The impact of human-induced climate change on future tornado intensity as revealed through multi-scale modeling

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Abstract

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1	The impact of human-induced climate change on future tornado intensity as revealed
2	through multi-scale modeling
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13	Key Points:
14	• The effects of climate change on tornado intensity have been unclear.
15	• A novel, multi-modeling approach is used to address such effects.
16 17	• The intensity of cool-season tornadoes would appear to be most susceptible.

18 Abstract

A novel, multi-scale climate modeling approach is used to show the potential for increases in 19 future tornado intensity due to anthropogenic climate change. Historical warm- and cool-season 20 (WARM and COOL) tornado events are virtually placed in a globally warmed future via the 21 "pseudo-global warming" method. As hypothesized based on meteorological arguments, the 22 23 tornadic-storm and associated vortex of the COOL event experiences consistent and robust increases in intensity, and size in an ensemble of imposed climate-change experiments. The 24 tornadic-storm and associated vortex of the WARM event experiences increases in intensity in 25 some of the experiments, but the response is neither consistent nor robust, and is overall weaker 26 than in the COOL event. An examination of environmental parameters provides further support 27 of the disproportionately stronger response in the cool-season event. These results have 28 29 implications on future tornadoes forming outside of climatologically favored seasons.

30

31 **1 Introduction**

Hazardous convective weather (HCW) in the form of damaging winds, hail, and tornadoes poses a serious threat to life and property in the United States. From 2012 to 2022, 99 HCW events each produced over \$1 billion (inflation-adjusted) in damages (NOAA, 2022). The frequency of these billion-dollar events has increased markedly since the start of the 21st century, owing in part to increased exposure and population density (Strader et al., 2017), but also potentially to anthropogenic climate change (ACC).

HCW depends on the 3D characteristics of environmental temperature, humidity, and 38 wind, which appear to have changed over the last few decades (Gensini & Brooks, 2018; Tang et 39 al. 2019; Taszarek et al., 2021) and are projected to change further by the late 21st century under 40 ACC. For example, as shown by Trapp et al. (2007), warming and humidification of lower-41 tropospheric air yields increases in convective available potential energy (CAPE), which leads to 42 increases in the potential intensity of convective-storm updrafts. Conversely, relatively more 43 44 warming at high latitudes weakens the meridional temperature gradient and thus weakens the vertical shear of the horizontal wind (hereinafter, VWS) per the thermal wind relation (e.g., Trapp 45 et al. 2007); this suggests a reduction in the tendency for convective updrafts to develop significant, 46

long-lived rotational cores. General circulation model (GCM) and regional climate model (RCM) 47 simulations reveal decreases in VWS that are disproportionately smaller than increases in CAPE, 48 indicating an increase in frequency and/or intensity of future HCW events under ACC in the United 49 States (e.g., Trapp et al., 2007; Del Genio et al., 2007; Trapp et al., 2009; Diffenbaugh et al., 2013; 50 Gensini et al., 2014; Seeley & Romps, 2015; Hoogewind et al., 2017). Of relevance herein is the 51 52 seasonal non-uniformity to this increase: Boreal winter tends to exhibit the largest relative increase in the CAPE–VWS covariate (Diffenbaugh et al., 2013). This is consistent with historical trends 53 of environmental parameters computed using reanalysis data (Gensini & Brooks, 2018). 54

Precisely how these conclusions relate to tornado intensity, and thus address the very basic 55 question of whether the environmental conditions due to 21st century ACC will contribute to more 56 intense tornadoes, is unclear. This is partly because relationships between observed tornado 57 intensity and environmental parameters such as CAPE and VWS are ambiguous. For example, 58 although nonzero CAPE is considered a necessary condition for, and thus critically relevant to 59 tornadic-storm formation, CAPE alone does not correlate well with observed tornado intensity 60 (Thompson et al., 2012). As supported by our analyses in section 3.3, a possible link could be 61 made using multivariate environmental parameters such as the significant tornado parameter 62 63 (STP), which appears to better discriminate environments of significant tornadoes from those of nonsignificant tornadoes (Thompson et al., 2012), although still not perfectly. However, an 64 environment-only argument has a critical limitation, namely, that realization of a significant 65 66 tornado is conditional on tornadic-storm initiation, which STP does not unambiguously predict. Indeed, the mean frequency of storms that initiate given a supportive environment is non-uniform 67 in time and space, and even appears to change under late 21st century ACC (Hoogewind et al., 68 69 2017).

Explicit climate modeling of tornadoes is an alternative to the use of environmental 70 parameters and removes the storm-initiation limitation. Although such an approach has been 71 computationally prohibitive because of the small-scale of tornadoes (~ 100 m to 1 km), multi-scale 72 modeling now offers a tractable solution. Herein we follow Trapp & Hoogewind (2016) and 73 employ the pseudo global warming (PGW) method (Schär et al., 1996; Frei et al., 1998; Kimura 74 75 and Kitoh, 2007; Sato et al., 2007) using a novel, multi-scale, multi-model approach. Briefly, the PGW method involves a comparison of simulations of events under their true 4D environment (the 76 control; CTRL) with those under a 4D environment modified by a climate-change perturbation 77 representative of mean atmospheric conditions over future (here, late 21st century) and historical 78 (here, late 20th century) time slices. Thus, this method allows for an isolation of the response of 79 an event to an imposed environment of the future. Because event-level PGW applications (see 80 Trapp et al., 2021) involve relatively short time integrations, they also allow for the use of higher 81 resolution and multiple realizations. 82

Two archetypal yet regionally and seasonally contrasting events are considered. The first is the 10 February 2013 (hereinafter, COOL) event that includes the EF-4 tornado in Hattiesburg, Mississippi, and the second is the 20 May 2013 (hereinafter, WARM) event that includes the EF-5 tornado in Moore, Oklahoma. Together, these tornadoes were responsible for 24 fatalities, more than 300 injuries, and approximately \$2 billion in damage (NOAA, 2013). Our working hypothesis is that the WARM event will exhibit relatively less intensity changes under PGW than the COOL event.

Analyses of these event simulations provide the initial means to address this hypothesis. However, the spatio-temporal representations of the tornadic storms, and even the total numbers of storms, are different between the PGW and CTRL simulations (see Fig. 1). This implied lack of a clear CTRL-to-PGW comparison of *specific* tornadic storms means that a quantitative evaluation of the climate change effect on the intensity of *specific* tornadoes is tenuous. Accordingly, we introduce an additional step wherein an idealized numerical model is integrated using initial and boundary conditions (ic/bc) drawn from the regional-model simulations. The relatively reduced complexity and higher spatial resolutions afforded by this idealized-modeling implementation of the PGW methodology helps further isolate the climate change response on a single storm, and allows for explicit diagnoses of tornado intensity.

- 100 **2 Materials and Methods**
- 101 2.1 PGW

The PGW method involves simulations of some event wherein its actual, present-day 102 forcing is modified through the addition of a climate-change perturbation or "delta", which is the 103 104 difference between mean conditions over future and historical time slices during a relevant month. Separate sets of deltas are constructed using historical and Representative Concentration Pathway 105 8.5 simulations from each of five GCMs (GFDL-CM3, MIROC5, NCAR-CCSM4, IPSL-CM5A-106 LR, and NorESM-1M). The GCM data originate from the Coupled Model Intercomparison Project 107 phase 5 (Taylor et al., 2012), and provide a range of convective-storm environments over historical 108 and future time periods (e.g., see Diffenbaugh et al., 2013; Seeley & Romps, 2015). 109

Three different formulations of the climate-change deltas (see Trapp et al., 2021), computed using five different GCMs, provide an ensemble of 15 simulations plus an additional composite-delta simulation to assess the PGW response of each event. Because these 16 different deltas explicitly represent a range in the climate-change signal, we argue that their use toward generation of an ensemble is more relevant than other approaches. Specifically, and importantly, 115 we are interested in the model response to the imposed future climate change and associated ic/bc
116 rather than in the model response to variations in parameterization schemes, etc.

117

118 2.2 Regional model configuration

119 The CTRL and PGW simulations of the WARM and COOL events are performed using

version 4.0 of the Weather Research and Forecasting model (WRF) (Skamarock et al., 2008).

121 The parent computational domains have horizontal grid spacings of 3 km. Subdomains of 1-km

122 grid spacing are nested within the parent domains over central Oklahoma and central Mississippi,

respectively (Fig. S1). The results reported in section 3.1 are based on analyses over the nesteddomains.

The simulations are initialized at 12 UTC for both events. This allows for more than six 125 hours of "spin-up" time prior to the observed EF-5 Moore (~2000 UTC) and EF-4 Hattiesburg 126 (~2300 UTC) tornadoes, which is typical for weather-event simulations with WRF (Skamarock, 127 2004). Initial and boundary conditions are derived from the North American Mesoscale Forecast 128 System analysis. Additional details regarding the WRF configuration can be found in Trapp et al. 129 (2021). Decisions on the configuration and on the ultimate veracity of the CTRL simulations 130 131 were established by comparing model output from configuration-sensitivity experiments to observed radar characteristics and tornado reports, as described in Woods (2021). 132 133 Tornadoes are not resolved on model grids with 1-km spacings. However, as 134 demonstrated in the Supplement, their signatures and potential intensity can be inferred using vertical vorticity (VV) computed at 80 m AGL, which is approximately the height of the first 135 level above the lower boundary of the model. A VV value locally exceeding 7.5×10^{-3} s⁻¹, which 136

137 is the 99th percentile of gridpoint values in the CTRL simulation, serves as a tornado proxy

