



Agricultural monitoring for Ukraine in EU4UA

Prof. Kussul Nataliia

Department of Mathematical Modelling and Data Analysis
NTUU "Igor Sikorsky Kyiv Polytechnic Institute"

Who we are?

National Technical University of Ukraine «Kyiv Polytechnic Institute»

- Department of Mathematical Modelling and Data Analysis

Space Reserch Institute National Academy of Sciences of Ukraine

- Department of space information technologies and systems
- GEO Working Plan - **GEOGLAM, JECAM**
- **EuroGEO**
- **Copernicus Academy**





Our expertise

- Satellite monitoring
- Machine learning on satellite data
- Land cover/land use
- Geospatial intelligence

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Journals & Magazines > IEEE Geoscience and Remote Sensing Letters > Volume: 14 Issue: 5

Deep Learning Classification of Land Cover and Crop Types Using Remote Sensing Data

Publisher: IEEE

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Nataliia Kussul ; Mykola Lavreniuk ; Sergii Skakun ; Andrii Shelestov [All Authors](#)

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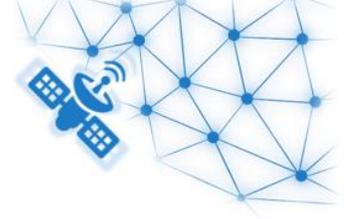


Abstract

Document
Sections

Abstract:

Deep learning (DL) is a powerful state-of-the-art technique for image processing including remote sensing (RS) images. This letter describes a multilevel DL architecture that targets land cover and crop type classification from multitemporal



Big data challenge - cloud computing required

- **EO4UA initiative**
- **NoR ESA Support within EU4UA Initiative**

Project Name: “Crop mapping and yield forecasting for Ukraine”

Main goal: The main objective is to use the **IaaS** service provided by the CREODIAS environment to classify crops and predict yields based on satellite and meteorological data available in the EO data repository.

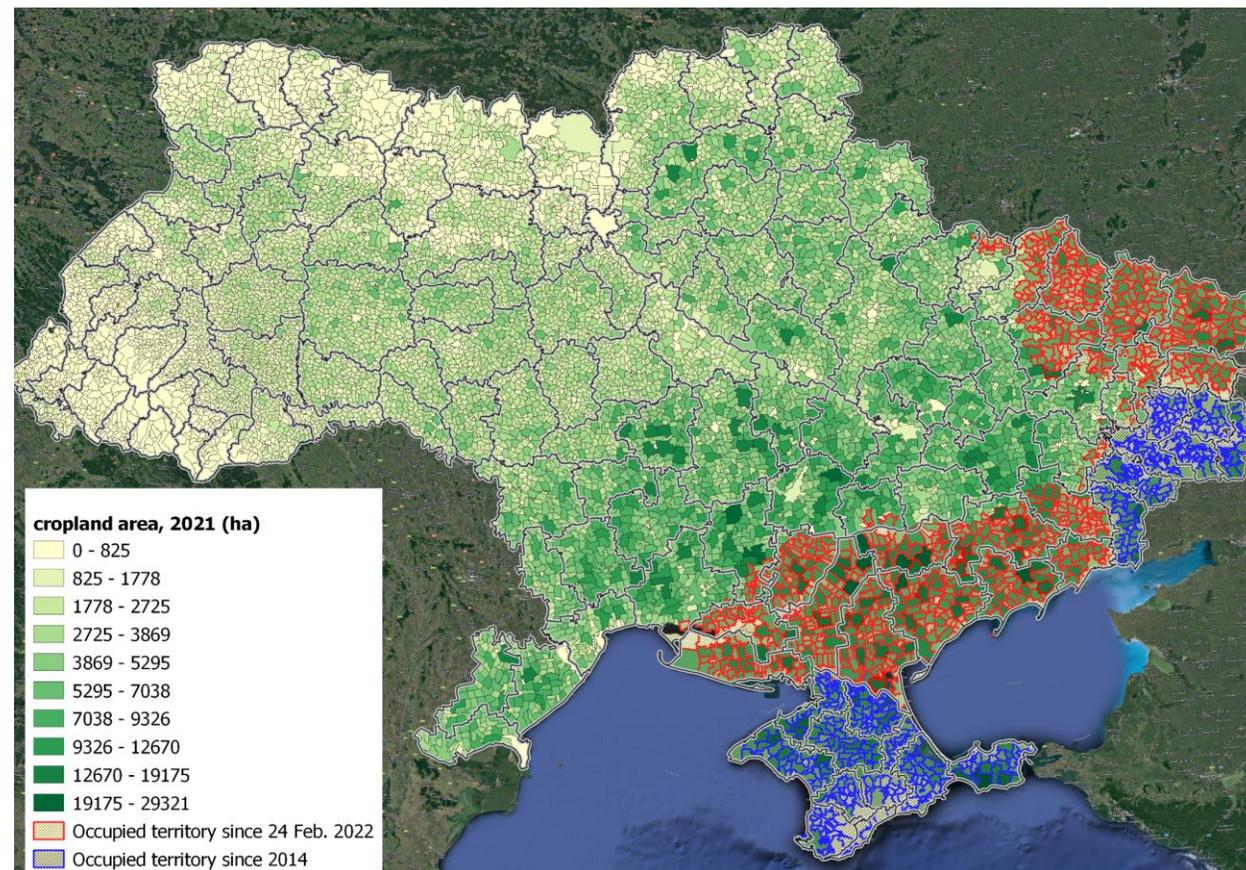
Service Provider: The **CREODIAS IaaS** service provided by the CloudFerro



Occupied cropland 2022

| In MLN ha | Occupied since 2014 | Occupied since 24 Feb. 2022 | Not occupied | Total MLN ha |
|-------------------|---------------------|-----------------------------|------------------|--------------|
| Cropland | 1,73 (5.6%) | 5,70 (18.3%) | 23,58 (76.1%) | 31,00 |
| Winter crops 2022 | 0,59 (6.6%) | 2,05 (22.9%) | 6,33 (70.5%) | 8,97 |

