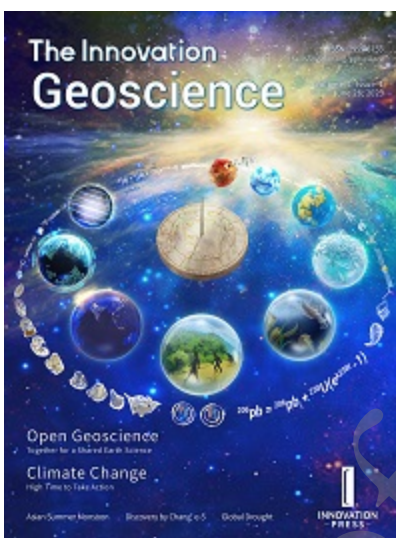




Beyond the multimodel ensemble mean (MME): assessing plausible climate risk at a given warming level

Journal:	<i>The Innovation Geoscience</i>
Manuscript ID	TIG-2026-0094.R2
Manuscript Type:	Commentary
Keywords:	Climate risk assessment, Extreme climate outcomes, Multimodel ensemble mean, Internal climate variability, Constrained climate projection



Beyond the multimodel ensemble mean (MME): Assessing plausible climate risk at a given warming level

Hainan Gong^{1,2}, Wentao Xia^{1,5}, Lin Wang^{1,2*}, Kangjie Ma³, Wen Chen⁴

¹Key Laboratory of Earth System Numerical Modeling and Application, Institute of Atmospheric Physics, Chinese Academy of Sciences, Beijing 100029, China

²Collaborative Innovation Center on Forecast and Evaluation of Meteorological Disasters (CIC - FEMD), Nanjing University of Information Science & Technology, Nanjing 210044, China.

³College of Atmospheric Sciences, Lanzhou University, Lanzhou 730000, China.

⁴Yunnan International Joint Laboratory of Monsoon and Extreme Climate Disasters /Department of Atmospheric Sciences, Yunnan University, Kunming 650500, China

⁵College of Earth and Planetary Sciences, University of Chinese Academy of Sciences, Beijing 100049, China.

*Correspondence: wanglin@mail.iap.ac.cn (L.W.)

[Subject Area: Atmospheric Sciences](#)

The 2°C threshold enshrined in the Paris Agreement is widely viewed as a guardrail against the most dangerous consequences of climate change. Yet the risks associated with any given level of warming are still commonly framed through the multimodel ensemble mean (MME), which mainly summarizes the externally forced response shared across climate models. That benchmark is useful, but it is not sufficient.

1
2
3
4 24 The climate that societies ultimately confront will be shaped not only by external
5
6 25 forcing, but also by differences in modelled process responses and by internal climate
7
8
9 26 variability. Consequently, some of the most consequential future impacts may arise not
10
11 27 from the ensemble average, but from plausible high-impact outcomes located in the
12
13
14 28 tails of the distribution.
15
16

17 29 **THE ILLUSION OF MODERATE RISK**

18
19 30 A recent study by Bevacqua and colleagues brings this point into sharp relief.¹
20
21 31 Drawing on CMIP6 simulations, they show that even in a 2°C warmer world, some
22
23 32 plausible climate outcomes can produce sectoral hazards that are more severe than the
24
25 33 MME response at 3°C or even 4°C warming. Their analysis challenges a familiar
26
27 34 assumption in climate communication: that the most extreme climate outcomes are
28
29 35 chiefly a concern under very high warming. In reality, moderate warming does not
30
31 36 necessarily translate into moderate risk. The significance of the study lies not merely in
32
33 37 emphasizing model spread, but in demonstrating how that spread can be interpreted in
34
35 38 a sector-relevant manner. Rather than focusing only on local extremes or broad global
36
37 39 averages, the authors define sector-specific “global climatic impact-drivers” that
38
39 40 connect each hazard to the regions where it matters most. In their framework, extreme
40
41 41 five-day precipitation over densely populated areas serves as a proxy for flood risk,
42
43 42 drought frequency across major breadbasket regions represents food-security risk, and
44
45 43 fire weather over forests reflects threats to ecosystems and wildfire exposure (Figure
46
47 44 1). Models are then ranked according to these sector-relevant impact drivers, making it
48
49 45 possible to identify plausible best- and worst-case outcomes at the same warming level.
50
51
52
53
54
55
56
57
58
59
60

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

46 These results have important implications. For drought across global breadbaskets,
47 the spread at 2°C is so large that several model outcomes exceed the MME response at
48 4°C. For extreme precipitation over populated regions and fire weather over forests, the
49 worst-case outcomes at 2°C surpass the MME response at 3°C. Put differently, the
50 upper tail of risk in a 2°C world can overlap with, or even exceed, the average risk
51 expected in a substantially warmer world. For climate-sensitive sectors, this is not a
52 minor statistical detail. It is a direct challenge to the way risk is assessed and adaptation
53 is planned.

54 **WHY THE MME IS NOT THE FUTURE CLIMATE**

55 The MME remains a powerful benchmark for identifying robust forced responses
56 and for reducing the influence of idiosyncratic biases in individual models. However,
57 it should not be interpreted as the full risk space of future climate. It is a statistical
58 summary of model responses, not the climate outcome that societies will necessarily
59 experience. Future climate hazards relevant to risk emerges from the combined
60 influence of external forcing, differences in model responses, and internal variability,^{2,3}
61 all of which can shape regional hazards. This distinction is especially important for
62 extreme events. Many societally disruptive extremes are not simply linear extensions
63 of the forced mean state. Instead, they often depend on specific circulation regimes and
64 oceanic background conditions. These ingredients are sensitive to both model
65 formulation and internal variability, which can amplify, mute, or reorganize regional
66 hazards across interannual to decadal timescales.³ A projection framework centered
67 only on MME change may therefore underestimate the likelihood, intensity, or spatial

68 coherence of future high-impact extremes.

