### Phenomena of Intense Climatic Changes over the Territory of Ukraine and a Vision for the Extension of the Climatic Monitoring System

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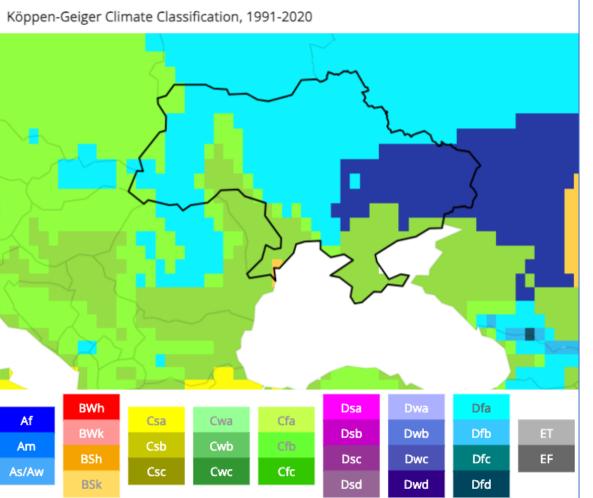
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### Goal and objectives

- Based on the spatio-temporal analysis of meteorological parameters for the period from 1901 to 2021, present evidence of dramatic changes of climatic conditions over the territory of Ukraine.
- The following metrics of meteorological and water balance parameters was analyzed: temperature, precipitation, Aridity Index, Potential and Actual evapotranspiration (ET), Standard Precipitation Index (SPI), and Standard Precipitation Evapotranspiration Index (SPEI).
- Hierarchical and Principal Component Analysis (PCA) clustering for periods prior and post temporal structural breaks/breakthroughs were used for mapping and zonation of the territory of Ukraine.

# According to the Koppen-Geiger classification, climate of Ukraine is mostly humid continental with hot summer

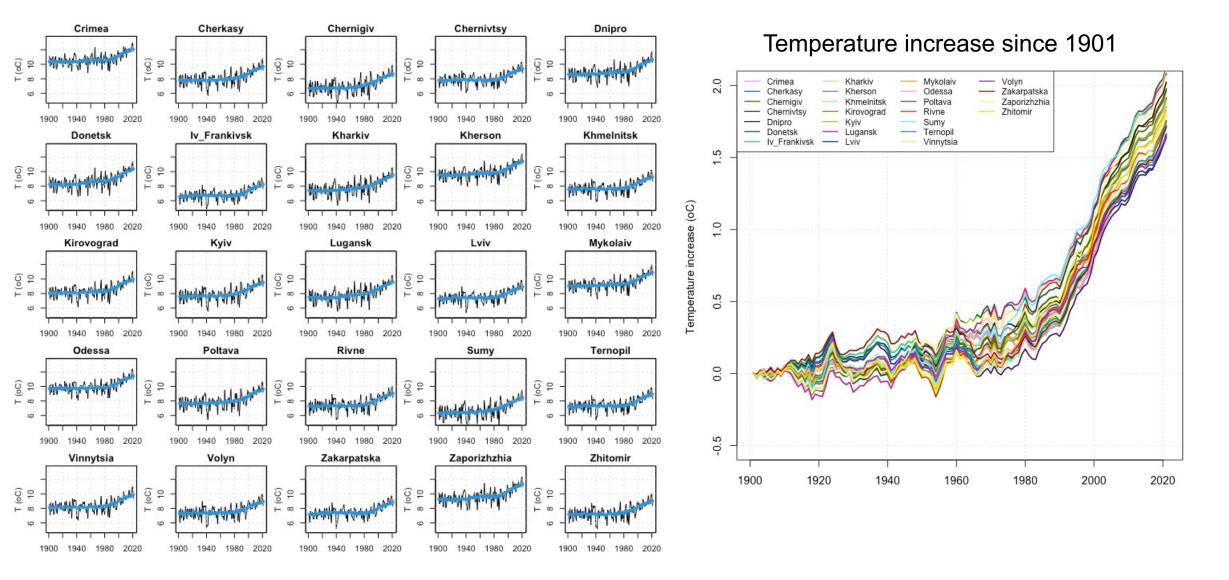


| Code | Description  | Group                 | Precipit<br>ation<br>Type | Level of Heat |
|------|--|-----------------------|---------------------------|---------------|
| Af   | Tropical rainforest climate  | Tropical              | Rainfor<br>est            |               |
| Cwa  | Monsoon-influenced<br>humid subtropical climate                                      | Temperate             | Dry<br>winter             | Hot summer    |
| Cwb  | Subtropical highland<br>climate or temperate<br>oceanic climate with dry<br>winters  | Temperate             | Dry<br>winter             | Warm summer   |
| Cwc  | Cold subtropical highland<br>climate or subpolar oceanic<br>climate with dry winters | Temperate             | Dry<br>winter             | Cold summer   |
| Dfa  | Hot-summer humid continental climate   | Cold<br>(continental) | Withou<br>t dry<br>season | Hot summer    |

