation will also increase on average [3].  
35 In theory, the Clausius-Clapeyron (CC) equation estimates that in the range of typical lower  
36 troposphere temperatures, the saturation vapor pressure increases by a rate of 7%/K of temperature  
37 increase [4]. This relationship gives a useful indication about the magnitude of expected changes in  
38 future precipitation rates in a warmer atmosphere [2,5]. However, for shorter temporal scales, many  
39 studies have examined CC rates derived from high resolution precipitation records (rain gauges, rain  
40 radars) or climate model simulations, showing that the obtained scaling rate may by far exceed the  
41 CC theory. As for example, recent studies by Bao et al., [6] and Manola et al., [7] have shown that  
42 increase in precipitation extremes can exceed this scaling rate in Australia and the Netherlands,  
43 respectively. These findings are of increased importance, as changes in short-duration precipitation  
44 extremes can cause significant changes in the probability of extreme hydrologic events [8].

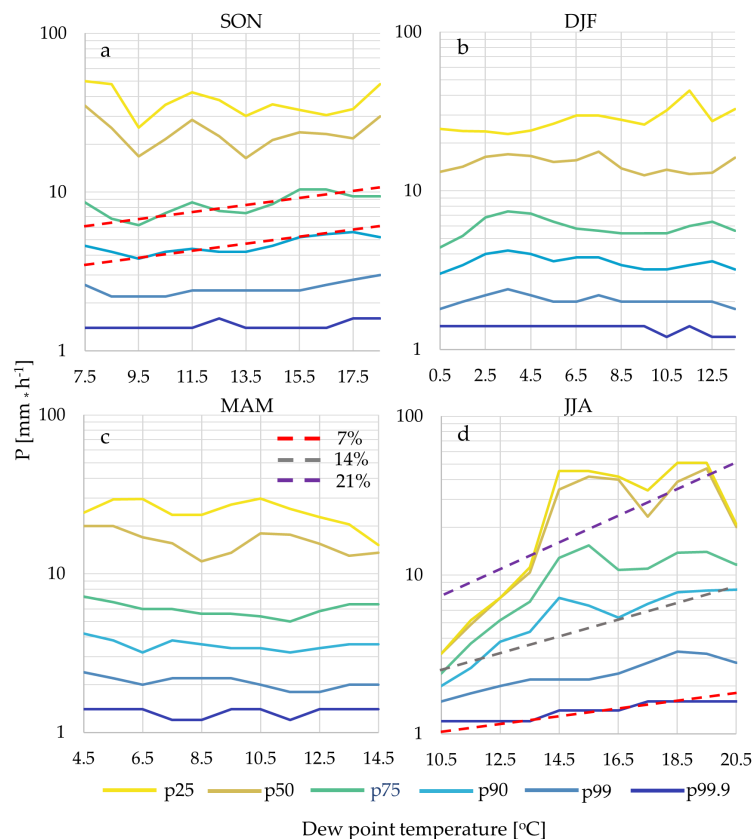
45 To manage the risk of high impact rainfall-runoff events in the context of climate change  
46 adaptation, local scale knowledge is required, being sufficiently reliable and custom-tailored to  
47 support decision making. Crete is a semi-arid island located in the eastern Mediterranean with  
48 complex and steep topography, prone to high impact, localized very intense, convective rainfall and  
49 highly seasonal precipitation patterns [9]. Such an event occurred on 17 October 2006 in Almirida  
50 region [10] at the western part of the Island. The total measured rainfall for the event was  
51 approximately 200 mm with the majority of precipitation occurring within 7 hours. This precipitation  
52 accumulation correspond to a 100-yr return period event and resulted to a flash flood with a unit  
53 peak discharge of the order of  $8 \text{ m}^3 \text{ s}^{-1} \text{ km}^{-2}$  at a watershed of  $25 \text{ km}^2$  (peak discharge  $\sim 200 \text{ m}^3 \text{ s}^{-1}$ ). The  
54 downstream part of the watershed experienced severe unexpected flooding leading to one casualty  
55 and extended damages to property and infrastructure.

