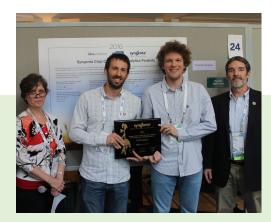


Al solutions for agriculture of the future

## Timeline



#### 2016



Syngenta Crop Challenge 4th place

#### 2018

BioSense Institute Novi Sad wins contest in Kenya – Smart choice of seed solving hunger problem in Africa



Bill and Melinda Gates Foundation grant 2021



REACH



The 2017 @Syngenta\_US Crop Challenge winners hail from Serbia. bit.ly/2o3uoNh #2017Analytics @BioSenseRS

2017

Follow



Syngenta Crop Challenge 1st prize on grant 2019



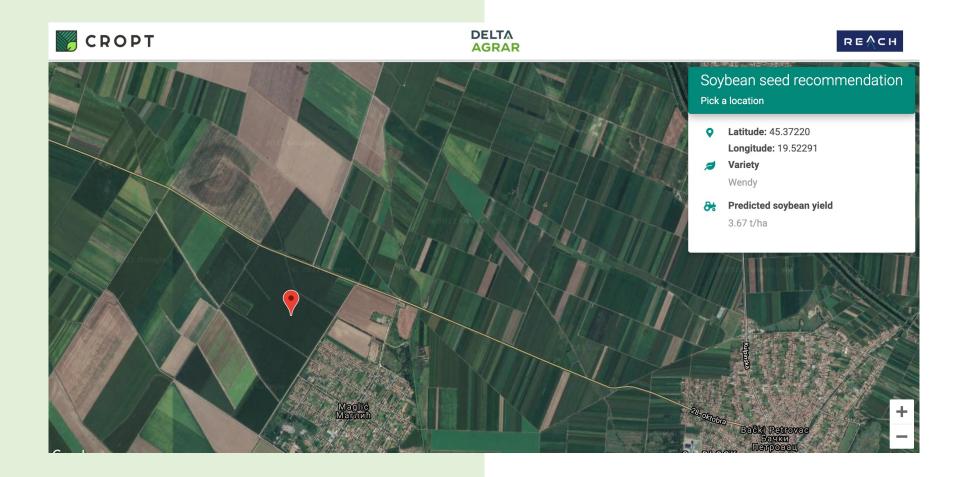
Company officially founded through Serbian Innovation Fund grant

# **Smart Seed Recommendation**

- Recommendation based on the local conditions
- Smart distribution of seeds

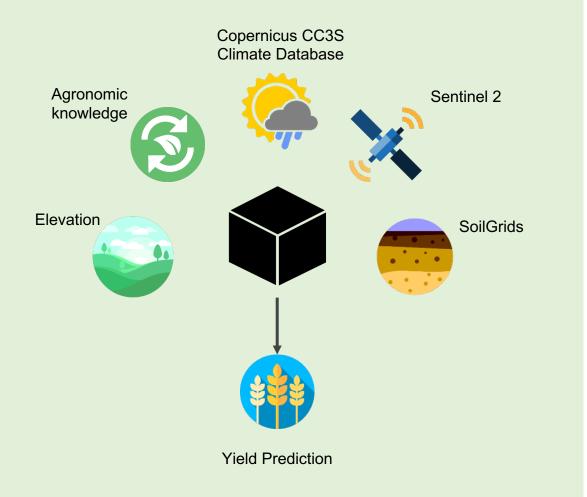








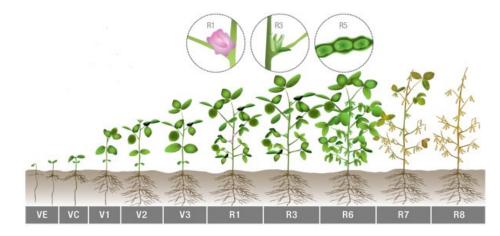
## **Big Data Analytics**



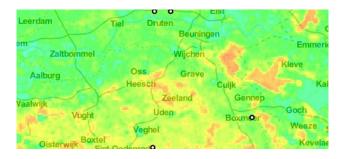
# **Feature Engineering**



Climate data at 1h resolution (1979-)
 Feature engineering based on domain knowledge



ISRIC SoilGrids maps 250m
 ~200 parameters (7 depths) -> PCA, LDA, autoencoders

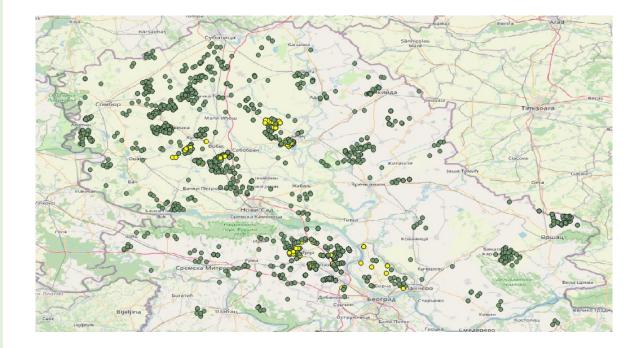


## **Delta's Database**



Parce	l informatio	n [ha]		Growing					
Parcel	Area	Latitude	Longitude	Year	Crop	ed producti	Variety	eed catego	
G-1-1	63.2	45.84584	19.50491	2020	Oilseed rap	0	Imperial		
G-1-2	22.48	45.84594	19.50482	2020	Oilseed rap	0	Imperial		
G-2-1	94.3	45.85271	19.51383	2020	Soybean	0	Dukat	C1	
G-2-2	20.59	45.8518	19.514	2020	Soybean	0	Dukat	C1	
G-3-1	63.28	45.84486	19.52034	2020	Barley	0	Salamandre		
G-3-2	17.8	45.84422	19.52051	2020	Barley	0	Salamandre		