Total **occupied** cropland is **5.7 MLN ha**

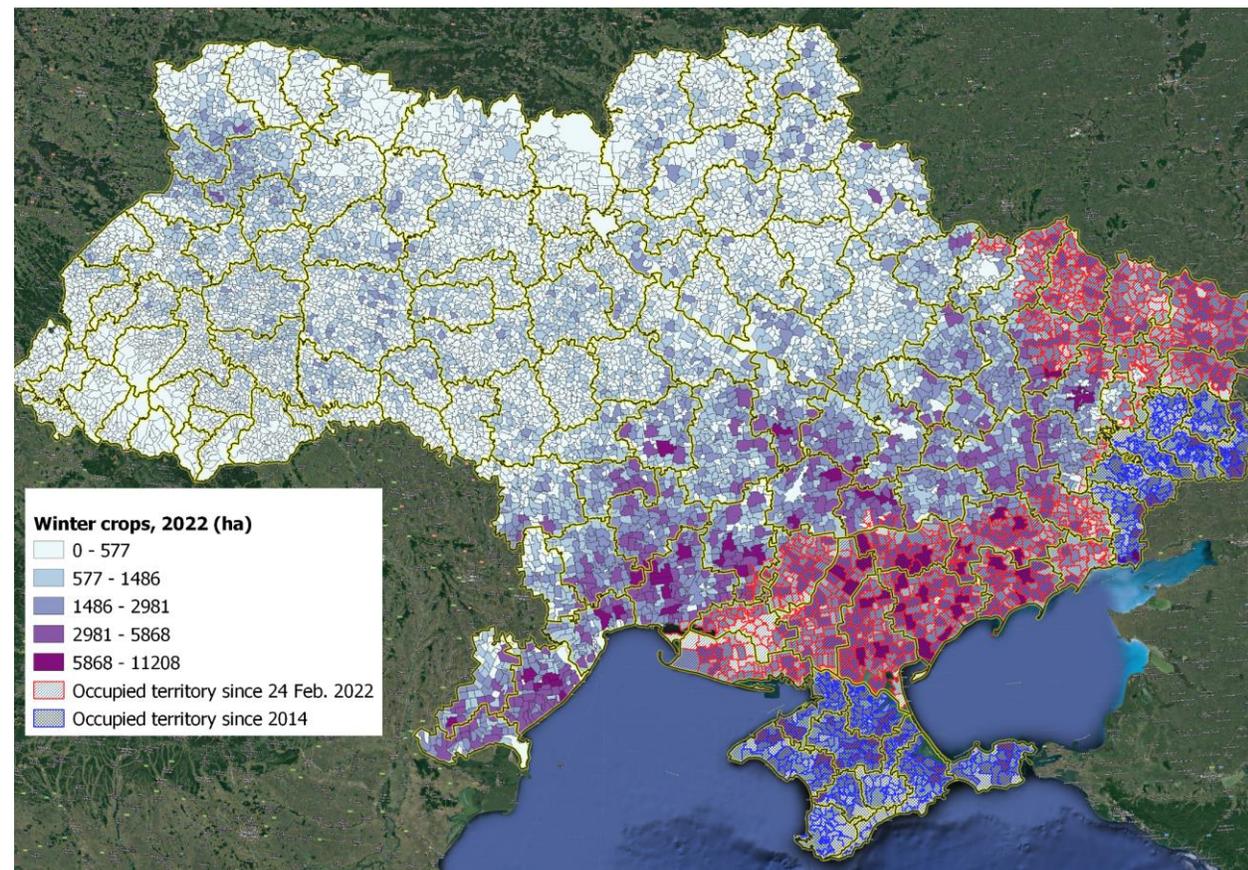




Occupied winter crops 2022

| In MLN ha | Occupied since 2014 | Occupied since 24 Feb. 2022 | Not occupied | Total |
|-------------------|---------------------|-----------------------------|------------------|-------|
| Cropland | 1,73 (5.6%) | 5,70 (18.3%) | 23,58 (76.1%) | 31,00 |
| Winter crops 2022 | 0,59 (6.6%) | 2,05 (22.9%) | 6,33 (70.5%) | 8,97 |