56 In this study, we assess the effect of the saturation vapor pressure increase to the precipitation  
57 intensity based on high temporal resolution data from meteorological stations and we compare our  
58 estimates with the rate of the CC theory. To obtain the correlation, we use data of precipitation and  
59 dew point temperature from 30 weather stations located in the island of Crete. The resulting  
60 precipitation intensity – dew point temperature relationship derived from observations is then used  
61 to scale/offset the extreme precipitation event of 17 October 2006, to higher dew temperatures (a  
62 virtual storm event of a warmer climate). Our results are also compared with simulations performed  
63 by three convection permitting regional climate models (CPRCM) used to simulate the same storm  
64 event. The simulations were conducted under the reference climate and under future conditions, by  
65 applying a  $+2^\circ\text{C}$  warming perturbation to the boundaries. The high resolution CPRCMs were able to  
66 adequately capture the main features (timing, magnitude and location) of the intense precipitation.  
67 The precipitation fields resulted from pattern scaling based on observed data and from the high  
68 resolution CPRCM simulations are used to drive a spatially distributed setup of HEC-HMS  
69 hydrological model, simulating the Almirida flash flood event. Comparative results of the present  
70 day and the  $2^\circ\text{C}$  warmer climate are obtained and discussed.  
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## 72 2. Results

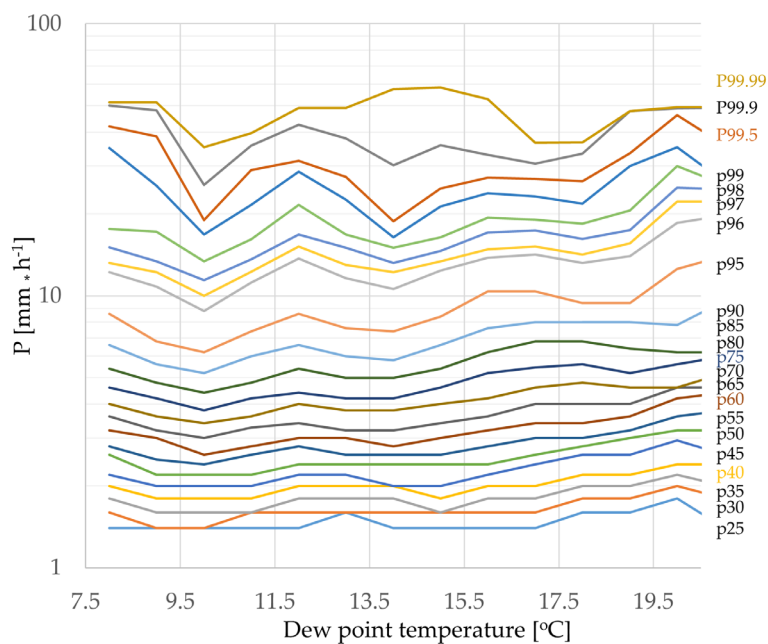
### 73 2.1. Precipitation intensity as a function of the dew-point temperature

74 The relationship between the precipitation intensity ( $\text{mm h}^{-1}$ ), calculated by hourly  
75 accumulations at a 10minute recording time step, and the dew point temperature ( $^\circ\text{C}$ ) is shown in  
76 **Figure 1**, for each season. The results show a diverse scaling behavior for each season, which is related  
77 to the different nature of precipitation occurrence (convective/stratiform/orographic). For Crete,  
78 during the cold winter months, the majority of the precipitation is occurring in the form of stratiform  
79 and orographic and less on convective. In contrast, during the summer months the rare precipitation  
80 occurrence is usually triggered by increased evaporation over the warm Mediterranean sea, causing  
81 convection patterns with high convective available potential energy that can result to torrential  
82 rainfall and locally severe thunderstorms. This explains the higher rates of change in the JJA (**Figure**  
83 **1d**). In the September to November period, both forms of precipitation occur, hence the slope of the  
84 correlation is milder than the summer. In **Figure 2**, is the same as **Figure 1a** but with higher detail in  
85 terms of precipitation percentiles. **Table 1** includes the slopes for each precipitation percentile  
86 illustrated in **Figure 2**.  
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**Figure 1.** Precipitation intensity as a function of dew point temperature for September to November (a), December to February (b), March to May (c) and June to August (d), for different percentiles (25<sup>th</sup> to 99.9<sup>th</sup>). Dashed lines represent the 7%, 14% and 21% of positive correlation, or 1, 2, 3 times the CC ratio.



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**Figure 2.** Precipitation intensity as a function of dew point temperature for September to November, for different percentiles (25<sup>th</sup> to 99.99<sup>th</sup>).

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**Table 1.** Rate of change in precipitation for each degree of dew point temperature change.

