

# OIKON Ltd. Institute of Applied Ecology

COPERNICUS/ESA imagery application



March 11, 2019

Zagreb

#### **Content of presentation**

• About the company



- Sentinel data use land cover mapping
- Sentinel data use agriculture
- Sentinel data use forestry



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#### About company

- OIKON is a leading licensed and accredited environmental consultancy/research institute in Croatia (research-based SME)
- ✓ 3 departments:
  - Department of Environmental Engineering
  - Department of Nature Protection and Landscape Architecture
  - Department of Natural Resource Management
- ✓ 3 laboratories:
  - LADIGIS Remote Sensing and GIS Laboratory (<u>https://www.researchgate.net/lab/LARESGIS-Remote-Sensing-and-GIS-LAb-Alen-Berta</u>)
  - Laboratory for Research and Monitoring of Large Carnivores
  - Laboratory for Fish and Aquatic Ecosystems

26.4.2019.



#### About company

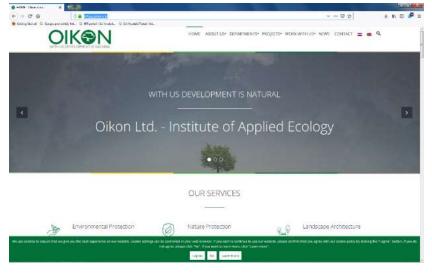
35 employees, 7 PhDs (Forestry, Biology, Ecology, Chemistry, Geoinformatics), 2 PMPs, 5 scientists registered with the Ministry of Science and Education

IUFRO- International council representative for Croatia (Oikon's employee- Vladimir Kušan, PhD)

Member of EARSEL

Candidates for Copernicus Academy

Website <u>www.oikon.hr</u>



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26.4.2019.

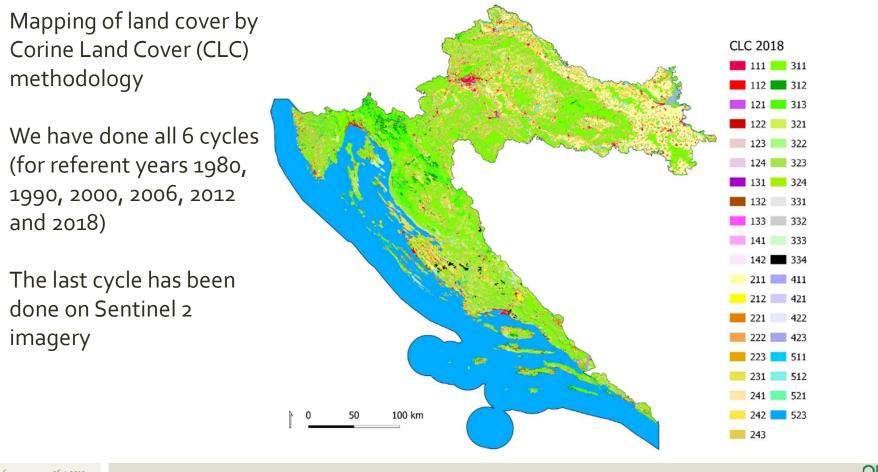
#### Laboratory for Remote Sensing and GIS

- Started for better horizontal connectivity between Departments
- For transfer and application of knowledge, and enhanced research and development work related to the use of remote sensing methods on projects (plus lobbying the Investors for using Remote Sensing technics: drone/satellite-LIDAR/imagery)
- Members
  - Alen Berta, **PhD** in forest management and remote sensing (**Head of the Laboratory** and Department for Natural Resources management)
  - Vladimir Kušan, **PhD** in forestry and remote sensing (former professor or RS and GIS on Faculty of forestry, Zagreb, pioneer of RS and GIS in forestry in Croatia)
  - Ivan Tomljenović, PhD in applied geoinformatics (Deputy Head of the Laboratory)
  - Zrinka Mesić, PhD in biology and remote sensing
  - Ivona Žiža M.Sc. in Agriculture (enrolled in PhD study as of 2018)
  - Nela Jantol, M.Sc. in Biology. (enrolled in PhD study as of 2018)
  - Branimir Radun, M.Sc. in geodesy and geoinformatics (will enroll PhD study in 2019)
  - Željko Čučković, Bachelor's degree in Informatics