Total **occupied** winter crops is **2.05 MLN ha**

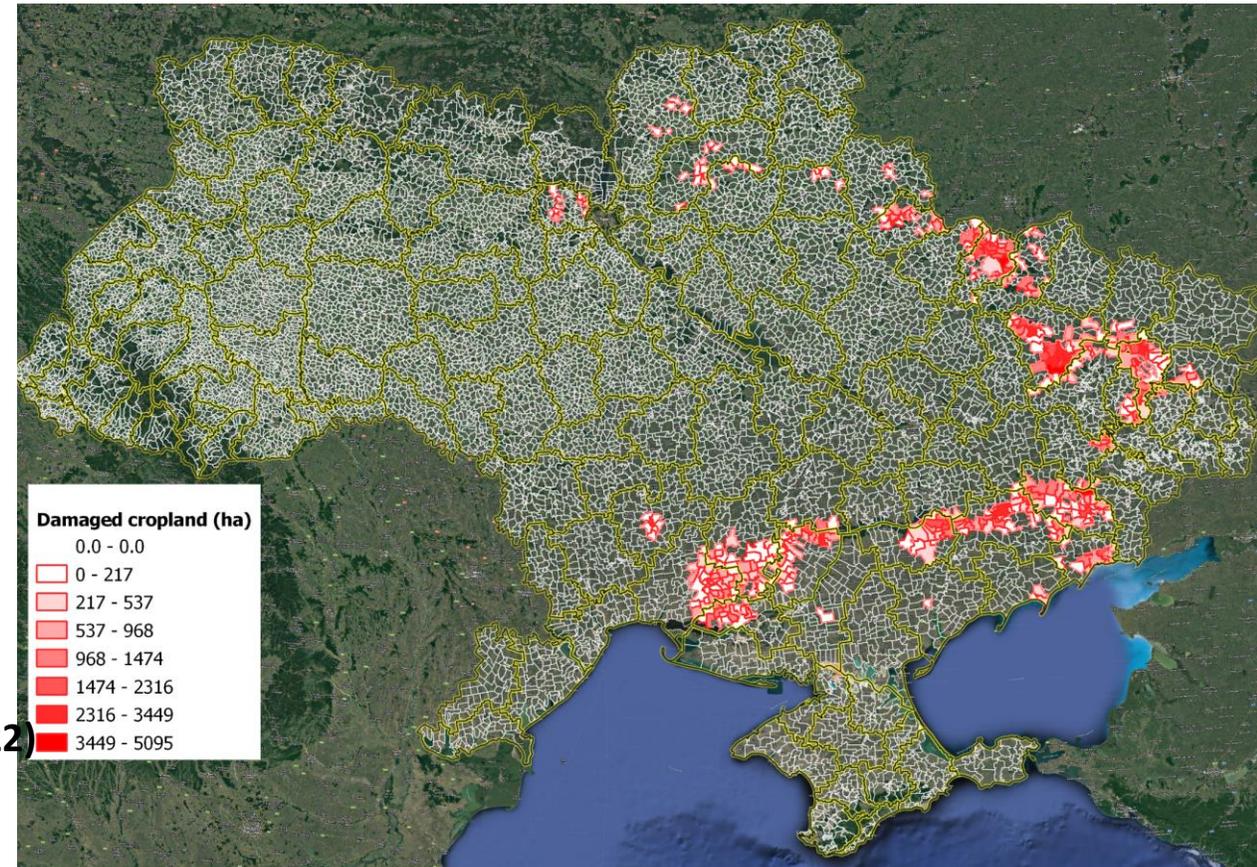




Damaged crops 2022

| In MLN ha | Occupied since 2014 | Occupied since 24 Feb. 2022 | Not occupied | Total |
|-------------------|---------------------|-----------------------------|------------------|-------|
| Cropland | 1,73 (5.6%) | 5,70 (18.3%) | 23,58 (76.1%) | 31,00 |
| Winter crops 2022 | 0,59 (6.6%) | 2,05 (22.9%) | 6,33 (70.5%) | 8,97 |

Direct damaged area is **272 th. ha** (as of 11 October 2022)





Damaged fields (examples)

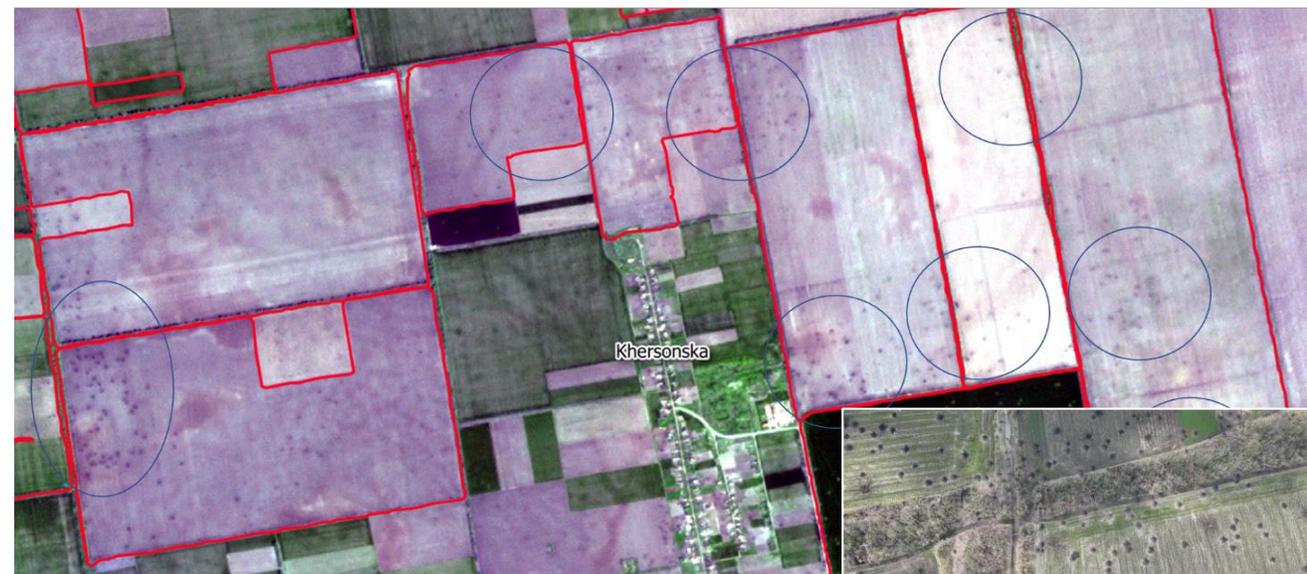
Zaporizka oblast, Vasylivskii region, Stepanohirska OTG