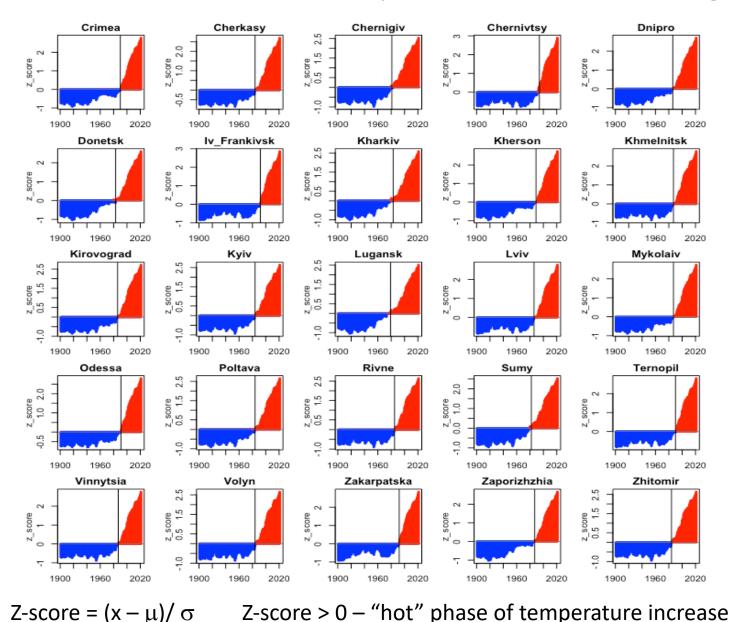
### Data sources and methods

- Data were downloaded from the Climate Change Knowledge Portal <u>https://climateknowledgeportal.worldbank.org/country/ukraine/climate-data-historical</u>
- Historical data at a resolution of 0.5°x0.5° (50km x 50km) were produced by the <u>Climatic</u> <u>Research Unit (CRU)</u> of University of East Anglia
  - 25 regions of Ukraine were analyzed
- Calculations were conducted with the application of the Rstudio platform using libraries:
  - zoo, xts. caTools, HydroTSM, pals, anytime, SPEI, dplyr, strucchange, ecdfHT, factoextra, maps, hydroTools,

# Time series of yearly temperature (black lines) and 30–year averaged temperature (blue lines)

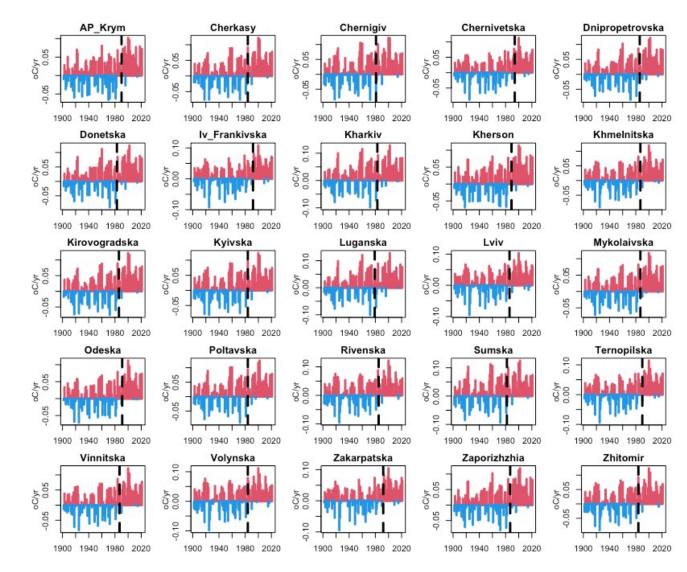


Z-score of temperature indicates that climate warming began in 1940s, and the "hot" phase of climate changes started in 1979-1994



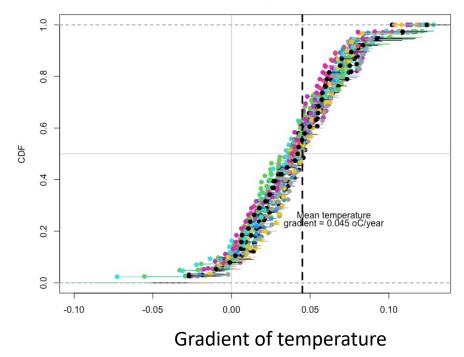
| Region               | Year |
|----------------------|------|
| Crimea               | 1990 |
|                      | 1990 |
| Cherkasy<br>Chamiain |      |
| Chernigiv            | 1981 |
| Chernivtsy           | 1994 |
| Dnipro               | 1986 |
| Donetsk              | 1983 |
| lv_Frankivsk         | 1992 |
| Kharkiv              | 1983 |
| Kherson              | 1989 |
| Khmelnitsk           | 1987 |
| Kirovograd           | 1986 |
| Kyiv                 | 1984 |
| Lugansk              | 1979 |
| Lviv                 | 1986 |
| Mykolaiv             | 1987 |
| Odessa               | 1991 |
| Poltava              | 1984 |
| Rivne                | 1985 |
| Sumy                 | 1982 |
| Ternopil             | 1990 |
| Vinnytsia            | 1987 |
| Volyn                | 1984 |
| Zakarpatska          | 1992 |
| Zaporizhzhia         | 1987 |
| Zhitomir             | 1984 |

