### Responses to all the Referees:

Dear Editor and Reviewers:

We sincerely appreciate the comments and advice from the Editor and Referees which have not only improved the quality of the current manuscript greatly, but also are beneficial for our research in general. We have carefully followed these comments in making revisions. Our detailed responses to the comments raised by the Editor and Referees are presented below. In the following Responses, for the sake of your evaluation, A1 represents the comment 1 made by Reviewer #1, B1 represents the comment 1 made by Reviewer #2.

Sincerely,

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#### Responses to Editor:

You are kindly asked to individually respond to all referee comments (RCs) that have not yet been answered (marked in red). You can choose between posting a new author comment (AC) and co-listing an existing one in response to an RC. You are also invited to respond to other discussion contributions, if applicable.

**Reply:** We thank the editor for handling the paper, we have carefully followed editor's advice in responding to reviewers' comments. For details, see below.

#### Responses to Referee #1:

This paper represents an interesting huge work, the main objective of this paper is to detect the possible changes in catchment water storage capacity induced by a prolonged meteorological drought. It will also help improve our ability to simulate the hydrological system. Meanwhile, the structure is clear and analyses and conclusions in this paper are reasonable and logical. Overall, it is a nice paper with proper methodology and complete discussion on the main findings. A minor modification should be considered before publication.

**Reply:** We are grateful for the reviewer's appreciation of our work and for the professional comments, which are carefully followed in making revision.

#### General comments:

A1: First, the results indicated that 12 catchments had a significant downward shift in the CWSC. My first principal doubts come from there: are 12 sufficient to be able to

analyze regularity about catchments with a significant downward shift.

**Reply:** Thanks. We have made it clearer in the revised version that to ensure the accuracy of the modeling results, strict criteria were adopted to evaluate the model results and to identify the catchments with a significant change in  $\theta_1$  including the minimum NSE requirement, the minimum requirement of significant change, the requirement for maximum performance degradation, and the requirement for the robustness of results (Please refer to lines 318-336 in the modified manuscript). Only these catchments that satisfied all these criteria were identified as catchments undergo significant changes. Actually, only 12 of the 145 catchments, which had experienced a long-term meteorological drought, satisfied all these four criteria and have been identified with a significant downward shift in the CWSC. Thus, the identified 12 catchments that had a significant downward shift should be reasonable results.

We have also clarified that this result depends on the criteria used for evaluation. All catchments from southeastern Australia in the dataset have been tested in this study using the above-defined criteria, and we did not find more catchments with a significant downward shift in the CWSC. More explanations have been provided in the revision. Please refer to lines 178-187, 318-336, 369-395, and 422-426 in the modified manuscript.

A2: Second: Formulating conclusions is similar to drawing up an abstract. I mean that the emphases of the abstract and conclusions are different.

**Reply:** Thank you for your comments, following which, the Abstract and conclusion have been rewritten.

The part of Abstract has been modified as follows:

Understanding the propagation of prolonged meteorological droughts helps solve the problem of intensified water scarcity around the world. Most of the existing literature studied the propagation of drought from one type to another (e.g., from meteorological to hydrological drought) with statistical approaches, there remains a difficulty in revealing the causality between the meteorological drought and potential changes in the Catchment Water Storage Capacity (CWSC). This study aims to identify the response of the CWSC to the meteorological drought by examining the changes of hydrological model parameters after the drought events. Firstly, the temporal variation of a model parameter that denotes the CWSC is estimated to reflect the potential changes in real CWSC. Next, the change points of the CWSC parameter were determined based on the Bayesian change point analysis. Finally, the possible association and linkage between the shift in the CWSC and the time-lag of the catchment (i.e., time-lag between the onset of the drought and the change point) with multiple catchment properties and climate characteristics were identified. In total 145 catchments from southeastern Australia were selected as the study areas. Results indicated that (1) significant shifts in the CWSC can be observed in 62.7% of the catchments, which can be divided into two subsets with the opposite response, i.e. 48.2% of catchments had lower runoff generation rates while 14.5% of catchments had higher runoff generation rate; (2) the increase in the CWSC during a chronic drought can be observed in smaller catchments with lower elevation, slope, and forest coverage of

Evergreen Broadleaf Forest, while the decrease in the CWSC can be observed in larger catchments with higher elevation and larger coverage of the Evergreen Broadleaf Forest; (3) catchments with a lower proportion of Evergreen Broadleaf Forest usually have longer time-lag and are more resilient. This study improves our understanding of possible changes in the CWSC induced by a prolonged meteorological drought, which will help improve our ability to simulate the hydrological system under climate change.

Please refer to lines 18-40 in the modified manuscript.

The Conclusion has been modified as follows:

This study aims to examine the possible changes in the CWSC as well as the timelag between the onset of the meteorological drought and the change point of the CWSC. A classical hydrological model, GR4J, was used and its parameter  $\theta_1$  was selected to denote catchment water storage capacity (CWSC). Thus, the temporal variation in parameter  $\theta_1$  was detected to reveal the possible fluctuation in the CWSC, and the causality between the temporal variation in parameter  $\theta_1$  and a persistent meteorological drought was examined. One hundred forty-five catchments in southeastern Australia were selected as the study areas. Main conclusions can be drawn as follows:

(1) Significant changes in the CWSC have been identified in 62.7% (52 in 83) of catchments, which can be divided into two subsets with opposite catchment responses: 48.2% (40 in 83) experienced a significant decrease in the CWSC during the drought period and had lower runoff generation rates, while 14.5% (12 in 83) of catchments experienced a significant decrease in the CWSC during the drought period, and had higher runoff generation rate.

(2) Different change directions in the CWSC resulted in the opposite impacts on runoff generation, i.e., catchments with increased CWSC would result in lower runoff generation rates for similar amounts of rainfall than before while those catchments with decreased CWSC would have an opposite response (higher runoff generation rate). Generally, the increase in the CWSC during a chronic drought can be observed in smaller catchments with lower elevation, slope, and forest coverage of Evergreen Broadleaf Forest, while the decrease in the CWSC can be observed in larger catchments with higher elevation and larger coverage of the Evergreen Broadleaf Forest. Among all catchment properties and climate variables considered, our results suggest that two climate variables (i.e., variation in annual rainfall and annual runoff ratio) have the strongest associations with the shift in the CWSC.

(3) The responses of different catchments to persistent meteorological drought were not equally susceptible. Catchments with a lower proportion of Evergreen Broadleaf Forest usually have longer time-lag and are more resilient.

It is noted that although this study resulted in interesting findings that give new insight and have not been fully outlined before, it is based on the lumped GR4J model and the specific case in Australia, which implies that the main findings/conclusions may not directly extendable to other regions. Thus, to examine the generality of the main

conclusions, the response of CWSC to the meteorological drought can be analyzed with the other hydrological models in the other regions.

Please refer to lines 602-632 in the modified manuscript.

Detailed comments:

A3: Is there a mistake in the inconsistency between the Abstract (L37-L38) and Conclusion (L613-615).

**Reply:** We are sorry for this error. The related has been modified as "...the increase in the CWSC during a chronic drought can be observed in smaller catchments with lower elevation, slope, and forest coverage of Evergreen Broadleaf Forest, while the decrease in the CWSC can be observed in larger catchments with higher elevation and larger coverage of the Evergreen Broadleaf Forest.". Please refer to lines 33-37 and 618-621 in the modified manuscript.

A4: Previous study (Yan et al., 2015) has indicated that the sensitivity of the parameters in the GR4J model has different performance in different parts of the same basin. Therefore, you should cite more citations or do some researches in the study area to support the sentence in the L224-L226.

**Reply:** Thank you. More citations have been added to the revised manuscript. This sentence has been modified as "Previous studies (Demirel et al., 2013; Pan et al., 2019a, 2019b; Perrin et al., 2003; Westra et al., 2014; Yan et al., 2015) showed that  $\theta_1$ , which denotes the catchment water storage capacity, is the most sensitive parameter in the structure of the GR4J model.". Please refer to lines 236-239 in the modified manuscript. Added reference:

- Yan, X. L., Zhang, J. Y., Wang, G. Q., Bao, Z. X., Liu, C. S., and Xuan, Y. Q.: Application of GR4J Rainfall-runoff Model to Typical Catchments in the Yellow River Basin, Proceedings of the 5th International Yellow River Forum on Ensuring Water Right of the River's Demand and Healthy River Basin Maintenance, Vol V, Yellow River Conservancy Press, Zhengzhou, 191-198 pp., 2015.
- Demirel, M. C., Booij, M. J., and Hoekstra, A. Y.: Effect of different uncertainty sources on the skill of 10 day ensemble low flow forecasts for two hydrological models, Water Resour. Res., 49, 4035-4053, 10.1002/wrcr.20294, 2013.

A5: L503-517: You should cut out much of the repetition with the Section 4.

**Reply:** Thanks. Changes have been made as suggested. The paragraph in these lines has been modified as follows:

The results indicate that, under certain circumstances, a long-term meteorological drought would result in a significant change in the CWSC. However, no strong association has been found between the magnitude of the change in the CWSC with any single variable. In addition, the length of dry period was not associated with the shift in the CWSC. Thus, it seems that the catchment response behavior to long-term meteorological drought is controlled by the combination of local catchment properties and climate characteristics rather than a single factor. Thus, further studies are still required to confirm which factors played the most important role in the catchment dynamic.

#### Please refer to lines 515-521 in the modified manuscript.

A6: In the Section 4.4 You had better discuss the factors for the direction first and then the magnitude of shifts in the CWSC.

**Reply:** Thanks. We have explained better that Section 4.4.1 presents the results that classify the catchments into two groups, one group shows significant shifts in the CWSC, and another does not. While section 4.4.2 continued to discuss the difference between two sub-groups of catchments with significant upward/significant downward shifts in the CWSC. These two sub-groups of catchments were extracted from the group of catchments with significant shifts in the CWSC according to the change direction of the estimated  $\theta_1$ . Thus, we thought it might be better to discuss the difference between two groups of catchments with/without significant shifts at first, and then illustrate the difference between two subsets of catchments with significant upward/significant downward shifts later.

To make it clearer, after considering reviewer's advice and reminder, the headings of sections 4.4.1 and 4.4.2 have been modified as "4.4.1 Factors for the significant/non-significant shifts in the CWSC" and "4.4.2 Factors for the significant upward/downward shifts in the CWSC" in the revised manuscript.

A7: Why not analyze the reasons for conclusion 2 in the Section 5.1? (Catchments with larger elevation and slope, lower forest coverage of Evergreen Broad leaf Forest are more likely to have an increase in the CWSC during a chronic drought while smaller catchments with lower elevation, lower coverage of the Evergreen Broad leaf Forest are more likely to have a decrease in the CWSC.)

**Reply:** Thanks. We tried but as shown in Figures 7 and 9, no strong PCC association has been found between the magnitude of the change in the CWSC and the single catchment property or climate variable. It seems that the catchment response behavior to long-term meteorological drought is controlled by the combination of local catchment properties and climate characteristics rather than a single factor Thus, we prospected that further studies are still required to confirm which factors played the most important role in the catchment dynamic.

A8: The conclusion should be concise and coherent. It is suggested that only the key and definitive conclusions of this paper should be stated. If you cannot confirm your conclusion, these results may only be used in the Discussion, such as L610-611 and L622-631, etc.

**Reply:** Thanks. Changes have been made as suggested. The sentences in lines 610-611 (in the original manuscript) have been deleted in the conclusion part of the revised manuscript. In addition, the sentences in lines 622-631 (in the original manuscript) have been modified as follows:

It is noted that although this study resulted in interesting findings that give new insight and have not been fully outlined before, it is based on the lumped GR4J model and the specific case in Australia, which implies that the main findings/conclusions may

not directly extendable to other regions. Thus, to examine the generality of the main conclusions, the response of CWSC to the meteorological drought can be analyzed with the other hydrological models in the other regions.

Please refer to lines 628-632 in the modified manuscript.

A9: It's better to add latitude and longitude to the location map of the study catchments (Figure 1).