69 At the same time, the study offers an important clarification regarding the sources
70 of uncertainty. For the sectors emphasized by Bevacqua and colleagues, much of the
71 spread at 2°C appears to stem from model differences rather than from internal
72 variability alone. That point matters because it underscores the central importance of
73 model performance and process representation for improving future risk assessments.
74 Yet internal variability cannot be dismissed. It still contributes to the envelope of
75 plausible outcomes and becomes particularly relevant when considering realized
76 regional climate trajectories over the coming decades. The relative importance of these
77 uncertainty sources also depends strongly on timescale. Internal variability is especially
78 relevant for near- to medium-term projections (e.g., 2030–2050), because it can
79 modulate the timing, regional expression, and realized severity of climate hazards. By
80 contrast, over longer timescales, model structural uncertainty, including differences in
81 climate sensitivity and process representation, generally becomes a larger contributor
82 to the spread of projected sectoral hazards. This distinction reinforces the need to
83 consider both sources of uncertainty, while recognizing that their relative roles vary
84 with lead time, region, and impact metric. A balanced reading of the study is therefore
85 that both model performance and internal variability matter, even though their relative
86 importance is likely to vary across sectors, timescales, and impact metrics.

87 **CONSTRAINING THE FUTURE THAT MATTER**

88 Recognizing these multiple sources of uncertainty has an important implication:
89 climate-risk assessment should not stop at describing average change, but should also

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

90 examine the plausibility and relevance of outcomes away from the MME. The
91 contribution of Bevacqua and colleagues is precisely to show that such outcomes can
92 be highly consequential even under moderate warming. This perspective points to
93 several priorities for future research. First, extreme outcomes identified within climate
94 ensembles should be subjected to careful process-based evaluation. Ensemble tails
95 should not be equated automatically with physically plausible futures. Some high-
96 impact outcomes may reflect credible process responses, whereas others may arise from
97 known model deficiencies or unrealistic regional teleconnections. Assessing
98 plausibility therefore requires process-based evaluation, including whether the
99 associated circulation changes, moisture transport, land–atmosphere feedbacks, or fire-
100 weather responses are dynamically and physically consistent with observations and
101 established mechanisms.⁴

102 Second, improving model performance remains fundamental. Differences in
103 climate sensitivity and in the treatment of clouds, convection, land–atmosphere
104 coupling, and hydrological processes can strongly affect projections of drought, heavy
105 rainfall, and wildfire-conducive weather. Better model fidelity, together with physically
106 grounded constraints, should therefore help refine the range of plausible future
107 hazards.⁴ Third, internal variability deserves more explicit attention rather than being
108 treated merely as residual noise. Even when it is not the leading source of spread for a
109 given sector, it can still modulate the timing, regional expression, and realized severity
110 of future extremes.^{2,3} This is particularly relevant for near-term regional planning,
111 where decadal circulation and ocean–atmosphere variability may amplify, delay, or

reorganize the forced response. For longer-term assessments, however, model structural uncertainty often becomes more important, because differences in climate sensitivity, circulation responses, convection, land–atmosphere coupling, and hydrological processes shape the spread of sectoral hazards such as drought, heavy precipitation, and fire-weather changes. Thus, adaptation planning should combine near-term regional storylines of internal variability with longer-term process-based evaluation of model credibility and high-impact ensemble tails. Although predictability remains limited and depends on the phenomenon considered, better characterization of internal variability would provide a more realistic picture of near- to medium-term risk. The goal is not to replace the MME, but to place it in a broader risk framework that combines the average forced response with physically grounded scrutiny of high-impact tails, improved model evaluation, and clearer characterization of internal variability. Such an approach would be particularly valuable in climate-risk hotspots, including densely populated urban areas, major crop-producing regions, ecologically fragile systems, and critical infrastructure corridors, where underestimating plausible extremes can carry outsized societal costs.⁵

IMPLICATIONS FOR RISK AND POLICY

This perspective also carries a clear message for climate policy. Warming thresholds such as 1.5°C and 2°C remain indispensable benchmarks, but they should not be interpreted as guarantees of proportionally moderate impacts. A 2°C world may still contain plausible futures in which drought, flood, and fire risks are comparable to, or even exceed, the average impacts associated with much warmer worlds. This

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

message should not be interpreted as weakening the case for mitigation. Although some high-impact outcomes at 2°C may exceed the ensemble-mean response at higher warming levels, further warming would still shift the overall distribution of hazards toward more severe outcomes and increase the likelihood of crossing critical impact thresholds. Attention to high-impact outcomes at moderate warming therefore reinforces the need for both rapid mitigation and robust adaptation⁵. Adaptation planning should therefore be informed not only by likely futures summarized by the MME, but also by credible high-impact tails within the same warming level. The broader lesson is straightforward. Hazard-based indicators of sectoral risk are not defined solely by where the MME lies. It is also shaped by what remains physically plausible within the ensemble spread, and by whether that spread can be better understood through process evaluation, improved model performance, and clearer characterization of internal variability. Bevacqua and colleagues offer an important warning against equating moderate warming with moderate risk. The next step is to translate that warning into climate assessments that move beyond average projections and are better able to inform decisions about the plausible extremes that matter most.

REFERENCES

1. Bevacqua E., Fischer E., Sillmann J., et al. (2026). Moderate global warming does not rule out extreme global climate outcomes. *Nature* **651**: 946–953. DOI: 10.1038/s41586-026-10237-9

2. Deser C., Lehner F., Rodgers K. B., et al. (2020). Insights from earth system model initial-condition large ensembles and future prospects. *Nat. Clim. Change* **10**: 277-

- 156 286. DOI: 10.1038/s41558-020-0731-2
- 157 3. Gong H., Wang L., Screen J. et al. (2025). Teleconnection from Arctic warming
158 suppresses long-term warming in central Eurasia. *Sci. Adv.* **11**: eadq9461. DOI:
159 10.1126/sciadv.adq9461
- 160 4. Williamson M. S., Thackeray C. W., Cox P. M. et al. (2021). Emergent constraints
161 on climate sensitivities. *Rev. Mod. Phys.* **93**: 025004. DOI:
162 10.1103/RevModPhys.93.025004
- 163 5. Intergovernmental Panel on Climate Change (IPCC). (2023). Key risks across
164 sectors and regions. *Climate Change 2022 – Impacts, adaptation and vulnerability:
165 Working group II contribution to the sixth assessment report of the
166 intergovernmental panel on climate change* pp:2411–2538. Cambridge University
167 Press. DOI: <https://doi.org/10.1017/9781009325844.025>

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

FUNDING AND ACKNOWLEDGMENT

This work was supported by the National Natural Science Foundation of China (42522508, 42275023), and the Chinese Academy of Sciences Project for Young Scientists in Basic Research (YSBR-137). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