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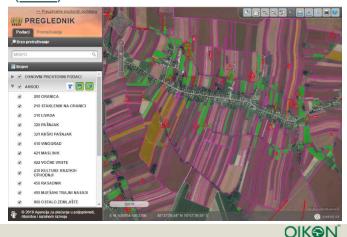
#### Land cover mapping

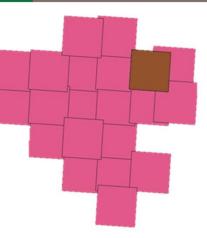


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Random Forest Based Automated Crop Mapping In Small-Scale Farming Using Stacked Multi-temporal Sentinel 1 And Sentinel 2 Satellite Imagery: A Case Study For Croatia

- Such kind of techniques have never been applied in the agricultural field of study in Croatia
- <u>Sentinel 1</u> and <u>Sentinel 2</u> data along with machine learning techniques (specifically <u>RandomForest</u>) to map predefined agricultural land cover classes.
- Input data used for classifier training is a set of polygons representing 16 specific crop classes obtained from Croatian database of agricultural parcels (<u>LPIS</u>).
- **70 %** training data- **30%** validation data.
- Total of **3TB** of remotely sensed data was downloaded for the time period of April to November (S1+S2)+ preprocessing for S1 data
- The main aims are:
  - use of Random Forest (RF) classifier to classify different agricultural crops,
  - explore best vegetation periods for each crop to get a seasonal pattern
  - to find the most suitable vegetation indices for crop mapping



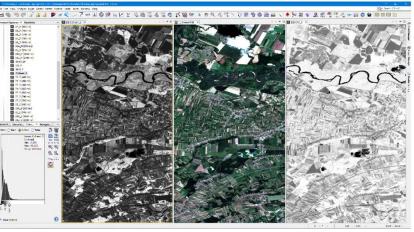


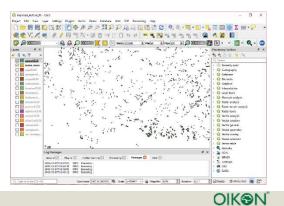
#### • Tools:

- Software
  - R software environment for statistical computing and graphics
  - SNAP science toolbox exploitation platform
  - QGIS open source GIS software
- Hardware
  - Workstations
    - Total of 4 workstations with multi-core processors (8 core), 32GB of RAM, 1 TB SSD storage for processing, 4TB for data archiving
  - Processing server
    - 16 core processor, 64GB of RAM, 12 TB of storage
  - Storage server
    - 30TB of available storage for data archiving