138	occurrence. A VV value exceeding 1.25×10^{-2} s ⁻¹ , which is the 99.9th percentile, serves as a
139	significant tornado proxy occurrence. Coexistence of local updraft velocities exceeding 5 m s ⁻¹ is
140	also required, to ensure that the VV is associated with a convective updraft. Differentiating
141	tornado intensity based on VV is justified in the Supplement through an analyses of a vortex
142	model, and also follows from Doppler radar-based studies by Toth et al. (2012) and others.
143	
144	2.3 Idealized model configuration
145	The idealized simulations are performed using Cloud Model 1 (CM1) (Bryan & Fritsch,
146	2002). Grid stretching is employed such that the horizontal grid spacing is 64 m over the inner 80
147	x 80 km of the 180 x 180 x 18.5 km model domain, and then increased to 2.5 km at the domain
148	edges. Vertical grid spacing varies from 20 m in the lowest model levels to 250 m in the upper
149	levels. Additional details regarding the CM1 model configuration can be found in Woods
150	(2021). Note that the actual tornadoes that occurred on 20 May 2013 and 10 February 2013 had
151	damage widths of 1600 m and 1200 m, respectively. Even if the core diameters of maximum
152	winds of these tornadoes were 50% of these widths, the cores would still be represented by ~ 10
153	grid points. So, although our simulations do not have grid spacings appropriate to resolve fine-
154	scale structures of the tornadoes, the simulations are certainly sufficient to represent core widths
155	and windspeeds, which is one goal of these simulations.
156	The initial and boundary conditions are drawn from the WRF output of the CTRL and
157	PGW simulations. Specifically, 60 x 60 km horizontal averages centered about the WRF grid

- 158 point nearest to Moore, Oklahoma and Hattiesburg, Mississippi are used to obtain vertical
- profiles at 20 UTC 20 May 2013 and 23 UTC 10 February, respectively, which represent the pre-
- 160 tornadic conditions during these two events. A single deep convective storm is initiated within

161 these environments via updraft nudging (Naylor & Gilmore, 2012) that persisted for 20 minutes.

162 Our analysis of the subsequent tornadic circulations begins at 30 min, i.e., 10 min after the

163 cessation of the nudging.

Tornadic-like vortices (TLVs) are identified by examining near-surface fields of 164 windspeed, VV, and the Obuko-Weiss (OW) parameter. Adapting the approaches of Sherburn & 165 166 Parker (2019), Gray & Frame (2021), and others, TLV identification requires VV, windspeed, and OW to exceed 0.1 s⁻¹, 30 m s⁻¹, and 0.03 s⁻², respectively, and be collocated with low-level 167 updraft speeds exceeding 5 m s⁻¹. Upon locating the strongest TLV, maximum and minimum of 168 x-direction and y-direction wind components are found within 500 m of the vortex center. The 169 170 locations of these maxima and minima are used to determine an average radius (r) of maximum winds (V). 171

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176 **Figure 1.** Locations of tornado proxies (magenta dots) for the regional-modeling simulations of

the WARM event during the hour ending 2100 UTC (upper panels), and COOL event during the

hour ending 2230 UTC (lower panels). The size of the dots correspond nonlinearly to the VV

associated with the proxy. The subpanels indicate the individual experiments composing theensemble.

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Figure 2. Box-and-whisker plots of tornadic-storm intensity metrics, as evaluated from the regional modeling simulations of the WARM event (left) and COOL event (right). Values of these metrics are given as percentage changes in the PGW simulations relative to the CTRL simulation. The median is the orange line, mean is the green triangle, and individual data points are the black circles.

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190 **3 Results**

191 3.1 Regional-modeling perspective

192 An ensemble of 16 simulations is used to assess the PGW response of each event. The

193 ensemble members represent a range of possible future realizations of the event. Herein, if 75%

194 of the ensemble members exhibit the same sign in the percentage change (PGW relative to

- 195 CTRL) in a given metric, we consider the PGW response for that metric to be *consistent*. If we
- 196 equate the signal in the metric to the mean value across the ensemble, and the noise to the

standard deviation, the response in this metric is considered to be *robust* (*highly robust*) if the 197 PGW signal-to-noise ratio in a given metric exceeds one (two) (e.g., Diffenbaugh et al., 2013). 198 We begin with two metrics that provide information on overall storm intensity. The first 199 is the cumulative gridpoint exceedance of 55 dBZ simulated radar reflectivity (Figs. S2 and S3). 200 This metric quantifies the total area of intense convective storms over a given simulation. A 201 202 consistent, robust response is shown in this metric, as represented by a mean percentage increase of +110% (PGW exceedances relative to those in the CTRL) (Fig. S3). Thus, the PGW-modified 203 conditions resulted in relatively more extensive and intense convective storms in association with 204 the WARM event. 205 Cumulative gridpoint exceedances of simulated updraft speed confirm this increase in the 206 extent of intense convective storms under PGW (Figs. S3 and S4); a consistent, robust response 207 is represented by a mean percentage increase of +40%. The *peak* updraft speeds are 208 comparatively stronger in only half of the PGW simulations, with a mean percentage increase of 209 +1% (Fig. 2). These results indicate that intense convective updrafts in a late 21st century 210 realization of the WARM event would be more numerous or larger, but not always stronger. 211 The PGW response in occurrences of our tornado proxy is consistent albeit not robust, 212 213 with a mean percentage increase of 8% (Fig. 2). The mean response occurrences of our significant tornado proxy is neither consistent nor robust, with a mean percentage decrease of -214 11% (Fig. 2). Finally, the peak VV per PGW simulation, which provides some information about 215 216 the *potential* tornado intensity, is also neither consistent nor robust, with a mean percentage increase of 5% (and median percentage decrease of -5%) (Fig. 2). Thus, the regional modeling 217 suggests relatively more but not necessarily stronger tornadic circulations in a late 21st century 218 219 realization the WARM event, albeit with large uncertainty (see also Fig. 1).

220	Like the WARM event, the COOL event under PGW also tends to be characterized by
221	more intense convective storms. Specifically, cumulative gridpoint exceedances of simulated
222	reflectivity of 55 dBZ are greater in all but one of the PGW simulations, thus contributing to an
223	average percentage increase of +125%, and a consistent and robust response in this metric (Figs.
224	S2 and S3). The other metric for overall storm intensity, cumulative gridpoint exceedances of
225	updraft speed of 25 m s ⁻¹ , is consistent but not robust; notably, the average percentage increase in
226	such strong updraft occurrence in the COOL event is +712%, as compared to the +40% increase
227	associated with the WARM event (see Figs. S2 and S3). All PGW simulations had peak updraft
228	speeds exceeding the 31 m s ⁻¹ peak of the CTRL (Fig. 2), thus implying a consistent and robust
229	response. Moreover, half of the PGW simulations had peak updrafts exceeding 50 m s ⁻¹ , which
230	historically are speeds more readily supportive in warm-season, Great Plains environments than
231	in cool-season, southeast U.S. environments. These results indicate that intense convective
232	updrafts in a late 21st century realization of the COOL event would be more numerous and
233	stronger.
224	Occurrences of the terredo prove on substantially greater under DCW in many of the

Occurrences of the tornado proxy are substantially greater under PGW in many of the simulations, leading to a mean percentage increase relative to CTRL of +211% (Fig. 2). Occurrences of the significant tornado proxy are also substantially greater, with a mean percentage increase of +3244%, in this consistent and robust response (Fig. 2). Finally, a consistent and robust response is indicated in the peak VV per PGW simulation, and thus potential tornado intensity, with an average percentage increase of +121% (Fig. 2). Collectively, these results suggest that tornadic circulations in a late 21st century

realization of the COOL event would be more numerous and stronger. In agreement with our
hypothesis, the magnitude of the response of this archetypal cool-season event to PGW is much

larger than that of the archetypal warm-season event; this finding is also in agreement with 243 Bercos-Hickey et al. (2021). There is still ambiguity, however, in precisely how the analyzed 244 response relates to tornado intensity, given both the model grid resolution and the nature of the 245 tornado proxy. Thus, we now use the TLV-resolving idealized PGW simulations to compute 246 explicit measures of tornado intensity, and thus help clarify the regional-model results. 247 248



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3.2 Idealized modeling perspective

The idealized PGW simulations have steady, horizontally homogeneous initial and 254

boundary conditions that were drawn from the regional-model simulations of the WARM and 255

COOL events (Figs. S5-S6). The much finer grid spacings (64 m) allow for explicit 256

quantifications of TLVs that form within the simulated storms. For this we use tornado power, 257

which accounts for the tornadic wind speed as well as the width and length of the tornado track.

As adapted from Fricker et al. (2014), instantaneous tornado power can be calculated as

$$P = \pi r^2 \rho V^3 \tag{1}$$

where *r* represents the average radius of maximum winds, ρ is the air density (assumed to be 1 kg m⁻³), and *V* is the average maximum surface wind speed at radius *r*. Total tornado power here is the summation of log (*P*) over the lifetime of the tornado-like vortex,

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$$P_t = \sum \log \left(P\right) \tag{2}$$

In simulations of the WARM event, the PGW response in total power is neither consistent nor robust. However, the 16-member ensemble contributed to a mean percentage increase in P_t of +124% (Fig. 3). This percentage increase is due to a few experiments with relatively stronger vortex windspeeds; none of the experiments exhibited wider vortices (Fig. 3). Thus, as in the coarser-resolution regional modeling simulations, there are indications of intensity increases in this violent, Great Plains, warm-season tornado given an imposed climate change, but with large uncertainty.

For the COOL event, the PGW response in total power is both consistent and robust, with 272 an average percentage increase of +109% (Fig. 3). The increases in P_t are driven by consistent 273 and robust increases in tornadic-vortex strength and width (Fig. 3). The relatively longer duration 274 of the tornadic vortices (+81%) also contribute to the larger P_t under PGW. These high-275 resolution simulations are in agreement with the regional modeling simulations, and clearly 276 demonstrate an increased intensity and duration for this archetypal cool-season tornado given an 277 imposed climate change. The collective simulations also confirm our hypothesis regarding a 278 relatively larger response of this cool-season event. 279

280

- Table 1. Mean values, and percentage changes relative to the CTRL experiment, of
- environmental parameters computed from the initial/boundary conditions of the idealized-modeling PGW experiments.
- 284

Event	САРЕ		APE CIN		LCL		SRH3		SRH1		S06		STP	
	(J/	kg)	(J/	'kg)	(m	l)	(m2	/s2)	(m2	/s2)	(n	n/s)		
WARM	4484	+56	0	+100	1774	+23	86	-58	34	-53	24	-14	0.2	-72
COOL	1037	+162	-24	-61	243	+33	427	-21	327	-23	36	-4	2.2	+100

CIN is convective inhibition; LCL is lifting condensation level; SRH3 is storm-relative
environmental helicity, evaluated over the 0-3 km layer; SRH1 is storm-relative environmental
helicity, evaluated over the 0-1 km layer; S06 is the bulk wind shear, evaluated over the 0-6 km
layer.

