

AgriGeo:

Geoinformation solutions for agriculture based on Big Data analytics

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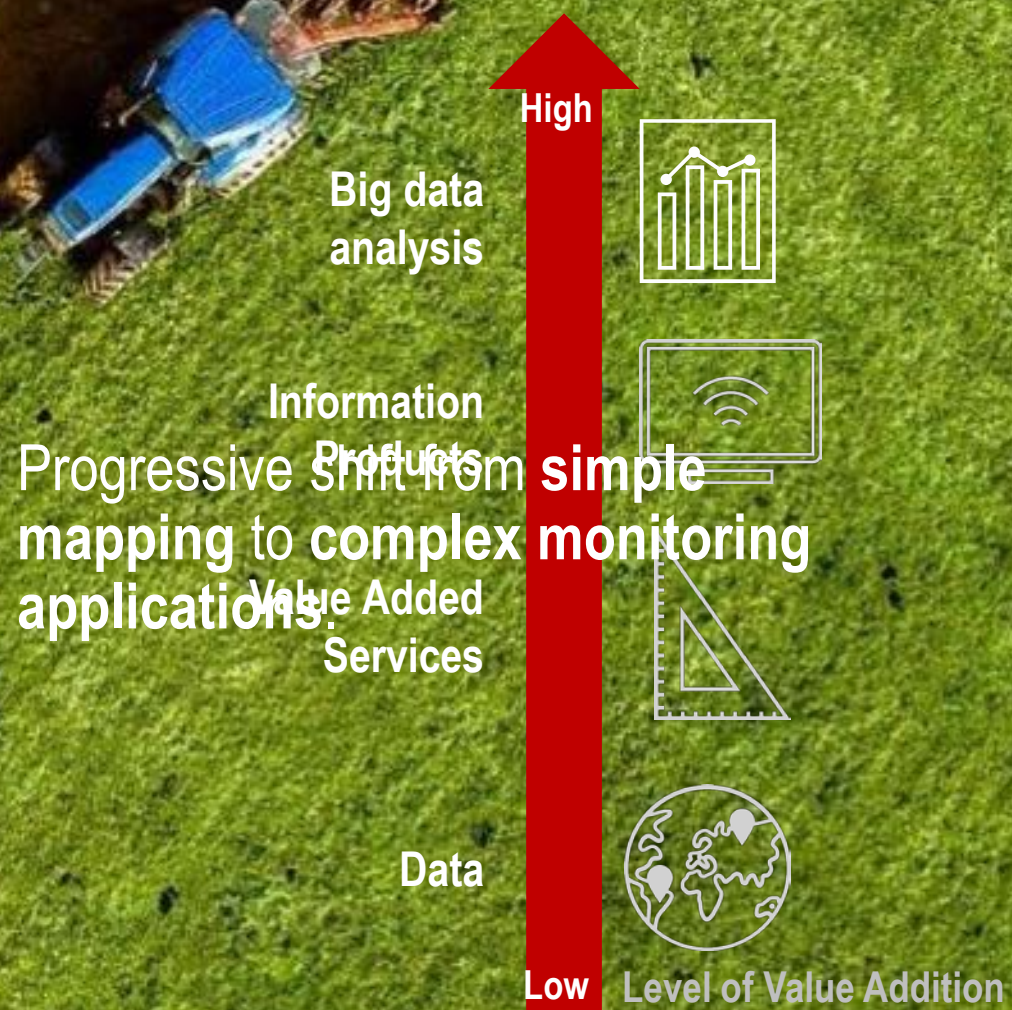
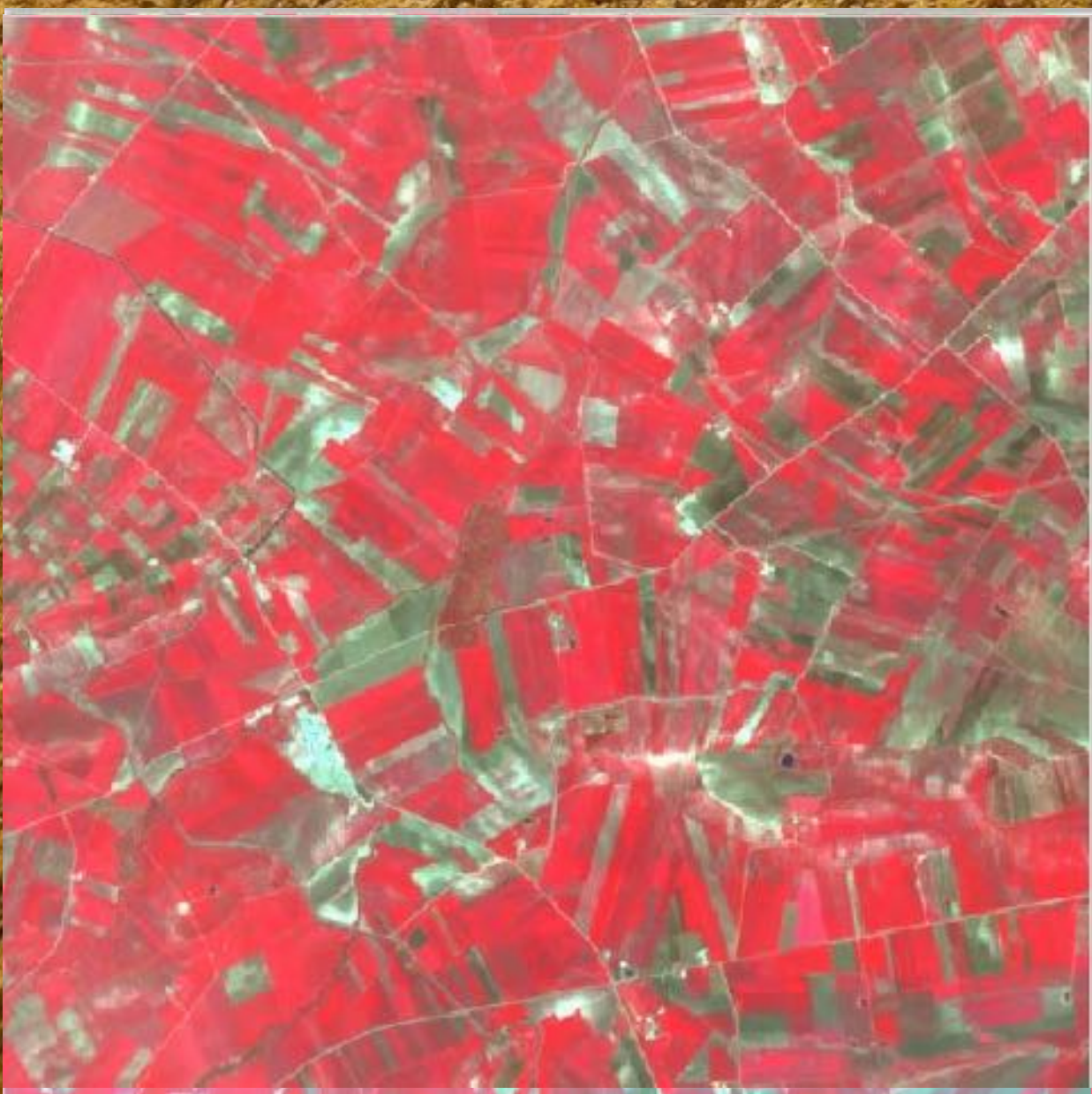
1: e-GEOS, Italy; 2: Politecnico di Milano, Italy