Sentinel-2



Khersonska oblast, Beryslavskii region, Novovorontsovska OTG

Sentinel-2



Kharkivska oblast, Izum

Drone



EO4UA



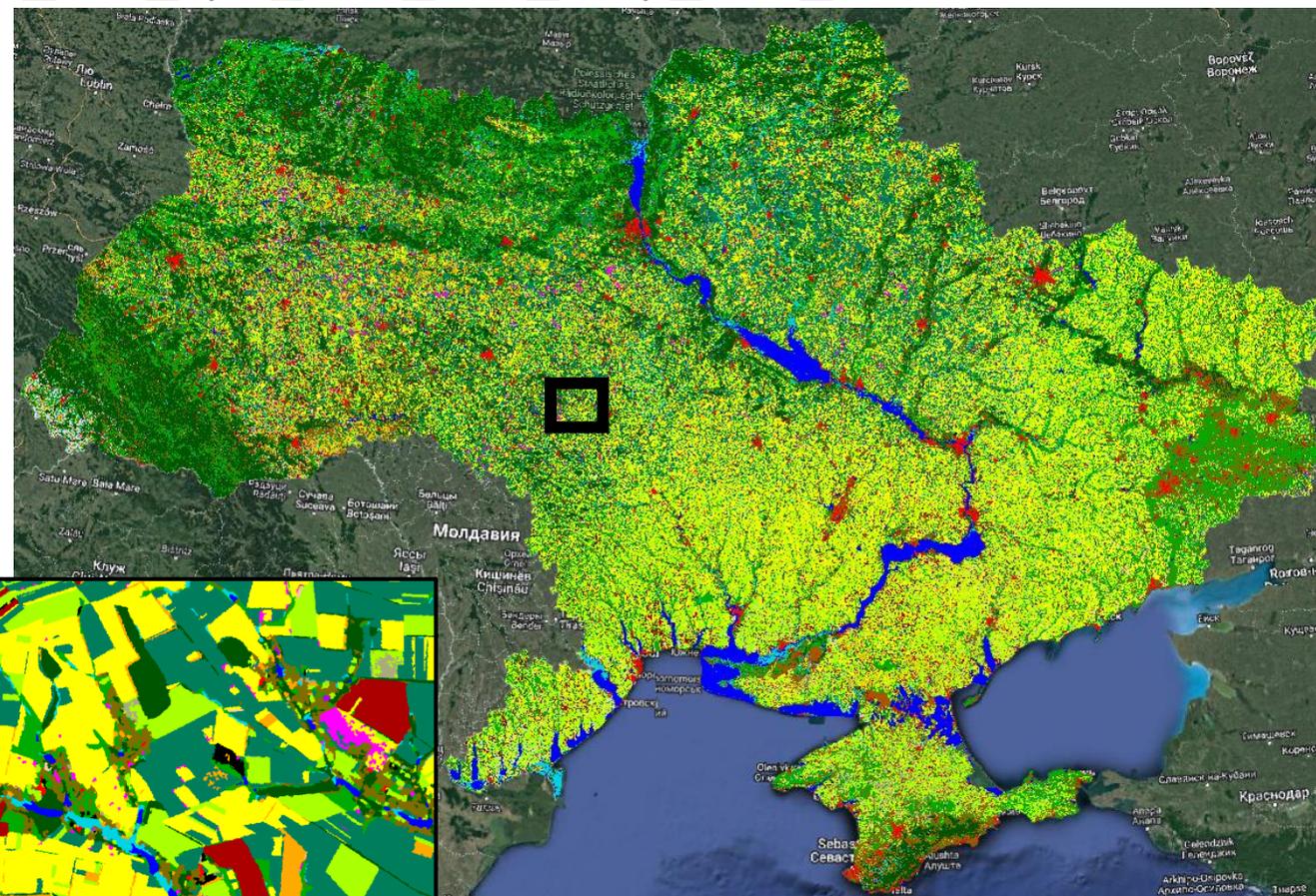


Classification in CREODIAS Cloud

Ukraine 2021

■ Artificial ■ Barley ■ Maize ■ Soybeans ■ Alfalfa ■ Forest ■ Bare land ■ Wetland ■ Gardens, parks ■ Grape
■ Wheat ■ Rapeseed ■ Sunflower ■ Peas ■ Other crops ■ Grassland ■ Water

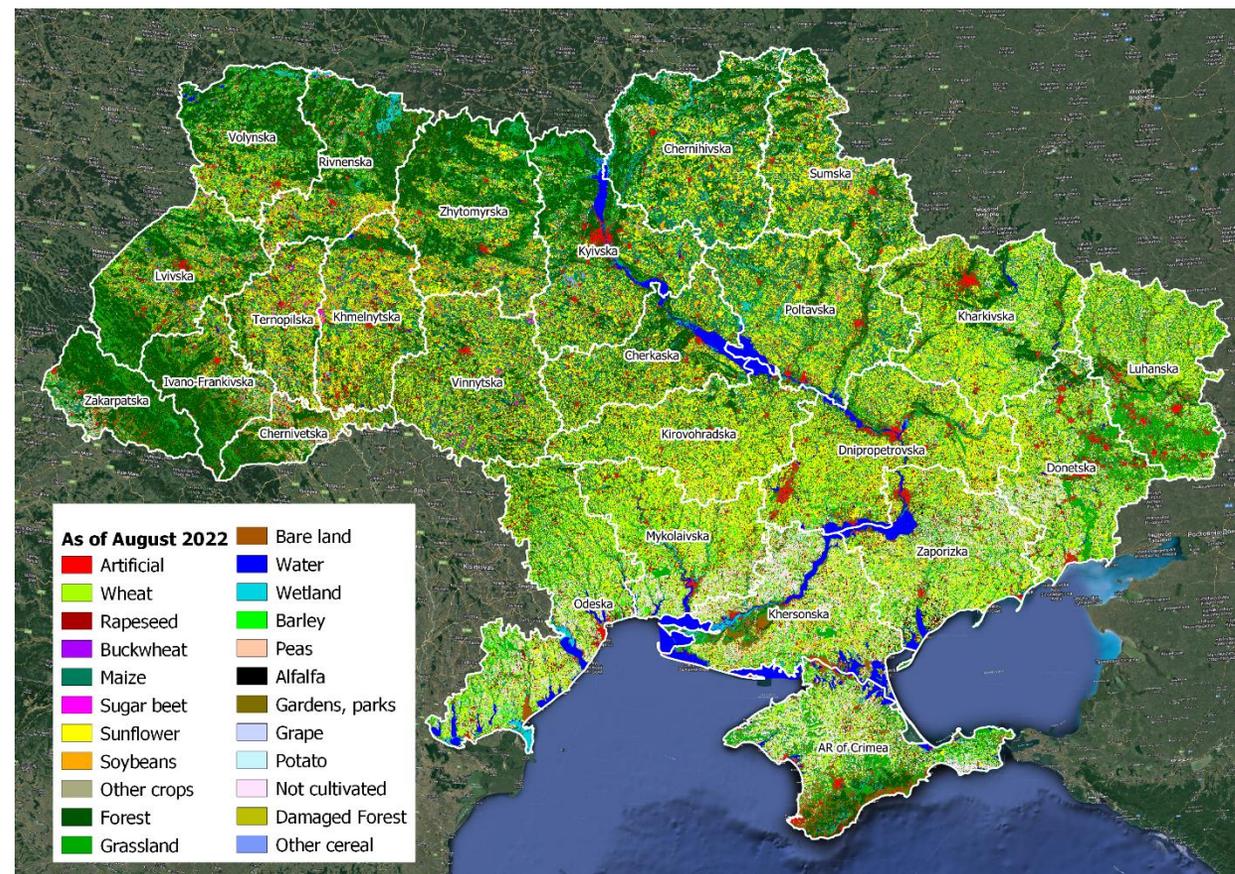
| Class | PA | UA | F1 |
|-------------------------|------|-------------|------|
| Artificial | 96,7 | 98,2 | 97,4 |
| Cereal | 98,6 | 99,8 | 99,2 |
| Rapeseed | 98,9 | 99,7 | 99,3 |
| Buckwheat | 93,1 | 57 | 70,7 |
| Maize | 97,7 | 98,3 | 98 |
| Sugar beet | 98,6 | 91,3 | 94,8 |
| Sunflower | 97,2 | 99,6 | 98,4 |
| Soybeans | 94,5 | 92,8 | 93,6 |
| Other crops | 75,5 | 44,5 | 56 |
| Forest | 99,3 | 98 | 98,7 |
| Grassland | 96,5 | 89,2 | 92,7 |
| Bareland | 96,9 | 44,9 | 61,4 |
| Water | 100 | 99,9 | 100 |
| Wetland | 92,6 | 83,1 | 87,6 |
| Peas | 89,3 | 92,7 | 91 |
| Alfalfa | 63,6 | 72,3 | 67,7 |
| Low trees | 76,9 | 86,5 | 81,4 |
| Grape | 91,2 | 86,4 | 88,7 |
| Overall Accuracy | | 97,6 | |





