

# Do severe storms across **Australia**, **Europe** and the **United States** share similarities? A comparison of atmospheric profiles and environmental predictors

#### Mateusz Taszarek<sup>1,2</sup>, John T. Allen<sup>3</sup>, Cameron Nixon<sup>3</sup>, Andrew Dowdy<sup>4</sup>, Francesco Battaglioli<sup>5</sup>

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- [2] NOAA National Severe Storms Laboratory, Norman, Oklahoma, United States
- [3] Department of Earth and Atmospheric Sciences, Central Michigan University, United States
- [4] Bureau of Meteorology, Melbourne, Victoria, Australia
- [5] European Severe Storms Laboratory, Wessling, Germany





















• Studies on storm environments for specific regions are heavily affected by local climatological features. For example, STP for tornadoes or lapse rates for large hail does not work as well in other parts of the world as in the United States.



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#### 2. Goal of the work

• To identify which environmental features share similarities among continents for storms producing severe wind, tornadoes and large hail.



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#### 2. Goal of the work

- To identify which environmental features share similarities among continents for storms producing severe wind, tornadoes and large hail.
  - ... and try to disentangle these results from local climatological features.



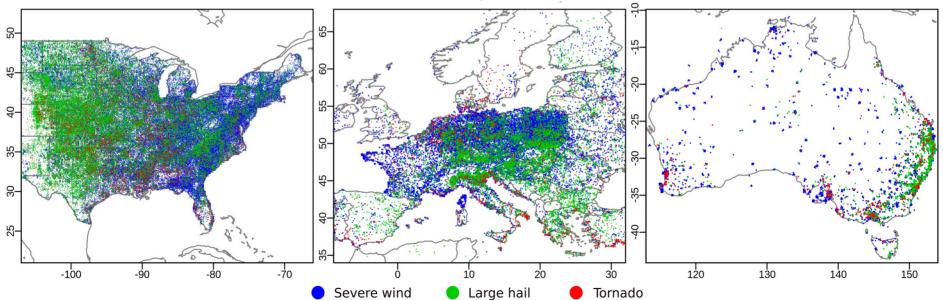
## **Datasets**



#### **Severe weather reports**

- United States: SPC Storm Reports Database
- Europe: European Severe Weather Database
- Australia: Storm Reports of Australian Bureau of Meteorology

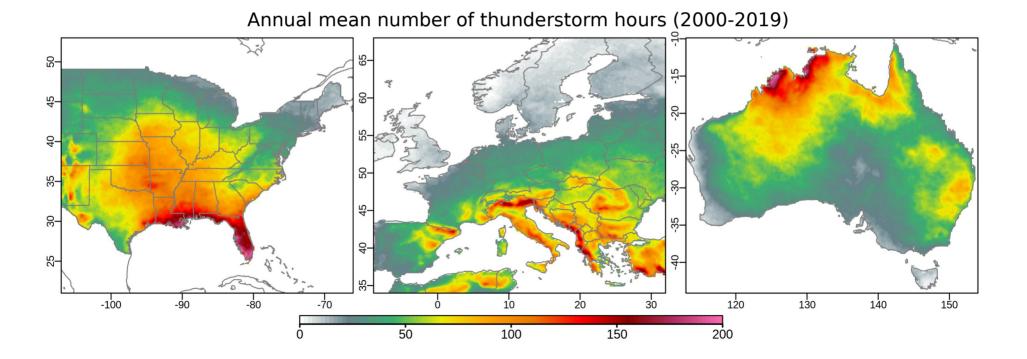






#### **Lightning data**

- United States: National Lightning Detection Network (NDLN)
- Europe: Arrival Time Difference Network (ATDnet)
- Australia: Global Position And Tracking Systems (GPATS)