## Temporal gradient of temperature increased during the "hot" phase of climate change



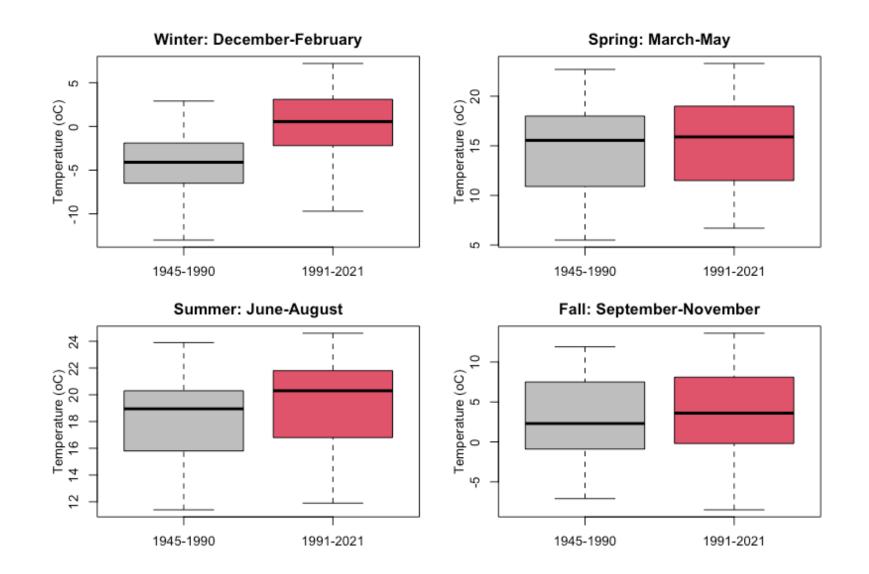
Cumulative distribution function of temporal gradient of temperature in the "hot" phase: average is 0.045 °C/year

CDF of the annual temperature gradient in the "hot" phase

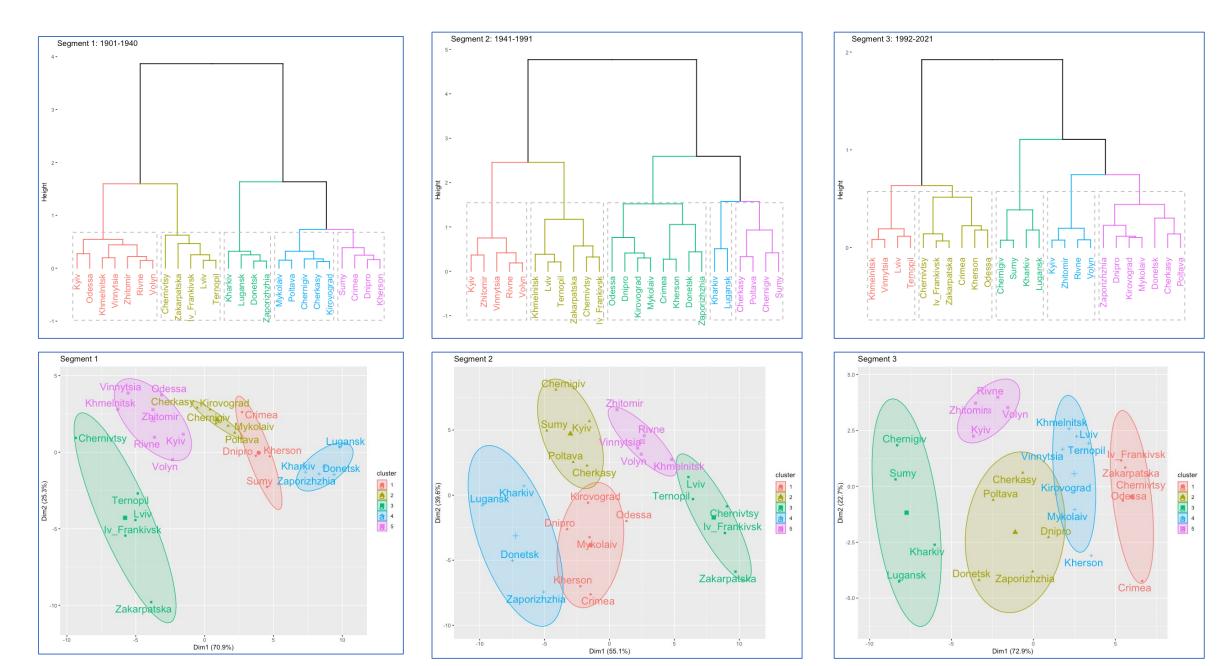


Vertical dashed lines are thresholds of time series of temperature—beginning of the "hot" phase

# Temperature increased more significantly in winter and summer (Kyiv region)



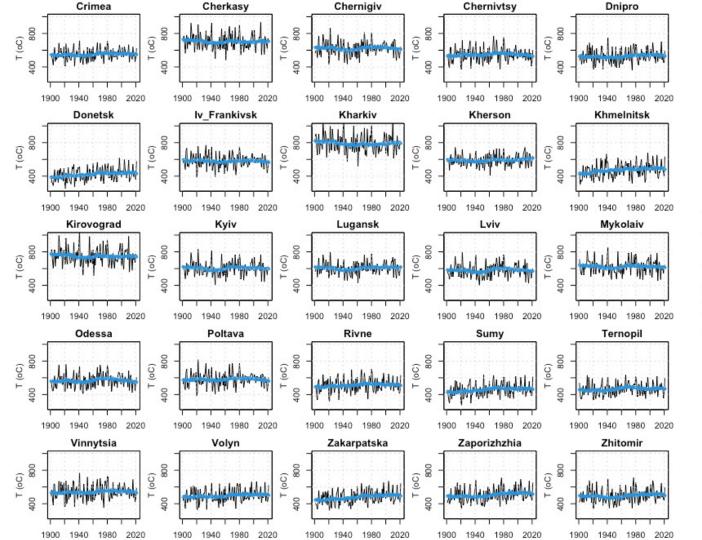
#### Hierarchical and PCA clustering of Ukraine based on temperature