**Reply:** Thanks. Changes have been made in the revised Figure 1. The modified Figure 1 reads as follows.



Figure 1. Location map of the study catchments in southeastern Australia. The dark gray color denotes the catchments with a long-term meteorological drought (145 catchments) while the light gray color denotes the catchments without any sustained droughts or ha more than one prolonged drought period (253 catchments).

A10: Table 3 should add the results about the fourth criteria.

**Reply:** Thanks. Changes have been made in the revised Table 3. The modified Table 3 is as follows.

Table 3. The direction of the shifts in the CWSC due to the long-term meteorological
drought for the catchments in southeastern Australia.

Magnitude	Change direction	Percentage (Number of catchments)
Significant	Downward (Smaller CWSC than the previous estimation suggests)	8.3% (12)
change	Upward (Larger CWSC than the previous	27.6% (40)

estimation suggests)				
Non-significant	Slight increase	12.4% (18)		
change	Slight decrease	9.0% (13)		
Dissatisfy the criteria	Dissatisfy the criteria of the minimum NSE performance, the			
maximum performance degradation and the robustness requirement		42.8% (62)		
All (catchments with	a sustained meteorological drought)	100% (145)		

A11: Figure 4 can be improved. The figure should show the change directions and magnitudes of the CWSC at the same time. It is better for readers to understand the shifts of the CWSC in the adjacent catchments.

**Reply:** Thanks. Changes have been made as suggested. The modified Figure 4 reads as follows:



Figure 4. Location map of the catchments with the significant and non-significant shifts in the CWSC. The red (blue) color denotes the catchments that have a significant increase (decrease) in the CWSC after the Change point while the (light blue) light red color denotes the catchments with a non-significant increase (decrease) in the CWSC.

A12: Is the supplementary material missing?
<b>Reply:</b> We are sorry for this mistake. We have uploaded the supplementary material
(Table S1) to the system. Please also refer to the material (Table S1) below.

	Table 51. Catchinents with the long-term meteorological dioughts.				
FID	Station ID	Drought start	Drought end	drought anomaly	Complete
1	143107	2000	2007	-19.67%	97.03%
2	145010	1993	2009	-10.41%	97.71%
3	146095	1991	1998	-11.24%	96.91%

Table S1. Catchments with the long-term meteorological droughts.

FID	Station ID	Drought start	Drought end	drought anomaly	Complete
4	201001	1991	1998	-9.64%	97.44%
5	203005	1991	2007	-11.66%	95.62%
6	203010	1991	2007	-11.84%	96.41%
7	204017	1991	2007	-9.95%	97.77%
8	204025	1991	2007	-12.37%	95.47%
9	204037	1991	2005	-9.15%	97.17%
10	204039	2000	2009	-13.66%	82.96%
11	204041	1991	2006	-12.39%	96.80%
12	204906	1991	2007	-12.71%	97.12%
13	208004	1991	1997	-12.47%	96.94%
14	208005	1991	1998	-10.85%	97.13%
15	208019	1991	1998	-13.11%	80.26%
16	210016	2001	2007	-10.13%	88.07%
17	210031	2001	2007	-9.50%	94.67%
18	210040	2001	2007	-11.87%	96.51%
19	210052	2001	2007	-8.63%	83.18%
20	210093	2001	2007	-12.36%	86.06%
21	211009	1993	2006	-15.08%	96.97%
22	211014	1993	2006	-14.82%	95.30%
23	212040	2000	2009	-12.27%	84.80%
24	215002	2000	2009	-16.58%	89.43%
25	215008	1999	2009	-14.45%	96.36%
26	217002	2000	2009	-19.67%	97.20%
27	218001	2002	2009	-16.00%	98.32%
28	218005	2002	2009	-16.37%	97.73%
29	218007	1996	2009	-11.64%	97.79%
30	218008	2002	2009	-16.56%	93.60%
31	219003	1998	2009	-13.85%	97.36%
32	219006	1998	2009	-15.14%	98.27%
33	219017	2002	2009	-21.36%	97.78%
34	219022	1998	2009	-15.71%	97.35%
35	220003	1998	2009	-12.20%	97.78%
36	220004	1996	2009	-12.28%	97.03%
37	221010	1996	2009	-9.23%	82.23%
38	222007	2002	2009	-13.72%	98.28%
39	222016	2002	2009	-12.26%	96.52%
40	222017	1996	2009	-9.98%	89.46%
41	222202	2002	2009	-10.32%	95.67%
42	222206	2002	2009	-10.76%	91.82%
43	222213	2002	2009	-12.23%	91.39%
44	222217	2002	2009	-10.15%	98.81%
45	223202	2002	2009	-13.78%	91.54%
46	224201	2002	2009	-13.64%	98.46%

FID	Station ID	Drought start	Drought end	drought anomaly	Complete
47	224206	2002	2009	-13.44%	91.88%
48	224213	2002	2009	-15.64%	95.80%
49	224214	2002	2009	-14.36%	99.51%
50	225218	2002	2009	-9.03%	100.00%
51	225219	1997	2009	-11.70%	91.47%
52	226204	1997	2009	-10.91%	96.30%
53	226209	1999	2009	-11.47%	100.00%
54	226220	1997	2009	-10.43%	85.57%
55	226226	1999	2009	-8.73%	99.95%
56	226402	1999	2009	-11.51%	100.00%
57	227202	1997	2009	-9.88%	95.68%
58	227219	1997	2009	-10.50%	92.34%
59	227227	1997	2009	-10.56%	92.09%
60	227231	1997	2009	-10.34%	92.30%
61	227236	1997	2009	-9.31%	83.12%
62	228209	1999	2009	-10.75%	80.24%
63	229661	1997	2009	-11.23%	82.54%
64	231225	1997	2009	-13.26%	100.00%
65	233223	1997	2009	-11.90%	92.68%
66	234200	1997	2009	-10.64%	84.79%
67	234201	1997	2009	-10.33%	94.83%
68	234203	1997	2009	-9.19%	96.24%
69	235203	1997	2009	-6.89%	91.44%
70	236205	1994	2009	-6.52%	92.62%
71	236212	1997	2009	-7.22%	91.93%
72	237202	1993	2009	-6.36%	92.05%
73	237205	1993	2009	-6.20%	92.21%
74	237206	1993	2009	-6.05%	96.41%
75	237207	1993	2009	-6.16%	92.04%
76	238204	1997	2009	-9.65%	89.94%
77	238229	1997	2009	-7.83%	92.24%
78	238231	1997	2009	-9.63%	82.82%
79	238235	1993	2009	-5.95%	92.05%
80	239523	1993	1999	-7.96%	99.72%
81	239531	1997	2009	-8.64%	98.30%
82	401012	2002	2009	-14.08%	99.13%
83	401013	2001	2009	-17.54%	98.17%
84	401203	2001	2009	-15.90%	99.86%
85	401208	2001	2009	-17.18%	99.98%
86	401212	2002	2009	-15.96%	99.87%
87	401217	2002	2009	-15.21%	99.87%
88	405205	1997	2009	-13.26%	99.99%
89	405209	1997	2009	-13.07%	99.95%

FID	Station ID	Drought start	Drought end	drought anomaly	Complete
90	405215	1999	2009	-12.49%	99.84%
91	405217	1997	2009	-13.27%	100.00%
92	405219	1997	2009	-11.16%	99.87%
93	405227	1997	2009	-11.61%	99.86%
94	405229	1997	2009	-14.97%	99.15%
95	405230	1997	2009	-14.79%	100.00%
96	405231	2001	2009	-16.24%	99.87%
97	405241	1997	2009	-13.62%	100.00%
98	405245	1997	2009	-15.99%	99.78%
99	405263	1997	2009	-10.61%	99.87%
100	405264	1997	2009	-11.14%	99.87%
101	406214	1997	2009	-14.23%	99.86%
102	406224	1997	2009	-14.08%	100.00%
103	407214	2001	2009	-16.19%	99.40%
104	407215	2001	2009	-17.73%	99.47%
105	407220	2001	2009	-18.39%	98.77%
106	407230	2001	2009	-17.92%	99.92%
107	408200	2000	2009	-18.03%	99.92%
108	408202	2001	2009	-14.66%	99.54%
109	410024	2001	2009	-19.20%	98.01%
110	410026	2000	2009	-13.19%	97.94%
111	410033	2001	2009	-12.11%	97.38%
112	410038	2001	2009	-20.49%	95.84%
113	410044	2001	2009	-20.21%	94.64%
114	410047	2001	2009	-17.73%	94.48%
115	410057	2001	2009	-19.32%	98.13%
116	410061	2001	2009	-19.12%	97.02%
117	410062	2002	2009	-14.90%	95.29%
118	410088	2001	2009	-17.90%	98.27%
119	410091	2001	2009	-17.43%	82.48%
120	410097	2001	2009	-17.25%	87.34%
121	410107	2001	2009	-19.39%	87.74%
122	410141	2000	2009	-14.70%	80.53%
123	410705	2000	2009	-14.97%	100.00%
124	410713	2001	2009	-19.65%	98.40%
125	410730	2000	2009	-15.05%	99.75%
126	410731	2000	2009	-14.82%	97.75%
127	410734	2000	2009	-14.43%	99.43%
128	412028	2001	2009	-16.98%	95.86%
129	412050	2001	2009	-12.92%	88.11%
130	412066	2001	2009	-15.27%	96.69%
131	412080	2001	2009	-14.72%	81.02%
132	415201	2000	2009	-13.22%	99.86%

FID	Station ID	Drought start	Drought end	drought anomaly	Complete
133	415207	2001	2009	-15.09%	99.54%
134	415220	2000	2009	-18.01%	99.29%
135	415226	2000	2008	-16.44%	99.40%
136	415237	1997	2009	-10.91%	97.17%
137	415238	2000	2009	-17.31%	97.51%
138	418027	2000	2009	-7.76%	95.20%
139	419032	2001	2009	-10.40%	91.78%
140	419035	1991	1997	-8.99%	80.84%
141	420003	2001	2007	-17.20%	95.01%
142	420017	2001	2007	-15.46%	86.20%
143	421042	2001	2007	-12.01%	97.50%
144	421055	2001	2007	-17.33%	80.79%
145	421076	2001	2009	-14.83%	80.21%

#### Responses to Referee #2:

I read with interest the paper on The Influence of a Prolonged Meteorological Drought on the Catchment 1 Water Storage Capacity: A Hydrological Model Perspective. It's a good piece of work whose findings are useful for water resources management in the light of climate and landuse changes. My major concern however is in the study design and methodology. Most of the steps in the methods section are not adequately described. Readers can fully link the methods with the results because certain information is not provided in the methods section.

**Reply:** Thanks for the comment and suggestions, we have carefully improved the description of the study design and methodology part in the revision. Some examples are described below:

B1: Typical examples but not limited to: Which datasets have been used in all the objectives Describe the spatial and temporal variation of these datasets What are the different sources of datasets For examples what is the source of the primary land-use types described in the results section.

**Reply:** Thanks. More descriptions of the adopted data set have been added in the revised manuscript. The sentences in lines 159-166 in the original manuscript for describing the research data has been modified as follows:

The following data have been used in this study: (1) climate variables, include daily rainfall and daily potential evapotranspiration; (2) daily streamflow observation at catchment outlet; (3) land use types at 1 km resolution; (4) soil types at 30 arc-second resolution, and (5) catchment attributes, include catchment area, mean elevation and so on. The detailed lists of the catchment attributes and climate characteristics were presented in Table 2. The data of climate variables, daily runoff, and catchment attributes were obtained from the Australian Water Resources Assessment (AWRA) system, which has been served as a standard publicly available national dataset for

hydrological model evaluation (https://publications.csiro.au/rpr/pub?pid=csiro:EP113194, Zhang et al. (2013)). For all catchments, there is no missing data in the rainfall and potential evapotranspiration data while the runoff data in some catchments are missing. The data set of soil types was obtained from the Harmonized World Soil Database by the Food and Agriculture Organization of the United Nations (http://www.fao.org/soils-portal/soil-survey/soilmaps-and-databases/harmonized-world-soil-database-v12/en/, Fischer et al. (2008)) and was classified according to the Soil Texture Triangle of USDA (https://www.nrcs.usda.gov/wps/portal/nrcs/detail/soils/survey/?cid=nrcs142p2\_0541 67). The data set of the land use types was derived from the global land cover map released by the University of Maryland (UMD) (Hansen et al., 2000) and was classified according to the UMD Land Cover Classification method (http://app.earthobserver.org/data/basemaps/images/global/LandCover\_512/LandCoverUMD\_512/La ndCoverUMD 512.html).