Summer crop classification 2022

| Class | PA (%) | UA (%) | F1 (%) |
|----------------|-----------------|--------|--------|
| Artificial | 93,2 | 98,5 | 95,8 |
| Wheat | 96,5 | 95,5 | 96 |
| Rapeseed | 99,9 | 100 | 100 |
| Buckwheat | 62,6 | 93,4 | 75 |
| Maize | 94,8 | 94,2 | 94,5 |
| Sugar beet | 100 | 86,7 | 92,9 |
| Sunflower | 98 | 98,5 | 98,2 |
| Soybeans | 80,3 | 84,2 | 82,2 |
| Other crops | 70,8 | 9,2 | 16,3 |
| Forest | 99,9 | 97,5 | 98,7 |
| Grassland | 95,3 | 85,2 | 90 |
| Bareland | 94,6 | 82,5 | 88,1 |
| Water | 99,6 | 100 | 99,8 |
| Wetland | 91,8 | 88,9 | 90,3 |
| Barley | 78,3 | 84,2 | 81,2 |
| Peas | 100 | 99,1 | 99,5 |
| Alfalfa | 94,8 | 83 | 88,5 |
| Gardens, parks | 83 | 97,1 | 89,5 |
| Grapes | 85,9 | 96,3 | 90,8 |
| Potato | 76,4 | 100 | 86,7 |
| | OA = 95% | | |

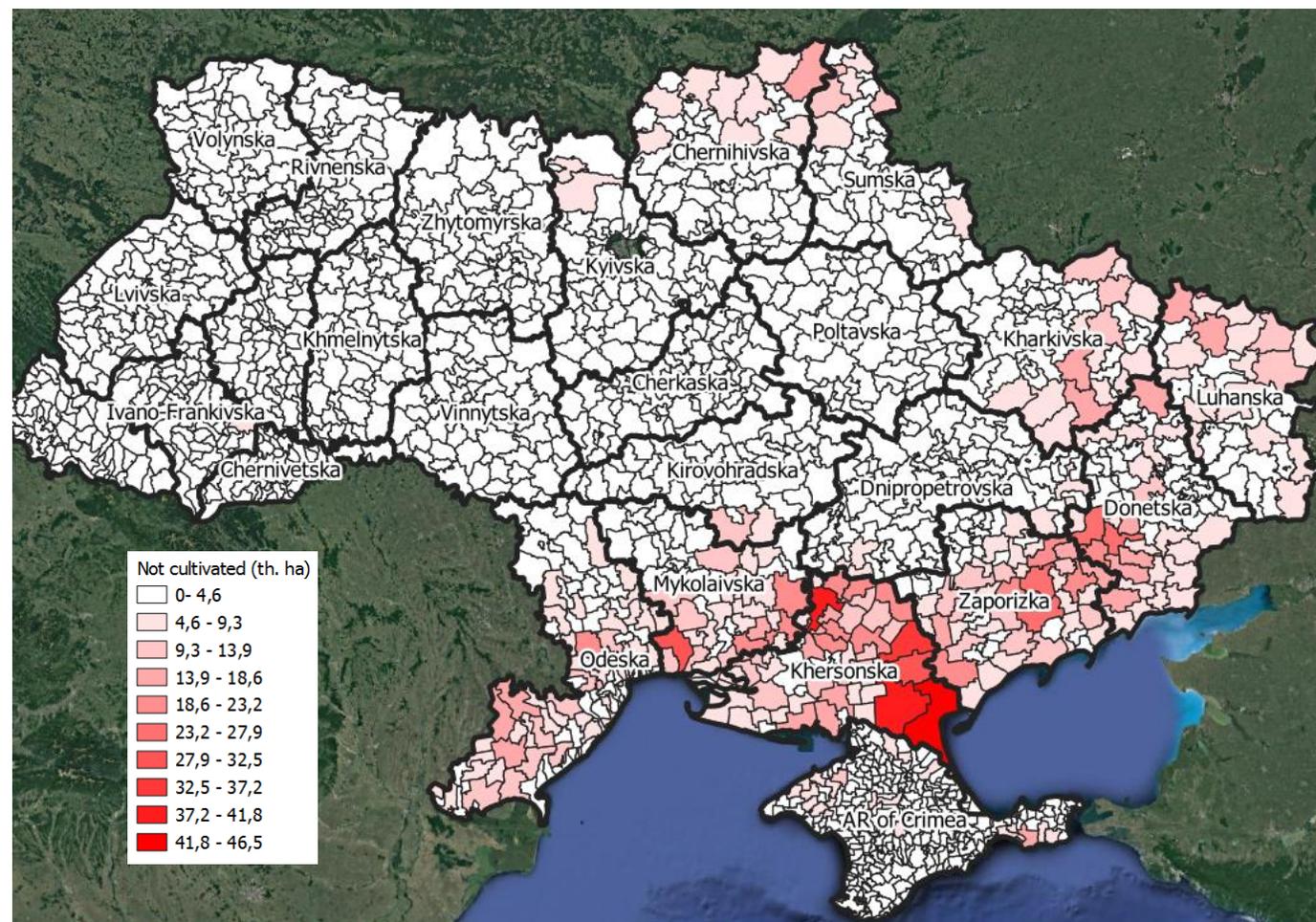




Identification of the non-cultivated Lands

| Oblast | Not cultivated cropland, 2022 |
|------------------------------------|-------------------------------|
| Biggest with uncultivated cropland | Th. ha |
| Khersonska | 672,5 |
| Odeska | 497,8 |
| Zaporizka | 476,1 |
| Mykolaivska | 321,8 |
| Donetska | 365,0 |
| Kharkivska | 196,8 |
| Luhanska | 192,8 |
| Dnipropetrovska | 148,0 |
| Sumska | 136,0 |