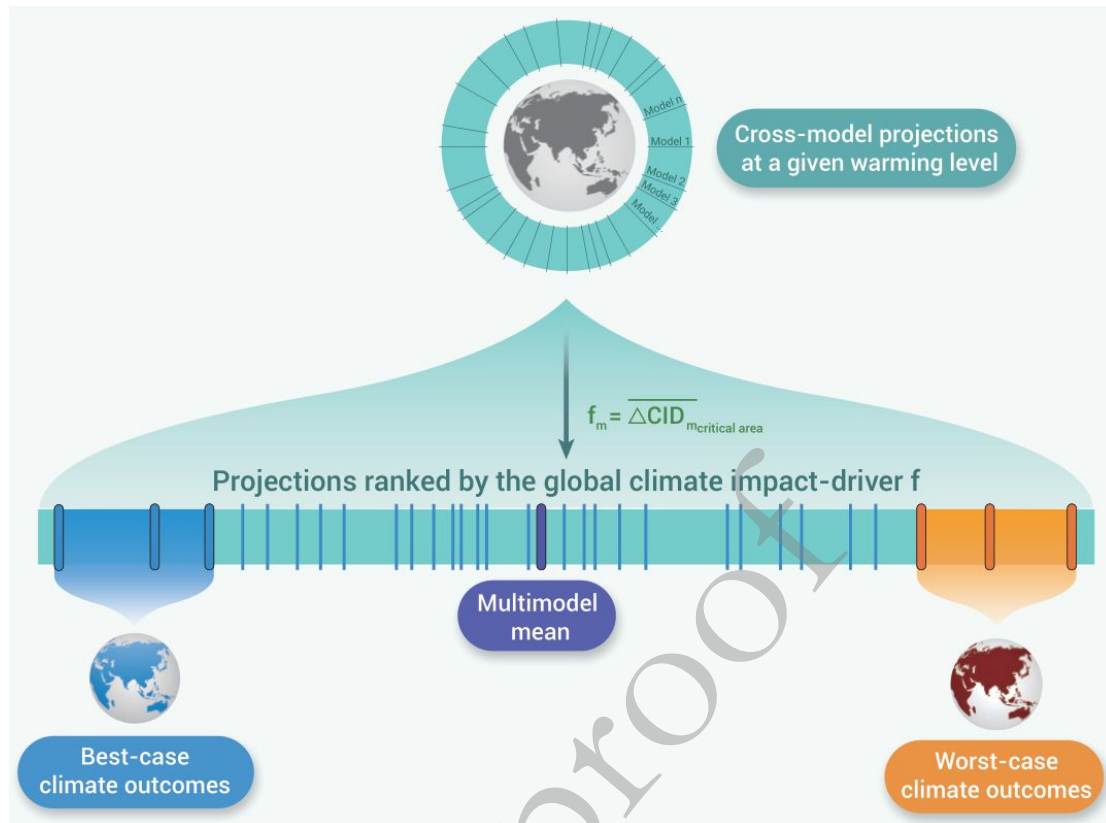
AUTHOR CONTRIBUTIONS

Hainan Gong: Writing-review & editing, Writing-original draft, Methodology, Funding, Investigation. Wentao Xia: Visualization, Software, Investigation. Lin Wang: Validation, Conceptualization, Writing-review & editing. Kangjie Ma: Visualization, Software, Investigation. Wen Chen: Validation, Conceptualization. All authors contributed to the manuscript and approved the final version.

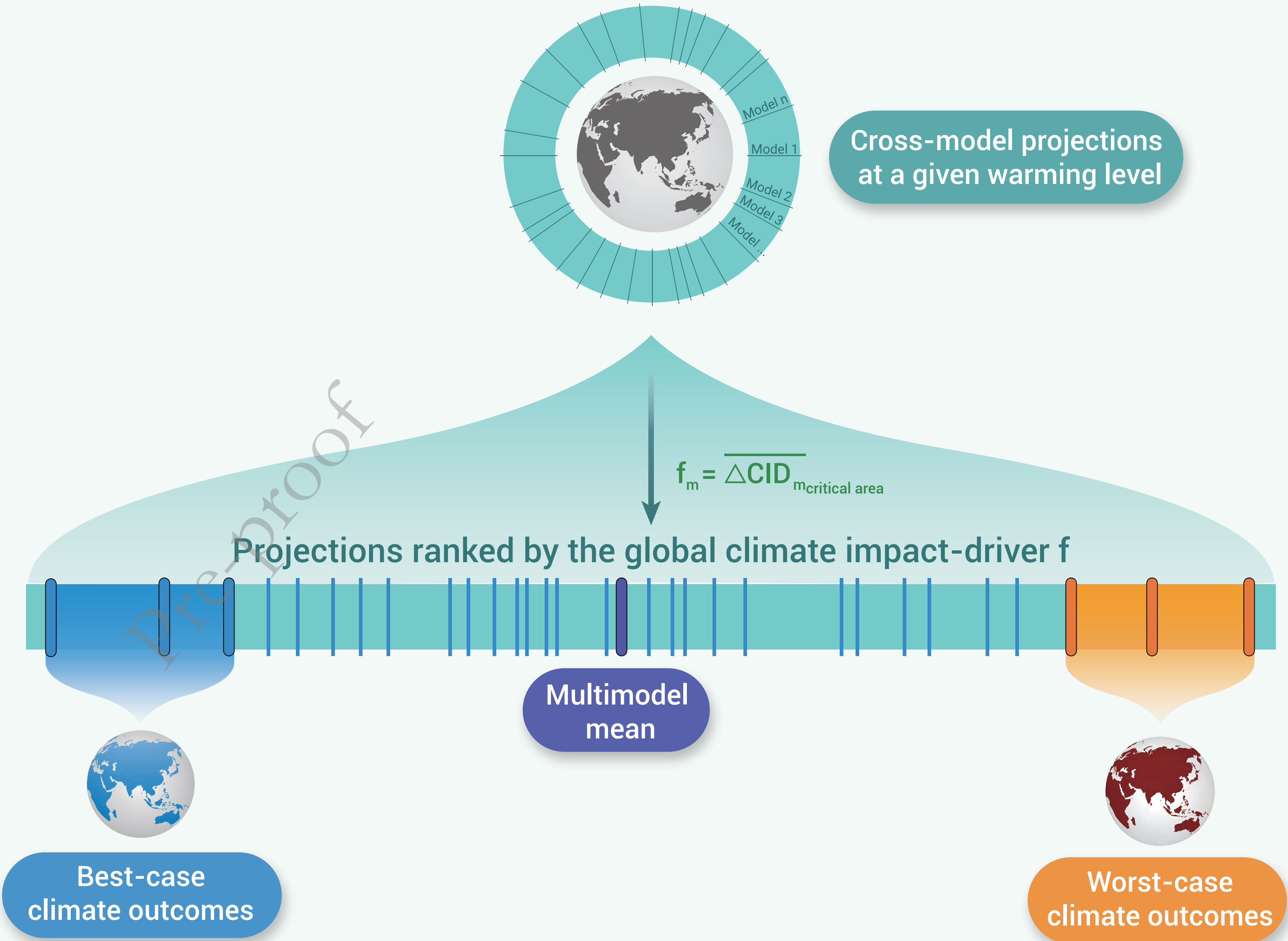
DECLARATION OF INTERESTS

The authors declare no conflicts of interest.