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INFORMATION NOT ONLY IMAGE DATA

Turning data and images into information that can be browsed and analyzed

USER-DRIVEN

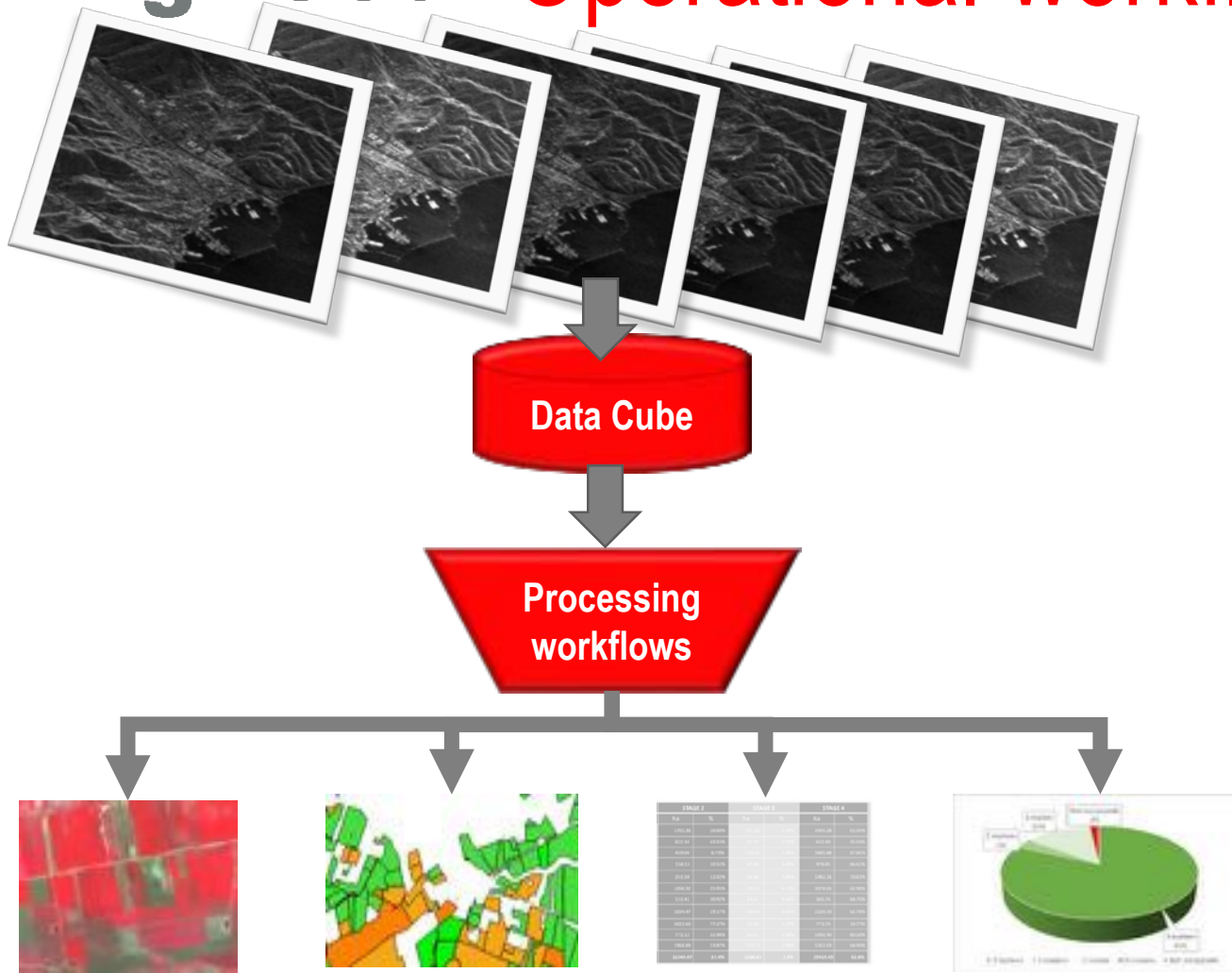
Solutions tailored on user requirements

FROM BIG DATA TO ANALYTICS

Generation of analytics from the processing of huge time series of different data