Total non cultivated area – **4.4 MLN ha**

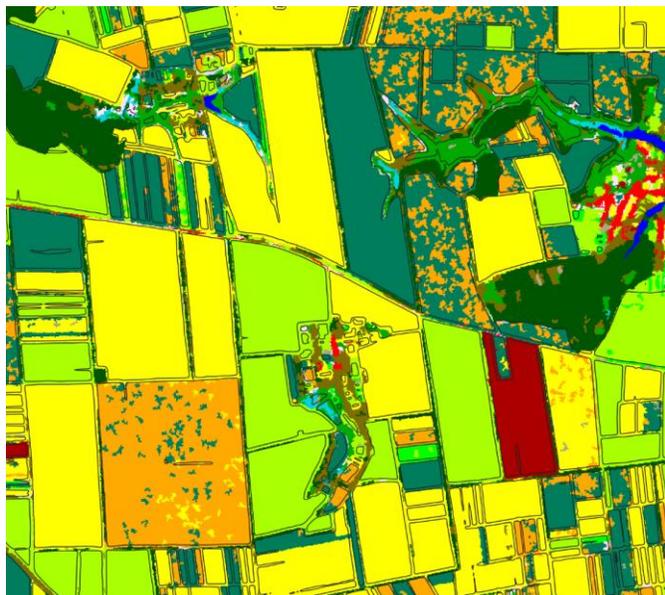




EO4UA synergy

- Parcels delineation (Synergise) has been used for crop type map filtering

Original map

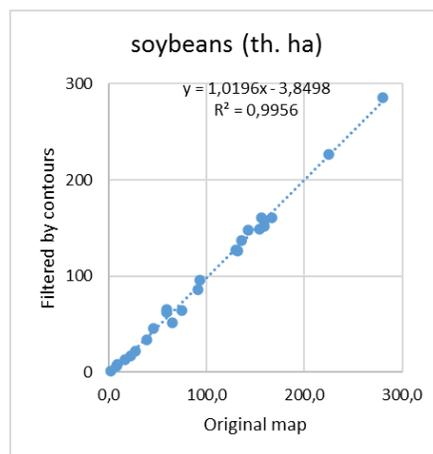
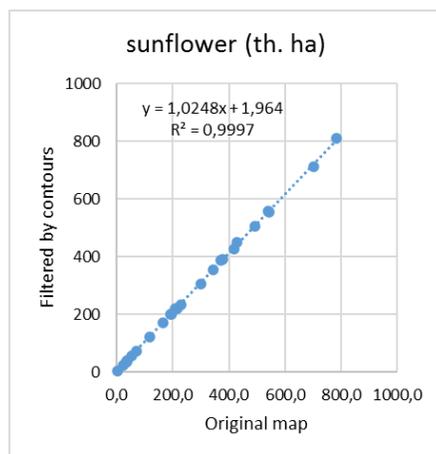
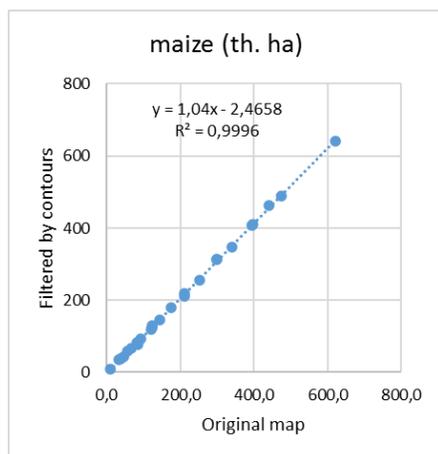
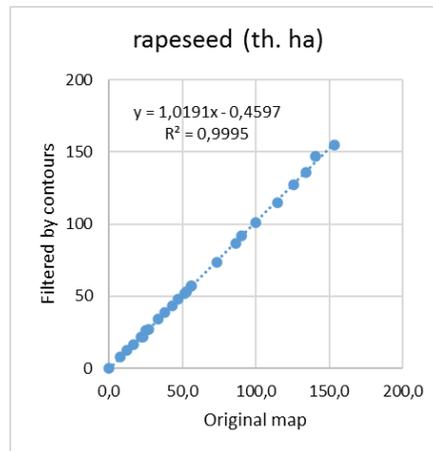
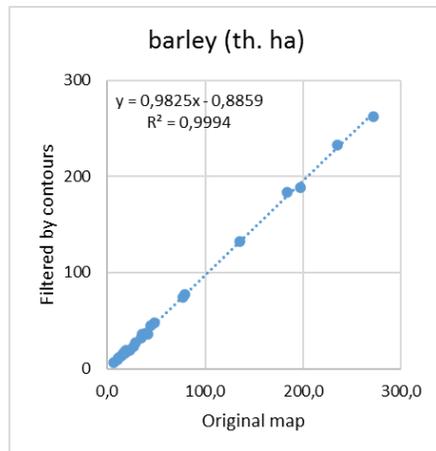
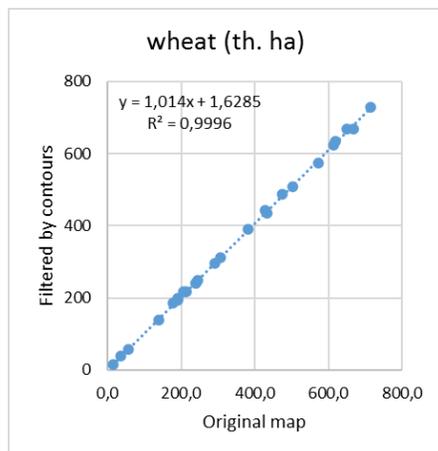


Filtered by contours

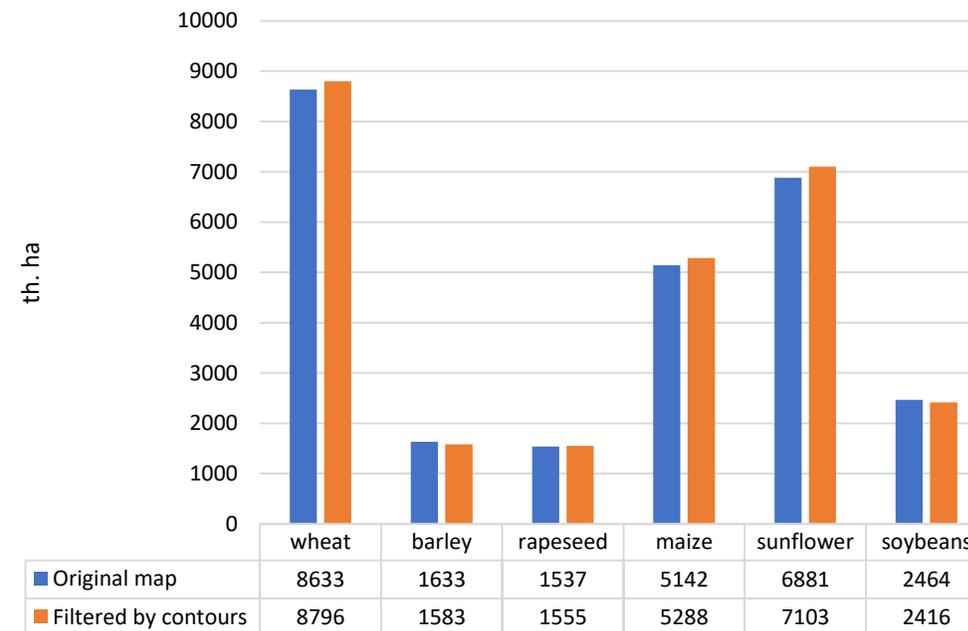




Area estimation (oblast level)