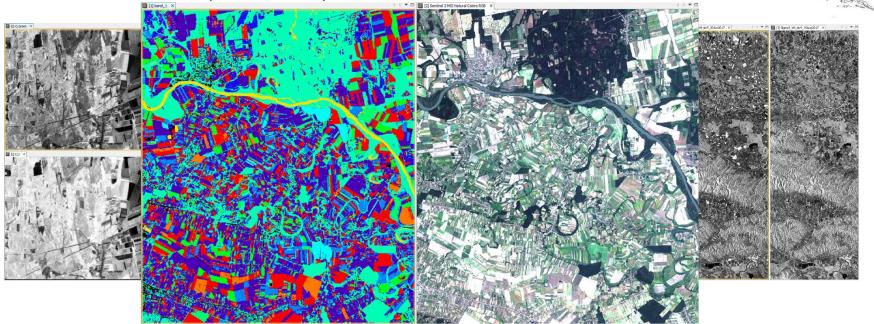


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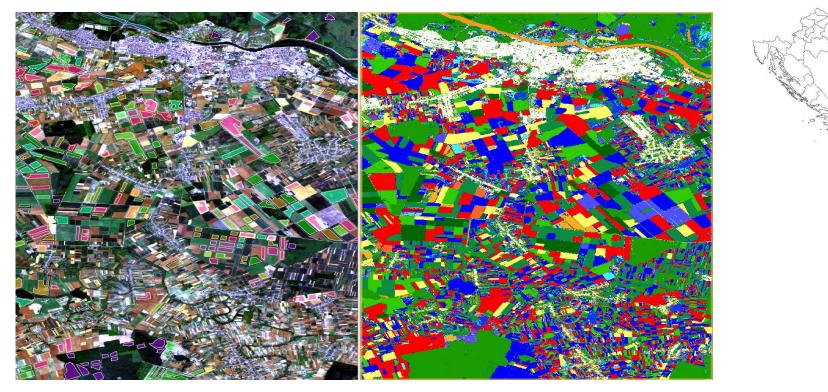


- Test results:
  - 92 % accuracy for the Bjelovarsko-Bilogorska county (<u>2640 km<sup>2</sup></u>)
  - Used vegetation indexes: NDVI, GNDVI, LCI and CLGreen
  - Sentinel 1 multitemporal stack April-November
  - Sentinel 2 multitemporal stack April-November



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- Initial production results:
  - Požeško-Slavonska county (1.823 km²)**> 93 % accuracy**





# Sentinel data use-forestry applications

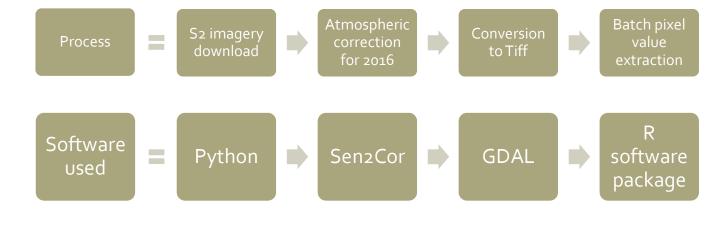
- Nationwide data collection projects
  - Project 1: Biomass assessment regression models based on Sentinel 2 multitemporal imagery for Thickets, Maquis and first age class stands of pedunculate oak, sessile oak, beech and ash- Investor: CAEN
  - **Project 2:** Use of multispectral satellite images of high resolution in **determining the degree of productivity and age** of uneven-aged stands of private forest owners in the Mediterranean and Submediterranean- Investor: Ministry of Agriculture
  - **Project 3: Forest type classification** using Sentinel 2 data and data mining in forests of Central Croatia (in progress-currently adding multitemporal Sentinel 1 imagery)- Investor: Oikon
- Forest fire mapping in Croatia
- Health monitoring/forest dieback monitoring in Forest park Marjan, Split (establishing)



#### Hardware/software/methodology

- 4 workstations plus one server (each with –only- 32 GB RAM and standard graphics card)
- Plus good organization, a lot of will and a few brilliant minds  $\textcircled{\odot}$

• For **project 1** Sentinel 2 year long data for Croatia (2016-5TB), for **project 2 and 3** 2017 year long data (2TB)





#### Hardware/software/methodology

- Pixel data were averaged on a monthly basis
- within the SQL database, all known Vegetation indices were calculated (more than 120) **for every month, for every extracted pixel**



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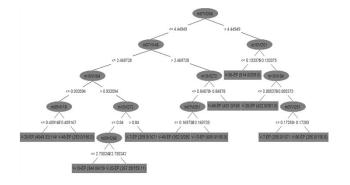
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### Hardware/software/methodology

- Project 1- With RF algorithm (for selecting circa 50 themost corellated variables among ~1000) and stepwise regression analysis (STATA software), we developed biomass assessment models
- Project 2 and 3- WEKA software (for data mining/machine learning), we developed classification trees for site index/forest type determination