183 **Figure caption**



184
 185 **Figure. 1 Framework for identifying plausible extreme climate outcomes from**
 186 **multi-model projections** At a given warming level (2°C in *Bevacqua et al.*)¹, model
 187 projections are ranked according to a sector-specific global climatic impact-driver,
 188 calculated as the spatially averaged change in a relevant hazard across the critical region
 189 for that sector. This procedure enables the identification of plausible high- and low-
 190 impact futures within the model ensemble. For food security, for example, the metric
 191 may be based on projected drought changes across major breadbasket regions. Adapted
 192 from Fig. 1 in *Bevacqua et al.*¹ under the terms of the CC BY 4.0 license.



Dear Editor,

Thank you for your careful evaluation of our manuscript entitled “Beyond the multimodel ensemble mean (MME): assessing plausible climate risk at a given warming level” (Manuscript ID: TIG-2026-0094).

As no further comments were raised regarding the scientific content of the manuscript, no substantive changes to the text or analyses were required. Following the journal’s instructions, we have carefully revised the manuscript and associated files to ensure that they comply with the required formatting and final-file guidelines. We have also completed the Article Processing Charge payment as requested.

We sincerely appreciate the time and efforts of the editors and reviewers in handling our manuscript. We hope that the revised submission now meets all the journal’s requirements and look forward to the final evaluation.

Sincerely,

Hainan Gong

On behalf of all authors

Beyond the multimodel ensemble mean (MME): Assessing plausible climate risk at a given warming level

Hainan Gong^{1,2}, Wentao Xia^{1,5}, Lin Wang^{1,2*}, Kangjie Ma³, Wen Chen⁴

¹Key Laboratory of Earth System Numerical Modeling and Application, Institute of Atmospheric Physics, Chinese Academy of Sciences, Beijing 100029, China

²Collaborative Innovation Center on Forecast and Evaluation of Meteorological Disasters (CIC - FEMD), Nanjing University of Information Science & Technology, Nanjing 210044, China.

³College of Atmospheric Sciences, Lanzhou University, Lanzhou 730000, China.

⁴Yunnan International Joint Laboratory of Monsoon and Extreme Climate Disasters /Department of Atmospheric Sciences, Yunnan University, Kunming 650500, China

⁵College of Earth and Planetary Sciences, University of Chinese Academy of Sciences, Beijing 100049, China.

*Corresponding author: Prof. Lin Wang (wanglin@mail.iap.ac.cn)

The 2°C threshold enshrined in the Paris Agreement is widely viewed as a guardrail against the most dangerous consequences of climate change. Yet the risks associated with any given level of warming are still commonly framed through the multimodel ensemble mean (MME), which mainly summarizes the externally forced response shared across climate models. That benchmark is useful, but it is not sufficient. The climate that societies ultimately confront will be shaped not only by external

forcing, but also by differences in modelled process responses and by internal climate variability. Consequently, some of the most consequential future impacts may arise not from the ensemble average, but from plausible high-impact outcomes located in the tails of the distribution.

THE ILLUSION OF MODERATE RISK

A recent study by Bevacqua and colleagues brings this point into sharp relief.¹ Drawing on CMIP6 simulations, they show that even in a 2°C warmer world, some plausible climate outcomes can produce sectoral hazards that are more severe than the MME response at 3°C or even 4°C warming. Their analysis challenges a familiar assumption in climate communication: that the most extreme climate outcomes are chiefly a concern under very high warming. In reality, moderate warming does not necessarily translate into moderate risk. The significance of the study lies not merely in emphasizing model spread, but in demonstrating how that spread can be interpreted in a sector-relevant manner. Rather than focusing only on local extremes or broad global averages, the authors define sector-specific “global climatic impact-drivers” that connect each hazard to the regions where it matters most. In their framework, extreme five-day precipitation over densely populated areas serves as a proxy for flood risk, drought frequency across major breadbasket regions represents food-security risk, and fire weather over forests reflects threats to ecosystems and wildfire exposure (Figure 1). Models are then ranked according to these sector-relevant impact drivers, making it possible to identify plausible best- and worst-case outcomes at the same warming level.

These results have important implications. For drought across global breadbaskets,

the spread at 2°C is so large that several model outcomes exceed the MME response at 4°C. For extreme precipitation over populated regions and fire weather over forests, the worst-case outcomes at 2°C surpass the MME response at 3°C. Put differently, the upper tail of risk in a 2°C world can overlap with, or even exceed, the average risk expected in a substantially warmer world. For climate-sensitive sectors, this is not a minor statistical detail. It is a direct challenge to the way risk is assessed and adaptation is planned.

WHY THE MME IS NOT THE FUTURE CLIMATE

The MME remains a powerful benchmark for identifying robust forced responses and for reducing the influence of idiosyncratic biases in individual models. However, it should not be interpreted as the full risk space of future climate. It is a statistical summary of model responses, not the climate outcome that societies will necessarily experience. Future climate hazards relevant to risk emerges from the combined influence of external forcing, differences in model responses, and internal variability,^{2,3} all of which can shape regional hazards. This distinction is especially important for extreme events. Many societally disruptive extremes are not simply linear extensions of the forced mean state. Instead, they often depend on specific circulation regimes and oceanic background conditions. These ingredients are sensitive to both model formulation and internal variability, which can amplify, mute, or reorganize regional hazards across interannual to decadal timescales.³ A projection framework centered only on MME change may therefore underestimate the likelihood, intensity, or spatial coherence of future high-impact extremes.