Please refer to lines 158-177 in the modified manuscript.

B2: Authors mention about the catchment physical properties and climate characteristics which influences CWSC. Readers will only get to understand or know these physical properties and climate characteristics when they read the results section. This again has to do with a poor study design.

**Reply:** Thanks. The list of catchment properties and climate characteristics that might influence CWSC was presented in Table 2. And the illustrations of these potential factors were presented in section 3.4. To facilitate the understanding of this manuscript, the following sentence has been added in section 2.2. of the modified manuscript:

The detailed lists of the catchment attributes and climate characteristics were presented in Table 2.

Please refer to lines 161-162 in the modified manuscript.

B3: In section 3.4, what do authors mean by '. . ...because of the limitation of available data of catchment attributes, only unique catchment properties are employed. . .". What are these unique catchment properties? And how were they selected? **Reply:** Thanks.

(1) The 'unique catchment properties' we meant these data are static values rather than a time series. For example, only one value of the catchment area was used.

(2) The unique catchment properties refer to the X1-X9 in Table 2, i.e., catchment area, mean elevation and elevation difference between the maximum and minimum elevations, mean slope, and slope range, forest coverage percentage, saturated hydraulic conductivity of the top soil, available soil water holding capacity of the top soil and sub soil.

(3) These catchment attributes were selected because they reflect the physical characteristics of the catchment, and might be related to the shift in the CWSC.

(4) To make it clearer, this sentence have been modified as "It should be noted that due to the limitation of available data of catchment attributes, for each catchment, only one static/constant value of the catchment property was employed (X1-X9).". Please

#### refer to lines 354-356 in the modified manuscript.

B4: The authors use the term 'climate characteristics' in the abstract and methods section-Upon reading the manuscript (rather the results) one discovers that its only rainfall being referred to. Is rainfall enough to define meteorological characteristics? - what about the influence of other climate characteristics such as Temperature, Evapotranspiration?

### **Reply:** Thanks.

(1) The term "climate characteristics" in this manuscript refers to the variables of Y1-Y24 in Table 2, which include rainfall, temperature, potential evapotranspiration, and runoff. It also should be mentioned that the employed climate variables can be divided into four categories, i.e., daily (Y1-Y4), monthly (Y5-Y7), seasonal (Y8-Y16), and annual scale variables (Y17-Y24). Please refer to Table 2.

(2) Since rainfall is the most important factor that influences the degree of catchment wetness, the identification of meteorological drought in this manuscript was only based on the annual rainfall data as in other studies (Li et al., 2020; Pan et al., 2019b; Saft et al., 2015; Wong et al., 2013). Furthermore, Saft et al. (2015) indicated that the selected algorithm has been verified as a rigorous method for processing the autocorrelation in regression residuals and testing the global significance. Furthermore, we have the same study region, i.e., catchments in southeastern Australia (but our data sources are different). Thus, the method proposed by Saft et al. (2015) was employed in this study to define the meteorological drought period.

Add reference:

- Li, Q. F., He, P. F., He, Y. C., Han, X. Y., Zeng, T. S., Lu, G. B., and Wang, H. J.: Investigation to the relation between meteorological drought and hydrological drought in the upper Shaying River Basin using wavelet analysis, Atmos. Res., 234, 10, 10.1016/j.atmosres.2019.104743, 2020.
- Wong, G., van Lanen, H. A. J., and Torfs, P.: Probabilistic analysis of hydrological drought characteristics using meteorological drought, Hydrol. Sci. J.-J. Sci. Hydrol., 58, 253-270, 10.1080/02626667.2012.753147, 2013.

B5: In section 4.3 authors point out that 'However, the geographical distribution of catchments with significant and non-significant changes in  $\theta_1$  showed no obvious geolocation clustering phenomenon. Which statistical techniques did the authors employ to come up with conclusions on significance in  $\theta_1$  Given multiple climate variables and catchment properties-which one significantly affects CWSC? **Reply:** Thanks.

(1) In order to avoid unclearness, this sentence has been deleted in the modified manuscript.

(2) The criteria in identifying catchments with a significant/non-significant change in  $\theta_1$  were presented in section 3.2.5. As illustrated in lines 325-330, the minimum requirement of significant change in  $\theta_1$  was defined as the simulated values of the parameter  $\theta_1$  between the two periods should be more than ±20%. In other words, only the catchments with more than  $\pm 20\%$  changes in  $\theta_1$  would be recognized as changed significantly. After a comparison of several other threshold levels (such as  $\pm 5\%$  and  $\pm 10\%$ ), we found that the value of  $\pm 20\%$  can maximally exclude the negative impacts by the heterogeneity of the available parameter sets.

(3) As presented in Figures 7 and 9, we used the Pearson Correlation Coefficient to reflect the potential relation between the (%) shift in the CWSC and the catchment properties/climate characteristics. However, no strong association has been found between the shift in the CWSC and the single climate variable/catchment property. Thus, it is really hard to judge the influence of each factor on the CWSC. According to our study, it seems that the final changes in the CWSC are the combined effects of multiple climate variables and catchment properties. Thus, we suggested that further studies are still required to confirm which factors played the most important role in the catchment dynamic.

1	The Influence of a Prolonged Meteorological Drought on the Catchment
2	Water Storage Capacity: A Hydrological Model Perspective
3	Zhengke Pan <sup>a,b,c,d</sup> , Pan Liu <sup>a,b,*</sup> , Chong-Yu Xu <sup>d</sup> , Lei Cheng <sup>a,b</sup> , Jing Tian <sup>a,b</sup> , Shujie Cheng <sup>a,b</sup> , Kang Xie <sup>a,b</sup>
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### 17 Abstract

Understanding the propagation of prolonged meteorological drought helps solve the problem of 18 19 intensified water scarcity around the world. Most of the existing literature studied the propagation 20 of drought from one type to another (e.g., from meteorological to hydrological drought) with 21 statistical approaches, there remains difficulty in revealing the causality between the 22 meteorological drought and potential changes in the Catchment Water Storage Capacity (CWSC). 23 This study aims to identify the response of CWSC to the meteorological drought by examining the 24 changes of hydrological model parameters after the drought events. Firstly, the temporal variation 25 of a model parameter that denotes the CWSC is estimated to reflect the potential changes in real CWSC. Next, the change points of the CWSC parameter were determined based on the Bayesian 26 27 change point analysis. Finally, the possible association and linkage between the shift in the CWSC 28 and the time-lag of the catchment (i.e., time-lag between the onset of the drought and the change 29 point) with multiple catchment properties and climate characteristics were identified. Eighty-three 30 catchments from southeastern Australia were selected as the study areas. Results indicated that 31 (1) significant shifts in the CWSC can be observed in 62.7% of the catchments, which can be divided 32 into two sub-groups with the opposite response, i.e., 48.2% of catchments had lower runoff 33 generation rates while 14.5% of catchments had higher runoff generation rate; (2) the increase in 34 the CWSC during a chronic drought can be observed in smaller catchments with lower elevation, 35 slope, and forest coverage of Evergreen Broadleaf Forest while the decrease in the CWSC can be 36 observed in larger catchments with higher elevation and larger coverage of the Evergreen 37 Broadleaf Forest; (3) catchments with a lower proportion of Evergreen Broadleaf Forest usually 38 have longer time-lag and are more resilient. This study improves our understanding of possible 39 changes in the CWSC induced by a prolonged meteorological drought, which will help improve our 40 ability to simulate the hydrological system under climate change.

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42	Keywords: Catchment water storage capacity; GR4J hydrological model; Temporal Variation;
43	Meteorological drought; Catchment response; Resilience
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# 54 **1. Introduction**

55 Drought is one of the most damaging environmental disasters and has significant environmental, 56 economic, and social impacts around the world (Zhao and Running, 2010). It not only affects the 57 balance of aquatic and terrestrial ecosystems, but also many economic and social sectors including 58 agriculture yield, industrial production and urban water supply (Mishra and Singh, 2010). 59 Furthermore, recent literature indicates that the improved probabilities of the extreme events 60 have been projected in many parts around the world because of the increasing anthropogenic 61 interference and global climate change, which implies the more severe droughts in the future (Dai, 62 2021, 2012; Pan et al., 2019b). Unlike other natural hazards, e.g., flood, cyclonic storms and 63 earthquakes, the drought may have a much longer duration.

64 The droughts are generally classified into four categories (Mishra and Singh, 2010): meteorological, 65 agricultural, hydrological, and socio-economic droughts. All droughts start as meteorological 66 droughts caused by precipitation shortage. Then a prolonged meteorological drought might result 67 in a hydrological drought that is represented by the deficits in the surface or subsurface water 68 supply (e.g., streamflow, groundwater, reservoir, and lake storage). An agricultural drought, a 69 period with declining soil moisture and consequent crop failure without any reference to surface 70 water resources, is usually the combined effects of meteorological and hydrological droughts. A 71 socio-economic drought is associated with the failure of water resources systems to meet water 72 demands as a result of a weather-related shortfall in the water supply. Recently, many studies have 73 been carried out on the links between different drought types, e.g., the link between the 74 meteorological and hydrological droughts (Haslinger et al., 2014; Huang et al., 2017; Lopez-Moreno 75 et al., 2013; Lorenzo-Lacruz et al., 2013; Van Loon et al., 2015; Wu et al., 2017), the link between 76 meteorological and agricultural droughts (Huang et al., 2015; Wu et al., 2016), and the link between 77 meteorological and socio-economic droughts (Zhao et al., 2019). However, little attention has been 78 paid to the causality between the meteorological drought and changes in catchment properties 79 where the latter plays a critical role in the transference of different drought types.

80 Whether a sustained shift in precipitation (e.g., a prolonged meteorological drought) can trigger a 81 change in catchment properties is important for understanding the mechanism of catchment 82 response and hydrological projections under change (Schindler and Hilborn, 2015). For example, 83 because of the significant decline in annual rainfall in the late 1960s, a shift from perennial to 84 ephemeral streams and a decline in the runoff coefficient (runoff/rainfall) since the 1970s has been 85 observed in Western Australia (Petrone et al., 2010). Furthermore, Saft et al. (2015) indicated the 86 shift in the annual rainfall-runoff relationship in southeastern Australia during the Millennium 87 drought (1997-2009). The possible mechanisms may be that the drought-induced persistent 88 change in groundwater level (Van Lanen et al., 2013), catchment soil condition (Descroix et al., 89 2009), vegetation (Adams et al., 2012) and soil moisture (Grayson et al., 1997). Furthermore, a new 90 hydrologic regime has developed in the study area with important implications for future surface 91 water supply.

One of the most important attributes of a catchment is the ability to store water and to release it
 later, which is known as the catchment water storage capacity (CWSC). The storage serves as a
 buffer for climate variability, meteorological extremes, and sustain vegetation during the drought

95 period, while the value of CWSC is a vital index to quantify and compare the maximum water 96 volume of different catchments. The detailed definition of the CWSC (McNamara et al., 2011) is in 97 an unregulated and unimpaired catchment, the water storage capacity is defined as the maximum 98 water volume that a catchment can hold after rainfall events. It refers to the part of effective rainfall 99 that does not develop into the surface flow, and it is the sum of soil water storage capacity, 100 vegetation intercept, and snowpack. Recently, there are two main methods to derive the CWSC value, i.e., water balance method and hydrological modeling method. For the former method, 101 102  $V(T) = V_0 + \Delta t \sum_{t=1}^{T} (P_t - Q_t - E_t)$ , where V(T) is the storage at time step t = T,  $\Delta t$  is the interval between two contiguous time steps,  $V_0$  is the storage at time t = 0,  $P_t$ ,  $Q_t$  and  $E_t$ 103 104 refer to the precipitation (mm), streamflow (mm), and evapotranspiration (mm) at time step t, 105 respectively. Thus, the CWSC is denoted as the difference between minimum and maximum of the 106 computed annual storage volumes over the observation period. For the latter method, the CWSC 107 is estimated through the calibration of hydrological model parameters (that denote the catchment 108 water storage capacity within the model structure) with the time series of precipitation, 109 evapotranspiration, and streamflow as well as certain objective functions (e.g., minimize the errors 110 between the streamflow observations and the simulated results based on the estimated 111 parameters) and the inference methods (e.g., SCEM-UA algorithm by Vrugt et al. (2003)). Generally, 112 the latter has the advantage of quantifying the contribution of snow, soil, and groundwater storage 113 (Staudinger et al., 2017). For example, Deng et al. (2016) calibrated the time-varying parameters 114 of a two-parameter monthly water balance model with a case study in Wudinghe catchment of 115 China and found one of the model parameters that denote the CWSC experienced a significant 116 upward trend during the historical period from 1958 to 2000. Pan et al. (2019b) calibrated the GR4J 117 hydrological model with time-varying parameters in three catchments of southeastern Australia and found that the spatial coherence of adjacent catchments helps to reduce the estimation 118 119 uncertainty of the CWSC and improves the model prediction performance. In addition, because of 120 the resilience of catchment, the shift in the CWSC might occur as a delayed step-change. However, 121 no study has been made on the application of hydrological modeling methods to explore the 122 impacts of sustained meteorological drought on the catchment water storage capacity.