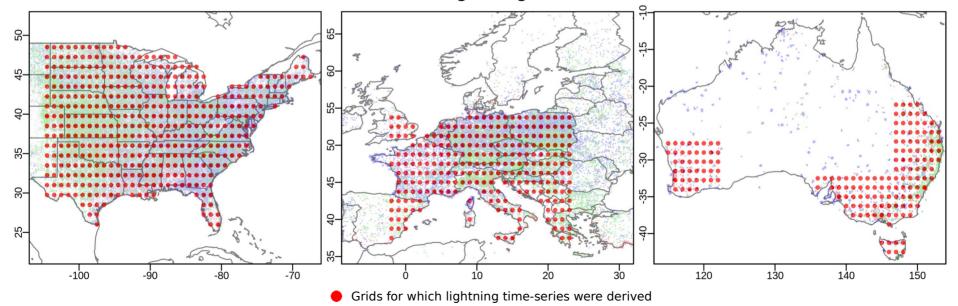




#### Construction of non-severe lightning category

- Lightning was detected, but no severe wind, tornado, hail was reported +/- 3h and up to 150 km.
- Only grids in the area of good severe weather reporting coverage were considered.
- Only every 4<sup>th</sup> ERA5 grid is considered to reduce sample size (otherwise would be several millions).

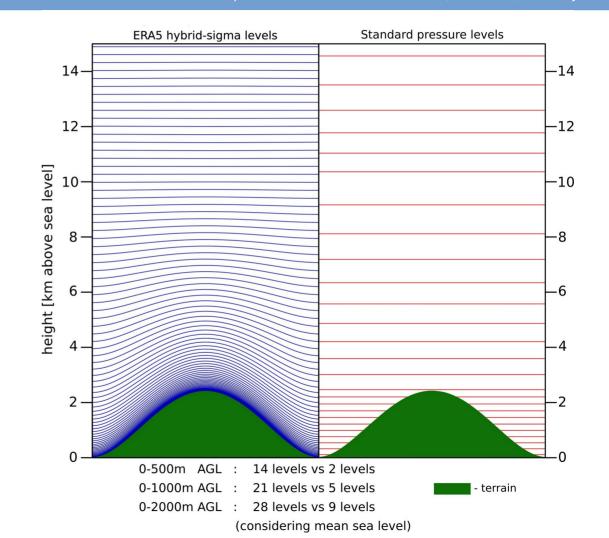
#### Domain for non-severe lightning situations (2015-2019)





#### **ERA5** reanalysis

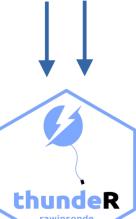
- hybrid-sigma levels
- 0.25° x 0.25°
- 1-hour step
- raw profiles of z, p, q, t, u, v



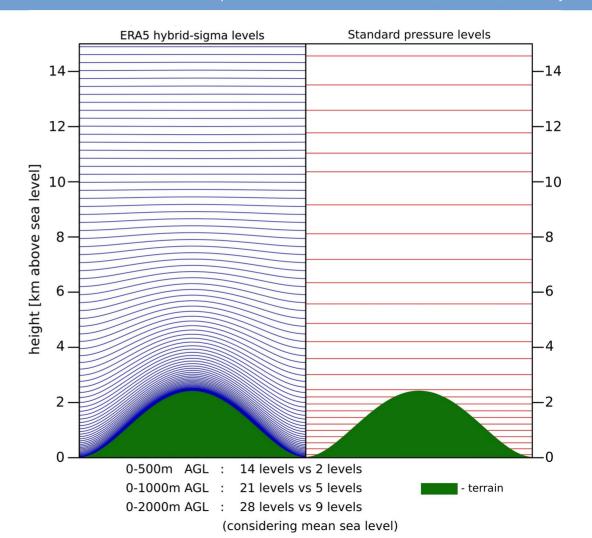


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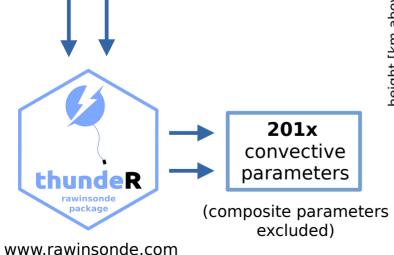
www.rawinsonde.com