At the same time, the study offers an important clarification regarding the sources of uncertainty. For the sectors emphasized by Bevacqua and colleagues, much of the spread at 2°C appears to stem from model differences rather than from internal variability alone. That point matters because it underscores the central importance of model performance and process representation for improving future risk assessments. Yet internal variability cannot be dismissed. It still contributes to the envelope of plausible outcomes and becomes particularly relevant when considering realized regional climate trajectories over the coming decades. The relative importance of these uncertainty sources also depends strongly on timescale. Internal variability is especially relevant for near- to medium-term projections (e.g., 2030–2050), because it can modulate the timing, regional expression, and realized severity of climate hazards. By contrast, over longer timescales, model structural uncertainty, including differences in climate sensitivity and process representation, generally becomes a larger contributor to the spread of projected sectoral hazards. This distinction reinforces the need to consider both sources of uncertainty, while recognizing that their relative roles vary with lead time, region, and impact metric. A balanced reading of the study is therefore that both model performance and internal variability matter, even though their relative importance is likely to vary across sectors, timescales, and impact metrics.

CONSTRAINING THE FUTURE THAT MATTER

Recognizing these multiple sources of uncertainty has an important implication: climate-risk assessment should not stop at describing average change, but should also examine the plausibility and relevance of outcomes away from the MME. The

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

90 contribution of Bevacqua and colleagues is precisely to show that such outcomes can
91 be highly consequential even under moderate warming. This perspective points to
92 several priorities for future research. First, extreme outcomes identified within climate
93 ensembles should be subjected to careful process-based evaluation. Ensemble tails
94 should not be equated automatically with physically plausible futures. Some high-
95 impact outcomes may reflect credible process responses, whereas others may arise from
96 known model deficiencies or unrealistic regional teleconnections. Assessing
97 plausibility therefore requires process-based evaluation, including whether the
98 associated circulation changes, moisture transport, land–atmosphere feedbacks, or fire-
99 weather responses are dynamically and physically consistent with observations and
100 established mechanisms.⁴

101 Second, improving model performance remains fundamental. Differences in
102 climate sensitivity and in the treatment of clouds, convection, land–atmosphere
103 coupling, and hydrological processes can strongly affect projections of drought, heavy
104 rainfall, and wildfire-conducive weather. Better model fidelity, together with physically
105 grounded constraints, should therefore help refine the range of plausible future
106 hazards.⁴ Third, internal variability deserves more explicit attention rather than being
107 treated merely as residual noise. Even when it is not the leading source of spread for a
108 given sector, it can still modulate the timing, regional expression, and realized severity
109 of future extremes.^{2,3} This is particularly relevant for near-term regional planning,
110 where decadal circulation and ocean–atmosphere variability may amplify, delay, or
111 reorganize the forced response. For longer-term assessments, however, model structural

uncertainty often becomes more important, because differences in climate sensitivity, circulation responses, convection, land–atmosphere coupling, and hydrological processes shape the spread of sectoral hazards such as drought, heavy precipitation, and fire-weather changes. Thus, adaptation planning should combine near-term regional storylines of internal variability with longer-term process-based evaluation of model credibility and high-impact ensemble tails. Although predictability remains limited and depends on the phenomenon considered, better characterization of internal variability would provide a more realistic picture of near- to medium-term risk. The goal is not to replace the MME, but to place it in a broader risk framework that combines the average forced response with physically grounded scrutiny of high-impact tails, improved model evaluation, and clearer characterization of internal variability. Such an approach would be particularly valuable in climate-risk hotspots, including densely populated urban areas, major crop-producing regions, ecologically fragile systems, and critical infrastructure corridors, where underestimating plausible extremes can carry outsized societal costs.⁵

IMPLICATIONS FOR RISK AND POLICY

This perspective also carries a clear message for climate policy. Warming thresholds such as 1.5°C and 2°C remain indispensable benchmarks, but they should not be interpreted as guarantees of proportionally moderate impacts. A 2°C world may still contain plausible futures in which drought, flood, and fire risks are comparable to, or even exceed, the average impacts associated with much warmer worlds. This message should not be interpreted as weakening the case for mitigation. Although some

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

high-impact outcomes at 2°C may exceed the ensemble-mean response at higher warming levels, further warming would still shift the overall distribution of hazards toward more severe outcomes and increase the likelihood of crossing critical impact thresholds. Attention to high-impact outcomes at moderate warming therefore reinforces the need for both rapid mitigation and robust adaptation⁵. Adaptation planning should therefore be informed not only by likely futures summarized by the MME, but also by credible high-impact tails within the same warming level. The broader lesson is straightforward. Hazard-based indicators of sectoral risk are not defined solely by where the MME lies. It is also shaped by what remains physically plausible within the ensemble spread, and by whether that spread can be better understood through process evaluation, improved model performance, and clearer characterization of internal variability. Bevacqua and colleagues offer an important warning against equating moderate warming with moderate risk. The next step is to translate that warning into climate assessments that move beyond average projections and are better able to inform decisions about the plausible extremes that matter most.

REFERENCES

1. Bevacqua E., Fischer E., Sillmann J., et al. (2026). Moderate global warming does not rule out extreme global climate outcomes. *Nature* **651**: 946–953. DOI: 10.1038/s41586-026-10237-9

2. Deser C., Lehner F., Rodgers K. B., et al. (2020). Insights from earth system model initial-condition large ensembles and future prospects. *Nat. Clim. Change* **10**: 277-286. DOI: 10.1038/s41558-020-0731-2

- 156 3. Gong H., Wang L., Screen J. et al. (2025). Teleconnection from Arctic warming
157 suppresses long-term warming in central Eurasia. *Sci. Adv.* **11**: eadq9461. DOI:
158 10.1126/sciadv.adq9461
- 159 4. Williamson M. S., Thackeray C. W., Cox P. M. et al. (2021). Emergent constraints
160 on climate sensitivities. *Rev. Mod. Phys.* **93**: 025004. DOI:
161 10.1103/RevModPhys.93.025004
- 162 5. Intergovernmental Panel on Climate Change (IPCC). (2023). Key risks across
163 sectors and regions. *Climate Change 2022 – Impacts, adaptation and vulnerability:*
164 *Working group II contribution to the sixth assessment report of the*
165 *intergovernmental panel on climate change* pp:2411–2538. Cambridge University
166 Press. DOI: <https://doi.org/10.1017/9781009325844.025>

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

FUNDING AND ACKNOWLEDGMENT

This work was supported by the National Natural Science Foundation of China (42522508, 42275023), and the Chinese Academy of Sciences Project for Young Scientists in Basic Research (YSBR-137). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

AUTHOR CONTRIBUTIONS

Hainan Gong: Writing-review & editing, Writing-original draft, Methodology, Funding, Investigation. Wentao Xia: Visualization, Software, Investigation. Lin Wang: Validation, Conceptualization, Writing-review & editing. Kangjie Ma: Visualization, Software, Investigation. Wen Chen: Validation, Conceptualization. All authors contributed to the manuscript and approved the final version.