123 The objectives of this study, therefore, are: (1) to verify whether a sustained meteorological 124 drought would result in a significant change in CWSC; if so, to explore the possible change points 125 (the time points that the value of the CWSC experienced an abrupt variation), change direction 126 (whether the value of the CWSC has an upward or downward change after the change point) and 127 change magnitude (the difference between the values of the CWSC during the periods before and 128 after the change point); (2) to analyze which catchment properties and climate characteristics are 129 more promising to be related to the shift in the CWSC; and (3) to explore the possible association 130 between catchment properties and climate characteristics with the time-lag between the onset of 131 the meteorological drought and the change point.

132The remainder of this study is organized as follows. Section 2 presents the study area and research133data. Section 3 illustrates the methodology to explore the questions mentioned above. Section 4134provides the results of catchments with significant and non-significant changes in the CWSC as well135as catchments with different change directions due to a prolonged meteorological drought, and136illustrates the association results between the shift in the CWSC and time-lag with the potential137variables (include catchment properties and climate characteristics). Section 5 provides discussions

138 of the results. The conclusions have been made in section 6.

# 139 **2. Study area and data**

#### 140 **2.1. Study area**

141 Analyses of this paper are based on daily rainfall, potential evapotranspiration, runoff time series, 142 and catchment attributes from southeastern Australia. The study catchments were checked to be 143 free from major anthropogenic disturbances during the measurement history (Zhang et al., 2013). 144 Southeastern Australia has gone through nearly a decade of meteorological drought that was 145 approximately from 1996 to 2009. This drought has resulted in large impacts on the economy, 146 culture, politics, and ecosystem development of southeastern Australia, the most densely 147 populated part of Australia. The study catchments are situated in this region, extending from 148 southern Queensland, southern New South Wales, and whole Victoria. A map of the study area 149 with geolocation of the study catchments in southeastern Australia is demonstrated in Figure 1.

The study catchments exhibit a broad variety of climatic conditions, soils, land use, vegetation, and hydrological regimes. Generally, the study catchments have much more rainfall during the spring and winter seasons than the summer and autumn seasons. In most of the study catchments, there is no snowmelt; even if the snowmelt appears in an individual catchment, it does not have much effect on the local hydrological system because the mean elevation of these catchments is around 584 m a.m.s.l. It should be mentioned that the mean elevation of these catchments is much lower than the seasonal snow line (1500 m a.m.s.l.) in this area (Saft et al., 2015).

### 157 2.2. Research data

158 The following data have been used in this study: (1) climate variables, include daily rainfall and 159 daily potential evapotranspiration; (2) daily streamflow observation at catchment outlet; (3) land 160 use types at 1 km resolution; (4) soil types at 30 arc-second resolution, and (5) catchment attributes, 161 include catchment area, mean elevation and so on. The detailed lists of the catchment attributes 162 and climate characteristics were presented in Table 2. The data of climate variables, daily runoff, 163 and catchment attributes were obtained from the Australian Water Resources Assessment (AWRA) 164 system, which has been served as a standard publicly available national dataset for hydrological 165 model evaluation (https://publications.csiro.au/rpr/pub?pid=csiro:EP113194, Zhang et al. (2013)). 166 For all catchments, there is no missing data in the rainfall and potential evapotranspiration data 167 while the runoff data in some catchments are missing. The data set of soil types was obtained from 168 the Harmonized World Soil Database by the Food and Agriculture Organization of the United 169 **Nations** (http://www.fao.org/soils-portal/soil-survey/soil-maps-and-databases/harmonized-170 world-soil-database-v12/en/, Fischer et al. (2008)) and was classified according to the Soil Texture 171 Triangle of USDA 172 (https://www.nrcs.usda.gov/wps/portal/nrcs/detail/soils/survey/?cid=nrcs142p2\_054167). The 173 data set of the land use types was derived from the global land cover map released by the 174 University of Maryland (UMD) (Hansen et al., 2000) and was classified according to the UMD Land 175 Cover Classification method (http://app.earth176 observer.org/data/basemaps/images/global/LandCover\_512/LandCoverUMD\_512/LandCoverUM177 D\_512.html).

178 In total 398 catchments from southeastern Australia were selected from the original data set, 179 under the conditions that 1) they are not regulated and with insignificant effects of human 180 activities during the observation period, and 2) the catchment area ranges from 50 to 17000 km<sup>2</sup>. 181 Available records of these catchments for our study are ranged from January 1, 1976, to December 182 31, 2011. For the initial data set of 398 catchments from southeastern Australia, a set of 125 183 catchments were excluded before analysis because the completeness of daily streamflow data in 184 these catchments is less than 80 percent. The remaining 273 catchments are used for the 185 identification of meteorological droughts. Finally, 145 catchments within the subset were identified 186 with a long-term meteorological drought (see sections 3.1 and 4.1) and analyzed further. The 187 attributes of the 145 catchments are summarized in Table S1 (Supplement material).

# 188 **3. Methodology**

This section presents the methodology of this study, including (i) identification of catchments with a long-term meteorological drought (section 3.1); (ii) derivation of change in the CWSC on account of drought based on hydrological modeling method (section 3.2), includes an introduction of the hydrological model adopted, the likelihood function, model parameter estimation method, and the identification method for the change points of the CWSC; (iii) potential variables that might be associated with the changes in the CWSC (section 3.3).

### 195 **3.1. Identification of meteorological drought**

196 Since rainfall is one of the most important factors that influence the degree of wetness, the 197 identification method of the meteorological drought was only based on the annual rainfall data as in other studies (Li et al., 2020; Pan et al., 2019b; Saft et al., 2015; Wong et al., 2013). The method 198 199 proposed by Saft et al. (2015) was introduced in this study to define the meteorological drought 200 period (also known as dry period). Saft et al. (2015) examined several algorithms for the 201 identification of dry period with the consideration of different combinations of the dry period anomaly (i.e., the percentage variation between the annual rainfall during the dry period and the 202 203 average of whole time series), length of the dry period and various boundary conditions, the 204 delineation results of the dry period by one of the algorithms illustrated the lowest dependency 205 on the algorithm itself, and were robust to different algorithms. The process of this best 206 identification method is generalized as follows:

207 Firstly, the anomaly was calculated as the percentage variation between the annual rainfall data 208 and the long-term annual mean value, and the anomaly was smoothed with a 3-year moving 209 window. It should be mentioned that smoothing was applied to avoid single wetter years that 210 interrupt a long dry period and identify all period of consecutive smoothed negative anomalies. 211 Secondly, the start year of the dry period was defined as the start of the first 3 continuous years of 212 the negative anomaly period based on the unsmoothed anomaly data. Similarly, the end year of 213 the dry period was determined from the last negative 3-year anomaly series based on the 214 unsmoothed anomaly data. The end year was defined as the last year of this 3 year series unless

(i) there was a year with a positive anomaly that was larger than 15% of the mean, in which case the end of dry period was determined as the year before that year, (ii) the last 2 years had a bit positive anomalies (but each was smaller than 15% of the mean), in which case the end year was determined as the first year of the positive anomaly. Two additional rules were set to ensure a sufficiently long and severe dry period: the length of the dry period should longer than 6 years and the mean dry years' anomaly should be smaller than 5%. In addition, the remaining part in the observation history (except the dry period) was determined as the non-dry period.

The selected algorithm has been verified as a rigorous method for processing the autocorrelation in regression residuals and testing the global significance. Furthermore, we have the same study region, i.e., catchments in southeastern Australia (but our data sources and periods are different). A more detailed process of the identification method of dry period can be obtained in research by Saft et al. (2015) and our previous study (Pan et al., 2019b).

### 3.2. Derivation of the catchment response to drought

#### 228 3.2.1 Hydrological model

229 The conceptual rainfall-runoff model, i.e., the GR4J (modèle du Génie Rural à 4 paramètres 230 Journalier) hydrological model, was used to examine the proposed method (Perrin et al., 2003). 231 Previous studies showed that the GR4J model had comparable simulation and prediction 232 performance with other hydrological models with more model parameters (Pan et al., 2019a, 233 2019b; Westra et al., 2014). The GR4J model comprised four parameters:  $\theta_1$  represents the 234 catchment water storage capacity (mm);  $\theta_2$  denotes the coefficient of groundwater exchange 235 (mm);  $\theta_3$  represents the 1-day-ahead maximum capacity of the routing store (mm); and 236  $heta_4$  denotes the time base of the unit hydrograph (days). Previous studies (Demirel et al., 2013; Pan 237 et al., 2019a, 2019b; Perrin et al., 2003; Westra et al., 2014; Yan et al., 2015) showed that  $\theta_1$ , which 238 denotes the catchment water storage capacity, is the most sensitive parameter in the structure of 239 the GR4J model.

240 In the GR4J model structure, the first operation is to subtract evapotranspiration from the original 241 rainfall to determine the net rainfall or net evapotranspiration. The net rainfall is then divided into 242 a surface flow and a water production storage of catchment, where  $\theta_1$  is the maximum capacity of the production store of the catchment. The total runoff includes two flow components 243 244 (underground flow and the surface runoff) which are presented as slow and fast routing processes 245 by two unit hydrographs. Ninety percent of the total runoff is routed by the slow unit hydrograph 246 and then a non-linear routing store, while the remaining 10% of the runoff is propagated through 247 the fast routing process. Both unit hydrographs depend on the same parameter  $\theta_4$  expressed in 248 days. In addition, a groundwater exchange term that acts on both flow components is calculated 249 based on parameters  $\theta_2$  and  $\theta_3$ . More details about the Gr4J model can be found in Perrin et al. 250 (2003).

The real CWSC values are hard to derive out based on available data and attributes of catchments. However, the hydrological model provides a new perspective for reflecting the potential variations of the CWSC, that is, the utilization of specific model parameter(s) that represent(s) CWSC, such as parameter  $\theta_1$  in the GR4J model. Figure 2 presents an example to illustrate the impacts of the shift in the value of  $\theta_1$  on the model simulation results.

Thus, in this study, we use the magnitude of the shift in estimated  $\theta_1$  between periods before and after the change point to represent the change in the CWSC. In addition, we assume that the other model parameters  $\theta_2$ ,  $\theta_3$ , and  $\theta_4$  are kept constant during the periods before and after the change point, and the shift of the CWSC happens on the potential change point. The constant assumption of parameters  $\theta_2$ ,  $\theta_3$ , and  $\theta_4$  is a common assumption, which has been made in many previous literatures, such as Westra et al. (2014), Pan et al. (2019a) and Pan et al. (2019b).