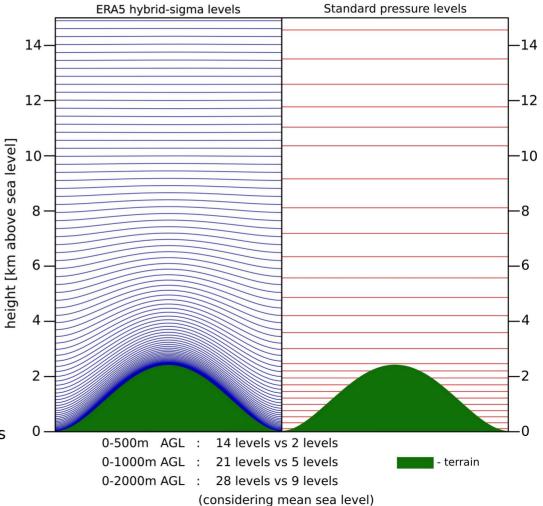




#### **ERA5** reanalysis

- hybrid-sigma levels
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thundeR - a rawinsonde package for processing convective parameters and visualizing atmospheric profiles

- 1 Department of Meteorology and Climatology, Adam Mickiewicz University, Poznań, Poland
- 2 NOAA National Severe Storms Laboratory, Norman, Oklahoma, United States
- 3 Department of Computer Science, Cracow University of Technology, Kraków, Poland
- 4 Department of Computer Science, AGH Cracow University of Science and Technology, Kraków, Poland



**Poster** 











Science Centre grant no. 2020/39/D/ST10/00768 and



Definition of parameters, quality-control, visualization and functionality (tornado@amu.edu.pl)

11th European Conference on Severe Storms
Bucharest, Romania, 8-12 May 2023



#### Bartosz Czernecki<sup>1</sup>



R, shiny, CRAN and github implementation

Piotr Szuster<sup>3,4</sup>



C++ engine and performance (retsuz@gmail.com)

#### What is thundeR?

ThundeR is a freeware R language package for skew-t and hodograph visualization, and rapid ation of convective parameters commonly used in the research and operational prediction of ive storms. It has been developed since 2017 and is constantly updated with new features and ters following requests from the community and the most up to date research findings.

does it work?

session! orithm is based on C++ code seamlessly integrated into the R language within the RCPP library. ution allows to compute over 200 thermodynamic and kinematic parameters within hundredths of a second per atmospheric profile. Such performance enables to process large numerical datasets such

Online sounding browser



Github repository



**Table 1**. Number of unique ERA5 profiles used in the analysis.

| Domain        | Non-severe<br>lightning | Severe wind |      | Large hail |                       | Tornado |                       |
|---------------|-------------------------|-------------|------|------------|-----------------------|---------|-----------------------|
|               |                         | Warm        | Cool | Severe     | Significant<br>severe | Severe  | Significant<br>severe |
| United States | 136935                  | 109174      | 9360 | 63757      | 5882                  | 9023    | 1315                  |
| Europe        | 67685                   | 17616       | 4520 | 11702      | 2267                  | 2102    | 249                   |
| Australia     | 30647                   | 2271        | 902  | 1260       | 227                   | 361     | 62                    |



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**Composite skew-ts** (buoyancy and RH averaging)



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Composite hodographs (hodograph shift & rotation)



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**Composite skew-ts** (buoyancy and RH averaging)

# Composite hodographs (hodograph shift & rotation)

- 1D Logistic Regression (deviance)
- 1D ROC curves (AUC)
- Random Forest (var. importance)



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**Composite skew-ts** (buoyancy and RH averaging)

## Composite hodographs

(hodograph shift & rotation)



- 1D ROC curves (AUC)
- Random Forest (var. importance)