DECLARATION OF INTERESTS

The authors declare no conflicts of interest.

182 **Figure caption**

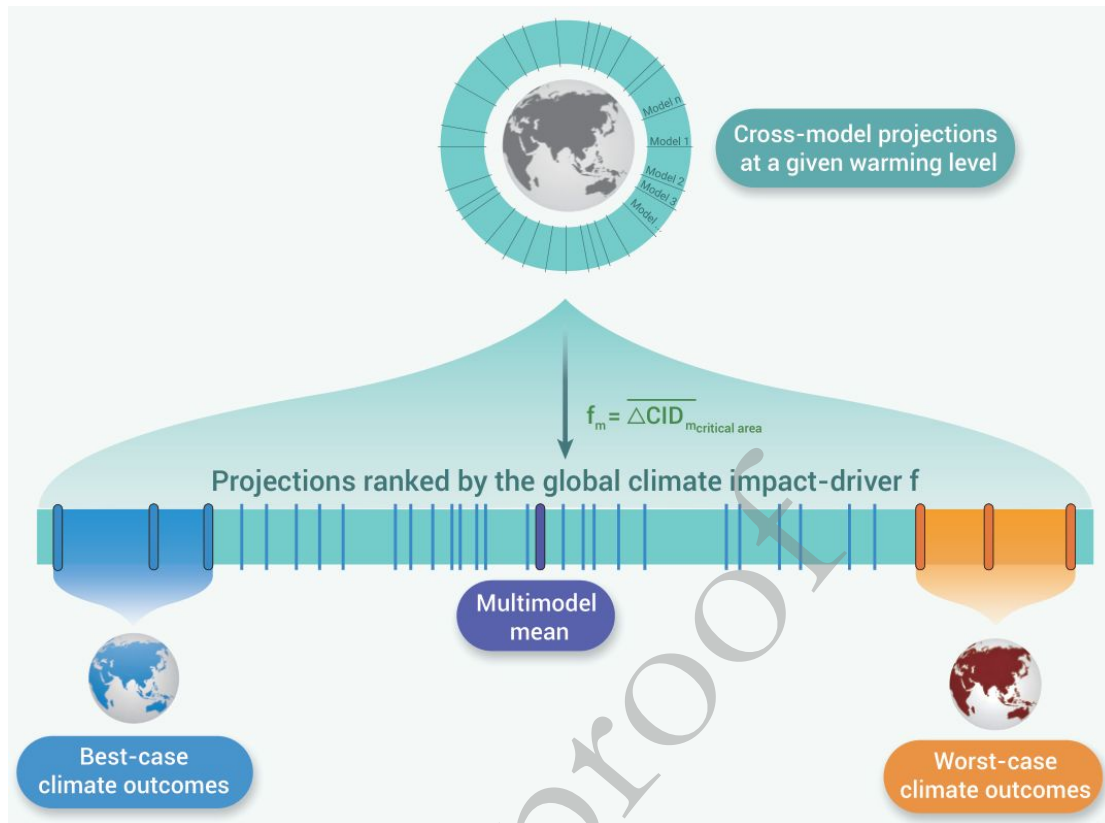


Figure. 1 Framework for identifying plausible extreme climate outcomes from multi-model projections At a given warming level (2°C in *Bevacqua et al.*)¹, model projections are ranked according to a sector-specific global climatic impact-driver, calculated as the spatially averaged change in a relevant hazard across the critical region for that sector. This procedure enables the identification of plausible high- and low-impact futures within the model ensemble. For food security, for example, the metric may be based on projected drought changes across major breadbasket regions. Adapted from Fig. 1 in *Bevacqua et al.*¹ under the terms of the CC BY 4.0 license.

Beyond the multimodel ensemble mean (MME): Assessing plausible climate risk at a given warming level

Hainan Gong^{1,2}, Wentao Xia^{1,5}, Lin Wang^{1,2*}, Kangjie Ma³, Wen Chen⁴

¹Key Laboratory of Earth System Numerical Modeling and Application, Institute of Atmospheric Physics, Chinese Academy of Sciences, Beijing 100029, China

²Collaborative Innovation Center on Forecast and Evaluation of Meteorological Disasters (CIC - FEMD), Nanjing University of Information Science & Technology, Nanjing 210044, China.

³College of Atmospheric Sciences, Lanzhou University, Lanzhou 730000, China.

⁴Yunnan International Joint Laboratory of Monsoon and Extreme Climate Disasters /Department of Atmospheric Sciences, Yunnan University, Kunming 650500, China

⁵College of Earth and Planetary Sciences, University of Chinese Academy of Sciences, Beijing 100049, China.

*Corresponding author: Prof. Lin Wang (wanglin@mail.iap.ac.cn)

The 2°C threshold enshrined in the Paris Agreement is widely viewed as a guardrail against the most dangerous consequences of climate change. Yet the risks associated with any given level of warming are still commonly framed through the multimodel ensemble mean (MME), which mainly summarizes the externally forced response shared across climate models. That benchmark is useful, but it is not sufficient. The climate that societies ultimately confront will be shaped not only by external

forcing, but also by differences in modelled process responses and by internal climate variability. Consequently, some of the most consequential future impacts may arise not from the ensemble average, but from plausible high-impact outcomes located in the tails of the distribution.