- 262 3.2.3 Likelihood function, parameter estimation, and inference
- 263 (1) likelihood function
- For catchment *c*, the likelihood function in this study was adopted from Thiemann et al. (2001), which is written as:

266 
$$p_c\left(\vec{\theta}(c)|\xi(c),q(c),\tau\right) \propto \left[\frac{\omega(\tau)}{\sigma}\right]^T \exp\left[-c(\tau)\sum_{t=1}^T \left|\frac{e_t\left(\vec{\theta}(c)\right)}{\sigma}\right|^{2/(1+\tau)}\right] p\left(\vec{\theta}(c)\right)$$
 (1)

267 where

268 
$$\omega(\tau) = \frac{\left\{\Gamma\left[3(1+\tau)/2\right]\right\}^{1/2}}{\left(1+\tau\right)\left\{\left\{\Gamma\left[(1+\tau)/2\right]\right\}^{3/2}\right\}}, c(\tau) = \left\{\frac{\Gamma\left[3(1+\tau)/2\right]}{\Gamma\left[(1+\tau)/2\right]}\right\}^{1/(1+\tau)}$$
(2)

where p refers to the likelihood probability.  $\vec{\theta}(c) = \{\theta_1, \theta_2, \theta_3, \theta_4\}$  and  $\Gamma(.)$  indicates the 269 270 gamma function. T refers to the number of time step t; c is the index of catchments; q denotes observations of streamflow;  $\xi$  represents the climate inputs of the hydrological model, including 271 272 precipitation (P) and potential evapotranspiration (PET); et signifies the residual error at time step 273 t; and  $\tau$  refers to the residual error model type (Pan et al., 2019a;Thiemann et al., 2001). When 274 the model type of residual error is verified, parameters  $\omega$  and c are unchanged values. The Gaussian distribution was used to denote the residual error model in this study, thus  $\tau = 0$  was 275 verified. Therefore,  $\omega(\tau = 0)$  and  $c(\tau = 0)$  are confirmed as:  $\omega(\tau = 0) = \frac{\{\Gamma(3/2)\}^{1/2}}{\{\Gamma(1/2)\}^{3/2}} =$ 276

- 277  $0.3989, \omega(\tau = 0) = \frac{\Gamma(3/2)}{\Gamma(1/2)} = 0.5$ , respectively. Additionally, for all unknown quantities, uniform 278 distributions are used as their prior distributions.
- 279 (2) Inference

The estimation of the posterior distributions of all unknown quantities is based on the Shuffled Complex Evolution Metropolis (SCEM-UA) sampling method (Vrugt et al., 2003). The Gelman-Rubin convergence value (Gelman et al., 2013) was used as the evaluation criterion of model convergence, with its value should be smaller than the threshold 1.2. The prior ranges of all model parameters have been given in Table 1. 285 **3.2.4 Bayesian change point analysis** 

In this part, the Bayesian change point analysis was introduced to find out the possible change points of the CWSC. Change point of the CWSC denotes the time point that the estimated values of the CWSC between two periods (before and after this point) were significantly different. Each change point was then illustrated by a likelihood probability. The time point with the maximum likelihood probability among all potential options was regard as the final change point of the catchment.

The Bayesian change point is one of the simplest and most effective methods to analyze the change point problem (Cahill et al., 2015; Carlin et al., 1992). The detailed process is as follows:

At first, assume unknown value k as the potential change point of the CWSC and its value is taken from  $\Theta = \{1, 2, ..., T\}$ . Thus, k = T is interpreted as "no change". Assuming the rainfall-runoff relationship Y before the change point k is

297 
$$Y_i(c) \sim p_c(\vec{\theta}(c)|\xi_i(c), q_i(c), \tau), i = 1, ..., k-1.$$
 (3)

Therefore, for all possible *k*, corresponding values of calibrating parameters  $\vec{\theta}(c)$  can be obtained through the derivation of the likelihood function with the SCEM-UA algorithm. Obviously, there were four unknown quantities (i.e., four model parameters) that need to solve during this process.

301 Similarly, the rainfall-runoff relationship after the change point *k* is assumed as

302 
$$Y_i(c) \sim p'_c\left(\overrightarrow{\theta}(c) \middle| \xi_i(c), q_i(c), \tau\right), i = k, ..., T.$$
(4)

where  $\vec{\theta'}(c) = \{\theta_1, \theta_2, \theta_3, \theta_4\}$ . Parameters  $\theta_2, \theta_3$  and  $\theta_4$  are predefined and taken from the calibrating results of the previous process. Thus, only  $\theta'_1$  would be calibrated in this process. The association between  $p_c$  and  $p_c'$  is that the posterior distributions of  $\theta_2, \theta_3, \theta_4$  are the same.

306 Therefore, for every k, the likelihood function L(Y; k) becomes

307 
$$L(Y;k) = p_c\left(\vec{\theta}(c)\right) \cdot p'_c\left(\vec{\theta}(c)\right)$$
(5)

308 The Bayesian perspective is added by placing a prior density  $\varsigma(k)$  on  $\Theta$  whence the posterior 309 density of p(k|Y)

310 
$$p(k|Y) = \frac{L(Y;k)\varsigma(k)}{\sum_{j=1}^{n} L(Y;j)\varsigma(j)}$$
(6)

Therefore, the final Change pint is recognized as the point that has the largest p(k|Y). It should be noted that every catchment would get a "potential change point" during the calculation process. However, these "potential change points" would be evaluated to judge whether there is a

- significant shift in the estimated  $\theta_1(\theta_1)$  between these two periods, i.e., before k and after k. In
- order to speed up the calculation process, the time interval between two adjacent change point isset as 30 days.

317 3.2.5 Criteria in identifying catchments with a significant change in  $\theta_1$ 

In order to derive the catchments with significant changes in the CWSC. Four evaluation criteriahave been used in this study.

(1) The minimum NSE requirement: The values of Nash-Sutcliffe efficiency coefficient (NSE) in two periods should be larger than 0.6. The reason for setting this requirement was to ensure the simulation results by the adopted model (the GR4J model) were reasonable for the simulation of the hydrological cycle in a catchment, thus, the estimated model parameter can truly reflect the CWSC of this catchment.

325 (2) **The minimum requirement of significant change:** The difference in simulated values of 326 the parameter  $\theta_1$  between the two periods should be more than ±20%. In other words, only the 327 catchments with more than ±20% changes in  $\theta_1$  would be recognized as significantly changed. 328 After comparison of several other threshold levels (such as ±5% and ±10%), we found that the 329 value of ±20% can maximally exclude the negative impacts by the heterogeneity of the available 330 parameter sets.

(3) The requirement for maximum performance degradation: the degradation of NSE values
 between the two periods should be no more than 20%.

(4) The requirement for the robustness of results: The initial conditions (i.e., the initial value
 of all unknown quantities which might have impacts on the final results) for the calculation would
 change three times, only the catchments that were identified as significantly changed in each time
 would be identified as the final changing items.

### 337 **3.3. Response time of catchment**

338 In those catchments with a significant change in the CWSC, a time-lag would usually exist between 339 the onset of the meteorological drought and the change point because of the catchment resilience. 340 For example, Van Lanen et al. (2013) and Huang et al. (2017) indicated that the groundwater 341 maintained the runoff during a brief drought period thus acted as a cushion to the spread of 342 meteorological drought to hydrological drought. However, the interactions between the surface 343 water and groundwater would be gradually reduced because of the falling groundwater levels if 344 the drought conditions persist for several years and even decades. The shift between the 345 connected situation and disconnected condition usually takes some time and occurs as a delayed step-change, which is also known as the time-lag of the catchment. Furthermore, the vegetation 346 347 and catchment soil moisture may also have an impact on the response of catchments to 348 meteorological drought.

### 349 **3.4.** Potential factors for the shift in the CWSC

350 Since the processes potentially responsible for the shift in the CWSC are not directly measured, 351 thus some measurable proxies are used to explore the potential factors and possible associations 352 between these potential factors with the changes in the CWSC and the length of the time-lag of 353 the catchment. Thus, 33 variables, including catchment physical properties and climate 354 characteristics, were employed. It should be noted that due to the limitation of available data of 355 catchment attributes, for each catchment, only one static/constant value of the catchment 356 property was employed (X1-X9). However, each climate variable includes four values, i.e., the 357 values of climate characteristics during the periods before and after the change point, and the 358 variation and percent variation of the climate characteristics between the aforementioned two 359 values. For example, four values of the average of daily runoff are considered, i.e., the average 360 values of daily rainfall during the period before the change point AR<sub>before</sub>, the average values of 361 daily rainfall during the period after the change point  $AR_{after}$ , the variation and percent variation 362 of the average of the daily runoff between  $AR_{before}$  and  $AR_{after}$ . Table 2 summarizes the 363 potential factors included in the following analysis. The employed climate variables can be divided 364 into four categories, i.e., daily (Y1-Y4), monthly (Y5-Y7), seasonal (Y8-Y16), and annual scale 365 variables (Y17-Y24). Noted that the base flows of catchments were calculated based on the Lyne-366 Hollick method (Lyne and Hollick, 1979).

# 367 **4. Results**

#### 368 **4.1.** Catchments with a long-term meteorological drought

369 One hundred and twenty five catchments in southeastern Australia were excluded from the original data set (total 398 catchments) because these catchments lacked a long enough data series 370 371 during their streamflow measurement history, that is, the completeness of daily streamflow data 372 is less than 80 percent. Furthermore, 145 catchments from the filtered 273 catchments have been 373 identified with one long-term meteorological drought during its observation history according to 374 the identification method mentioned in section 3.1. It should be mentioned that the catchments 375 with more than one long-term drought periods in its measurement history were not included in 376 order to exclude the unnecessary impact on the subsequent evaluation of shift in the CWSC due 377 to sustained drought. For most catchments, the long-term meteorological drought started around 378 2000 and then ended around 2009. The drought length of all these catchments was longer than 7 379 years. During this period, a larger than 5 percent decrease has been identified in the annual rainfall 380 of all those catchments.

### 4.2. Catchments with significant and non-significant change

The Bayesian change point test was applied to the 145 catchments that have been identified with a long-term meteorological drought (Table S1). Based on the evaluation criteria mentioned in section 3.2.5, it was found that 83 of the 145 catchments satisfied the requirements for minimum NSE performance and maximum performance degradation. The following analysis was based on these 83 catchments.

In 52 out of 83 (62.7%) catchments, the estimated value of the model parameter  $\, heta_1\,$  was detected 387 388 to have a significant change after the onset of the meteorological drought, indicating the potential 389 changes of the CWSC in these catchments. These catchments satisfied all criteria mentioned in 390 section 3.2.5. More clearly, the median estimated value of parameter  $\theta_1$  during the period after 391 the change point was significantly different from that value before the change point; the median 392 NSE performances of both parameter sets in two periods were larger than 0.6; furthermore, the 393 performance degradation between simulated results before and after the change point was no 394 more than 20 percent. Meanwhile, the remaining 31 (37.3%) catchments had no significant 395 changes after the onset of the drought.

396 Figure 3 illustrates the results of three examples, including the posterior distributions of  $\theta_1$  during 397 the periods before and after the change point (left three columns), the posterior probability in the 398 likely change points (median three columns), and the corresponding NSE performance (right three 399 columns). Clearly, there was a time-lag between the onset of the meteorological drought and the 400 shift in the CWSC. In catchment 215002, a significant upward change in  $\theta_1$  was detected after the 401 change point. It means that after the change point the CWSC was larger than expected based on 402 the calibrated results in two periods. As for the posterior probability, it was found that there was a 403 probability of 48.0% that the change point would locate in the range of July - December in 2001, 404 and a probability of 76.0% that the change point would locate in the range of February - December 405 in 2001. In catchment 401203, the white box that refers to the mean estimate of  $\theta_1$ , was shifted 406 downward significantly, indicating the potential decreased change in the CWSC of this catchment. 407 The likely change point has a probability of 39.9% to occur within the period of January - July in 408 2003. Finally, catchment 410061 experienced an upward but not significant change in  $\theta_1$  when 409 comparing the results from two periods that separated by the "most likely change point". Since the 410 shift in  $\theta_1$  was not significant in this catchment, the change point did not exist here statistically. Thus, under sustained rainfall reduction, the CWSC of different catchments might experience 411 412 absolute diverse changes. The possible reasons may lie in the diverse catchment properties and 413 climate characteristics (see sections 4.4 and 4.5).