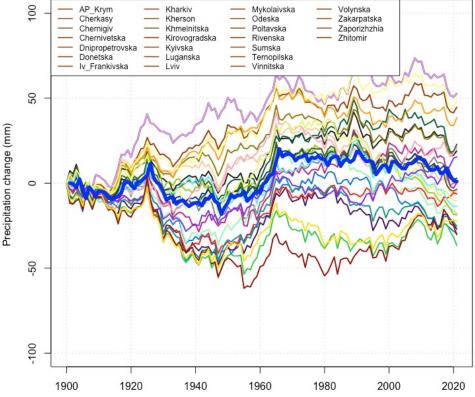
### Comparison of clusters of temperature for different regions

| Column1      | 1901-1941 | 1941-1991 | 1992-2021 |
|--------------|-----------|-----------|-----------|
| Crimea       | 1         | 1         | 1         |
| Cherkasy     | 2         | 2         | 2         |
| Chernigiv    | 2         | 2         | 3         |
| Chernivtsy   | 3         | 3         | 1         |
| Dnipro       | 1         | 1         | 2         |
| Donetsk      | 4         | 4         | 2         |
| lv_Frankivsk | 3         | 3         | 1         |
| Kharkiv      | 4         | 4         | 3         |
| Kherson      | 1         | 1         | 4         |
| Khmelnitsk   | 5         | 5         | 4         |
| Kirovograd   | 2         | 1         | 4         |
| Kyiv         | 5         | 2         | 5         |
| Lugansk      | 4         | 4         | 3         |
| Lviv         | 3         | 3         | 4         |
| Mykolaiv     | 2         | 1         | 4         |
| Odessa       | 5         | 1         | 1         |
| Poltava      | 2         | 2         | 2         |
| Rivne        | 5         | 5         | 5         |
| Sumy         | 1         | 2         | 3         |
| Ternopil     | 3         | 3         | 4         |
| Vinnytsia    | 5         | 5         | 4         |
| Volyn        | 5         | 5         | 5         |
| Zakarpatska  | 3         | 3         | 1         |
| Zaporizhzhia | 4         | 4         | 2         |
| Zhitomir     | 5         | 5         | 5 _       |

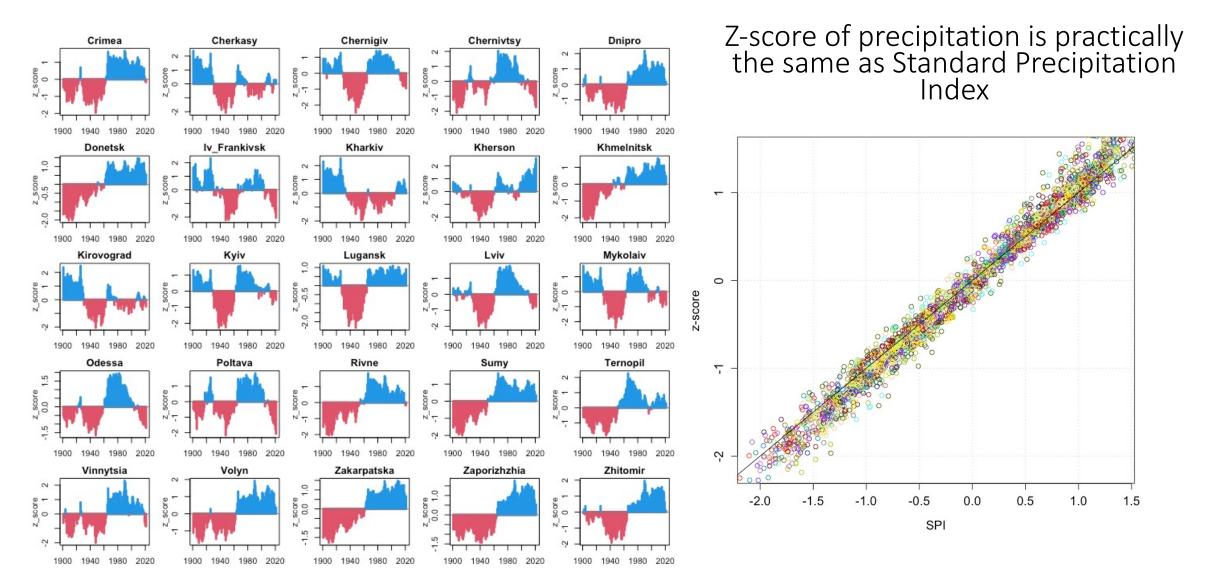
# Time series of yearly precipitation (black lines) and 30–year averaged temperature (blue lines)