Output [t	/ha, RSD/kg	, RSD/ha]	Time frame			
Yield	Price	Revenue	Planting date	Harvest date		
3.6	39.98	143.928	17.9.19 00:00	2.7.20 00:00		
3.4	39.98	135.932	17.9.19 00:00	2.7.20 00:00		
4.093889	37.78	154.6671	9.4.20 00:00	14.9.20 00:00		
3.472559	37.78	131.1933	9.4.20 00:00	14.9.20 00:00		
9.339117	17.19	160.5394	7.10.19 00:00	25.6.20 00:00		
6.848315	17.19	117.7225	7.10.19 00:00	25.6.20 00:00		
4.373026	37.78	165.2129	9.4.20 00:00	14.9.20 00:00		
3.666532	37.78	138.5216	9.4.20 00:00	14.9.20 00:00		

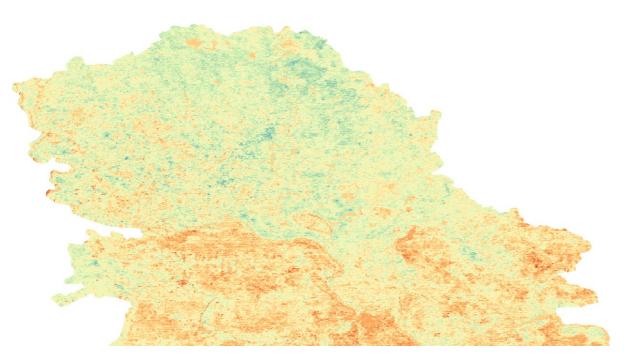


	Raw material [kg/ha]						Machinery and labour costs per ha [RSD]						
revious cro	Seed units	Manure	tiliser amou	Ν	Р	к	sticide amo	Tillage	Sowing	liser applica	cide applic	Irrigation	Harvest
Soybean	9	0	891	142.1205	117.16	113.4869	4.794304	4820.75	3031.25	7666	15084	3000	11232
Soybean	3	0	821.1744	137.6335	104.0925	93.41637	4.848754	4820.75	3031.25	7666	15084	3000	11232
Maize	7100	0	339.3425	60.4779	57.09452	28.54726	3.654944	26277	3084.15	3196	11953	3000	10510.92
Maize	1900	0	320.544	58.08645	53.61826	26.80913	3.287282	26277	3084.15	3196	8860.176	3000	10510.92
Soybean	13000	0	308.1542	58.20189	86.11987	0	7.054362	18501.6	3712.97	4614	18083	3000	12476
Soybean	3695	0	396.6292	69.50562	130.2921	0	7.595506	10438	3712.97	4614	18083	3000	12476

# CROPT

# **Yield Prediction**

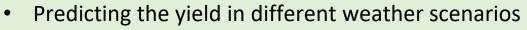
- Machine Learning models Conventional: Random Forest, SVM, k-NN, XGBoost Deep Neural Networks
- 1<sup>st</sup> approach: Model ~ variety
  2<sup>nd</sup> approach: variety categorical feature
- Categorical encoding: One-hot Numbering Embeddings
- ML models handling categorical data: catBoost histGradientBoosting tree-based models (RF)



Yield Maps

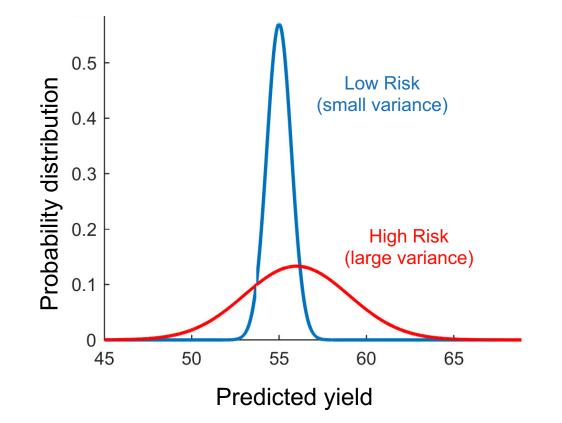
 Big Data analytics High resolution
 PySpark
 Parallelisation
 Cythonisation

## **Risk Assessment**



- Risk assessment
- Customised loans & interest rates

Weather Scenarios	Yield				
1	High				
2	Medium				
3	High				
15	Low				





## **Software Architecture**

#### Prototype available at selsem.cropt.ag