### 414 **4.3.** Direction and magnitude of the shift in the CWSC

In the case of the direction of shift in the CWSC, a significant increase in the estimated  $\theta_1$  has 415 416 been found in 40 out of 83 catchments. Since the significant decrease in rainfall has been found 417 during the prolonged drought, these catchments were expected to experience a downward trend 418 with a similar magnitude of reduction in the runoff generation. However, the increase of the CWSC 419 means that the drought might result in lower runoff generation rates for similar amounts of rainfall 420 during the drought period. Thus, in the following years with reduced rainfall, lower runoff due to 421 the reduced rainfall could be expected, furthermore, the even less runoff than historical records 422 may occur because of the significant increase in the CWSC. Another 12 catchments had a significant 423 downward shift in the CWSC. The decrease of CWSC indicates that the meteorological drought 424 might result in higher runoff generation rates for a similar amount of rainfall than previous records. 425 These catchments had the lower capacity to hold available water and their ecosystems might suffer 426 more frequent and more severe extreme events, e.g., droughts and floods. In addition, the 427 remaining 31 catchments were divided into two parts further, i.e., 18 catchments with a slight (non-428 significant) increase in the CWSC and 13 catchments with a slight (non-significant) decrease in the 429 CWSC. As for the geographical distribution of the catchments with significant and non-significant 430 changes in the CWSC, Figure 4 illustrates that there is some tendency for clustering, e.g., (1) for the 431 majority, adjacent catchments tend to have same change directions; (2) catchments in 432 southwestern and southern Victoria experienced different levels of increase in the CWSC, while (3) 433 in northeastern Victoria, the majority of catchments had a decrease in the CWSC. Figure 5 presents 434 the statistical histograms of catchments with different degrees of the shift in  $\theta_1$ . It should be noted 435 that both catchments with significant changes and non-significant changes have been plotted 436 together. The fitted curves in Figures 5 (a) and (b) are both positively-biased since that there was a 437 larger number of catchments with an increasing trend in the CWSC rather than those with 438 decreased trend detected. The distribution of the catchments illustrates that the majority of 439 catchments have the [-50, 100] percent change (based on the period before the change point) or [-100, 200] absolute change in the estimated value of  $\theta_1$ . 440

### 441 **4.4.** Factors for shifts in the CWSC

In this part, we investigate whether changes in the CWSC are associated with particular catchment
properties or climate characteristics. In other words, are catchments with certain catchment
properties or climate characteristics easier to trigger the potential shift in its CWSC?

445 4.4.1 Factors for the significant/non-significant shifts in the CWSC

446 Two groups of catchments were established according to the significance level of the shift in  $\theta_1$ after the onset of the long-term drought. Specifically, one group is composed of catchments with 447 448 a significant change in the estimation of parameter  $\theta_1$  between two periods. The other group is 449 composed of catchments that only had a non-significant change in parameter  $\theta_1$  between two periods. As shown in Figure 6 (left two columns), the catchment properties of two groups of 450 451 catchments have been presented. Significant changes in the CSWC were likely to occur in 452 catchments with smaller catchment areas, lower elevation and its difference, less slope, lower 453 Available soil Water Holding Capacity (AWHC) in sub soil, smaller saturated hydraulic conductivity 454 (Ks) in top soil. The forest coverage percentage and the AWHC in top soil are not significantly 455 different between the two groups of catchments. It should be noted that some of those catchment 456 properties might be somewhat related. Thus, the Pearson Correlation Coefficient (PCC) has been 457 used to explore the potential relationship between the change in parameter  $\theta_1$  with the 458 catchment properties as well as the connection between different catchment properties. Figure 7 459 illustrates a low degree (PCC  $\in [\pm 0.3, \pm 0.5]$ ) of association between the (%) shift in parameter 460  $\theta_1$  and these catchment properties for two groups of catchments.

461 4.4.2 Factors for the significant upward/downward shifts in the CWSC

462 Two sub-groups of catchments were extracted from the group of catchments with significant shifts 463 in the CWSC according to the change direction of the estimated  $\theta_1$ . Specifically, one subset is 464 composed of catchments with a significant upward change in the estimated  $\theta_1$  while another 465 subset is composed of catchments that experienced a significant downward shift in the estimated 466  $\theta_1$ . As shown in Figure 6 (right two columns), catchments with a significant upward change in 467 estimate  $\theta_1$  had a smaller catchment area, lower elevation, and its difference, less slope, lower 468 AWHC in sub soil, smaller saturated hydraulic conductivity (Ks) in top soil. The forest coverage 469 percentage, the AWHC in top soil, and the length of the time-lag are not significantly different 470 between two sub-groups of catchments.

471 Furthermore, twenty-four climate variables in Table 2 have been used to explore the difference 472 between two sub-groups of catchments and the possible associations between the magnitude of 473 the shift in the CWSC with the values of climate variables. As illustrated in section 3.4, one climate 474 variable consists of four values, i.e., the climate values during the periods before and after the 475 change point, the absolute difference, and % variation between the climate variables between two 476 periods. Thus, there were 96 climate values considered in this part. As shown in Figure 8, significant 477 differences (i.e., % variation is larger than ±10 percentage) have been found in the majority of the 478 climate variables between two sub-groups of catchments for both four categories of climate values, 479 except for the % difference in the daily maximum temperature, which was not significant for both 480 four values between two periods. In addition, the % difference of the drought length ( $\geq$ 7 years) 481 between the two sub-groups of catchments was 14.3%, and on average, the subset of catchments 482 with significantly increased shift had longer drought length than the other subset.

483 The potential associations between the change in the CWSC and both climate values have been presented in Figure 9. A medium degree of correlation (PCC>0.4) has been found between the % 484 485 shift in the CWSC with the CV of annual rainfall (PCC=0.422), the CV of annual runoff (PCC=0.419) 486 during the period before the change point. No more than a medium degree correlation has been 487 found between the shift in the CWSC with the climate values after the change point. As for the 488 variation of climate value between two periods, a larger association has been found in the shift in 489 CSWC with the variation in daily rainfall (PCC=-0.425), variation in annual rainfall (PCC=-0.518), and 490 change in annual runoff ratio (PCC=0.479) rather than others. In addition, it seems that the shift in 491 parameter  $\theta_1$  was not related to drought length ( $\geq$ 7 years) because its PCC value was only 0.148.

### 492 **4.5.** Factors for the time-lag of catchment

Using the same method as illustrated in section 4.4, the difference between two sub-groups of catchments, and potential associations between the time-lag of the catchment (time-lag) with catchment properties and climate characteristics were analyzed. In other words, are catchments with certain catchment properties and/or climate conditions easier to have longer time-lag? It should be noted that the catchments with a non-significant change in the CWSC were not included in this part, because these catchments did not experience a significant change in its estimation value of  $\theta_1$  thus did not have a statistically significant change point.

500 On average, the time-lag in the subset of catchments with the significant upward change in 501 estimated  $\theta_1$  was 9.4% larger than the subset with a significant downward shift. As shown in 502 Figure 10, only lower associations have been found between the time-lag with different catchment. 503 The maximum PCC value between the time-lag with the catchment properties was just 0.159, 504 which was achieved by the correlation between the time-lag and the AWHC in top soil. In addition, 505 the potential association between the time-lag with the climate variables also has been presented in Figure 11. Similarly, low correlation (|PCC < 0.3|) has been found between the time-lag and 506 507 both four categories of climate values.

# 508 **5. Discussions**

509 The results indicate that, under certain circumstances, a long-term meteorological drought would 510 result in a significant change in the CWSC. In this study, 52 in 83 catchments (62.7%) have been 511 found to have a significant shift in its CWSC. Furthermore, a subset of 40 catchments had a 512 significant upward change in the CWSC while another subset of 12 catchments had a significant 513 downward change.

### 514 **5.1.** Possible reasons for different changes in the CWSC

515 The results indicate that, under certain circumstances, a long-term meteorological drought would 516 result in a significant change in the CWSC. However, no strong association has been found between 517 the magnitude of the change in the CWSC with any single variable. In addition, the length of dry 518 period was not associated with the shift in the CWSC. Thus, it seems that the catchment response 519 behavior to long-term meteorological drought is controlled by the combination of local catchment 520 properties and climate characteristics rather than a single factor. Thus, further studies are still 521 required to confirm which factors played the most important role in the catchment dynamic.

522 5.1.1 Potential mechanisms for the impacts of catchments properties on the CWSC

523 The CWSC of a catchment is the comprehensive presentation of catchment properties in the field 524 of water storage. The interrelated impacts by the changes in catchment properties, such as 525 groundwater decline, may result in the potential shift in the CWSC. However, it should be 526 mentioned that even similar changes take part in catchments with different backgrounds of 527 properties, may have opposite impacts on its change directions of the CWSC.

528 In the study area, the groundwater decline combined with different background of soil types in the 529 catchments may be one of the possible reasons for different change directions in the CWSC. The 530 groundwater decline would lead to the loss of the hydraulic connection between groundwater and 531 surface water. The space that once was occupied by soil water become void. However, catchments 532 with different soils would have different change directions. In sand and other soil types with lower 533 adhesive property, these soil pores would be compacted due to the reduction of buoyancy of soil 534 water, thus the compacted soil may result in a decrease in the CWSC. Conversely, these soil pores 535 may be retained in those soils with strong adhesive property, the decline of groundwater may lead 536 to an increase in the CWSC. A significant decline in groundwater level has been observed in 537 southeastern Australia during the drought periods (Leblanc et al., 2009). Figure 12 presents the 538 soil types of 83 catchments in southeastern Australia, and illustrates that the silt loam and loam 539 are the main soil types in the study area, the sum of which occupies more than 80 percent of the 540 region. Moreover, southwestern Victoria and southern New South Wales (i.e., catchments with an increase in the CWSC), were mainly occupied by the loam while eastern Victoria (i.e., catchments 541 542 with an increase in the CWSC) was mainly occupied by the silt loam. By contrast, the silt loam had 543 a stronger adhesive property and larger field capacity than the loam. Thus, the distribution of these 544 two soil types may explain a proportion of variance in the change direction of the CWSC. However, 545 in southern Victoria, the results disagree with this finding, the possible reasons might be that other 546 more influential factors control the catchment behaviors in this region.

547 In addition, another possible reason is the variance in land use. The primary land-use types in the 548 study region are Evergreen Broadleaf Forest (49.8%), Wooded Grassland (16.9%), Woodland 549 (14.1%), and cropland (13.2%). As shown in Figure 13, catchments with downward changes are 550 mainly covered by the Evergreen Broadleaf Forest while those with upward changes are mainly 551 covered by other three land-use types. Historical literature (Adams et al., 2012; Fensham et al., 552 2009; Ferraz et al., 2009) showed that, due to the persistent drought, plant mortality and change 553 in species compositions have been observed in southeastern Australia. Thus, it can be 554 hypothesized that the Evergreen Broadleaf Forest has less resilience in response to the drought 555 and may be much easier to experience significant changes in the CWSC than other types since that 556 the growth of the Evergreen Broadleaf Forest needs much more water than other types. In 557 catchments with large coverage of the Evergreen Broadleaf Forest, the canopy interception and 558 absorption of the forest usually consist of the vital proportions for the catchments to storage water, 559 thus the tree die-off in these catchments might result in a decrease in the CWSC. On the contrary, in the catchment with other land use types, the water storage by its vegetation may only play a 560 561 non-primary role and its vegetation has stronger resilience in response to the drought because of 562 less water consumption. Thus, the persistent drought in these catchments did not result in massive 563 tree morality but merely led to the increased water stress and the augment of the CWSC.

564 5.1.2 Potential mechanisms for the impacts of climate characteristics on the CWSC

565 The effect mechanism of climate characteristics on the CWSC is through their remodeling on the 566 catchment properties. A medium degree of correlation has been found between the % shift in the 567 CWSC with the coefficients of annual rainfall and runoff before the change point, and the variation 568 in annual or daily rainfall and annual runoff ratio. Furthermore, the shift in the CWSC was not 569 associated with all climate variables after the change point. It also has been found that the annual 570 distribution of baseflow, the interannual, seasonal, and monthly distribution of rainfall and runoff, 571 are not correlated to the shift in the CWSC. Previous studies (Chiew et al., 2011; Saft et al., 2015) 572 illustrated that during the meteorological drought large reduction in autumn rainfall and an even 573 larger decrease in winter runoff and annual runoff of many catchments in southeastern Australia 574 have been observed. However, in our study, significant declines in rainfall and runoff of both four 575 seasons have been observed throughout the study area, not merely the autumn rainfall and winter runoff. Furthermore, significant differences have been found in the most climate variables between 576 577 catchments with significant upward and downward changes, including the autumn rainfall, and 578 winter and annual runoff and other climate variables. Thus, it is really hard to judge the influence 579 of each factor on the CWSC. According to our study, it seems that the final changes in the CWSC 580 are the combined effects of multiple climate variables and catchment properties.