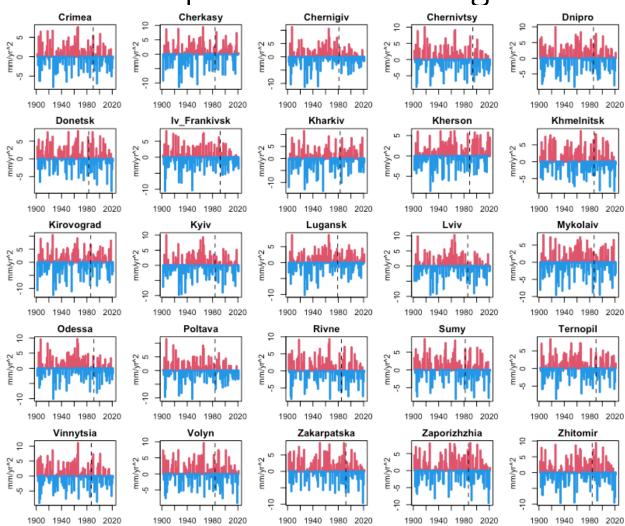




#### z-score of precipitation vs. time

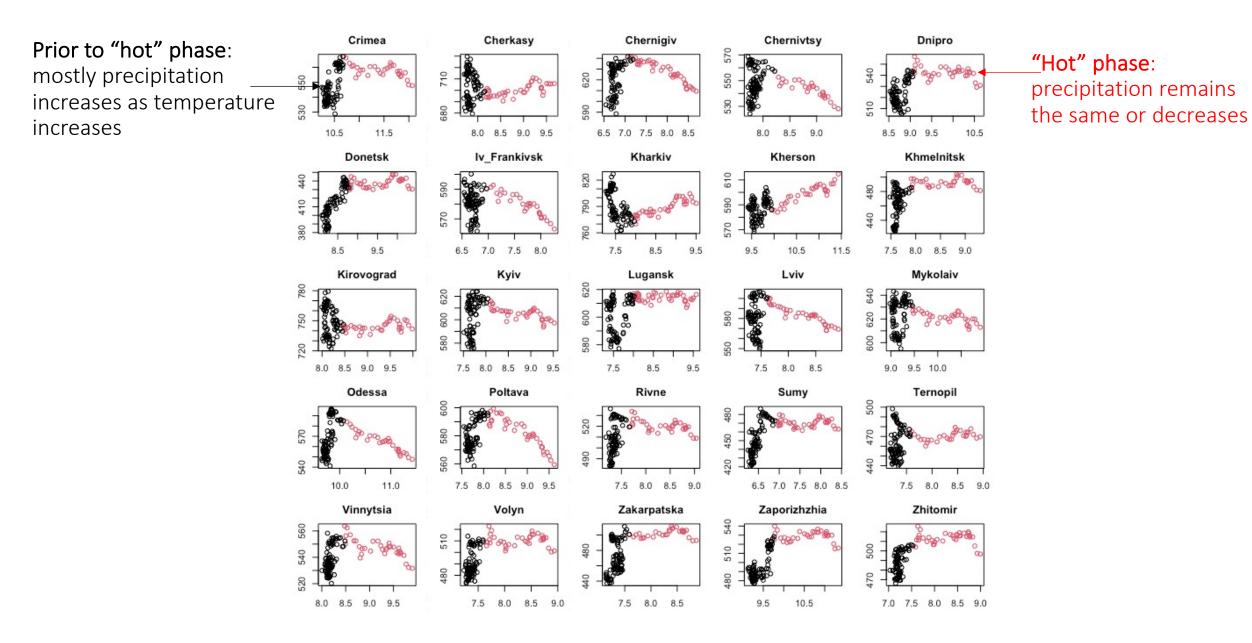


# Temporal gradient of precipitation decreases during the hot phase of warming

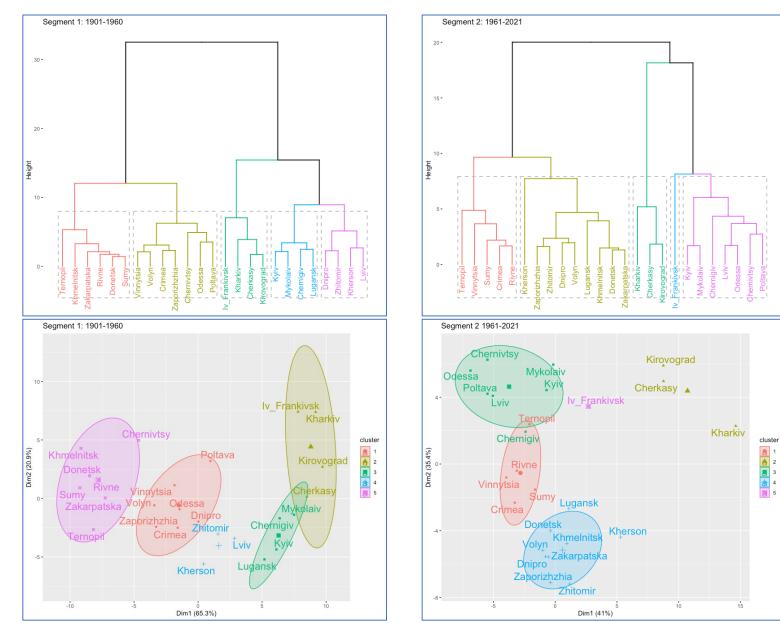


Vertical dashed lines are thresholds of time series of temperature—beginning of the "hot" phase