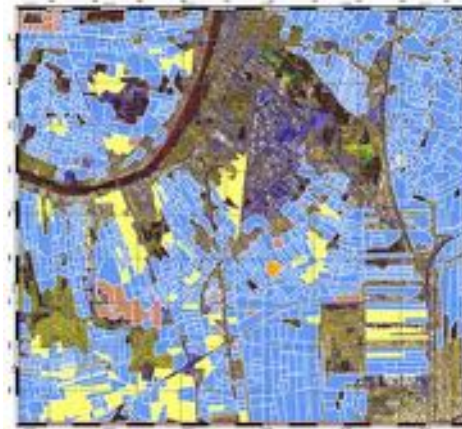
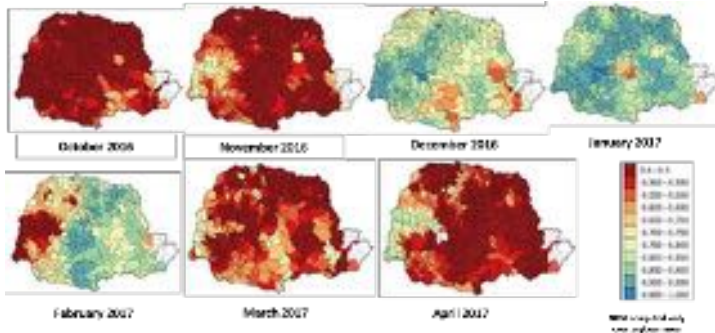
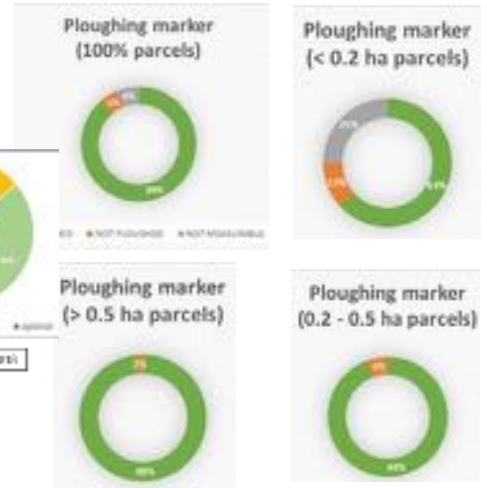
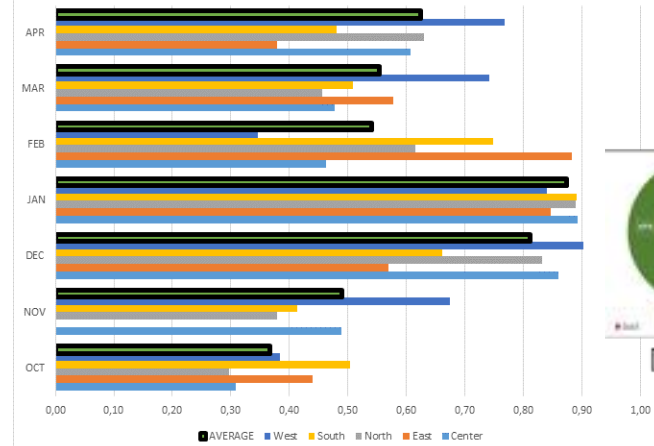
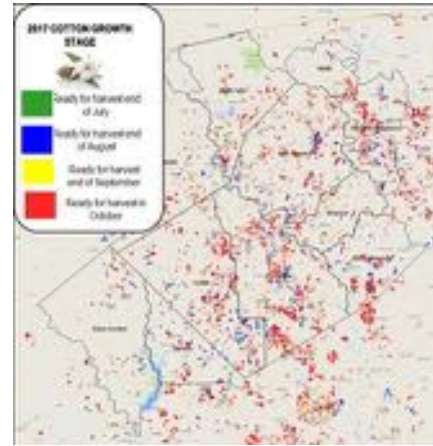