Percentile	Slope [% C <sup>-1</sup> ]	Percentile	Slope [% C <sup>-1</sup> ]
25	0.015	80	0.151
30	0.031	85	0.253
35	0.034	90	0.429
40	0.040	95	0.562
45	0.057	96	0.654
50	0.069	97	0.735
55	0.081	98	0.707
60	0.098	99	0.209
65	0.103	99.5	0.216
70	0.110	99.9	0.250
75	0.142	99.99	-0.012

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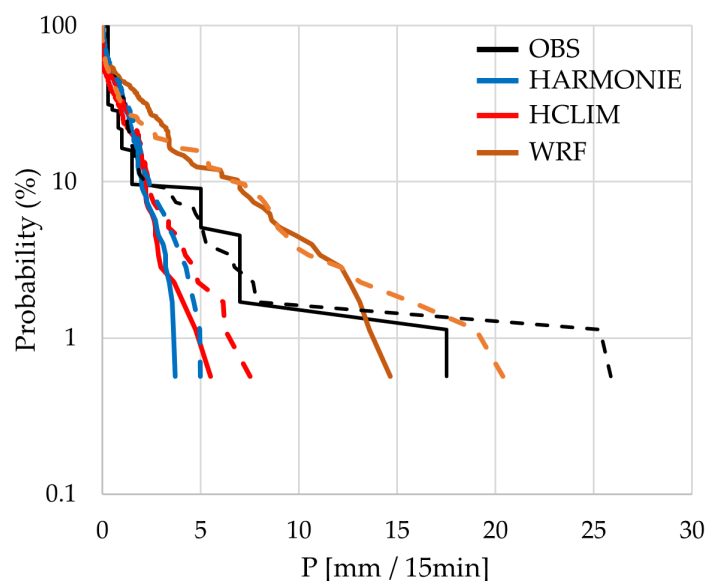
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The established relationships between precipitation and dew point temperature are used to scale the precipitation of the 17 October 2006 reference event to a +2°C event. Comparison of the reference climate and the scaled future precipitation is shown in **Figure 3**. The scaled observations at +2°C show a 12% increase in the total accumulated precipitation with a 47% increase in the 15min peak precipitation. The CPRCM runs (also shown in **Figure 3**) simulate a 30% (HCLIM), 17% (HARMONIE) and -7% (WRF) change in the total depth of the precipitation for the +2°C climate. The respective changes in the peak 15min precipitation were estimated at 40%, 35% and 40%. Absolute values of precipitation are shown in **Table 2**.



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**Figure 3.** Probability distributions of precipitation. The solid lines correspond to the present day simulations while the dashed lines to the +2°C weather.

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**Table 2.** Changes in total precipitation at event scale (\*for the 17<sup>th</sup> of October) and maximum 15 minute accumulated precipitation for the present day and the +2°C climate.

	OBS	OBS <sup>+2</sup>	HCLI	HCLI <sup>+2</sup>	HAR	HAR <sup>+2</sup>	WRF	WRF <sup>+2</sup>
<b>Total* precipitation depth (mm)</b>	193	216	124	160	147	172	355	328
<b>Max 15 minute precipitation (mm)</b>	17.5	25.9	5.5	7.5	3.7	5.0	14.7	20.4

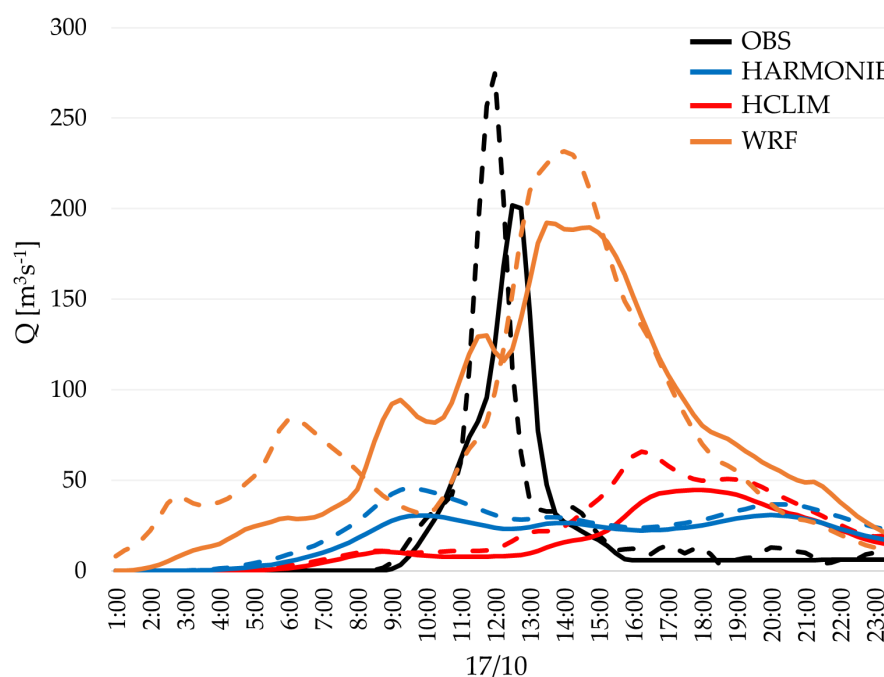
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2.2. Hydrological simulations comparison