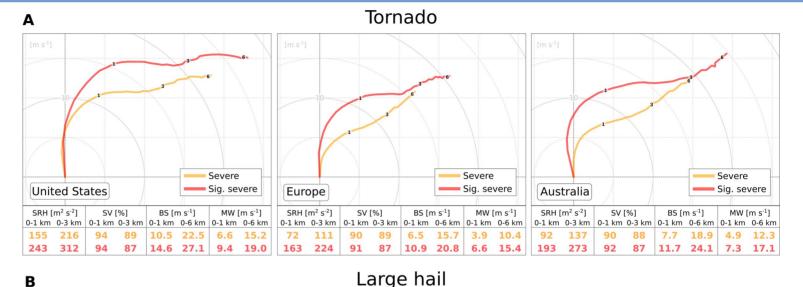
Parameter importance

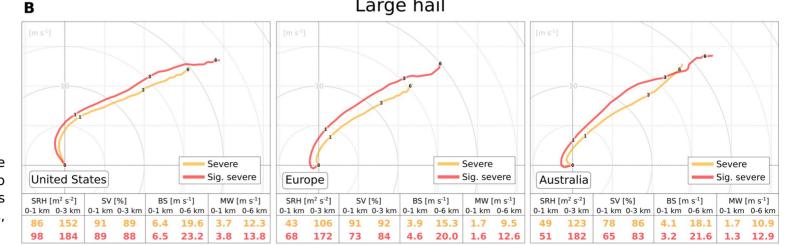
(averaging with equal weights)



# **Results**







**Figure 1**. Mean composite hodographs for (a) tornado and (b) large hail events across the United States, Europe and Australia.



## Mean vertical profiles of relative humidity

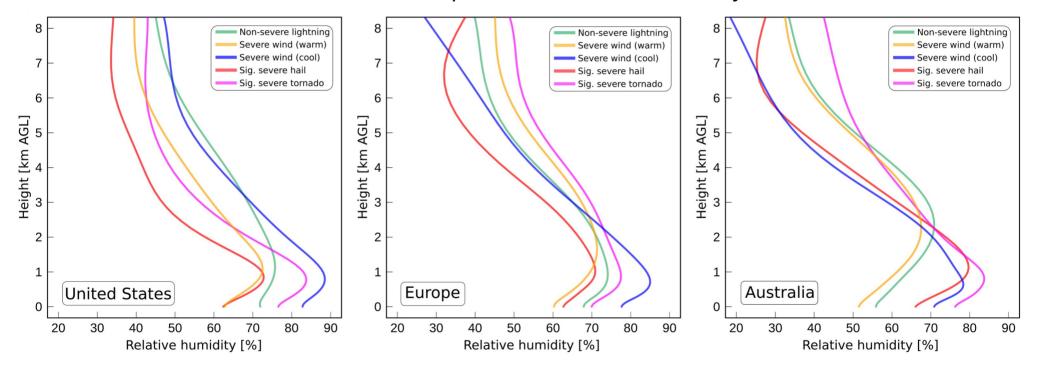


Figure 2. Mean vertical profiles of relative humidity for non-severe lightning and convective hazards across the United States, Europe and Australia.



## Mean vertical profiles of wind speed

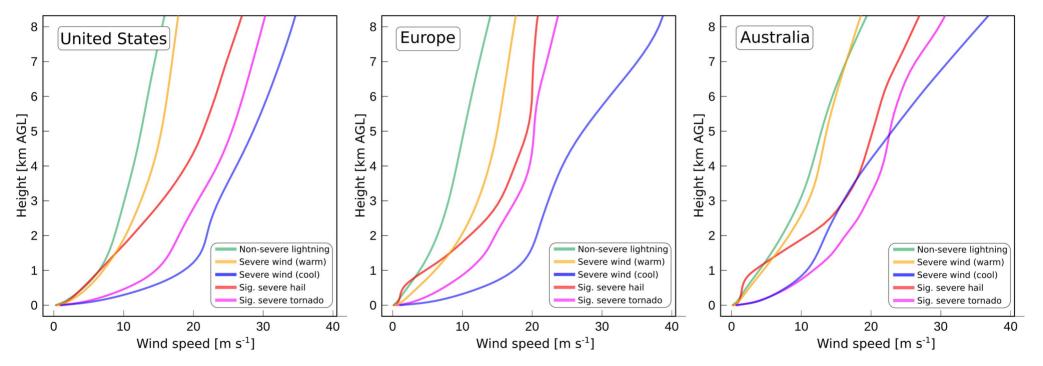


Figure 3. Mean vertical profiles of wind speed for non-severe lightning and convective hazards across the United States, Europe and Australia.