#### Relationship between temperature vs precipitation changes with time



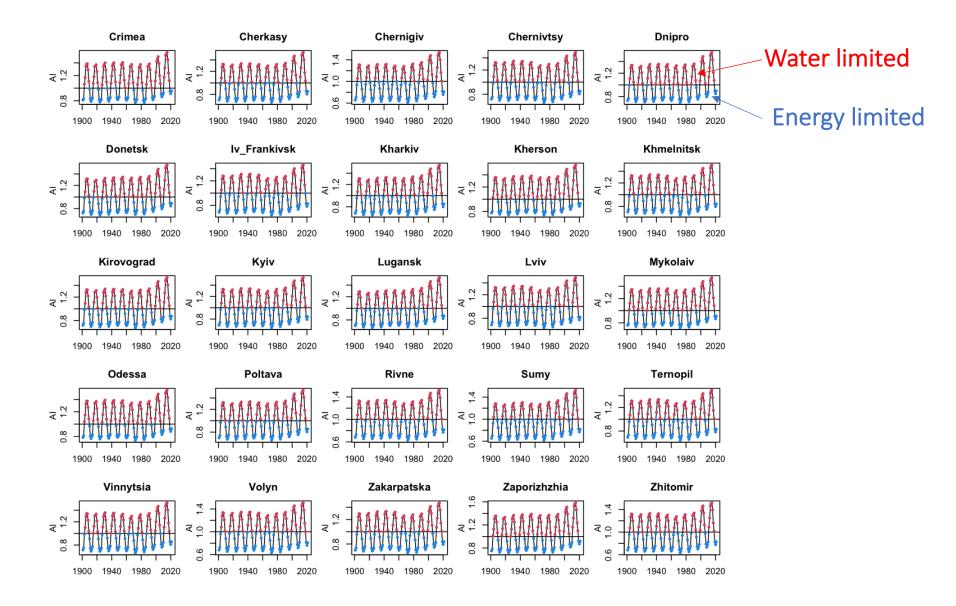
## Hierarchical and PCA clustering and zonation of Ukraine based on precipitation



#### **Cluster numbers**

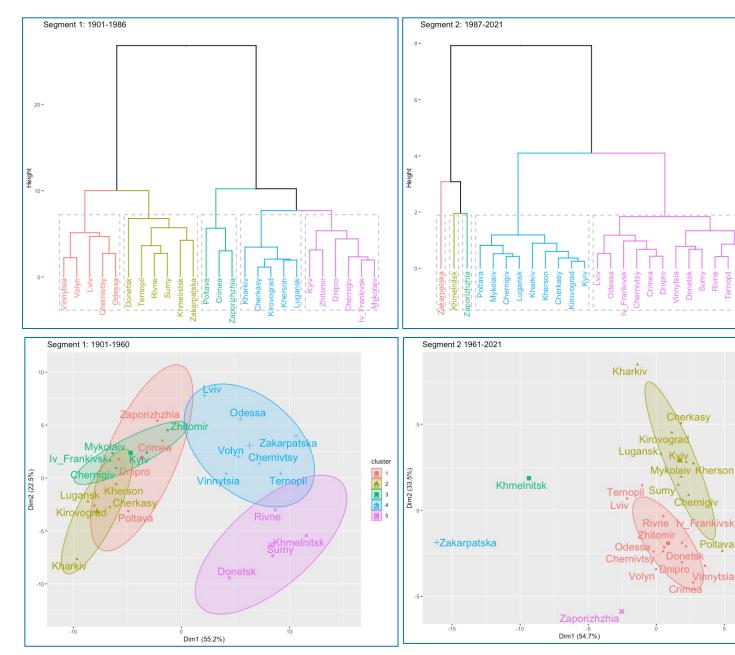
|              | 1901-1960 | 1961-2021 |
|--------------|-----------|-----------|
| Crimea       | 1         | 1         |
| Cherkasy     | 2         | 2         |
| Chernigiv    | 3         | 3         |
| Chernivtsy   | 5         | 3         |
| Dnipro       | 1         | 4         |
| Donetsk      | 5         | 4         |
| lv_Frankivsk | 2         | 5         |
| Kharkiv      | 2         | 2         |
| Kherson      | 4         | 4         |
| Khmelnitsk   | 5         | 4         |
| Kirovograd   | 2         | 2         |
| Kyiv         | 3         | 3         |
| Lugansk      | 3         | 4         |
| Lviv         | 4         | 3         |
| Mykolaiv     | 3         | 3         |
| Odessa       | 1         | 3         |
| Poltava      | 1         | 3         |
| Rivne        | 5         | 1         |
| Sumy         | 5         | 1         |
| Ternopil     | 5         | 1         |
| Vinnytsia    | 1         | 1         |
| Volyn        | 1         | 4         |
| Zakarpatska  | 5         | 4         |
| Zaporizhzhia | 1         | 4         |
| Zhitomir     | 4         | 4         |