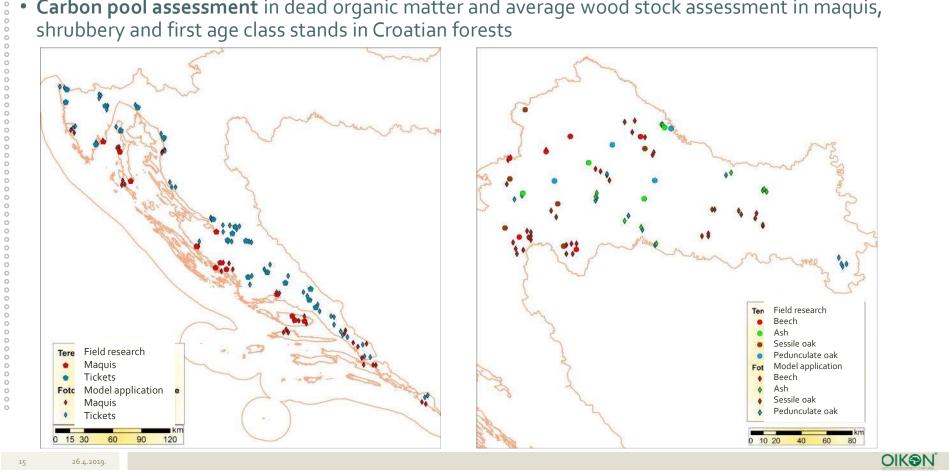




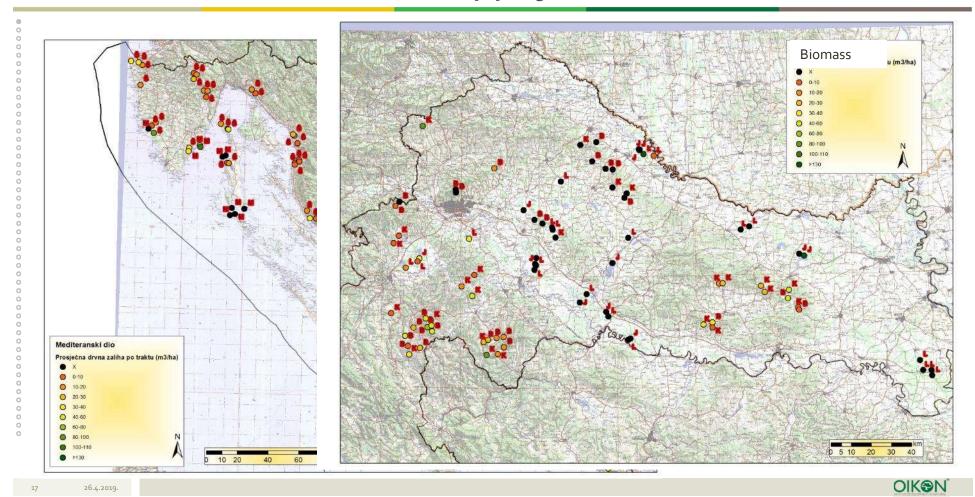
• Models/classification trees can be used for raster calculations within SNAP/ArcGIS/QGIS/ENVI



• Carbon pool assessment in dead organic matter and average wood stock assessment in maquis, shrubbery and first age class stands in Croatian forests



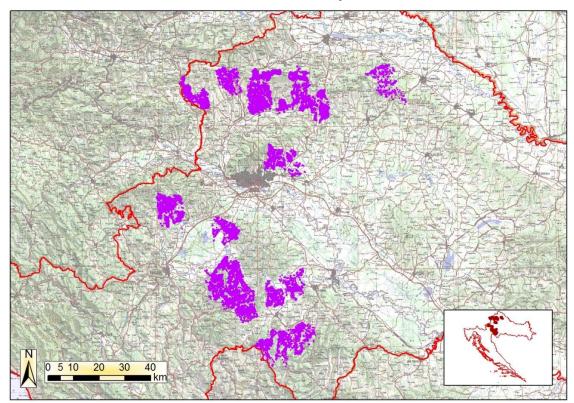
Forest stand	Independent variable code	Month/season	Vegetation index	Vegetation indeks formula
Common beech	m7VI266	7	MTCI (MERIS Terrestrial Chlorophyll Index)	(B06 - B05) / (B05 - B04)
and sessile oak	m3VI178	3	Simple Ratio B08/B011	(B08/B011)
	m10VI207	10	Single Band B03	B03
Common oak and narrow-leafed ash	m5VI261	5	NDVI705	(B06 - B05) / (B06 + B05)
nanow-lealed ash	m3VI167	3	Simple Ratio B08/B012	(B08/B012)
	m9VI93	9	Normalized Difference B07/B04	(B07-B04)/(B07+B04)
Thicket in Istria and Kvarner	m5VI285	5	ARI1 (Anthocyanin Reflectance Index)	(1 / B03) - (1 / B05)
	m8VI277	8	EVI (Enhanced Vegetation Index)	2.5*(B08 - B04) / (B08 + 6*B04 7.5*B02 + 1)
	m8VI246	8	Visible Atmospherically Resistant Index Green	(B03-B04)/(B03+B04-B02)
Thicket in	m4VI285	4	ARI1 (Anthocyanin Reflectance Index)	(1 / B03) - (1 / B05)
Dalmatia	m8VI225	8	Soil Composition Index	(B011-B08)/(B011+B08)
	m10VI281	10	CHL-RED-EDGE (Chlorophyll Red-Edge)	(B05 / B08)
Maquis	m4VI153	4	Simple Ratio B03/B08	(B03/B08)
	m9VI280	9	CRI1 (Carotenoid Reflectance Index 1)	(1 / B02) - (1 / B03)
	m8VI149	8	Simple Ratio B02/B04	(B02/B04)