## Mean vertical profiles of theta-e

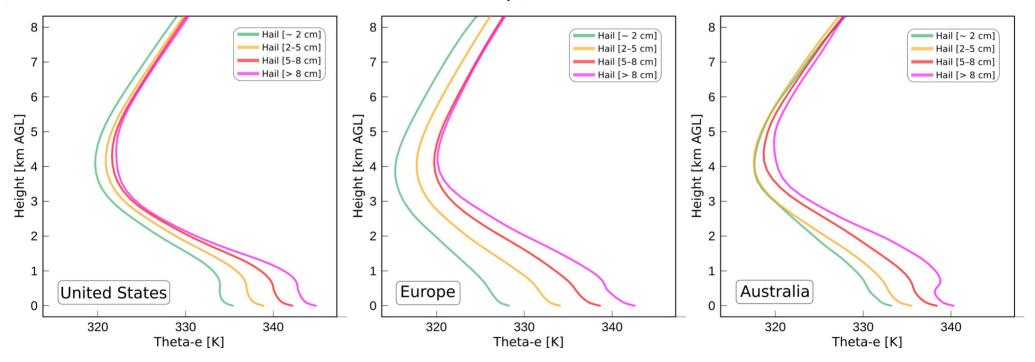


Figure 4. Mean vertical profiles of equivalent potential temperature for various hailstone sizes across the United States, Europe and Australia.







## **Tornado given lightning detection** (best predictors)

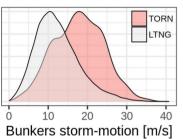








## **Tornado given lightning detection** (best predictors)

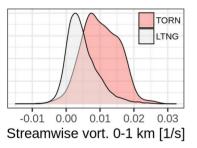


#### **United States**

1. Storm-motion vector (score: 100)

2. Effective shear (score: 83.6)

3. Mean wind 1-3 km (score: 80.7)

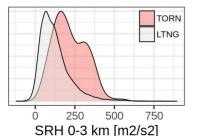


#### Europe

1. Streamwise vorticity 0-1 km (score: 83.5)

2. Storm-relative helicity 0-1 km (score: 80.4)

3. Bulk shear 0-1 km (score: 79.5)



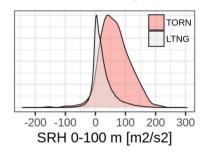
#### <u>Australia</u>

1. Storm-relative helicity 0-3 km (score: 93.6)

2. Relative humidity 0-1 km (score: 92.9)

3. Streamwise vorticity 0-3 km (score: 83.9)

#### **Combined best predictors**



1. Storm-relative helicity 0-100m

(score: 76.9)

2. Moisture flux 0-2 km

(score: 74.1)

3. Mean wind 1-3 km

(score: 73.2)

4. Streamwise vorticity 0-500m

(score: 72.3)

5. Bulk shear 0-2 km

(score: 70.9)







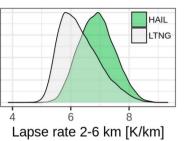
## Large hail given lightning detection (best predictors)





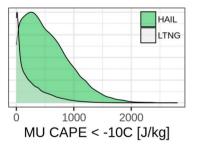


## Large hail given lightning detection (best predictors)



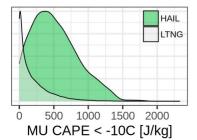
#### **United States**

- 1. Lapse rate 2-6 km (score: 100)
- 2. Storm-relative flow 0-2 km (score: 64.3)
- 3. Effective shear (score: 61.7)



#### **Europe**

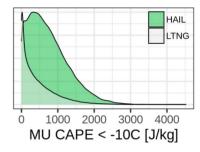
- 1. MU CAPE < -10°C (score: 99.9)
- 2. Effective shear (score: 84.8)
- 3. Storm-relative flow 0-2 km (score: 61.4)



#### <u>Australia</u>

- 1. MU CAPE  $< -10^{\circ}$ C (score: 99.7)
- 2. Effective shear (score: 84.7)
- 3. MU LI -10°C (score: 76.3)

#### **Combined best predictors**



- 1. MU CAPE < -10°C
  - (score: 82.6)
- 2. Effective shear (score: 75.0)
- 3. MU LI -10°C (score: 59.8)
- 4. Lapse rate 3-6 km
  - (score: 58.5)
- 5. Storm-relative winds 0-2 km

(score: 56.4)