#### Aridity Index increased during the "hot" phase



#### Hierarchical and PCA clustering of Ukraine based on SPEI

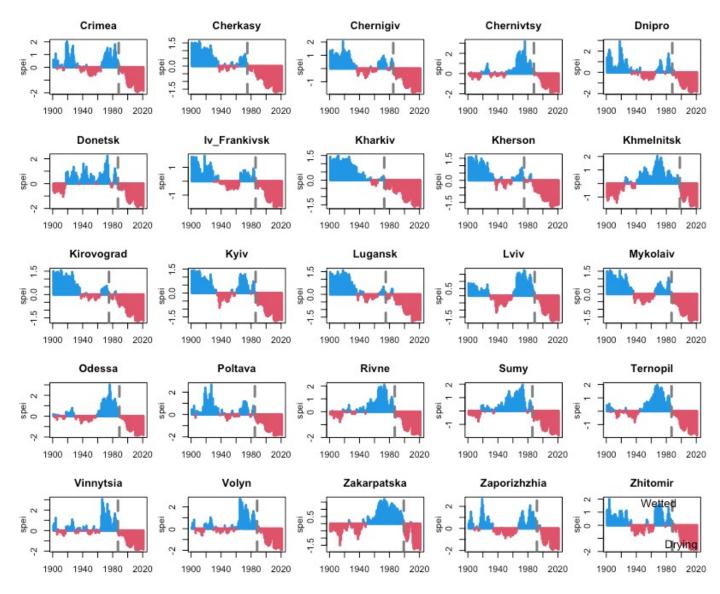
cluster



#### Clusters

| Column1      | 1901-1986 | 1987-2021 |
|--------------|-----------|-----------|
| Crimea       | 1         | 1         |
| Cherkasy     | 2         | 2         |
| Chernigiv    | 3         | 2         |
| Chernivtsy   | 4         | 1         |
| Dnipro       | 1         | 1         |
| Donetsk      | 5         | 1         |
| lv_Frankivsk | 3         | 1         |
| Kharkiv      | 2         | 2         |
| Kherson      | 2         | 2         |
| Khmelnitsk   | 5         | 3         |
| Kirovograd   | 2         | 2         |
| Kyiv         | 3         | 2         |
| Lugansk      | 2         | 2         |
| Lviv         | 4         | 1         |
| Mykolaiv     | 3         | 2         |
| Odessa       | 4         | 1         |
| Poltava      | 1         | 2         |
| Rivne        | 5         | 1         |
| Sumy         | 5         | 2         |
| Ternopil     | 4         | 1         |
| Vinnytsia    | 4         | 1         |
| Volyn        | 4         | 1         |
| Zakarpatska  | 4         | 4         |
| Zaporizhzhia | 1         | 5         |
| Zhitomir     | 3         | 1         |

### SPEI time series

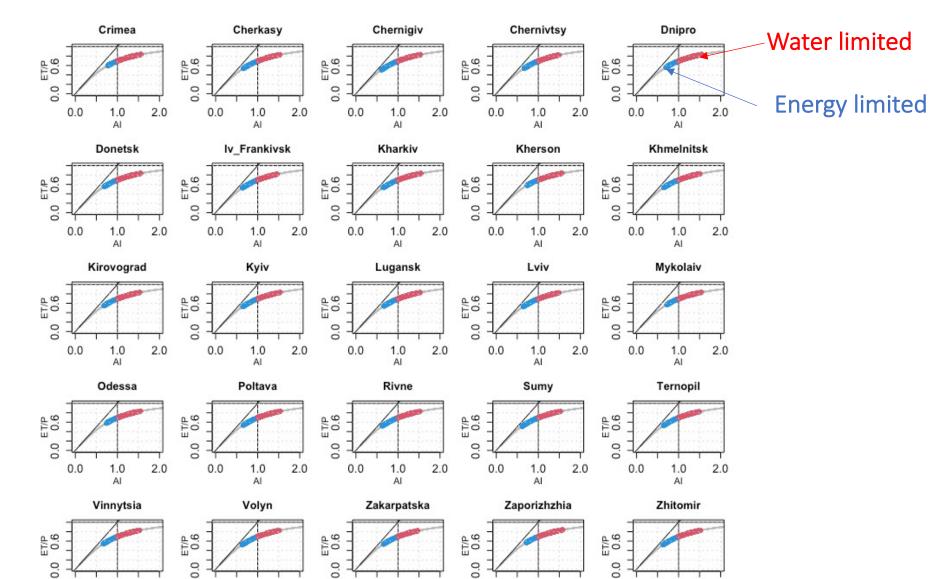


Vertical dashed lines are the beginning of the "hot" phase

#### Beginning of the "hot" phase

| -            | -    |
|--------------|------|
| Region       | Year |
| Crimea       | 1988 |
| Cherkasy     | 1975 |
| Chernigiv    | 1985 |
| Chernivtsy   | 1988 |
| Dnipro       | 1988 |
| Donetsk      | 1987 |
| lv_Frankivsk | 1986 |
| Kharkiv      | 1973 |
| Kherson      | 1975 |
| Khmelnitsk   | 1998 |
| Kirovograd   | 1975 |
| Kyiv         | 1986 |
| Lugansk      | 1975 |
| Lviv         | 1989 |
| Mykolaiv     | 1987 |
| Odessa       | 1989 |
| Poltava      | 1985 |
| Rivne        | 1987 |
| Sumy         | 1986 |
| Ternopil     | 1987 |
| Vinnytsia    | 1987 |
| Volyn        | 1988 |
| Zakarpatska  | 1999 |
| Zaporizhzhia | 1992 |
| Zhitomir     | 1988 |
|              |      |