THE ILLUSION OF MODERATE RISK

A recent study by Bevacqua and colleagues brings this point into sharp relief.¹ Drawing on CMIP6 simulations, they show that even in a 2°C warmer world, some plausible climate outcomes can produce sectoral hazards that are more severe than the MME response at 3°C or even 4°C warming. Their analysis challenges a familiar assumption in climate communication: that the most extreme climate outcomes are chiefly a concern under very high warming. In reality, moderate warming does not necessarily translate into moderate risk. The significance of the study lies not merely in emphasizing model spread, but in demonstrating how that spread can be interpreted in a sector-relevant manner. Rather than focusing only on local extremes or broad global averages, the authors define sector-specific “global climatic impact-drivers” that connect each hazard to the regions where it matters most. In their framework, extreme five-day precipitation over densely populated areas serves as a proxy for flood risk, drought frequency across major breadbasket regions represents food-security risk, and fire weather over forests reflects threats to ecosystems and wildfire exposure (Figure 1). Models are then ranked according to these sector-relevant impact drivers, making it possible to identify plausible best- and worst-case outcomes at the same warming level.

These results have important implications. For drought across global breadbaskets,

the spread at 2°C is so large that several model outcomes exceed the MME response at 4°C. For extreme precipitation over populated regions and fire weather over forests, the worst-case outcomes at 2°C surpass the MME response at 3°C. Put differently, the upper tail of risk in a 2°C world can overlap with, or even exceed, the average risk expected in a substantially warmer world. For climate-sensitive sectors, this is not a minor statistical detail. It is a direct challenge to the way risk is assessed and adaptation is planned.

WHY THE MME IS NOT THE FUTURE CLIMATE

The MME remains a powerful benchmark for identifying robust forced responses and for reducing the influence of idiosyncratic biases in individual models. However, it should not be interpreted as the full risk space of future climate. It is a statistical summary of model responses, not the climate outcome that societies will necessarily experience. Future climate hazards relevant to risk emerges from the combined influence of external forcing, differences in model responses, and internal variability,^{2,3} all of which can shape regional hazards. This distinction is especially important for extreme events. Many societally disruptive extremes are not simply linear extensions of the forced mean state. Instead, they often depend on specific circulation regimes and oceanic background conditions. These ingredients are sensitive to both model formulation and internal variability, which can amplify, mute, or reorganize regional hazards across interannual to decadal timescales.³ A projection framework centered only on MME change may therefore underestimate the likelihood, intensity, or spatial coherence of future high-impact extremes.

At the same time, the study offers an important clarification regarding the sources of uncertainty. For the sectors emphasized by Bevacqua and colleagues, much of the spread at 2°C appears to stem from model differences rather than from internal variability alone. That point matters because it underscores the central importance of model performance and process representation for improving future risk assessments. Yet internal variability cannot be dismissed. It still contributes to the envelope of plausible outcomes and becomes particularly relevant when considering realized regional climate trajectories over the coming decades. The relative importance of these uncertainty sources also depends strongly on timescale. Internal variability is especially relevant for near- to medium-term projections (e.g., 2030–2050), because it can modulate the timing, regional expression, and realized severity of climate hazards. By contrast, over longer timescales, model structural uncertainty, including differences in climate sensitivity and process representation, generally becomes a larger contributor to the spread of projected sectoral hazards. This distinction reinforces the need to consider both sources of uncertainty, while recognizing that their relative roles vary with lead time, region, and impact metric. A balanced reading of the study is therefore that both model performance and internal variability matter, even though their relative importance is likely to vary across sectors, timescales, and impact metrics.

CONSTRAINING THE FUTURE THAT MATTER

Recognizing these multiple sources of uncertainty has an important implication: climate-risk assessment should not stop at describing average change, but should also examine the plausibility and relevance of outcomes away from the MME. The

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

90 contribution of Bevacqua and colleagues is precisely to show that such outcomes can
91 be highly consequential even under moderate warming. This perspective points to
92 several priorities for future research. First, extreme outcomes identified within climate
93 ensembles should be subjected to careful process-based evaluation. Ensemble tails
94 should not be equated automatically with physically plausible futures. Some high-
95 impact outcomes may reflect credible process responses, whereas others may arise from
96 known model deficiencies or unrealistic regional teleconnections. Assessing
97 plausibility therefore requires process-based evaluation, including whether the
98 associated circulation changes, moisture transport, land–atmosphere feedbacks, or fire-
99 weather responses are dynamically and physically consistent with observations and
100 established mechanisms.⁴

101 Second, improving model performance remains fundamental. Differences in
102 climate sensitivity and in the treatment of clouds, convection, land–atmosphere
103 coupling, and hydrological processes can strongly affect projections of drought, heavy
104 rainfall, and wildfire-conducive weather. Better model fidelity, together with physically
105 grounded constraints, should therefore help refine the range of plausible future
106 hazards.⁴ Third, internal variability deserves more explicit attention rather than being
107 treated merely as residual noise. Even when it is not the leading source of spread for a
108 given sector, it can still modulate the timing, regional expression, and realized severity
109 of future extremes.^{2,3} This is particularly relevant for near-term regional planning,
110 where decadal circulation and ocean–atmosphere variability may amplify, delay, or
111 reorganize the forced response. For longer-term assessments, however, model structural

uncertainty often becomes more important, because differences in climate sensitivity, circulation responses, convection, land–atmosphere coupling, and hydrological processes shape the spread of sectoral hazards such as drought, heavy precipitation, and fire-weather changes. Thus, adaptation planning should combine near-term regional storylines of internal variability with longer-term process-based evaluation of model credibility and high-impact ensemble tails. Although predictability remains limited and depends on the phenomenon considered, better characterization of internal variability would provide a more realistic picture of near- to medium-term risk. The goal is not to replace the MME, but to place it in a broader risk framework that combines the average forced response with physically grounded scrutiny of high-impact tails, improved model evaluation, and clearer characterization of internal variability. Such an approach would be particularly valuable in climate-risk hotspots, including densely populated urban areas, major crop-producing regions, ecologically fragile systems, and critical infrastructure corridors, where underestimating plausible extremes can carry outsized societal costs.⁵

IMPLICATIONS FOR RISK AND POLICY

This perspective also carries a clear message for climate policy. Warming thresholds such as 1.5°C and 2°C remain indispensable benchmarks, but they should not be interpreted as guarantees of proportionally moderate impacts. A 2°C world may still contain plausible futures in which drought, flood, and fire risks are comparable to, or even exceed, the average impacts associated with much warmer worlds. This message should not be interpreted as weakening the case for mitigation. Although some

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

high-impact outcomes at 2°C may exceed the ensemble-mean response at higher warming levels, further warming would still shift the overall distribution of hazards toward more severe outcomes and increase the likelihood of crossing critical impact thresholds. Attention to high-impact outcomes at moderate warming therefore reinforces the need for both rapid mitigation and robust adaptation⁵. Adaptation planning should therefore be informed not only by likely futures summarized by the MME, but also by credible high-impact tails within the same warming level. The broader lesson is straightforward. Hazard-based indicators of sectoral risk are not defined solely by where the MME lies. It is also shaped by what remains physically plausible within the ensemble spread, and by whether that spread can be better understood through process evaluation, improved model performance, and clearer characterization of internal variability. Bevacqua and colleagues offer an important warning against equating moderate warming with moderate risk. The next step is to translate that warning into climate assessments that move beyond average projections and are better able to inform decisions about the plausible extremes that matter most.