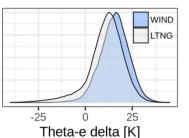
## Severe wind given lightning detection (best predictors)







## **Severe wind given lightning detection** (best predictors)

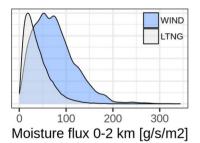


#### **United States**

1. Delta theta-e (score: 94.7)

2. DCAPE (score: 92.9)

3. Cold pool strength (score: 85.9)

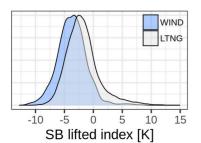


#### **Europe**

1. Moisture flux 0-2 km (score: 100)

2. Precipitable water (score: 72.9)

3. Mean wind 0-3 km (score: 72.3)



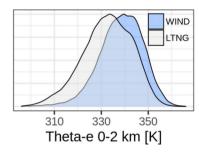
#### <u>Australia</u>

1. SB LI (score: 84.2)

2. SB CAPE (score: 76.9)

3. Cold pool strength (score: 75.9)

## **Combined best predictors**



1. Mean theta-e 0-2 km

(score: 64.8)

2. Cold pool strength

(score: 63.8)

3. Precipitable water

(score: 61.3)

4. DCAPE

(score: 61.1)

5. Delta theta-e 0-4 km

(score: 54.9)







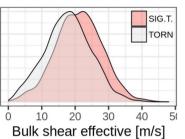
## Significant tornado given tornado (best predictors)







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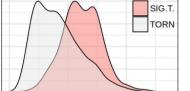


#### **United States**

1. Effective shear (score: 99.8)

2. Storm-motion vector (score: 97.3)

3. Mean wind 0-3 km (score: 80.4)



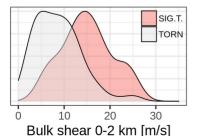
20 40 Total shear 0-3 km [m/s]

#### Europe

1. Total shear 0-3 km (score: 95.9)

2. Effective shear (score: 87.9)

3. Bulk shear 0-3 km (score: 85.8)



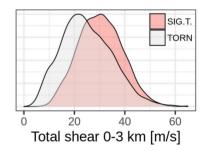
#### <u>Australia</u>

1. Bulk shear 0-2 km (score: 95.8)

2. Storm-relative helicity 0-3 km (score: 94.7)

3. Total shear 0-3 km (score: 80.2)

#### **Combined best predictors**



1. Total shear 0-3 km (score: 81.2)

2. Effective shear (score: 80.6)

3. Bulk shear 0-3 km (score: 80.2)

4. Storm-motion vector (score: 69.1)

5. Mean wind 1-3 km (score: 68.9)







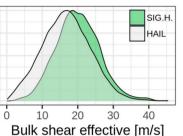
Very large hail given large hail (best predictors)





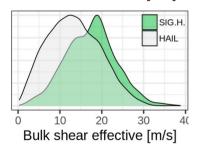


## Very large hail given large hail (best predictors)



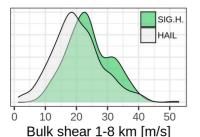
#### **United States**

- 1. Effective shear (score: 100)
- 2. Storm-relative winds in HGL (score: 84.2)
- 3. Bulk shear 1-6 km (score: 80.3)



#### **Europe**

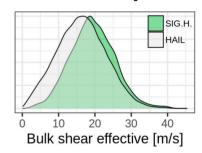
- 1. Effective shear (score: 99.2)
- 2. Storm-relative winds in HGL (score: 95.8)
- 3. Bulk shear surface to -10°C (score: 90.9)



#### <u>Australia</u>

- 1. Bulk shear 1-8 km (score: 94.5)
- 2. Storm-relative winds 0-2 km (score: 90.8)
- 3. Storm-relative winds in HGL (score: 84.9)

### **Combined best predictors**



- 1. Effective shear (score: 91.3)
- 2. Storm-relative winds in HGL (score: 89.3)
- 3. Bulk shear surface to -10°C (score: 81.9)
- 4. Storm-relative winds 0-2 km (score: 77.4)
- 5. Bulk shear 1-8 km (score: 71.8)