We can use the ic/bc of the idealized experiments to explore the meteorological

arguments on which this hypothesis is based. The mean, PGW-enhanced CAPE of 4484 J kg⁻¹

and 1037 J kg⁻¹ for the WARM and COOL events, respectively, represent consistent and robust

increases of +56% and +162% relative to the corresponding CTRL environments (Table 1). The

mean, PGW-diminished VWS of 24 m s⁻¹ and 36 m s⁻¹ for the WARM and COOL events,

respectively, represent consistent and robust decreases of -14% and -4% relative to the

296 corresponding CTRL environments (Table 1); disproportionate decreases of storm-relative

297 helicity, another measure of VWS, are also revealed for the WARM versus COOL events (-53%

and -23%, respectively; Table 1). When these and other environmental parameters are combined

through the multivariate parameter STP, the environment of the WARM event is found to be

300 relatively less supportive of a significant tornado under PGW (mean percentage decrease of -

301 72%), while the environment of the COOL event is relatively *more* supportive under PGW

302 (mean percentage increase of +100%) (Table 1).

303

304 3.3 Generality of the conclusions

305	Although the intensity changes described herein apply to the specific WARM and COOL
306	events simulated, all potential tornadic-storm events realized during the warm- and cool-season
307	months of consideration would be subject to the same range of climate-change perturbations. To
308	help quantify how these perturbations alone might contribute to environments of significant
309	tornadoes, STP is calculated at all points within the regional-model domain for the CTRL and
310	PGW simulations of both events (Fig. S7). The PGW – CTRL difference for each PGW
311	ensemble member represents the contribution of the monthly climate change perturbation for that
312	member (see section 2.1) to the STP change. Upon spatially averaging the PGW – CTRL
313	differences, we find that the ensemble mean STP perturbation is -0.30 for the month of May, and
314	+0.70 for the month of February. The implication is that ACC would contribute, on average, to
315	environments that are relatively less supportive of a significant tornado during May across the
316	central Great Plains U.S., and relatively more supportive of a significant tornado during February
317	across the southeast U.S. Such environmental changes have been noted in studies by Gensini &
318	Brooks (2018), Bercos-Hickey et al. (2021), and Lepore et al. (2021).

319

320 **4 Summary and Conclusions**

Evidence for the potential of ACC to lead to increases in future tornado intensity is provided through a novel climate modeling study of two contemporary, archetypal, warm- and cool-season tornado events. The tornadic-storm and associated vortex of the cool-season event experiences a consistent and robust increase in intensity and size when virtually placed in a globally warmed future via the PGW method. The tornadic-storm and associated vortex of the warm-season event experiences increases in intensity in some of the virtual experiments, but the 327 response is neither consistent nor robust, and is overall weaker than in the cool-season event.

328 Consideration of other data lends support to such a disproportionate response based on season of 329 the year.

The preceding statement should not be interpreted to mean that *all* tornadoes will be 330 stronger in the future. The atmospheric heterogeneity arising from naturally variable large-scale 331 332 atmospheric circulations, high-frequency weather systems, convective storms and their residual effects, and land-surface variations (e.g., see Trapp, 2013) will continue to create diverse 333 environmental conditions both supportive and non-supportive of thunderstorm formation. 334 Significant tornadogenesis within such thunderstorms will also continue to require a delicate 335 balance between VWS and CAPE, among other environmental parameters. Yet because cool-336 season environments in the current climate tend to be characterized by very large VWS and 337 small CAPE, future increases in CAPE (decreases in VWS) due to ACC appear to be relatively 338 more conductive to (less impactful on) this balance and thus on cool-season tornado potential. 339 340 These findings have implications on the possible impacts of future tornadoes forming outside of climatologically favored seasons, in the United States and elsewhere around the world. 341 Indeed, situational awareness of tornado risk tends to be reduced during seasons such as boreal 342 343 winter, which offers one explanation for high fatalities from tornadic events during these times (e.g., Ashley, 2007). It follows that more intense future tornadoes would have the potential to 344 345 result in more fatalities and damage.

346

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354	producing and making available their model output.
355	
356	Open Research
357	The following GCM data sets used in this study are available through the CMIP5 repository
358	(https://esgf-node.llnl.gov/projects/cmip5/), using these criteria: Models: GFDL-CM3,
359	MIROC5, NCAR-CCSM4, IPSL-CM5A-LR, and NorESM-1M; Experiments: historical and
360	RCP8.5; Ensemble: r1i1p1; Realm: atmos; and Time Frequency: 3hr or 6hr. The WRF model is
361	available at https://www2.mmm.ucar.edu/wrf/users/, and the CM1 model is available at
362	https://www2.mmm.ucar.edu/people/bryan/cm1/. Relevant simulation data are available through
363	the Illinois Data Bank at https://databank.illinois.edu/datasets/IDB-4479773.
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365	
366	References
367	Ashley, W. S. (2007). Spatial and Temporal Analysis of Tornado Fatalities in the United States:
368	1880–2005. Weather and Forecasting, 22(6), 1214–1228.
369	https://doi.org/10.1175/2007WAF2007004.1
370	Bercos-Hickey, E., Patricola, C. M., & Gallus, W. A. (2021). Anthropogenic Influences on

371 Tornadic Storms. Journal of Climate, 1–57. <u>https://doi.org/10.1175/JCLI-D-20-0901.1</u>

- 372 Bryan, G. H., & Fritsch, J. M. (2002). A Benchmark Simulation for Moist Nonhydrostatic
- 373 Numerical Models. *Monthly Weather Review*, *130*(12), 2917–2928.
- 374 https://doi.org/10.1175/1520-0493(2002)130<2917:ABSFMN>2.0.CO;2
- 375 Del Genio, A. D., Yao, M.-S., & Jonas, J. (2007). Will moist convection be stronger in a warmer
- climate? *Geophysical Research Letters*, *34*(16). https://doi.org/10.1029/2007GL030525
- 377 Diffenbaugh, N. S., Scherer, M., & Trapp, R. J. (2013). Robust increases in severe thunderstorm
- 378 environments in response to greenhouse forcing. *Proceedings of the National Academy of*
- 379 Sciences. <u>https://doi.org/10.1073/pnas.1307758110</u>
- 380 Frei, C., Schär, C., Lüthi, D., & Davies, H. C. (1998). Heavy precipitation processes in a warmer
- climate. *Geophysical Research Letters*, *25*(9), 1431–1434.
- 382 https://doi.org/10.1029/98GL51099
- 383 Fricker, T., Elsner, J. B., Camp, P., & Jagger, T. H. (2014). Empirical estimates of kinetic energy
- from some recent U.S. tornadoes. *Geophysical Research Letters*.
- 385 https://doi.org/10.1002/2014GL060441
- 386 Gensini, V. A., & Brooks, H. E. (2018). Spatial trends in United States tornado frequency. Npj
- Climate and Atmospheric Science 2018 1:1, 1(1), 1–5. https://doi.org/10.1038/s41612-018 0048-2
- 389 Gensini, V. A., Ramseyer, C., & Mote, T. L. (2014). Future convective environments using
- 390 NARCCAP. International Journal of Climatology, 34(5), 1699–1705.
- 391 https://doi.org/10.1002/joc.3769
- 392 Gray, K., & Frame, J. (2021). The impact of midlevel shear orientation on the longevity of and
- downdraft location and tornado-like vortex formation within simulated supercells. Monthly
- Weather Review, 149, 3739-3759, <u>https://doi.org/10.1175/MWR-D-21-0085.1</u>

- Hoogewind, K. A., Baldwin, M. E., & Trapp, R. J. (2017). The Impact of Climate Change on
- 396 Hazardous Convective Weather in the United States: Insight from High-Resolution
- 397 Dynamical Downscaling. *Journal of Climate*, *30*, 10081–10100.
- 398 https://doi.org/10.1175/JCLI-D-16-0885.1
- 399 Kimura, F., & Kitoh, A. (2007). Downscaling by pseudo global warming method. In Final report
- 400 to the ICCAP. Kyoto, Japan.
- Lepore, C., Abernathey, R., Henderson, N., Allen, J. T., & Tippett, M. K. (2021). Future Global
- 402 Convective Environments in CMIP6 Models. *Earth's Future*, e2021EF002277.
- 403 https://doi.org/https://doi.org/10.1029/2021EF002277
- Naylor, J., & Gilmore, M. S. (2012). Convective Initiation in an Idealized Cloud Model Using an
- 405 Updraft Nudging Technique. *Monthly Weather Review*, *140*(11), 3699–3705.
- 406 https://doi.org/10.1175/MWR-D-12-00163.1
- 407 NOAA. (2013). NCEI Storm Events Database. Retrieved from
- 408 <u>https://www.ncdc.noaa.gov/stormevents/</u>
- 409 NOAA. (2022). NOAA National Centers for Environmental Information (NCEI) U.S. Billion-
- 410 Dollar Weather and Climate Disasters (2022). https://doi.org/10.25921/stkw-7w73
- 411 Sato, T., Kimura, F., & Kitoh, A. (2007). Projection of global warming onto regional
- 412 precipitation over Mongolia using a regional climate model. *Journal of Hydrology*, *333*(1),
- 413 144–154. https://doi.org/https://doi.org/10.1016/j.jhydrol.2006.07.023
- 414 Schär, C., Frei, C., Lüthi, D., & Davies, H. C. (1996). Surrogate climate-change scenarios for
- 415 regional climate models. *Geophysical Research Letters*, 23(6), 669–672.
- 416 https://doi.org/10.1029/96GL00265