#### ET/P vs Aridity index plotted on the SOB curve



1.0 Al

2.0

0.0

1.0

AI

2.0

0.0

SOB -- Schreiber-Ol'dekop-Budyko curve

0.0

1.0 Al 2.0

2.0

0.0

1.0

AI

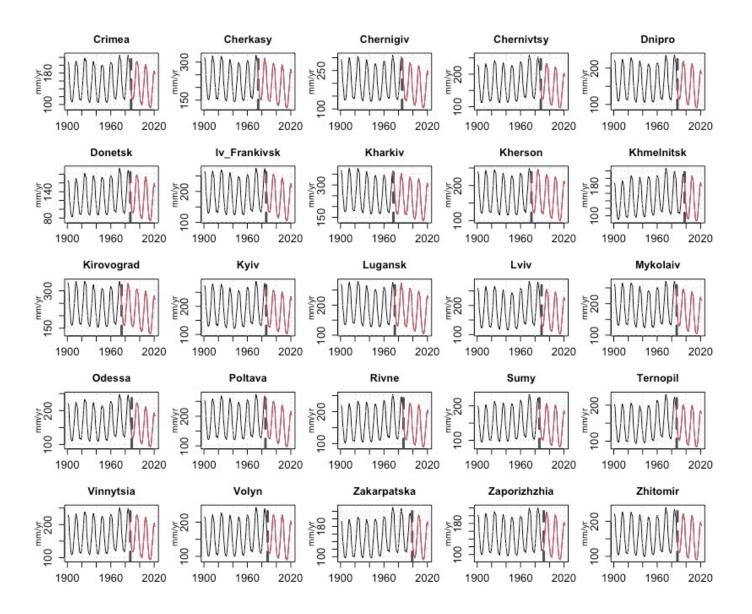
2.0

1.0

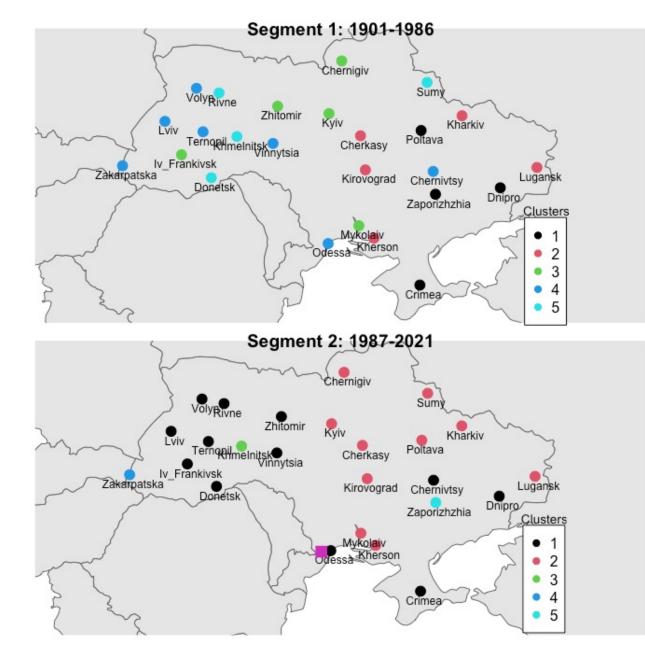
AI

0.0

## Infiltration/groundwater recharge+surface runoff decreased during the "hot" phase



### Mapping/zonation of Ukraine based on SPEI



### Conclusions

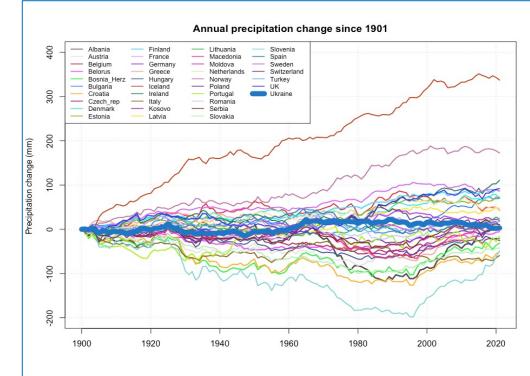
- Based on the statistical analysis of 25 regions of Ukraine, the country has been experiencing spatio-temporal changes of climatic conditions since the 1940s, with a drastic increase ('hot" phase) since the 1980s.
- Z-score and temporal gradient time series can be used as statistical tools to identify the temporal trends of climatic conditions of Ukraine.
- Clustering/zonation of the territory of Ukraine is different for the periods prior and during the 'hot' phase of the climatic changes, and it is different for temperature, precipitation and SPEI. The SPEI is an integrated climatic index to be used for the zonation and mapping of Ukraine.
- However, the obtained 2D spatio-temporal data are insufficient to explain the impact of climatic processes on land-atmosphere processes in Ukraine.

#### Examples of directions of future research

Hypothesis: an extension of the FLUXNET global network of eddy covariance towers over the territory of Ukraine will help construct reliable 3D climatic models and explain the impact of observed climatic changes on water cycle in Ukraine and surrounding European regions.



### Compare meteorological parameters of Ukraine and other European coutries



#### Examples of directions of future research

## Compare meteorological parameters of Ukraine and Europe

Expand the European Eddy Covariance network of towers into Ukraine