## Very large hail vs significant tornado (best predictors)

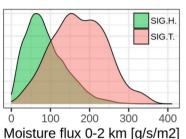






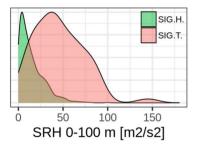


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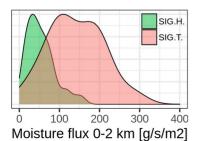
#### **United States**

- 1. Moisture flux 0-2 km (score: 100)
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- 3. Storm-motion vector (score: 84.3)



#### Europe

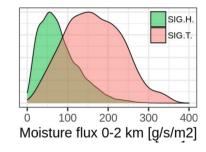
- 1. Storm-relative helicity 0-100 m (score: 96.7)
- 2. Streamwise vorticity 0-500 m (score: 87.8)
- 3. Mean wind 0-2 km (score: 82.1)



#### <u>Australia</u>

- 1. Moisture flux 0-2 km (score: 94.3)
- 2. Mean wind 0-1 km (score: 87.3)
- 3. Streamwise vorticity 0-500 m (score: 65.1)

#### **Combined best predictors**



1. Moisture flux 0-2 km

(score: 85.2)

2. Mean wind 0-1 km

(score: 81.6)

3. Storm-relative helicity 0-100 m

(score: 81.1)

4. Streamwise vorticity 0-500 m

(score: 73.9)

5. Bulk shear 0-500 m

(score: 70.6)



Skill of convective parameters for specific convective hazards is heavily driven by underlying local climatology (e.g. lapse rates or low-level jet in the U.S.). However, despite using markedly different datasets, some important common features were found:



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#### Large hail:

- buoyancy in below freezing layers
- low-level storm-relative wind
- (intensity) effective shear / storm-relative winds in HGL



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#### **Tornado:**

- low-level storm-relative helicity and streamwise vorticity
- low-level moisture flux
- (intensity) total / bulk shear in 0-3 km layer



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#### **Tornado:**

- low-level storm-relative helicity and streamwise vorticity
- low-level moisture flux
- (intensity) total / bulk shear in 0-3 km layer

#### Severe wind:

- low-level theta-e profile (DCAPE / cold pool strength)
- precipitable water



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- (intensity) effective shear / storm-relative winds in HGL

#### **Tornado:**

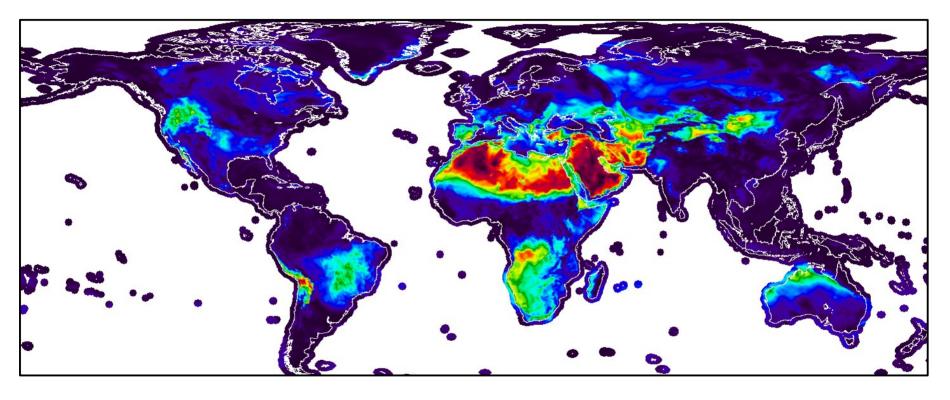
- low-level storm-relative helicity and streamwise vorticity
- low-level moisture flux
- (intensity) total / bulk shear in 0-3 km layer

#### Severe wind:

- low-level theta-e profile (DCAPE / cold pool strength)
- precipitable water

Future work will include data from South America and development of the machine learning model that will be used to study a global 80-year relationship between warming climate and convective hazards.





Interested in working with global ERA5 post-processed convective environment data?

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Large supercell on 22 May 2020 that produced 15 cm hailstones near Burkburnett in Texas (United States). Photography: Paulina Ćwik