- 417 Seeley, J. T., & Romps, D. M. (2015). The Effect of Global Warming on Severe Thunderstorms
- in the United States. *Journal of Climate*, 28(6), 2443–2458. https://doi.org/10.1175/JCLI-D14-00382.1
- 420 Sherburn, K. D., & Parker, M. D. (2019). The development of severe vortices within simulated
- high-shear, low-CAPE convection. *Monthly Weather Review*. https://doi.org/10.1175/MWRD-18-0246.1
- 423 Skamarock, W. C., Klemp, J. B., Dudhia, J., Gill, D. O., Barker, D. M., Huang, X.-Y., et al.
- 424 (2008). A description of the Advanced Research WRF version 3. NCAR Tech. Note TN-
- 425 475 + STR.
- 426 Skamarock, W. C. (2004). Evaluating Mesoscale NWP Models Using Kinetic Energy Spectra.
- 427 *Monthly Weather Review*, *132*(12), 3019–3032. https://doi.org/10.1175/MWR2830.1
- 428 Strader, S. M., Ashley, W. S., Pingel, T. J., & Krmenec, A. J. (2017). Projected 21st century
- 429 changes in tornado exposure, risk, and disaster potential. *Climatic Change*, *141*(2), 301–313.
- 430 <u>https://doi.org/10.1007/s10584-017-1905-4</u>
- 431 Tang, B. J., Gensini, V. A., & Homeyer, C. R. (2019). Trends in United States large hail
- 432 environments and observations. *Npj Climate and Atmospheric Science*,
- 433 https://doi.org/10.1038/s41612-019-0103-7
- 434 Taylor, K. E., Stouffer, R. J., & Meehl, G. A. (2012). An Overview of CMIP5 and the
- 435 Experiment Design. *Bulletin of the American Meteorological Society*, 93(4), 485–498.
- 436 <u>https://doi.org/10.1175/BAMS-D-11-00094.1</u>
- 437 Taszarek, M., Allen, J. T., Marchio, M., & Brooks, H. E. (2021). Global climatology and trends
- in convective environments from ERA5 and rawinsonde data. *Npj Climate and Atmospheric*
- 439 *Science*, https://doi.org/10.1038/s41612-021-00190-x

- 440 Thompson, R. L., Smith, B. T., Grams, J. S., Dean, A. R., & Broyles, C. (2012). Convective
- 441 Modes for Significant Severe Thunderstorms in the Contiguous United States. Part II:
- 442 Supercell and QLCS Tornado Environments. *Weather and Forecasting*, *27*(5), 1136–1154.
- 443 https://doi.org/10.1175/WAF-D-11-00116.1
- 444 Toth, M., Trapp, R. J., Wurman, J., & Kosiba, K. A. (2012). Comparison of Mobile-Radar
- Measurements of Tornado Intensity with Corresponding WSR-88D Measurements. *Weather and Forecasting*, 28(2), 418–426. <u>https://doi.org/10.1175/WAF-D-12-00019.1</u>
- Trapp, R. J. (2013). *Mesoscale-Convective Processes in the Atmosphere*. Cambridge University
 Press.
- Trapp, R. J., & Hoogewind, K. A. (2016). The realization of extreme tornadic storm events under
 future anthropogenic climate change. *Journal of Climate*. https://doi.org/10.1175/JCLI-D15-0623.1
- Trapp, R.J., Woods, M. J., Lasher-Trapp, S. G., & Grover, M. A. (2021). Alternative
- 453 Implementations of the "Pseudo-Global-Warming" Methodology for Event-Based
- 454 Simulations. *Journal of Geophysical Research: Atmospheres*, *126*(24).
- 455 https://doi.org/10.1029/2021JD035017
- Trapp, R. J, Diffenbaugh, N. S., Brooks, H. E., Baldwin, M. E., Robinson, E. D., & Pal, J. S.
- 457 (2007). Changes in severe thunderstorm environment frequency during the 21st century
- 458 caused by anthropogenically enhanced global radiative forcing. *Proceedings of the National*
- 459 *Academy of Sciences*, 104(50), 19719–19723. https://doi.org/10.1073/pnas.0705494104
- 460 Trapp, R. J., Diffenbaugh, N. S., & Gluhovsky, A. (2009). Transient response of severe
- thunderstorm forcing to elevated greenhouse gas concentrations. *Geophysical Research*
- 462 *Letters*, *36*(1), L01703. https://doi.org/10.1029/2008GL036203

- 463 Woods, M. J. (2021). Understanding extreme tornado events under future climate change
- 464 through the pseudo-global warming methodology. University of Illinois at Urbana-
- 465 Champaign.

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1	The impact of human-induced climate change on future tornado intensity as revealed
2	through multi-scale modeling
3	
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12	
13	Key Points:
14	• The effects of climate change on tornado intensity have been unclear.
15	• A novel, multi-modeling approach is used to address such effects.
16 17	• The intensity of cool-season tornadoes would appear to be most susceptible.

18 Abstract

A novel, multi-scale climate modeling approach is used to show the potential for increases in 19 future tornado intensity due to anthropogenic climate change. Historical warm- and cool-season 20 (WARM and COOL) tornado events are virtually placed in a globally warmed future via the 21 "pseudo-global warming" method. As hypothesized based on meteorological arguments, the 22 23 tornadic-storm and associated vortex of the COOL event experiences consistent and robust increases in intensity, and size in an ensemble of imposed climate-change experiments. The 24 tornadic-storm and associated vortex of the WARM event experiences increases in intensity in 25 some of the experiments, but the response is neither consistent nor robust, and is overall weaker 26 than in the COOL event. An examination of environmental parameters provides further support 27 of the disproportionately stronger response in the cool-season event. These results have 28 29 implications on future tornadoes forming outside of climatologically favored seasons.

30

31 **1 Introduction**

Hazardous convective weather (HCW) in the form of damaging winds, hail, and tornadoes poses a serious threat to life and property in the United States. From 2012 to 2022, 99 HCW events each produced over \$1 billion (inflation-adjusted) in damages (NOAA, 2022). The frequency of these billion-dollar events has increased markedly since the start of the 21st century, owing in part to increased exposure and population density (Strader et al., 2017), but also potentially to anthropogenic climate change (ACC).

HCW depends on the 3D characteristics of environmental temperature, humidity, and 38 wind, which appear to have changed over the last few decades (Gensini & Brooks, 2018; Tang et 39 al. 2019; Taszarek et al., 2021) and are projected to change further by the late 21st century under 40 ACC. For example, as shown by Trapp et al. (2007), warming and humidification of lower-41 tropospheric air yields increases in convective available potential energy (CAPE), which leads to 42 increases in the potential intensity of convective-storm updrafts. Conversely, relatively more 43 44 warming at high latitudes weakens the meridional temperature gradient and thus weakens the vertical shear of the horizontal wind (hereinafter, VWS) per the thermal wind relation (e.g., Trapp 45 et al. 2007); this suggests a reduction in the tendency for convective updrafts to develop significant, 46

long-lived rotational cores. General circulation model (GCM) and regional climate model (RCM) 47 simulations reveal decreases in VWS that are disproportionately smaller than increases in CAPE, 48 indicating an increase in frequency and/or intensity of future HCW events under ACC in the United 49 States (e.g., Trapp et al., 2007; Del Genio et al., 2007; Trapp et al., 2009; Diffenbaugh et al., 2013; 50 Gensini et al., 2014; Seeley & Romps, 2015; Hoogewind et al., 2017). Of relevance herein is the 51 52 seasonal non-uniformity to this increase: Boreal winter tends to exhibit the largest relative increase in the CAPE–VWS covariate (Diffenbaugh et al., 2013). This is consistent with historical trends 53 of environmental parameters computed using reanalysis data (Gensini & Brooks, 2018). 54

Precisely how these conclusions relate to tornado intensity, and thus address the very basic 55 question of whether the environmental conditions due to 21st century ACC will contribute to more 56 intense tornadoes, is unclear. This is partly because relationships between observed tornado 57 intensity and environmental parameters such as CAPE and VWS are ambiguous. For example, 58 although nonzero CAPE is considered a necessary condition for, and thus critically relevant to 59 tornadic-storm formation, CAPE alone does not correlate well with observed tornado intensity 60 (Thompson et al., 2012). As supported by our analyses in section 3.3, a possible link could be 61 made using multivariate environmental parameters such as the significant tornado parameter 62 63 (STP), which appears to better discriminate environments of significant tornadoes from those of nonsignificant tornadoes (Thompson et al., 2012), although still not perfectly. However, an 64 environment-only argument has a critical limitation, namely, that realization of a significant 65 66 tornado is conditional on tornadic-storm initiation, which STP does not unambiguously predict. Indeed, the mean frequency of storms that initiate given a supportive environment is non-uniform 67 in time and space, and even appears to change under late 21st century ACC (Hoogewind et al., 68 69 2017).

Explicit climate modeling of tornadoes is an alternative to the use of environmental 70 parameters and removes the storm-initiation limitation. Although such an approach has been 71 computationally prohibitive because of the small-scale of tornadoes (~ 100 m to 1 km), multi-scale 72 modeling now offers a tractable solution. Herein we follow Trapp & Hoogewind (2016) and 73 employ the pseudo global warming (PGW) method (Schär et al., 1996; Frei et al., 1998; Kimura 74 75 and Kitoh, 2007; Sato et al., 2007) using a novel, multi-scale, multi-model approach. Briefly, the PGW method involves a comparison of simulations of events under their true 4D environment (the 76 control; CTRL) with those under a 4D environment modified by a climate-change perturbation 77 representative of mean atmospheric conditions over future (here, late 21st century) and historical 78 (here, late 20th century) time slices. Thus, this method allows for an isolation of the response of 79 an event to an imposed environment of the future. Because event-level PGW applications (see 80 Trapp et al., 2021) involve relatively short time integrations, they also allow for the use of higher 81 resolution and multiple realizations. 82

Two archetypal yet regionally and seasonally contrasting events are considered. The first is the 10 February 2013 (hereinafter, COOL) event that includes the EF-4 tornado in Hattiesburg, Mississippi, and the second is the 20 May 2013 (hereinafter, WARM) event that includes the EF-5 tornado in Moore, Oklahoma. Together, these tornadoes were responsible for 24 fatalities, more than 300 injuries, and approximately \$2 billion in damage (NOAA, 2013). Our working hypothesis is that the WARM event will exhibit relatively less intensity changes under PGW than the COOL event.