### 581 **5.2.** Catchments with quick or slow response

The length of time-lag represents the resilience of a catchment in response to a prolonged drought. Our results indicated a negative association between the length of time-lag with the forest coverage percentage in both catchments with significant upward and downward changes. It means that catchments with larger forest coverage percentage are more susceptible to the stress from a chronic meteorological drought than other catchments. This phenomenon is possibly related to the primary land use types in the study area, i.e., the Evergreen Broadleaf Forest (49.8%), which 588 has a high demand for water consumption. Thus, a catchment that experienced a prolonged 589 meteorological drought, combined with the characteristic of large coverage of the Evergreen 590 Broadleaf Forest, would be quite sensitive to have changes in its CWSC. In addition, opposite 591 directions of PCC association between the time-lag with several catchment properties (i.e., mean 592 elevation and elevation difference, mean slope and slope range, AWHC in sub soil, Ks in top soil) 593 have been found in two sub-groups of catchments. For example, in the subset of catchments with 594 a significant decrease in the CWSC, the length of time-lag is positively associated with the elevation 595 level and slope, while in the subset of catchments with a significant increase in the CWSC, it is a 596 negative association. Similar findings also have been found in associations between the time-lag 597 and multiple climate variables (e.g., daily rainfall, baseflow, and so on). However, since only a low 598 association level has been observed between the time-lag and these single climate variables, it is 599 still hard to judge whether there are certain physical mechanisms behind this phenomenon or it is 600 just a statistical artifact.

# 601 **6. Conclusions**

602 This study aims to examine the possible changes in the catchment water storage capacity (CWSC) 603 as well as the time-lag between the onset of the meteorological drought and the change point of the CWSC. A classical hydrological model, GR4J, was used and its parameter  $\theta_1$  was selected to 604 605 denote CWSC. Thus, the temporal variation in parameter  $\theta_1$  was detected to reveal the possible fluctuation in the CWSC, and the causality between the temporal variation in parameter  $\theta_1$  and a 606 607 persistent meteorological drought was examined. The 83 catchments in southeastern Australia 608 were selected as the study areas because a decadal meteorological drought was observed. Main 609 conclusions can be drawn as follows:

(1) Significant changes in CWSC have been identified in 62.7% (52 in 83) of catchments, which can
be divided into two sub-groups with opposite catchment responses: 48.2% (40 in 83) experienced
a significant decrease in the CWSC during the drought period, and had lower runoff generation
rates while 14.5% (12 in 83) of catchments experienced a significant decrease in the CWSC during
the drought period, and had higher runoff generation rate.

615 (2) Different change directions in the CWSC resulted in the opposite impacts on runoff generation, 616 i.e., catchments with increased CWSC would result in lower runoff generation rates for similar 617 amounts of rainfall than before while those catchments with decreased CWSC would have an 618 opposite response (higher runoff generation rate). Generally, the increase in the CWSC during a 619 chronic drought can be observed in smaller catchments with lower elevation, slope, and forest 620 coverage of Evergreen Broadleaf Forest while the decrease in the CWSC can be observed in larger 621 catchments with higher elevation and larger coverage of the Evergreen Broadleaf Forest. Among 622 all catchment properties and climate variables considered, our results suggest that two climate 623 variables (i.e., variation in annual rainfall and annual runoff ratio) have the strongest associations 624 with the shift in the CWSC.

(3) The responses of different catchments to persistent meteorological drought were not equally
 susceptible. Catchments with a lower proportion of Evergreen Broadleaf Forest usually have longer
 time-lag and are more resilient.

628 It is noted that although this study resulted in interesting findings that give new insight and have 629 not been fully outlined before, it is based on the lumped GR4J model and the specific case in 630 Australia, which implies that the main findings/conclusions may not directly extendable to other 631 regions. Thus, to examine the generality of the main conclusions, the response of CWSC to the 632 meteorological drought can be analyzed with the other hydrological models in the other regions.

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### 639 Author contributions

640 Zhengke Pan and Pan Liu conceived the study and wrote the paper. Chong-Yu Xu, Lei Cheng, and 641 Jing Tian made constructive comments on the writing of this study, which improves the quality of 642 this paper. Shujie Cheng and Kang Xie provided the data of the catchment attributes and made 643 comments. All of the authors read and approved the manuscript.

### 644 Code/Data availability

645 The data and codes that support the findings of this study are available from the corresponding 646 author upon reasonable request.

# 647 Compliance with ethical standards

648 **Conflict of interest:** The authors declare that they have no conflict of interest.

# 649 **References**

- Adams, H. D., Luce, C. H., Breshears, D. D., Allen, C. D., Weiler, M., Hale, V. C., Smith, A. M. S.,
  and Huxman, T. E.: Ecohydrological consequences of drought- and infestation- triggered tree
  die-off: insights and hypotheses, Ecohydrology, 5, 145-159, 10.1002/eco.233, 2012.
- Cahill, N., Rahmstorf, S., and Parnell, A. C.: Change points of global temperature, Environ. Res.
  Lett., 10, 6, 10.1088/1748-9326/10/8/084002, 2015.
- Carlin, B. P., Gelfand, A. E., and Smith, A. F. M.: Hierarchical Bayesian-Analysis of Changepoint
  Problems, J. R. Stat. Soc. Ser. C-Appl. Stat., 41, 389-405, 1992.
- Chiew, F. H. S., Young, W. J., Cai, W., and Teng, J.: Current drought and future hydroclimate
  projections in southeast Australia and implications for water resources management, Stoch.
  Environ. Res. Risk Assess., 25, 601-612, 10.1007/s00477-010-0424-x, 2011.
- Dai, A.: Increasing drought under global warming in observations and models, Nature Climate
  Change, 3, 52-58, 10.1038/nclimate1633, 2012.
- 662 Dai, A. G.: Drought under global warming: a review, Wiley Interdisciplinary Reviews-Climate

- 663 Change, 2, 45-65, 10.1002/wcc.81, 2011.
- Demirel, M. C., Booij, M. J., and Hoekstra, A. Y.: Effect of different uncertainty sources on the skill
  of 10 day ensemble low flow forecasts for two hydrological models, Water Resour. Res., 49,
  4035-4053, 10.1002/wrcr.20294, 2013.
- Deng, C., Liu, P., Guo, S. L., Li, Z. J., and Wang, D. B.: Identification of hydrological model
  parameter variation using ensemble Kalman filter, Hydrol. Earth Syst. Sci., 20, 4949-4961,
  10.5194/hess-20-4949-2016, 2016.
- Descroix, L., Mahe, G., Lebel, T., Favreau, G., Galle, S., Gautier, E., Olivry, J. C., Albergel, J.,
  Amogu, O., Cappelaere, B., Dessouassi, R., Diedhiou, A., Le Breton, E., Mamadou, I., and
  Sighomnou, D.: Spatio-temporal variability of hydrological regimes around the boundaries
  between Sahelian and Sudanian areas of West Africa: A synthesis, J. Hydrol., 375, 90-102,
  10.1016/j.jhydrol.2008.12.012, 2009.
- Fensham, R. J., Fairfax, R. J., and Ward, D. P.: Drought-induced tree death in savanna, Glob. Change
  Biol., 15, 380-387, 10.1111/j.1365-2486.2008.01718.x, 2009.
- Ferraz, S. F. D., Vettorazzi, C. A., and Theobald, D. M.: Using indicators of deforestation and landuse dynamics to support conservation strategies: A case study of central Rondonia, Brazil, For.
  Ecol. Manage., 257, 1586-1595, 10.1016/j.foreco.2009.01.013, 2009.
- Fischer, G., Nachtergaele., F., Prieler., S., Velthuizen, H. T. v., Verelst., L., and D. Wiberg: Global
  Agro-ecological Zones Assessment for Agriculture (GAEZ 2008), in, edited by: IIASA,
  Laxenburg, Austria and FAO, Rome, Italy., 2008.
- 683 Gelman, A., Carlin, J., Stern, H., Dunson, D., Vehtari, A., and Rubin, D.: Bayesian Data Analysis,
  684 third ed ed., CRC Press, 2013.
- Grayson, R. B., Western, A. W., Chiew, F. H. S., and Bloschl, G.: Preferred states in spatial soil
  moisture patterns: Local and nonlocal controls, Water Resour. Res., 33, 2897-2908,
  10.1029/97wr02174, 1997.
- Hansen, M., DeFries, R., Townshend, J. R. G., and Sohlberg, R.: Global land cover classification at
  1km resolution using a decision tree classifier, International Journal of Remote Sensing, 21,
  1331-1365, 2000.
- Haslinger, K., Koffler, D., Schoner, W., and Laaha, G.: Exploring the link between meteorological
  drought and streamflow: Effects of climate- catchment interaction, Water Resour. Res., 50,
  2468-2487, 10.1002/2013wr015051, 2014.
- Huang, S. Z., Huang, Q., Chang, J. X., Leng, G. Y., and Xing, L.: The response of agricultural
  drought to meteorological drought and the influencing factors: A case study in the Wei River
  Basin, China, Agric. Water Manage., 159, 45-54, 10.1016/j.agwat.2015.05.023, 2015.
- Huang, S. Z., Li, P., Huang, Q., Leng, G. Y., Hou, B. B., and Ma, L.: The propagation from
  meteorological to hydrological drought and its potential influence factors, J. Hydrol., 547, 184195, 10.1016/j.jhydrol.2017.01.041, 2017.
- Leblanc, M. J., Tregoning, P., Ramillien, G., Tweed, S. O., and Fakes, A.: Basin-scale, integrated
  observations of the early 21st century multiyear drought in southeast Australia, Water Resour.
  Res., 45, 10, 10.1029/2008wr007333, 2009.
- Li, Q. F., He, P. F., He, Y. C., Han, X. Y., Zeng, T. S., Lu, G. B., and Wang, H. J.: Investigation to
  the relation between meteorological drought and hydrological drought in the upper Shaying
  River Basin using wavelet analysis, Atmos. Res., 234, 10, 10.1016/j.atmosres.2019.104743,
  2020.