 Use of multispectral satellite images of high resolution in determining the degree of productivity and age of uneven-aged stands of private forest owners in the Mediterranean and Submediterranean

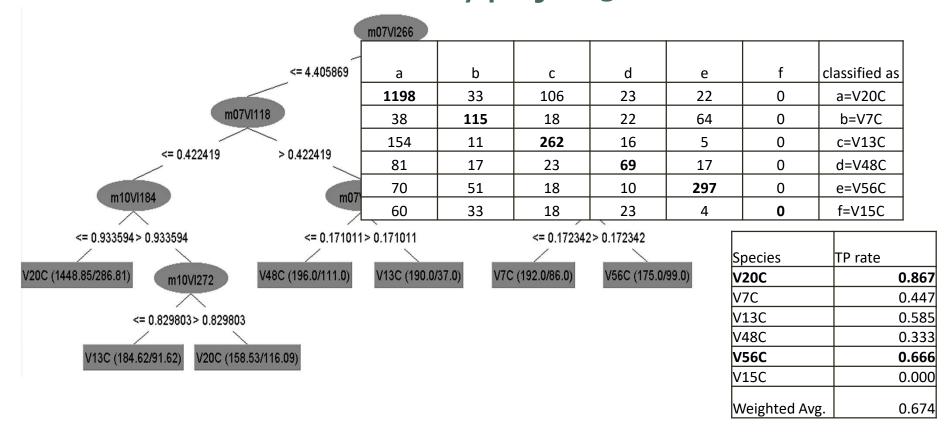
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• Forest type classification- more than 17.000 field plots



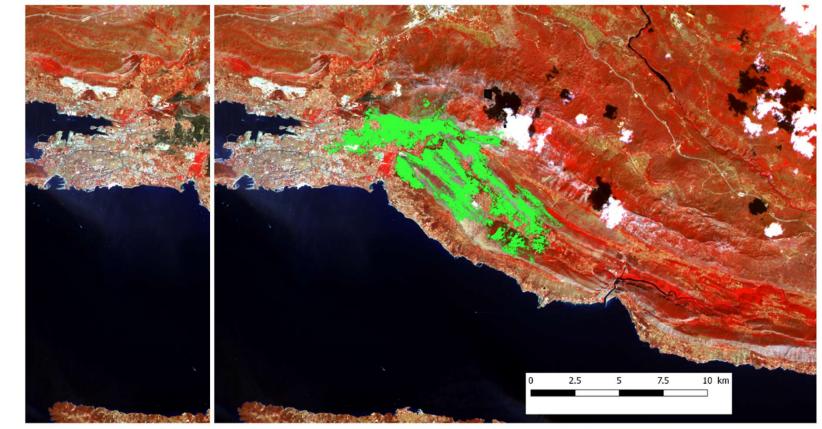






### **Remote sensing activities – forestry applications**





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# Thank you for your attention!



# **Questions?**

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