Comparison of "original" area and filtered by contours (country level)





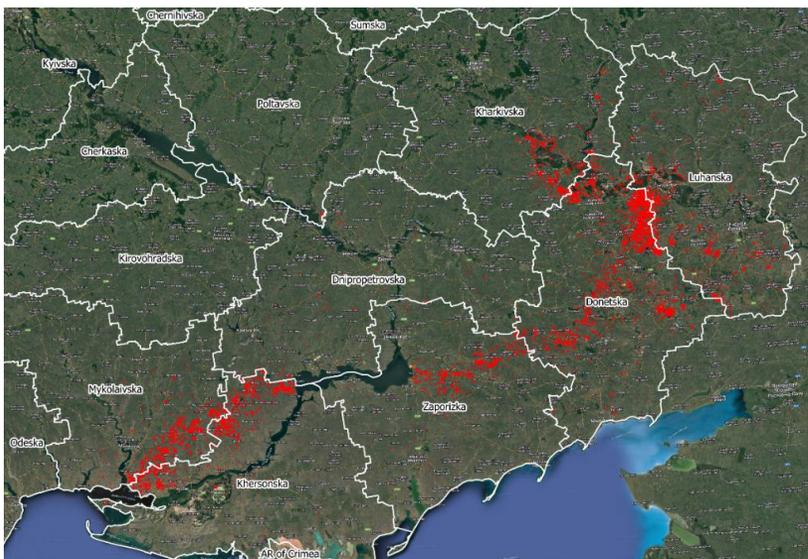
Fires detection (July 2022)

Overall burned area is **104.2 th. ha**

- 70 th. ha – cereal crops
- 7.8 th. ha – summer crops
- 25 th. ha – grassland

Damaged **317 th. tons** of grain

| | Cereal | Rapeseed | Summer crops | Grassland | Forest | Total (ha) |
|------------------------|---------|----------|--------------|-----------|--------|------------|
| Donetska | 25823,7 | 4,3 | 144,8 | 10122,6 | 266,3 | 36361,6 |
| Khersonska | 10843,2 | 87,3 | 4129,4 | 4684,9 | 150,6 | 19895,3 |
| Mykolaivska | 14556,3 | 41,0 | 1398,2 | 2964,9 | 286,8 | 19247,1 |
| Zaporizka | 9173,0 | 81,2 | 1774,7 | 1448,5 | 61,4 | 12538,8 |
| Luhanska | 3396,0 | 30,1 | 175,3 | 4859,1 | 287,7 | 8748,2 |
| Kharkivska | 5395,0 | 0,1 | 43,2 | 769,0 | 87,1 | 6294,4 |
| Dnipropetrovska | 745,6 | 7,7 | 152,4 | 163,0 | 2,5 | 1071,2 |
| Poltavska | 45,1 | 13,1 | 1,0 | 0,9 | 0,0 | 60,1 |
| Odeska | 3,0 | 0,0 | 7,7 | 1,8 | 0,0 | 12,6 |





Land surface temperature in CREODIAS (Sentinel-3)

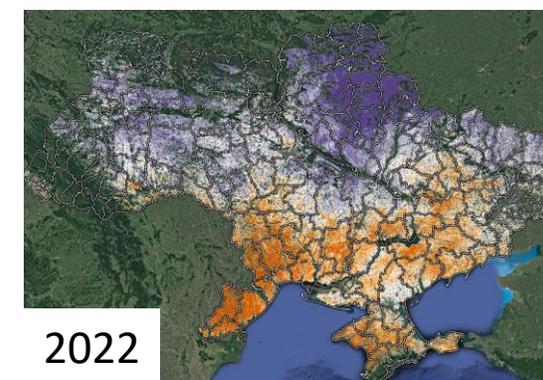
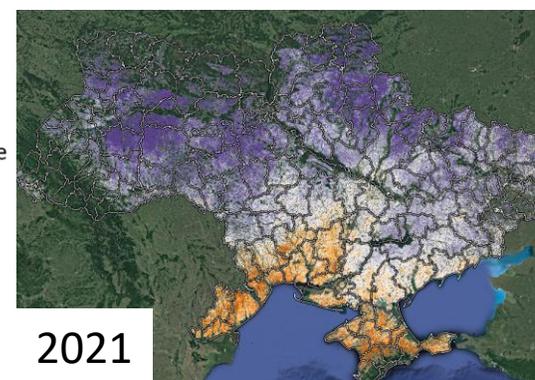
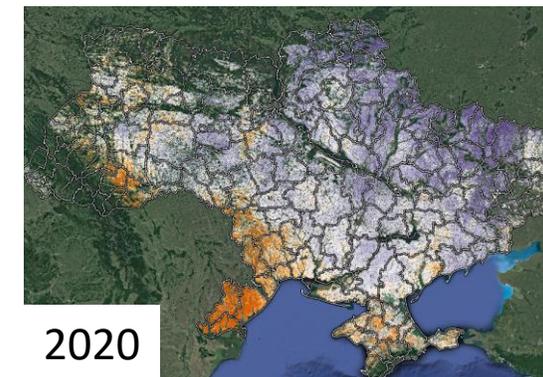
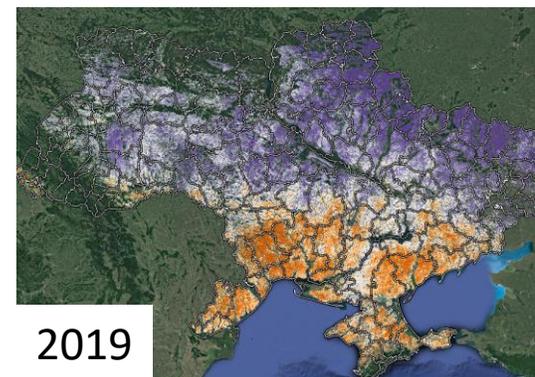
Preprocessing
(SNAP), Cloud
masking



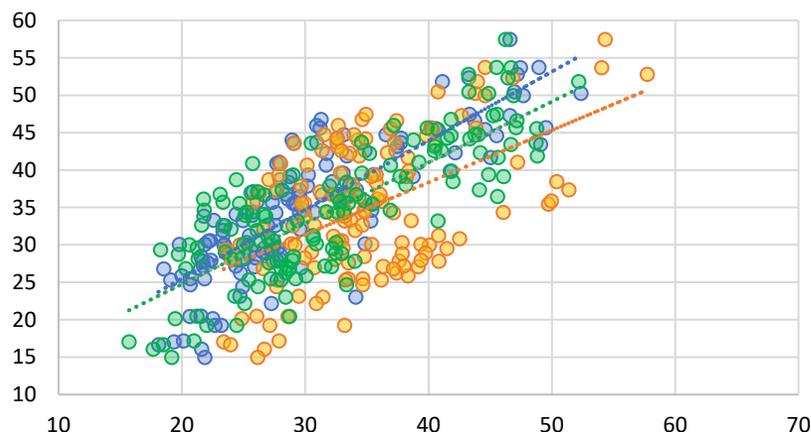
Monthly
composite
(median, $T > 0^{\circ}\text{C}$)