Analyses of these event simulations provide the initial means to address this hypothesis. However, the spatio-temporal representations of the tornadic storms, and even the total numbers of storms, are different between the PGW and CTRL simulations (see Fig. 1). This implied lack of a clear CTRL-to-PGW comparison of *specific* tornadic storms means that a quantitative evaluation of the climate change effect on the intensity of *specific* tornadoes is tenuous. Accordingly, we introduce an additional step wherein an idealized numerical model is integrated using initial and boundary conditions (ic/bc) drawn from the regional-model simulations. The relatively reduced complexity and higher spatial resolutions afforded by this idealized-modeling implementation of the PGW methodology helps further isolate the climate change response on a single storm, and allows for explicit diagnoses of tornado intensity.

- 100 **2 Materials and Methods**
- 101 2.1 PGW

The PGW method involves simulations of some event wherein its actual, present-day 102 forcing is modified through the addition of a climate-change perturbation or "delta", which is the 103 104 difference between mean conditions over future and historical time slices during a relevant month. Separate sets of deltas are constructed using historical and Representative Concentration Pathway 105 8.5 simulations from each of five GCMs (GFDL-CM3, MIROC5, NCAR-CCSM4, IPSL-CM5A-106 LR, and NorESM-1M). The GCM data originate from the Coupled Model Intercomparison Project 107 phase 5 (Taylor et al., 2012), and provide a range of convective-storm environments over historical 108 and future time periods (e.g., see Diffenbaugh et al., 2013; Seeley & Romps, 2015). 109

Three different formulations of the climate-change deltas (see Trapp et al., 2021), computed using five different GCMs, provide an ensemble of 15 simulations plus an additional composite-delta simulation to assess the PGW response of each event. Because these 16 different deltas explicitly represent a range in the climate-change signal, we argue that their use toward generation of an ensemble is more relevant than other approaches. Specifically, and importantly, 115 we are interested in the model response to the imposed future climate change and associated ic/bc
116 rather than in the model response to variations in parameterization schemes, etc.

117

118 2.2 Regional model configuration

119 The CTRL and PGW simulations of the WARM and COOL events are performed using

version 4.0 of the Weather Research and Forecasting model (WRF) (Skamarock et al., 2008).

121 The parent computational domains have horizontal grid spacings of 3 km. Subdomains of 1-km

122 grid spacing are nested within the parent domains over central Oklahoma and central Mississippi,

respectively (Fig. S1). The results reported in section 3.1 are based on analyses over the nesteddomains.

The simulations are initialized at 12 UTC for both events. This allows for more than six 125 hours of "spin-up" time prior to the observed EF-5 Moore (~2000 UTC) and EF-4 Hattiesburg 126 (~2300 UTC) tornadoes, which is typical for weather-event simulations with WRF (Skamarock, 127 2004). Initial and boundary conditions are derived from the North American Mesoscale Forecast 128 System analysis. Additional details regarding the WRF configuration can be found in Trapp et al. 129 (2021). Decisions on the configuration and on the ultimate veracity of the CTRL simulations 130 131 were established by comparing model output from configuration-sensitivity experiments to observed radar characteristics and tornado reports, as described in Woods (2021). 132 133 Tornadoes are not resolved on model grids with 1-km spacings. However, as 134 demonstrated in the Supplement, their signatures and potential intensity can be inferred using vertical vorticity (VV) computed at 80 m AGL, which is approximately the height of the first 135 level above the lower boundary of the model. A VV value locally exceeding 7.5×10^{-3} s⁻¹, which 136

137 is the 99th percentile of gridpoint values in the CTRL simulation, serves as a tornado proxy

138	occurrence. A VV value exceeding 1.25×10^{-2} s ⁻¹ , which is the 99.9th percentile, serves as a
139	significant tornado proxy occurrence. Coexistence of local updraft velocities exceeding 5 m s ⁻¹ is
140	also required, to ensure that the VV is associated with a convective updraft. Differentiating
141	tornado intensity based on VV is justified in the Supplement through an analyses of a vortex
142	model, and also follows from Doppler radar-based studies by Toth et al. (2012) and others.
143	
144	2.3 Idealized model configuration
145	The idealized simulations are performed using Cloud Model 1 (CM1) (Bryan & Fritsch,
146	2002). Grid stretching is employed such that the horizontal grid spacing is 64 m over the inner 80
147	x 80 km of the 180 x 180 x 18.5 km model domain, and then increased to 2.5 km at the domain
148	edges. Vertical grid spacing varies from 20 m in the lowest model levels to 250 m in the upper
149	levels. Additional details regarding the CM1 model configuration can be found in Woods
150	(2021). Note that the actual tornadoes that occurred on 20 May 2013 and 10 February 2013 had
151	damage widths of 1600 m and 1200 m, respectively. Even if the core diameters of maximum
152	winds of these tornadoes were 50% of these widths, the cores would still be represented by ~ 10
153	grid points. So, although our simulations do not have grid spacings appropriate to resolve fine-
154	scale structures of the tornadoes, the simulations are certainly sufficient to represent core widths
155	and windspeeds, which is one goal of these simulations.
156	The initial and boundary conditions are drawn from the WRF output of the CTRL and
157	PGW simulations. Specifically, 60 x 60 km horizontal averages centered about the WRF grid

- 158 point nearest to Moore, Oklahoma and Hattiesburg, Mississippi are used to obtain vertical
- profiles at 20 UTC 20 May 2013 and 23 UTC 10 February, respectively, which represent the pre-
- 160 tornadic conditions during these two events. A single deep convective storm is initiated within

161 these environments via updraft nudging (Naylor & Gilmore, 2012) that persisted for 20 minutes.

162 Our analysis of the subsequent tornadic circulations begins at 30 min, i.e., 10 min after the

163 cessation of the nudging.

Tornadic-like vortices (TLVs) are identified by examining near-surface fields of 164 windspeed, VV, and the Obuko-Weiss (OW) parameter. Adapting the approaches of Sherburn & 165 166 Parker (2019), Gray & Frame (2021), and others, TLV identification requires VV, windspeed, and OW to exceed 0.1 s⁻¹, 30 m s⁻¹, and 0.03 s⁻², respectively, and be collocated with low-level 167 updraft speeds exceeding 5 m s⁻¹. Upon locating the strongest TLV, maximum and minimum of 168 x-direction and y-direction wind components are found within 500 m of the vortex center. The 169 170 locations of these maxima and minima are used to determine an average radius (r) of maximum winds (V). 171

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175

176 **Figure 1.** Locations of tornado proxies (magenta dots) for the regional-modeling simulations of

the WARM event during the hour ending 2100 UTC (upper panels), and COOL event during the

hour ending 2230 UTC (lower panels). The size of the dots correspond nonlinearly to the VV

associated with the proxy. The subpanels indicate the individual experiments composing theensemble.

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Figure 2. Box-and-whisker plots of tornadic-storm intensity metrics, as evaluated from the regional modeling simulations of the WARM event (left) and COOL event (right). Values of these metrics are given as percentage changes in the PGW simulations relative to the CTRL simulation. The median is the orange line, mean is the green triangle, and individual data points are the black circles.

189

190 **3 Results**

191 3.1 Regional-modeling perspective

192 An ensemble of 16 simulations is used to assess the PGW response of each event. The

193 ensemble members represent a range of possible future realizations of the event. Herein, if 75%

194 of the ensemble members exhibit the same sign in the percentage change (PGW relative to

- 195 CTRL) in a given metric, we consider the PGW response for that metric to be *consistent*. If we
- 196 equate the signal in the metric to the mean value across the ensemble, and the noise to the

standard deviation, the response in this metric is considered to be *robust* (*highly robust*) if the 197 PGW signal-to-noise ratio in a given metric exceeds one (two) (e.g., Diffenbaugh et al., 2013). 198 We begin with two metrics that provide information on overall storm intensity. The first 199 is the cumulative gridpoint exceedance of 55 dBZ simulated radar reflectivity (Figs. S2 and S3). 200 This metric quantifies the total area of intense convective storms over a given simulation. A 201 202 consistent, robust response is shown in this metric, as represented by a mean percentage increase of +110% (PGW exceedances relative to those in the CTRL) (Fig. S3). Thus, the PGW-modified 203 conditions resulted in relatively more extensive and intense convective storms in association with 204 the WARM event. 205 Cumulative gridpoint exceedances of simulated updraft speed confirm this increase in the 206 extent of intense convective storms under PGW (Figs. S3 and S4); a consistent, robust response 207 is represented by a mean percentage increase of +40%. The *peak* updraft speeds are 208 comparatively stronger in only half of the PGW simulations, with a mean percentage increase of 209 +1% (Fig. 2). These results indicate that intense convective updrafts in a late 21st century 210 realization of the WARM event would be more numerous or larger, but not always stronger. 211 The PGW response in occurrences of our tornado proxy is consistent albeit not robust, 212 213 with a mean percentage increase of 8% (Fig. 2). The mean response occurrences of our significant tornado proxy is neither consistent nor robust, with a mean percentage decrease of -214 11% (Fig. 2). Finally, the peak VV per PGW simulation, which provides some information about 215 216 the *potential* tornado intensity, is also neither consistent nor robust, with a mean percentage increase of 5% (and median percentage decrease of -5%) (Fig. 2). Thus, the regional modeling 217 suggests relatively more but not necessarily stronger tornadic circulations in a late 21st century 218 219 realization the WARM event, albeit with large uncertainty (see also Fig. 1).