- Lopez-Moreno, J. I., Vicente-Serrano, S. M., Zabalza, J., Begueria, S., Lorenzo-Lacruz, J., AzorinMolina, C., and Moran-Tejeda, E.: Hydrological response to climate variability at different
  time scales: A study in the Ebro basin, J. Hydrol., 477, 175-188, 10.1016/j.jhydrol.2012.11.028,
  2013.
- Lorenzo-Lacruz, J., Moran-Tejeda, E., Vicente-Serrano, S. M., and Lopez-Moreno, J. I.: Streamflow
  droughts in the Iberian Peninsula between 1945 and 2005: spatial and temporal patterns,
  Hydrol. Earth Syst. Sci., 17, 119-134, 10.5194/hess-17-119-2013, 2013.
- Lyne, V., and Hollick, M.: Stochastic Time-Variable Rainfall-Runoff Modeling, Institute of
   Engineers Australia National Conference, Australia 1979.
- McNamara, J. P., Tetzlaff, D., Bishop, K., Soulsby, C., Seyfried, M., Peters, N. E., Aulenbach, B. T.,
  and Hooper, R.: Storage as a Metric of Catchment Comparison, Hydrol. Process., 25, 33643371, 10.1002/hyp.8113, 2011.
- Mishra, A. K., and Singh, V. P.: A review of drought concepts, J. Hydrol., 391, 204-216,
  10.1016/j.jhydrol.2010.07.012, 2010.
- Pan, Z., Liu, P., Gao, S., Cheng, L., Chen, J., and Zhang, X.: Reducing the uncertainty of timevarying hydrological model parameters using spatial coherence within a hierarchical Bayesian
  framework, J. Hydrol., 577, 10.1016/j.jhydrol.2019.123927, 2019a.
- Pan, Z., Liu, P., Gao, S., Xia, J., Chen, J., and Cheng, L.: Improving hydrological projection
  performance under contrasting climatic conditions using spatial coherence through a
  hierarchical Bayesian regression framework, Hydrol. Earth Syst. Sci., 23, 3405-3421,
  10.5194/hess-23-3405-2019, 2019b.
- Perrin, C., Michel, C., and Andreassian, V.: Improvement of a parsimonious model for streamflow
   simulation, J. Hydrol., 279, 275-289, 10.1016/S0022-1694(03)00225-7, 2003.
- Petrone, K. C., Hughes, J. D., Van Niel, T. G., and Silberstein, R. P.: Streamflow decline in southwestern Australia, 1950-2008, Geophys. Res. Lett., 37, 7, 10.1029/2010gl043102, 2010.
- Saft, M., Western, A. W., Zhang, L., Peel, M. C., and Potter, N. J.: The influence of multiyear drought
  on the annual rainfall-runoff relationship: An Australian perspective, Water Resour. Res., 51,
  2444-2463, 10.1002/2014wr015348, 2015.
- Schindler, D. E., and Hilborn, R.: Prediction, precaution, and policy under global change, Science,
  347, 953-954, 10.1126/science.1261824, 2015.
- Staudinger, M., Stoelzle, M., Seeger, S., Seibert, J., Weiler, M., and Stahl, K.: Catchment water
  storage variation with elevation, Hydrol. Process., 31, 2000-2015, 10.1002/hyp.11158, 2017.
- Thiemann, M., Trosset, M., Gupta, H., and Sorooshian, S.: Bayesian recursive parameter estimation
  for hydrologic models, Water Resour. Res., 37, 2521-2535, Doi 10.1029/2000wr900405, 2001.
- Van Lanen, H. A. J., Wanders, N., Tallaksen, L. M., and Van Loon, A. F.: Hydrological drought
  across the world: impact of climate and physical catchment structure, Hydrol. Earth Syst. Sci.,
  17, 1715-1732, 10.5194/hess-17-1715-2013, 2013.
- Van Loon, A. F., Ploum, S. W., Parajka, J., Fleig, A. K., Garnier, E., Laaha, G., and Van Lanen, H.
  A. J.: Hydrological drought types in cold climates: quantitative analysis of causing factors and
  qualitative survey of impacts, Hydrol. Earth Syst. Sci., 19, 1993-2016, 10.5194/hess-19-19932015, 2015.
- Vrugt, J. A., Gupta, H. V., Bouten, W., and Sorooshian, S.: A Shuffled Complex Evolution
  Metropolis algorithm for optimization and uncertainty assessment of hydrologic model
  parameters, Water Resour. Res., 39, 18, Artn 1201

- 751 10.1029/2002wr001642, 2003.
- Westra, S., Thyer, M., Leonard, M., Kavetski, D., and Lambert, M.: A strategy for diagnosing and
  interpreting hydrological model nonstationarity, Water Resour. Res., 50, 5090-5113,
  10.1002/2013wr014719, 2014.
- Wong, G., van Lanen, H. A. J., and Torfs, P.: Probabilistic analysis of hydrological drought
  characteristics using meteorological drought, Hydrol. Sci. J.-J. Sci. Hydrol., 58, 253-270,
  10.1080/02626667.2012.753147, 2013.
- Wu, J. F., Chen, X. W., Yao, H. X., Gao, L., Chen, Y., and Liu, M. B.: Non-linear relationship of
  hydrological drought responding to meteorological drought and impact of a large reservoir, J.
  Hydrol., 551, 495-507, 10.1016/j.jhydrol.2017.06.029, 2017.
- Wu, Z. Y., Mao, Y., Li, X. Y., Lu, G. H., Lin, Q. X., and Xu, H. T.: Exploring spatiotemporal
  relationships among meteorological, agricultural, and hydrological droughts in Southwest
  China, Stoch. Environ. Res. Risk Assess., 30, 1033-1044, 10.1007/s00477-015-1080-y, 2016.
- Yan, X. L., Zhang, J. Y., Wang, G. Q., Bao, Z. X., Liu, C. S., and Xuan, Y. Q.: Application of GR4J
  Rainfall-runoff Model to Typical Catchments in the Yellow River Basin, Proceedings of the
  5th International Yellow River Forum on Ensuring Water Right of the River's Demand and
  Healthy River Basin Maintenance, Vol V, Yellow River Conservancy Press, Zhengzhou, 191198 pp., 2015.
- Zhang, Y. Q., Viney, N., Frost, A., and Oke, A.: Collation of australian modeller's streamflow dataset
   for 780 unregulated australian catchments, Water for a healthy country national research
   flagship, 115pp, 2013.
- Zhao, M., and Running, S. W.: Drought-induced reduction in global terrestrial net primary
   production from 2000 through 2009, Science, 329, 940-943, 10.1126/science.1192666, 2010.
- Zhao, M. L., Huang, S. Z., Huang, Q., Wang, H., Leng, G. Y., and Xie, Y. Y.: Assessing socioeconomic drought evolution characteristics and their possible meteorological driving force,
  Geomat. Nat. Hazards Risk, 10, 1084-1101, 10.1080/19475705.2018.1564706, 2019.
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# 779 Tables

	Parameters	Min	Max	
	$\theta_1$	1.0	500.0	
	$\theta_2$	-5.0	5.0	
	$ heta_3$	1.0	200.0	
	$ heta_4$	0.1	8.0	
781				
782				

780 Table 1. Prior ranges of parameters in the GR4J hydrological model

783
784 Table 2. Potential factors for exploring the association between the change of CWSC

785 with catchment properties and climate characteristics.

786

Category	Variables
	X1. Catchment area (km <sup>2</sup> )
	X2. Elevation difference between the maximum and minimum
	elevations (m)
Catchment properties	X3. Mean elevation (m)
	X4. Slope range (deg)
	X5. Mean slope (deg)
	X6. Forest coverage percentage (%)
	X7. AWHC of the top soil (mm)
	X8. AWHC of the sub soil (mm)
	X9 Ks of the top soil (mm/h)
	Y1. Average of daily rainfall
	Y2. Average of daily potential evapotranspiration
	Y3. Average maximum daily temperature
	Y4. Average minimum daily temperature
	Y5. Cv of monthly rainfall
	Y6. Cv of monthly runoff
	Y7. Average of monthly runoff ratio
	Y8. Average of spring rainfall
	Y9. Average of summer rainfall
	Y10. Average of autumn rainfall
	Y11. Average of winter rainfall
Climate	Y12. Average of spring runoff
characteristics	Y13. Average of summer runoff
	Y14. Average of autumn runoff
	Y15. Average of winter runoff
	Y16. Average of annual rainfall
	Y17. Average of annual potential evapotranspiration
	Y18. Average of annual runoff
	Y19. Average of annual aridity index (PET/rainfall)
	Y20. Average of annual runoff ratio
	Y21. Cv of annual rainfall
	Y22. Cv of annual runoff
	Y23. Average of annual baseflow

Note: 1. AWSC is the Available soil Water Holding Capacity; 2. Ks is the saturated hydraulic

788 conductivity; 3. Cv denotes the coefficient of variation.

## Table 3. The direction of the shifts in the CWSC due to the long-term meteorological drought for the catchments in southeastern Australia.

Magnitude	Change direction	Percentage (Number of catchments)
Downward (Smaller CWSC than the previous		0.2% (1.2)
Significant	estimation suggests)	8.3% (12)
change	Upward (Larger CWSC than the previous	27.6% (40)
	estimation suggests)	
Non-significant	Slight increase	12.4% (18)
change	Slight decrease	9.0% (13)
Dissatisfy the c	42.8% (62)	
maximum performa		
All (catchmer	100% (145)	

793 Figures



Figure 1. Location map of the study catchments in southeastern Australia. The dark gray color denotes the catchments with a long-term meteorological drought (145 catchments) while the light gray color denotes the catchments without any sustained droughts or have more than one prolonged drought period (253 catchments).



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Figure 2. Example of the impacts on model simulation due to the different shifts in model parameter  $\theta_1$  (that denotes the catchment water storage capacity)



Figure 3. Examples of shifts in model parameter  $\theta_1$ : (a) catchment 215002 with a 802 significant upward change in  $\theta_1$ ; (b) catchment 401203 with a significant downward 803 change in  $\theta_1$ ; and (c) catchment 410061 with a non-significant change in  $\theta_1$ . The first 804 column compares the posterior distributions of  $\theta_1$  calibrated during the periods 805 before and after the Change point. The second column denotes the posterior 806 probabilities based on all possible Change points. The last column denotes the NSE 807 performances of the model parameters calibrated during the periods before and after 808 809 the most likely Change point.

- 810
- 811



Figure 4. Location map of the catchments with the significant and non-significant shifts in the CWSC. The red (blue) color denotes the catchments that have a significant increase (decrease) in the CWSC after the Change point while the (light blue) light red color denotes the catchments with a non-significant increase (decrease) in the CWSC. 817





point. The orange lines denote the Kernel Smooth curve of the histograms.

812



Figure 6. Catchment properties for the study catchments, including catchment area 822 823 (km<sup>2</sup>), elevation difference between the maximum and minimum elevations (m), mean elevation (m), slope range (deg), mean slope (deg), forest coverage percentage (%), 824 Available soil Water Holding Capacity (AWHC) in top and sub soils, and saturated 825 hydraulic conductivity (Ks) in top soil (mm/h). The red and black lines (solid) denote 826 the average of catchments with and without significant changes in the CWSC, 827 respectively. The "Increased" means catchments with a significant increase in CWSC 828 while the "Decreased" represents catchments with a significant decrease in the CWSC. 829



Figure 7. Pearson Correlation Coefficient based on the association between the magnitude of the shift in  $\theta_1$  and multiple catchment properties as well as the associations between different catchment properties. In the lower triangular matrix, shift in in  $\theta_1$  was considered while in the upper triangular matrix, the percentage shift in  $\theta_1$  was used. S denotes the shift in  $\theta_1$ , %S denotes the percentage shift in  $\theta_1$ while X1-X9 denotes the catchment properties mentioned in Table 2.





Figure 8. The percentage difference of climate variables between two sub-groups of catchments (catchments with significant upward and downward changes in estimated  $\theta_1$ ). The numbers in X-coordinate denote climate variables illustrated in Table 2. The blue and orange lines denote the percentage difference of climate variables between two sub-groups of catchments during the periods before and after the Change point, respectively. The gray line denotes the percentage difference of the amplitude of variation between two periods. The positive value means an increase while a negative value means a decrease. 







(c) Amplitude of variation



(b) After the Change point



(d) Amplitude of the % variation

Figure 9. Pearson Correlation Coefficient based on the association between (1) the 853 854 magnitude of shifts in the CWSC with multiple climate variables as well as the connection between different climate variables (lower triangular matrix) and (2) the 855 magnitude of % shifts in the CWSC with multiple climate variables as well as the 856 connection between different climate variables (upper triangular matrix). Sub figures 857 (a) and (b) denote a connection between the shift or % shift in the CWSC with the 858 climate variables during the periods before and after the Change point, respectively. 859 Sub figures (c) and (d) denote the association between the shift or % shift in the CWSC 860 with the variation and % variation of climate variables of two periods, respectively. Y1-861 Y24 denotes the climate variables in Table 2. 862



Figure 10. Pearson Correlation Coefficient based on the length of the time-lag of the catchment (between the start of the meteorological drought and the Change point) with the catchment properties.

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Figure 11. Pearson Correlation Coefficient based on the association between the length of the time-lag of the catchment with multiple climate variables.



Figure 12. Soil types and corresponding percentages in the study catchments (83 catchments). The data of soil types was adopted from the Harmonized World Soil Database at 30 arc-second resolution (Fischer et al., 2008) and classified according to the Soil Texture Triangle of USDA.



883 Figure 13. Land use types and corresponding percentages in the study catchments (83

catchments). The data of land use was adopted from the global land cover map at 1

885 km resolution released by the University of Maryland (Hansen et al., 2000)