REFERENCES

1. Bevacqua E., Fischer E., Sillmann J., et al. (2026). Moderate global warming does not rule out extreme global climate outcomes. *Nature* **651**: 946–953. DOI: 10.1038/s41586-026-10237-9

2. Deser C., Lehner F., Rodgers K. B., et al. (2020). Insights from earth system model initial-condition large ensembles and future prospects. *Nat. Clim. Change* **10**: 277-286. DOI: 10.1038/s41558-020-0731-2

- 156 3. Gong H., Wang L., Screen J. et al. (2025). Teleconnection from Arctic warming
157 suppresses long-term warming in central Eurasia. *Sci. Adv.* **11**: eadq9461. DOI:
158 10.1126/sciadv.adq9461
- 159 4. Williamson M. S., Thackeray C. W., Cox P. M. et al. (2021). Emergent constraints
160 on climate sensitivities. *Rev. Mod. Phys.* **93**: 025004. DOI:
161 10.1103/RevModPhys.93.025004
- 162 5. Intergovernmental Panel on Climate Change (IPCC). (2023). Key risks across
163 sectors and regions. *Climate Change 2022 – Impacts, adaptation and vulnerability:*
164 *Working group II contribution to the sixth assessment report of the*
165 *intergovernmental panel on climate change* pp:2411–2538. Cambridge University
166 Press. DOI: <https://doi.org/10.1017/9781009325844.025>

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60

FUNDING AND ACKNOWLEDGMENT

This work was supported by the National Natural Science Foundation of China (42522508, 42275023), and the Chinese Academy of Sciences Project for Young Scientists in Basic Research (YSBR-137). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

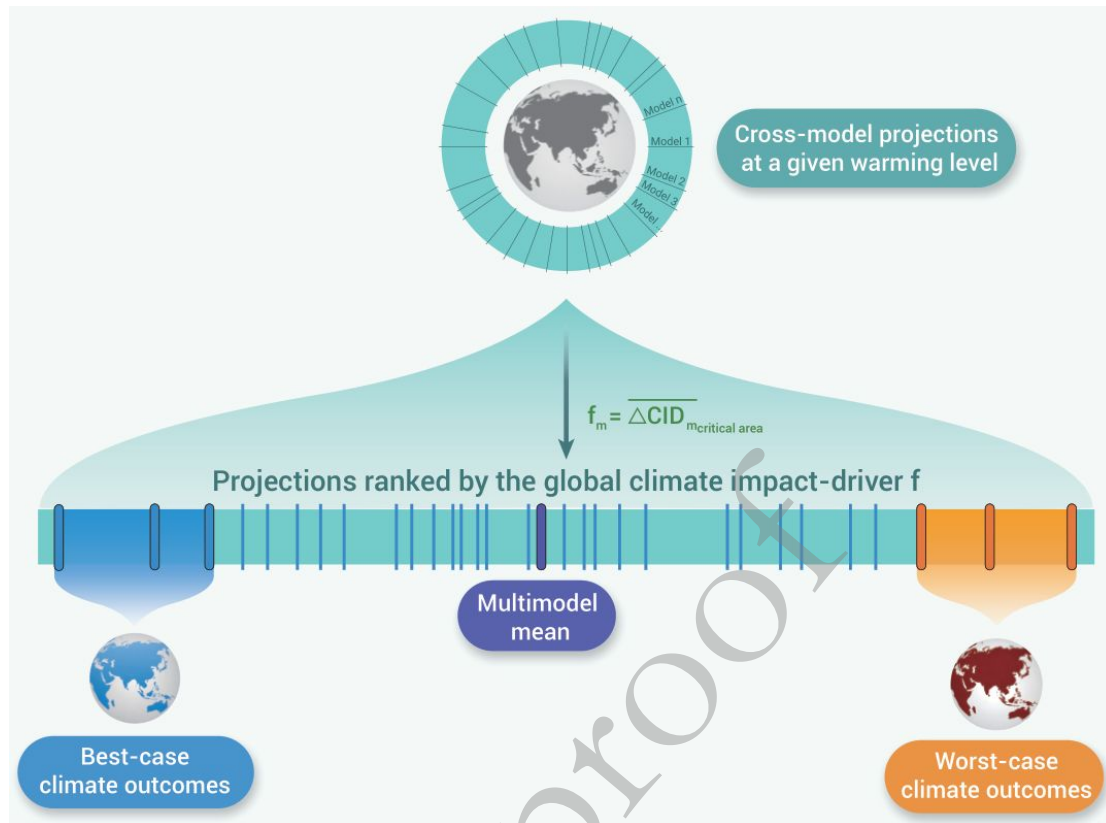
AUTHOR CONTRIBUTIONS

Hainan Gong: Writing-review & editing, Writing-original draft, Methodology, Funding, Investigation. Wentao Xia: Visualization, Software, Investigation. Lin Wang: Validation, Conceptualization, Writing-review & editing. Kangjie Ma: Visualization, Software, Investigation. Wen Chen: Validation, Conceptualization. All authors contributed to the manuscript and approved the final version.

DECLARATION OF INTERESTS

The authors declare no conflicts of interest.

182 **Figure caption**



184 **Figure. 1 Framework for identifying plausible extreme climate outcomes from**
 185 **multi-model projections** At a given warming level (2°C in *Bevacqua et al.*)¹, model
 186 projections are ranked according to a sector-specific global climatic impact-driver,
 187 calculated as the spatially averaged change in a relevant hazard across the critical region
 188 for that sector. This procedure enables the identification of plausible high- and low-
 189 impact futures within the model ensemble. For food security, for example, the metric
 190 may be based on projected drought changes across major breadbasket regions. Adapted
 191 from Fig. 1 in *Bevacqua et al.*¹ under the terms of the CC BY 4.0 license.