220	Like the WARM event, the COOL event under PGW also tends to be characterized by
221	more intense convective storms. Specifically, cumulative gridpoint exceedances of simulated
222	reflectivity of 55 dBZ are greater in all but one of the PGW simulations, thus contributing to an
223	average percentage increase of +125%, and a consistent and robust response in this metric (Figs.
224	S2 and S3). The other metric for overall storm intensity, cumulative gridpoint exceedances of
225	updraft speed of 25 m s ⁻¹ , is consistent but not robust; notably, the average percentage increase in
226	such strong updraft occurrence in the COOL event is +712%, as compared to the +40% increase
227	associated with the WARM event (see Figs. S2 and S3). All PGW simulations had peak updraft
228	speeds exceeding the 31 m s ⁻¹ peak of the CTRL (Fig. 2), thus implying a consistent and robust
229	response. Moreover, half of the PGW simulations had peak updrafts exceeding 50 m s ⁻¹ , which
230	historically are speeds more readily supportive in warm-season, Great Plains environments than
231	in cool-season, southeast U.S. environments. These results indicate that intense convective
232	updrafts in a late 21st century realization of the COOL event would be more numerous and
233	stronger.
224	Occurrences of the terredo prove on substantially greater under DCW in many of the

Occurrences of the tornado proxy are substantially greater under PGW in many of the simulations, leading to a mean percentage increase relative to CTRL of +211% (Fig. 2). Occurrences of the significant tornado proxy are also substantially greater, with a mean percentage increase of +3244%, in this consistent and robust response (Fig. 2). Finally, a consistent and robust response is indicated in the peak VV per PGW simulation, and thus potential tornado intensity, with an average percentage increase of +121% (Fig. 2). Collectively, these results suggest that tornadic circulations in a late 21st century

realization of the COOL event would be more numerous and stronger. In agreement with our
hypothesis, the magnitude of the response of this archetypal cool-season event to PGW is much

larger than that of the archetypal warm-season event; this finding is also in agreement with 243 Bercos-Hickey et al. (2021). There is still ambiguity, however, in precisely how the analyzed 244 response relates to tornado intensity, given both the model grid resolution and the nature of the 245 tornado proxy. Thus, we now use the TLV-resolving idealized PGW simulations to compute 246 explicit measures of tornado intensity, and thus help clarify the regional-model results. 247 248



250



252

253

3.2 Idealized modeling perspective

The idealized PGW simulations have steady, horizontally homogeneous initial and 254

boundary conditions that were drawn from the regional-model simulations of the WARM and 255

COOL events (Figs. S5-S6). The much finer grid spacings (64 m) allow for explicit 256

quantifications of TLVs that form within the simulated storms. For this we use tornado power, 257

which accounts for the tornadic wind speed as well as the width and length of the tornado track.

As adapted from Fricker et al. (2014), instantaneous tornado power can be calculated as

$$P = \pi r^2 \rho V^3 \tag{1}$$

where *r* represents the average radius of maximum winds, ρ is the air density (assumed to be 1 kg m⁻³), and *V* is the average maximum surface wind speed at radius *r*. Total tornado power here is the summation of log (*P*) over the lifetime of the tornado-like vortex,

264
$$P_t = \sum \log \left(P\right) \tag{2}$$

In simulations of the WARM event, the PGW response in total power is neither consistent nor robust. However, the 16-member ensemble contributed to a mean percentage increase in P_t of +124% (Fig. 3). This percentage increase is due to a few experiments with relatively stronger vortex windspeeds; none of the experiments exhibited wider vortices (Fig. 3). Thus, as in the coarser-resolution regional modeling simulations, there are indications of intensity increases in this violent, Great Plains, warm-season tornado given an imposed climate change, but with large uncertainty.

For the COOL event, the PGW response in total power is both consistent and robust, with 272 an average percentage increase of +109% (Fig. 3). The increases in P_t are driven by consistent 273 and robust increases in tornadic-vortex strength and width (Fig. 3). The relatively longer duration 274 of the tornadic vortices (+81%) also contribute to the larger P_t under PGW. These high-275 resolution simulations are in agreement with the regional modeling simulations, and clearly 276 demonstrate an increased intensity and duration for this archetypal cool-season tornado given an 277 imposed climate change. The collective simulations also confirm our hypothesis regarding a 278 relatively larger response of this cool-season event. 279

280

- Table 1. Mean values, and percentage changes relative to the CTRL experiment, of
- environmental parameters computed from the initial/boundary conditions of the idealized-modeling PGW experiments.
- 284

Event	САРЕ		APE CIN		LCL		SRH3		SRH1		S06		STP	
	(J/	kg)	(J/	'kg)	(m	l)	(m2	/s2)	(m2	/s2)	(n	n/s)		
WARM	4484	+56	0	+100	1774	+23	86	-58	34	-53	24	-14	0.2	-72
COOL	1037	+162	-24	-61	243	+33	427	-21	327	-23	36	-4	2.2	+100

CIN is convective inhibition; LCL is lifting condensation level; SRH3 is storm-relative
environmental helicity, evaluated over the 0-3 km layer; SRH1 is storm-relative environmental
helicity, evaluated over the 0-1 km layer; S06 is the bulk wind shear, evaluated over the 0-6 km
layer.

We can use the ic/bc of the idealized experiments to explore the meteorological

arguments on which this hypothesis is based. The mean, PGW-enhanced CAPE of 4484 J kg⁻¹

and 1037 J kg⁻¹ for the WARM and COOL events, respectively, represent consistent and robust

increases of +56% and +162% relative to the corresponding CTRL environments (Table 1). The

mean, PGW-diminished VWS of 24 m s⁻¹ and 36 m s⁻¹ for the WARM and COOL events,

respectively, represent consistent and robust decreases of -14% and -4% relative to the

296 corresponding CTRL environments (Table 1); disproportionate decreases of storm-relative

297 helicity, another measure of VWS, are also revealed for the WARM versus COOL events (-53%

and -23%, respectively; Table 1). When these and other environmental parameters are combined

through the multivariate parameter STP, the environment of the WARM event is found to be

300 relatively less supportive of a significant tornado under PGW (mean percentage decrease of -

301 72%), while the environment of the COOL event is relatively *more* supportive under PGW

302 (mean percentage increase of +100%) (Table 1).

303

304 3.3 Generality of the conclusions

305	Although the intensity changes described herein apply to the specific WARM and COOL
306	events simulated, all potential tornadic-storm events realized during the warm- and cool-season
307	months of consideration would be subject to the same range of climate-change perturbations. To
308	help quantify how these perturbations alone might contribute to environments of significant
309	tornadoes, STP is calculated at all points within the regional-model domain for the CTRL and
310	PGW simulations of both events (Fig. S7). The PGW – CTRL difference for each PGW
311	ensemble member represents the contribution of the monthly climate change perturbation for that
312	member (see section 2.1) to the STP change. Upon spatially averaging the PGW – CTRL
313	differences, we find that the ensemble mean STP perturbation is -0.30 for the month of May, and
314	+0.70 for the month of February. The implication is that ACC would contribute, on average, to
315	environments that are relatively less supportive of a significant tornado during May across the
316	central Great Plains U.S., and relatively more supportive of a significant tornado during February
317	across the southeast U.S. Such environmental changes have been noted in studies by Gensini &
318	Brooks (2018), Bercos-Hickey et al. (2021), and Lepore et al. (2021).

319

320 **4 Summary and Conclusions**

Evidence for the potential of ACC to lead to increases in future tornado intensity is provided through a novel climate modeling study of two contemporary, archetypal, warm- and cool-season tornado events. The tornadic-storm and associated vortex of the cool-season event experiences a consistent and robust increase in intensity and size when virtually placed in a globally warmed future via the PGW method. The tornadic-storm and associated vortex of the warm-season event experiences increases in intensity in some of the virtual experiments, but the 327 response is neither consistent nor robust, and is overall weaker than in the cool-season event.

328 Consideration of other data lends support to such a disproportionate response based on season of 329 the year.

The preceding statement should not be interpreted to mean that *all* tornadoes will be 330 stronger in the future. The atmospheric heterogeneity arising from naturally variable large-scale 331 332 atmospheric circulations, high-frequency weather systems, convective storms and their residual effects, and land-surface variations (e.g., see Trapp, 2013) will continue to create diverse 333 environmental conditions both supportive and non-supportive of thunderstorm formation. 334 Significant tornadogenesis within such thunderstorms will also continue to require a delicate 335 balance between VWS and CAPE, among other environmental parameters. Yet because cool-336 season environments in the current climate tend to be characterized by very large VWS and 337 small CAPE, future increases in CAPE (decreases in VWS) due to ACC appear to be relatively 338 more conductive to (less impactful on) this balance and thus on cool-season tornado potential. 339 340 These findings have implications on the possible impacts of future tornadoes forming outside of climatologically favored seasons, in the United States and elsewhere around the world. 341 Indeed, situational awareness of tornado risk tends to be reduced during seasons such as boreal 342 343 winter, which offers one explanation for high fatalities from tornadic events during these times (e.g., Ashley, 2007). It follows that more intense future tornadoes would have the potential to 344 345 result in more fatalities and damage.