116 The different precipitation realizations for the present day and the warmer climate were used  
 117 to drive a calibrated rainfall-runoff model for simulation of the hydrologic response of the flash flood  
 118 event. The results show significant increase in the peak discharge due to a potential +2°C warming.  
 119 The simulation of the scaled observations at +2°C shown a 36% increase in the peak discharge. Similar  
 120 changes also derived from the perturbed simulations at +2°C CPRCM, with an increase in the peak  
 121 discharge by 47% (HCLIM), 49% (HARMONIE) and (WRF) 20%. The hydrological simulations driven  
 122 by the WRF data were found to be closer to the observations, in terms of magnitude and timing of  
 123 the peak discharge.

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126 **Figure 4.** Flash flood events runoff hydrographs. The full lines represent the present day simulation  
 127 while the dashed lines shows results from the warmer atmosphere.

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### 129 3. Discussion

130 The analysis of the precipitation intensity and the dew point temperature shown diverse results  
 131 for the different seasons that were analyzed. This is in line with [7], which denotes that the correlation  
 132 can vary with region, season, duration, and form of precipitation, and is different for low and high  
 133 temperatures, ranging from below CC rate or exceeding it by far.

134 While large discrepancies were found among the CPRCM simulations of the reference climate,  
 135 the estimated relative changes in +2°C total precipitation and peak intensity were found to be  
 136 consistent. Moreover, they were found to be consistent with the relative changes estimated between  
 137 the observed data and the scaled +2°C observations. The agreement in the relative changes is more  
 138 important than the agreement in absolute values, as the latter is highly sensitive to the boundary  
 139 conditions of each model setup.

140 The results of the hydrological simulations revealed significant increases in the flood peak that  
 141 can consecutively result to higher maximum depth and wider flood inundation. The increased  
 142 precipitation intensity also affected the timing of the peak discharge.

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#### 146 4. Materials and Methods

147 Precipitation and dew point temperature observations were obtained from 30 weather stations  
148 operating at the island of Crete (10 minute gauging frequency). The operation period of each station  
149 varied between 0.1 and 5.6 years. The total length of the data from all weather stations, used to  
150 establish the precipitation – temperature correlation was 101years of records. The correlation was  
151 assessed using the methodology of [7], that considers hourly precipitation data and dew point  
152 temperature, four hours prior the precipitation occurrence.

153 The CPRCM data were provided by HARMONIE (SMHI), HCLIM (KNMI) and WRF(UNI)  
154 models.

- 155 • HARMONIE is a NWP model framework that contains a suite of physical parameterization  
156 packages, developed to be applicable to convective permitting resolutions of ~2 km. Details about  
157 the model can be found in [11].
- 158 • HCLIM is a different version of HARMONIE that runs in climate model setting using different  
159 physics package [12] that enables the model to be run at very high horizontal resolution while  
160 retaining the convection parameterization.
- 161 • WRF - Weather Research and Forecasting Model (WRF) version employed by Uni Research is a  
162 fully non-hydrostatic modeling system with the ability to resolve strongly nonlinear small scale  
163 processes. Details about the model setup can be found in [13].  
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165 The hydrological simulations were performed with HEC – HMS 4.2 model. The model was set up  
166 using a variant of Clark's unit hydrograph technique to accommodate spatially distributed rainfall  
167 data. The model was calibrated to simulate the peak discharge as it was reported in [14].  
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172

173 **Author Contributions:** A.G.K. and M.G.G. conceived and designed the experiments; M.G.G. performed the  
174 experiments; M.G.G. and A.G.K. analyzed the data and wrote the paper.

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176 **Conflicts of Interest:** The authors declare no conflict of interest.

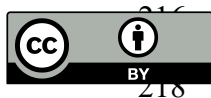
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