Cumulative
temperature



Different years comparison (regions level)



| Correlation | |
|-------------|------|
| 2022 - 2021 | 0,82 |
| 2022 - 2020 | 0,52 |
| 2022 - 2019 | 0,80 |

- 2021 and 2022 $R^2 = 0.68$
- 2020 and 2022 $R^2 = 0.27$
- 2019 and 2022 $R^2 = 0.64$

Cumulative
temperature
(C)

- 19.1
- 27.8
- 36.5
- 45.2
- 53.9

1 Oct. 2021 – 1 Apr. 2022



WORKING PAPER

Quantifying War-Induced Crop Losses in Ukraine in Near Real Time to Strengthen Local and Global Food Security



English ▾



OPEN KNOWLEDGE REPOSITORY

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15% yield reduction in 2022
output loss of **4.2 million tons** of
winter cereal

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WORKING PAPER

Quantifying War-Induced Crop Losses in Ukraine in Near Real Time to Strengthen Local and Global Food Security



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This paper uses a 4-year panel (2019–2022) of 10,125 village councils in Ukraine to estimate direct and indirect effects of the war started by Russia on area and expected yield of winter crops. Satellite imagery is used to provide information on direct damage to agricultural fields; classify crop cover using machine learning; and compute the Normalized Difference Vegetation Index (NDVI) for winter cereal fields as a proxy for yield. Without conflict, winter crop area would have been 9.14 rather than 8.38 mn. ha, a 0.75 mn. ha reduction, 86% of which is due to economy-wide effects. The estimated conflict-induced drop in NDVI for winter cereal, which is particularly pronounced for small farms, translates into a 15% yield reduction or an output loss of 4.2 million tons. Taking area and yield reduction together suggests a war-induced loss of winter crop output of 20% if the current winter crop can be harvested fully.

Citation

ABSTRACT VIEWS

557

AUTHOR PROFILES

View

<https://openknowledge.worldbank.org/handle/10986/37665>





GeoPortal Demo (Cloud-based)





Crop map in the State Agrarian Register

ДАР Державний Аграрний Реєстр

Обрані сторінки

- Мої повідомлення
- Профіль сільгоспвиробника
- Дані з ЄДР
- Діяльність та активності
- Земельні ділянки
- Документи
- Тварини
- Дані з ДержЗемКадастра
- Ділянки на карті**
- Виправлення помилок
- Програми підтримки
- Доступні програми підтримки
- Потенційно доступні програми підтримки

ГОЛОВНА СТОРІНКА > ДАНІ З ДЕРЖЗЕМКАДАСТРА > ДІЛЯНКИ НА КАРТІ

Умовні позначення

- Штучні об'єкти
- Пшениця
- Ріпак
- Гречка
- Кукурудза
- Цукровий буряк
- Соняшник
- Соеві боби
- Зернові культури. 2022 рік
- Інші культури
- Ліс
- Пасовища

Вимірювання
Маркери
Кадастровий поділ
Озимі посіви 2022
Ярові посіви 2022
Супутник
Карта місцевості
Оглядова карта

Версія: v0.6.1-40-g0537feb0-perfect(09.10.2022)

<https://reg.dar.gov.ua/farmer/landparcelsonmap>

EO4UA





OCRE4Ukraine – Quantifying war damage in Ukraine based on EO data in support of EO4UA initiative

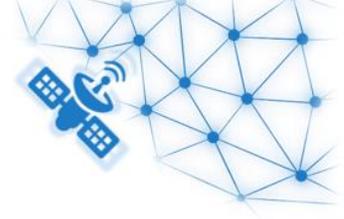
- **Goal:** Quantifying war damage in Ukraine based on EO data in support of EO4UA initiative
- **Coordinator** - Anhalt University of applied science
- **German-Ukrainian Center of excellence** (<https://aidati.org>)

“AIDA-TI: AI-aided Data Analysis and Data Transport Infrastructures”

- **Partners:**

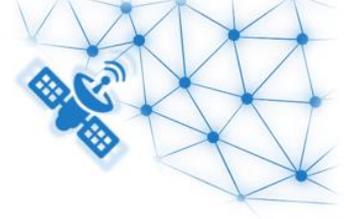
- Anhalt University of applied science (Germany)
- University of Konstanz (Germany)
- NTUU “KPI” (Ukraine)
- Space Research Institute (Ukraine)





OCRE4Ukraine as EU OCRE Project

- OCRE Project - Open Cloud for Research Environments” (Horizon 2020)
 - Access to > 31 PB of full and open high resolution EO data sets and relevant reference data
 - Very high connectivity bandwidth on the internal networks, and high throughput connection to GEANT2
 - Jupyter Notebook interface
 - Data discovery services to EO data repository with open API



OCRE4Ukraine Objectives

- To **expand existing crop monitoring methodology** to new regions and assess war damages based on EO data using advanced machine learning algorithms deployed within cloud infrastructure.
- To establish **close collaboration with Ukrainian researchers** (i.e. Kyiv Polytechnic Institute, Polissia National University, Space Research Institute) within the community-driven EO4UA initiative that will benefit/promote the results acquired within the proposed OCRE project.
- To **prepare for prospective inclusion of Ukraine within the EU** to facilitate technology transfer (including cloud computing) from member states to Ukraine.



Impact

- Strengthening the **European** Research environment in the area of Earth observation and **integration of Ukraine** into it
- **Extending the best EU practices** and innovations to Ukraine in a mutually beneficial way
- Contribution to the **restoration of Ukraine** and moving to sustainable economic environment with focus on Green Deal, Common Agricultural Policy (CAP) and Land Parcel Identification System (LPIS)
- Continuation of **digitalization and intellectualization** of the **economies** of Europe and the Eastern Partnership countries
- Contribution to AI and machine learning **algorithms and applications** aimed at supporting **big data processing** in **strategic areas** such as **climate change**, green deal, sustainable development, strategic planning, economical and **business analytics**



Stand with Ukraine!



nataliia.kussul@gmail.com

EO4UA