346

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354	producing and making available their model output.
355	
356	Open Research
357	The following GCM data sets used in this study are available through the CMIP5 repository
358	(https://esgf-node.llnl.gov/projects/cmip5/), using these criteria: Models: GFDL-CM3,
359	MIROC5, NCAR-CCSM4, IPSL-CM5A-LR, and NorESM-1M; Experiments: historical and
360	RCP8.5; Ensemble: r1i1p1; Realm: atmos; and Time Frequency: 3hr or 6hr. The WRF model is
361	available at https://www2.mmm.ucar.edu/wrf/users/, and the CM1 model is available at
362	https://www2.mmm.ucar.edu/people/bryan/cm1/. Relevant simulation data are available through
363	the Illinois Data Bank at https://databank.illinois.edu/datasets/IDB-4479773.
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366	References
367	Ashley, W. S. (2007). Spatial and Temporal Analysis of Tornado Fatalities in the United States:
368	1880–2005. Weather and Forecasting, 22(6), 1214–1228.
369	https://doi.org/10.1175/2007WAF2007004.1
370	Bercos-Hickey, E., Patricola, C. M., & Gallus, W. A. (2021). Anthropogenic Influences on

371 Tornadic Storms. Journal of Climate, 1–57. <u>https://doi.org/10.1175/JCLI-D-20-0901.1</u>

- 372 Bryan, G. H., & Fritsch, J. M. (2002). A Benchmark Simulation for Moist Nonhydrostatic
- 373 Numerical Models. *Monthly Weather Review*, *130*(12), 2917–2928.
- 374 https://doi.org/10.1175/1520-0493(2002)130<2917:ABSFMN>2.0.CO;2
- 375 Del Genio, A. D., Yao, M.-S., & Jonas, J. (2007). Will moist convection be stronger in a warmer
- climate? *Geophysical Research Letters*, *34*(16). https://doi.org/10.1029/2007GL030525
- 377 Diffenbaugh, N. S., Scherer, M., & Trapp, R. J. (2013). Robust increases in severe thunderstorm
- 378 environments in response to greenhouse forcing. *Proceedings of the National Academy of*
- 379 Sciences. <u>https://doi.org/10.1073/pnas.1307758110</u>
- 380 Frei, C., Schär, C., Lüthi, D., & Davies, H. C. (1998). Heavy precipitation processes in a warmer
- climate. *Geophysical Research Letters*, *25*(9), 1431–1434.
- 382 https://doi.org/10.1029/98GL51099
- 383 Fricker, T., Elsner, J. B., Camp, P., & Jagger, T. H. (2014). Empirical estimates of kinetic energy
- from some recent U.S. tornadoes. *Geophysical Research Letters*.
- 385 https://doi.org/10.1002/2014GL060441
- 386 Gensini, V. A., & Brooks, H. E. (2018). Spatial trends in United States tornado frequency. Npj
- Climate and Atmospheric Science 2018 1:1, 1(1), 1–5. https://doi.org/10.1038/s41612-018 0048-2
- 389 Gensini, V. A., Ramseyer, C., & Mote, T. L. (2014). Future convective environments using
- 390 NARCCAP. International Journal of Climatology, 34(5), 1699–1705.
- 391 https://doi.org/10.1002/joc.3769
- 392 Gray, K., & Frame, J. (2021). The impact of midlevel shear orientation on the longevity of and
- downdraft location and tornado-like vortex formation within simulated supercells. Monthly
- Weather Review, 149, 3739-3759, <u>https://doi.org/10.1175/MWR-D-21-0085.1</u>

- Hoogewind, K. A., Baldwin, M. E., & Trapp, R. J. (2017). The Impact of Climate Change on
- 396 Hazardous Convective Weather in the United States: Insight from High-Resolution
- 397 Dynamical Downscaling. *Journal of Climate*, *30*, 10081–10100.
- 398 https://doi.org/10.1175/JCLI-D-16-0885.1
- 399 Kimura, F., & Kitoh, A. (2007). Downscaling by pseudo global warming method. In Final report
- 400 to the ICCAP. Kyoto, Japan.
- Lepore, C., Abernathey, R., Henderson, N., Allen, J. T., & Tippett, M. K. (2021). Future Global
- 402 Convective Environments in CMIP6 Models. *Earth's Future*, e2021EF002277.
- 403 https://doi.org/https://doi.org/10.1029/2021EF002277
- Naylor, J., & Gilmore, M. S. (2012). Convective Initiation in an Idealized Cloud Model Using an
- 405 Updraft Nudging Technique. *Monthly Weather Review*, *140*(11), 3699–3705.
- 406 https://doi.org/10.1175/MWR-D-12-00163.1
- 407 NOAA. (2013). NCEI Storm Events Database. Retrieved from
- 408 <u>https://www.ncdc.noaa.gov/stormevents/</u>
- 409 NOAA. (2022). NOAA National Centers for Environmental Information (NCEI) U.S. Billion-
- 410 Dollar Weather and Climate Disasters (2022). https://doi.org/10.25921/stkw-7w73
- 411 Sato, T., Kimura, F., & Kitoh, A. (2007). Projection of global warming onto regional
- 412 precipitation over Mongolia using a regional climate model. *Journal of Hydrology*, 333(1),
- 413 144–154. https://doi.org/https://doi.org/10.1016/j.jhydrol.2006.07.023
- 414 Schär, C., Frei, C., Lüthi, D., & Davies, H. C. (1996). Surrogate climate-change scenarios for
- 415 regional climate models. *Geophysical Research Letters*, 23(6), 669–672.
- 416 https://doi.org/10.1029/96GL00265

- 417 Seeley, J. T., & Romps, D. M. (2015). The Effect of Global Warming on Severe Thunderstorms
- in the United States. *Journal of Climate*, 28(6), 2443–2458. https://doi.org/10.1175/JCLI-D14-00382.1
- 420 Sherburn, K. D., & Parker, M. D. (2019). The development of severe vortices within simulated
- high-shear, low-CAPE convection. *Monthly Weather Review*. https://doi.org/10.1175/MWRD-18-0246.1
- 423 Skamarock, W. C., Klemp, J. B., Dudhia, J., Gill, D. O., Barker, D. M., Huang, X.-Y., et al.
- 424 (2008). A description of the Advanced Research WRF version 3. NCAR Tech. Note TN-
- 425 475 + STR.
- 426 Skamarock, W. C. (2004). Evaluating Mesoscale NWP Models Using Kinetic Energy Spectra.
- 427 *Monthly Weather Review*, *132*(12), 3019–3032. https://doi.org/10.1175/MWR2830.1
- 428 Strader, S. M., Ashley, W. S., Pingel, T. J., & Krmenec, A. J. (2017). Projected 21st century
- 429 changes in tornado exposure, risk, and disaster potential. *Climatic Change*, *141*(2), 301–313.
- 430 <u>https://doi.org/10.1007/s10584-017-1905-4</u>
- 431 Tang, B. J., Gensini, V. A., & Homeyer, C. R. (2019). Trends in United States large hail
- 432 environments and observations. *Npj Climate and Atmospheric Science*,
- 433 https://doi.org/10.1038/s41612-019-0103-7
- 434 Taylor, K. E., Stouffer, R. J., & Meehl, G. A. (2012). An Overview of CMIP5 and the
- 435 Experiment Design. *Bulletin of the American Meteorological Society*, *93*(4), 485–498.
- 436 <u>https://doi.org/10.1175/BAMS-D-11-00094.1</u>
- 437 Taszarek, M., Allen, J. T., Marchio, M., & Brooks, H. E. (2021). Global climatology and trends
- in convective environments from ERA5 and rawinsonde data. *Npj Climate and Atmospheric*
- 439 *Science*, https://doi.org/10.1038/s41612-021-00190-x

- 440 Thompson, R. L., Smith, B. T., Grams, J. S., Dean, A. R., & Broyles, C. (2012). Convective
- 441 Modes for Significant Severe Thunderstorms in the Contiguous United States. Part II:
- 442 Supercell and QLCS Tornado Environments. *Weather and Forecasting*, *27*(5), 1136–1154.
- 443 https://doi.org/10.1175/WAF-D-11-00116.1
- 444 Toth, M., Trapp, R. J., Wurman, J., & Kosiba, K. A. (2012). Comparison of Mobile-Radar
- Measurements of Tornado Intensity with Corresponding WSR-88D Measurements. *Weather and Forecasting*, 28(2), 418–426. <u>https://doi.org/10.1175/WAF-D-12-00019.1</u>
- Trapp, R. J. (2013). *Mesoscale-Convective Processes in the Atmosphere*. Cambridge University
 Press.
- Trapp, R. J., & Hoogewind, K. A. (2016). The realization of extreme tornadic storm events under
 future anthropogenic climate change. *Journal of Climate*. https://doi.org/10.1175/JCLI-D15-0623.1
- Trapp, R.J., Woods, M. J., Lasher-Trapp, S. G., & Grover, M. A. (2021). Alternative
- 453 Implementations of the "Pseudo-Global-Warming" Methodology for Event-Based
- 454 Simulations. *Journal of Geophysical Research: Atmospheres*, *126*(24).
- 455 https://doi.org/10.1029/2021JD035017
- Trapp, R. J, Diffenbaugh, N. S., Brooks, H. E., Baldwin, M. E., Robinson, E. D., & Pal, J. S.
- 457 (2007). Changes in severe thunderstorm environment frequency during the 21st century
- 458 caused by anthropogenically enhanced global radiative forcing. *Proceedings of the National*
- 459 *Academy of Sciences*, 104(50), 19719–19723. https://doi.org/10.1073/pnas.0705494104
- 460 Trapp, R. J., Diffenbaugh, N. S., & Gluhovsky, A. (2009). Transient response of severe
- thunderstorm forcing to elevated greenhouse gas concentrations. *Geophysical Research*
- 462 *Letters*, *36*(1), L01703. https://doi.org/10.1029/2008GL036203

- 463 Woods, M. J. (2021). Understanding extreme tornado events under future climate change
- 464 through the pseudo-global warming methodology. University of Illinois at Urbana-
- 465 Champaign.

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The impact of human-induced climate change on future tornado intensity as revealed through multi-scale modeling

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Supplementary Material

Tornado intensification results from vortex stretching, which is dynamically equivalent to conservation of circulation Γ . For an axisymmetric vortex with a uniform core of vorticity on a horizontal plane, circulation is

$$\Gamma = \zeta \pi R^2 \qquad (1)$$

where *R* is vortex-core radius, and ζ is the vertical component of the vorticity vector. For such an axisymmetric vortex, we can also write:

$$\Gamma = 2\pi R V \quad (2)$$

where V is the tangential speed of the vortex at radius R. Using (1) and (2), the vertical vorticity of the vortex can thus be expressed as:

$$\zeta = 2V/R \quad (3)$$

Note here that we can obtain Eq. (3) directly by using the definition of vertical vorticity in polar coordinates,

$$\zeta = \frac{1}{r} \frac{\partial (ru_{\theta})}{\partial r} - \frac{1}{r} \frac{\partial u_{r}}{\partial \theta} \quad (4)$$

and then substituting $u_r = 0$, $u_{\theta} = V r/R$, where u_{θ} and u_r are the tangential and radial velocity components, respectively.

If we evaluate Eq. (3) with R = 100 m, then for a weak (i.e., EF0), strong (i.e., EF2), and violent (i.e., EF4) tornado, with V = 30 m s⁻¹, V = 50 m s⁻¹, and V = 75 m s⁻¹, respectively, we find that $\zeta = 0.6$ s⁻¹, $\zeta = 1.0$ s⁻¹, and $\zeta = 1.5$ s⁻¹. Thus, in an idealized vortex with a fixed core radius, vortex intensity is quantified well by vertical vorticity.

Unsurprisingly, these estimates based on an idealized vortex model are of the same order of magnitude as the 10° s⁻¹ estimate based on typical scale analysis (e.g., Trapp 2013). In real tornadoes with asymmetric, non-uniform cores observed using discrete data, the magnitude of the calculated vertical vorticity depends on the resolution of the data used in the calculations. As would be the case for extrema of any field represented in discrete data, it is logical to expect that the "true" value of ζ will be reduced in coarsened data. This explains why, for example, Coffer et al. (2017) and Gray and Frame (2021) used vertical vorticity thresholds of 0.3 s⁻¹ and 0.15 s⁻¹, respectively, for "tornado-like vortex" (TLV) identification on horizontal grids with 125 m and 250 m spacings. A key point here is that the thresholds in these and many other studies are obtained heuristically.

We can, however, demonstrate support of these heuristic estimates by calculating the vertical vorticity of an idealized tornado on a Cartesian grid with different spacings in x and y, i.e., Δx and Δy . Let:

$$u_{\theta} = \begin{cases} \frac{Vr}{R}, r \le R\\ \frac{VR}{r}, r > R \end{cases}$$
(5)

which models a Rankine vortex with a uniform core of vorticity surrounded by irrotational flow; despite its idealization, Eq. (5) also approximates the rotational flow in real tornadoes to varying degrees (e.g., Wurman & Gill, 2000). For consistency with the discussion above, we initially let R = 100 m and V = 50 m s⁻¹, and thus per Eq. (3), $\zeta = 1.0$ s⁻¹ within the core. The arbitrary domain for our calculations is $0 \le x, y \le 5000$ m, and the vortex is centered at $x_o, y_o = 2500$ m. Upon implementing Eq. (5) using $r = \sqrt{(x - x_o)^2 + (y - y_o)^2}$, the resulting velocity field is transformed into Cartesian coordinates, and then $\zeta (= \partial v/\partial x - \partial u/\partial y)$ is determined using centered finite differencing.

On a grid with $\Delta x = 10 \text{ m} = \Delta y$, which resolves well a 200-m diameter vortex, the calculated maximum vertical vorticity is $\hat{\zeta} = 1.0 \text{ s}^{-1}$, implying that the tornadic vortex intensity is fully represented (Fig. A). If we coarsen the grid to $\Delta x = 250 \text{ m} = \Delta y$, we no longer resolve the vortex, yet Fig. B still reveals a vortex signature, with $\hat{\zeta} = 0.16 \text{ s}^{-1}$; notice that this vertical vorticity value is nearly the same as Gray and Frame (2021)'s threshold of 0.15 s⁻¹ used for TLV identification in model simulations with 250 m grid spacing. If we further coarsen the grid to $\Delta x = 1000 \text{ m} = \Delta y$, which is the grid spacing used in regional model simulations of this study, a size-exaggerated signature of the vortex continues to exist, with $\hat{\zeta} = 0.008 \text{ s}^{-1}$ (Fig. C). Finally, if we increase the tangential windspeed to $V = 75 \text{ m s}^{-1}$, we find a size-exaggerated signature of the vortex is represented on a coarse grid as an increase in maximum vertical vorticity, even though the tornado itself is under-resolved.



Fig. A. Cartesian component velocities and vertical vorticity for the case $\Delta x = 10$ m, V = 50 m s⁻¹, in which $\hat{\zeta} = 1.0$ s⁻¹.



Fig. B. As in Fig. A, except for Cartesian component velocities and vertical vorticity for the case case $\Delta x = 250$ m, V = 50 m s⁻¹, in which $\hat{\zeta} = 0.16$ s⁻¹.



Fig. C. As in Fig. A, except for Cartesian component velocities and vertical vorticity for the case case $\Delta x = 1000 \text{ m}, V = 50 \text{ m s}^{-1}$, in which $\hat{\zeta} = 0.008 \text{ s}^{-1}$.



Fig. D. As in Fig. A, except for Cartesian component velocities and vertical vorticity for the case $\Delta x = 1000 \text{ m}, V = 75 \text{ m s}^{-1}$, in which $\hat{\zeta} = 0.012 \text{ s}^{-1}$.

The essence of this simple exercise is also revealed in the observational results of Toth et al. (2013; see their section 3), which show high linear correlation between quantifications of tornado intensity (differential velocity) obtained near the surface with high-resolution mobile radar and quantifications of the corresponding tornadic-vortex/mesocyclone intensity determined using the coarser-resolution measurements of the nearest WSR-88D. To be clear, the vortex sampled by a WSR-88D represents some combination of the tornado and its ambient circulation. The essence of the exercise is also reflected in the ongoing efforts to estimate tornado intensity–as manifest by degree of damage, and represented through an EF rating–using radar-quantified characteristics of the mesocyclone or tornadic vortex (e.g., Smith et al. 2020).

Thus, as justified by observational data as well as by analyses of a discretized vortex model, we use magnitudes of vertical vorticity as potential tornado proxies in our regional model simulations with 1-km grid spacings. The vertical vorticity is evaluated at a height of 80 m, which is approximately the height of the first model level above the lower model boundary. Consistent with the vortex-model analysis results, a vertical vorticity value locally exceeding 0.0075 s^{-1} , which is the 99th percentile of gridpoint values in the CTRL simulation, serves as a tornado proxy occurrence. A vertical vorticity value exceeding 0.0125 s^{-1} , which is the 99.9th percentile, serves as a significant tornado proxy occurrence. Coexistence of local updraft velocities exceeding 5 m s⁻¹ is required.

References

- Coffer, B. E., Parker, M. D., Dahl, J. M. L., Wicker, L. J., & Clark, A. J. (2017). Volatility of tornadogenesis: An ensemble of simulated nontornadic and tornadic supercells in VORTEX2 environments. Monthly Weather Review, 145, 4605-4625, <u>https://doi.org/10.1175/MWR-D-17-0152.1</u>.
- Gray, K., & Frame, J. (2021). The impact of midlevel shear orientation on the longevity of and downdraft location and tornado-like vortex formation within simulated supercells. *Monthly Weather Review*, 149, 3739-3759, <u>https://doi.org/10.1175/MWR-D-21-0085.1</u>
- Smith, B. T., Thompson, R. L., Speheger, D. A., Dean, A. R., Karstens, C. D., & Anderson-Frey, A. K. (2020). WSR-88D Tornado Intensity Estimates. Part II: Real-Time Applications to Tornado Warning Time Scales. *Weather and Forecasting*, 35, 2493– 2506, https://doi.org/10.1175/WAF-D-20-0011.1.
- Trapp, R. J. (2013). *Mesoscale-Convective Processes in the Atmosphere*. Cambridge University Press.
- Wurman, J., & Gill, S. (2000). Finescale Radar Observations of the Dimmitt, Texas (2 June 1995), Tornado. *Monthly Weather Review*, 128, 2135–2164, <u>https://doi.org/10.1175/1520-0493(2000)128<2135:FROOTD>2.0.CO;2</u>



Supplemental Figure S1. Computational domains used for the regional model (WRF) simulations of the 20 May 2013 (WARM) and 10 February 2013 (COOL) events.



Supplemental Figure S2. Simulated radar reflectivity (dBZ) for the regional-modeling simulations of the WARM event (top panel; 2100 UTC) and COOL event (bottom panel; 0000 UTC). The color fill indicates the areas of intense convective storms over a given simulation. The gray contours are of 30 dBZ radar reflectivity, and show the outline of the convective storms. Each subpanel represents an individual experiment composing the ensemble. See section 2 for guidance on experiment nomenclature.



Supplemental Figure S3. Box-and-whisker plots of tornadic-storm intensity-coverage metrics, as evaluated from the regional modeling simulations of the WARM event (top) and COOL event (bottom). Values of these metrics are given as percentage changes in the PGW simulations relative to the control (CTRL) simulation. The median is the orange line, mean is the green triangle, and individual data points are the black circles.



Supplemental Figure S4. Maximum vertical velocity (m/s) for the regional-modeling simulations of the WARM event (top panel; 2100 UTC) and COOL event (bottom panel; 0000 UTC). The color fill indicates the areas of intense updrafts over a given simulation. The gray contours are of 30 dBZ radar reflectivity, and show the outline of the convective storms. Each subpanel represents an individual experiment composing the ensemble. See section 2 for guidance on experiment nomenclature.



Supplemental Figure S5. Initial and boundary conditions of temperature and dewpoint (°C) for the idealized modeling simulations, for the WARM event (left panel) and COOL event (right panel), as presented on skew-T/log-p diagrams. The solid and dashed black (colored) lines are the temperature and dewpoint for the CTRL (PGW) simulations.



Supplemental Figure S6. Initial and boundary conditions of horizontal wind components (m/s), for the WARM event (top panel) and COOL event (bottom panel), as presented on hodograph plots. The solid (colored) lines are for the CTRL (PGW) simulations. Asterisks show estimated storm motion for a right-moving supercell, and closed circles indicate heights of 1 and 3 km.



Supplemental Figure S7. Analysis of the significant tornado parameter (STP; nondimensional) over the respective simulation domains (D01; see Fig. S1) of the WARM event (top panel) and COOL event (bottom panel). The calculations were performed using model output at 1800 UTC for the WARM event, and 1500 UTC for the COOL event, which generally represent preconvective times across the respective simulation domains. See section 2 for guidance on experiment nomenclature.