AgriGeo Operational workflows

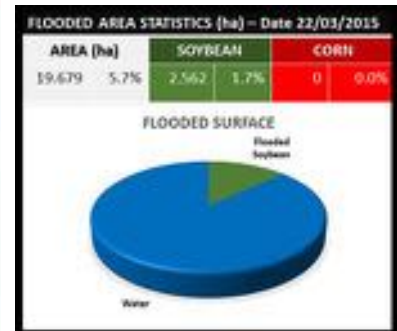


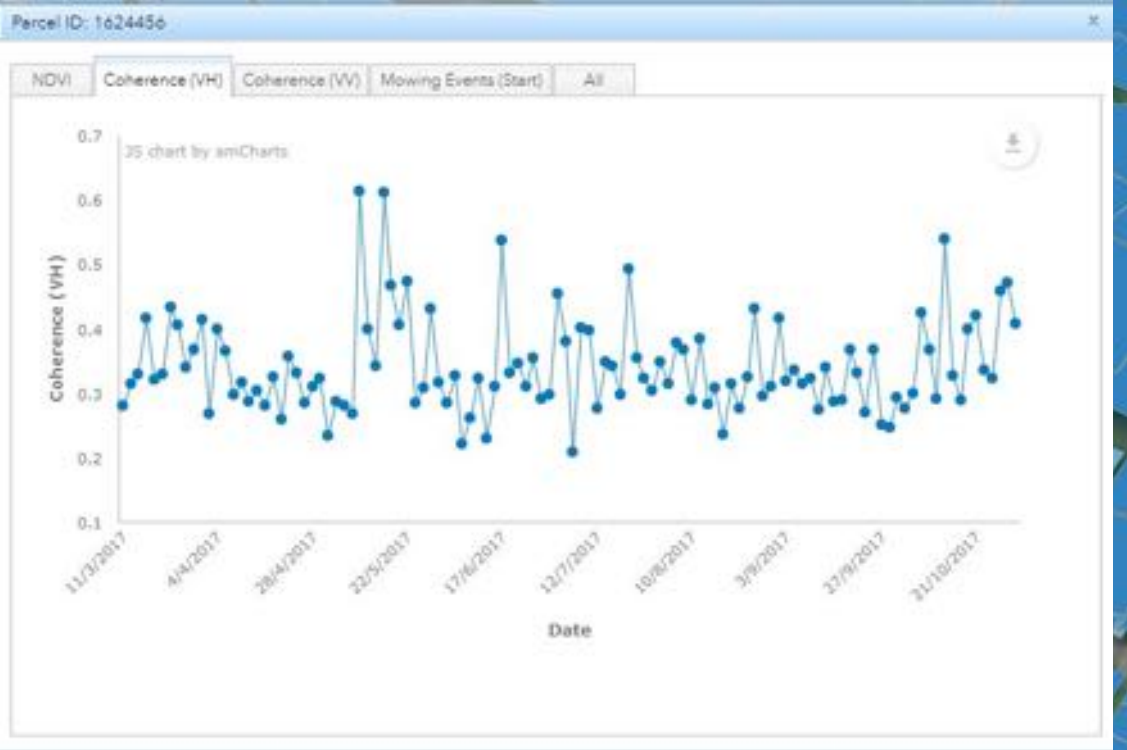
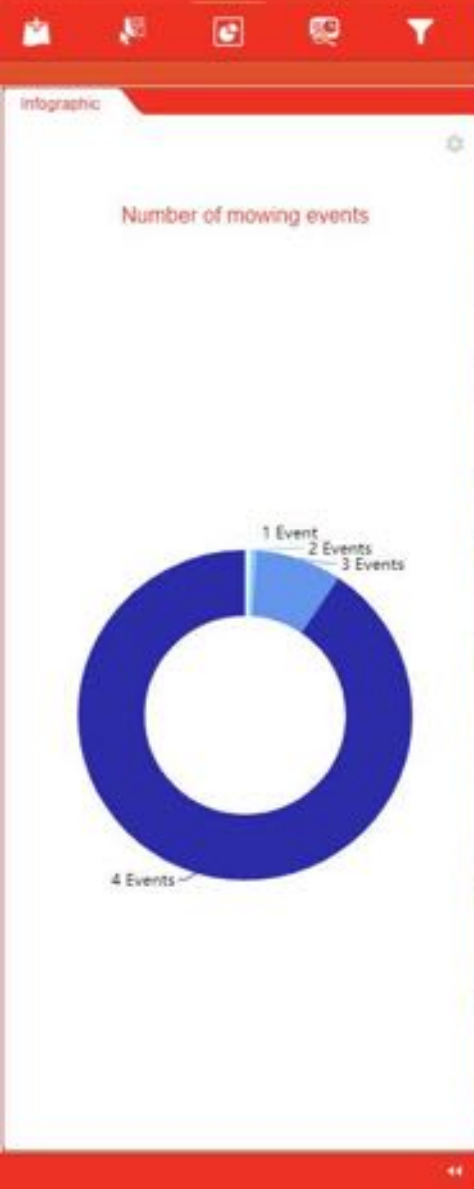
- Services provided by AgriGEO strongly rely on the usage of satellite time series, organised in multi-source Data Cubes
- They are managed in a fully scalable environment, allowing a fast and efficient extraction of information for feeding **vertical workflow pipelines**, often requiring near-real-time delivery performances.
- One main driver for the provision of these services is the availability of big data analysis techniques enabling the extraction of information and analytics from huge amounts of data





COUNTY	STAGE 1		STAGE 2		STAGE 3		STAGE 4	
	ha	%	ha	%	ha	%	ha	%
Cher	593.32	13.33%	1,921.36	26.60%	1,277.83	1.89%	2,064.28	33.04%
Canada	1,213.38	8.30%	623.35	43.53%	86.36	1,000%	642.40	45.04%
Calca-Cordoba	2,151.07	3.33%	438.04	6.79%	1,283.04	1,000%	3,465.48	47.40%
Carriacou	268.44	14.48%	314.53	19.51%	66.46	1,000%	376.80	64.42%
Capo Lake	120.35	15.36%	253.58	31.02%	78.81	1,000%	1,082.33	79.83%
Cast. Bernard	308.44	6.32%	1,298.32	25.91%	1,543.44	1,766%	3,078.33	60.48%
Avella	30.44	4.74%	112.40	20.92%	44.11	1,000%	365.76	68.70%
Circhard-Cassaban	1,176.45	4.89%	1,694.47	29.17%	1,108.11	1,000%	2,224.33	62.78%
Charente	19.84	1.89%	862.46	77.22%	65.25	1,000%	173.20	18.77%
Charente-Nouvelle	148.35	5.74%	773.32	31.98%	1,662.33	1,000%	1,954.36	63.18%
St. Camille	206.36	4.57%	1,968.49	23.87%	1,111.11	1,000%	3,014.00	64.90%
TOTAL	2,194.4	7.3%	11,345.87	27.4%	1,168.41	2.8%	23,919.43	42.4%

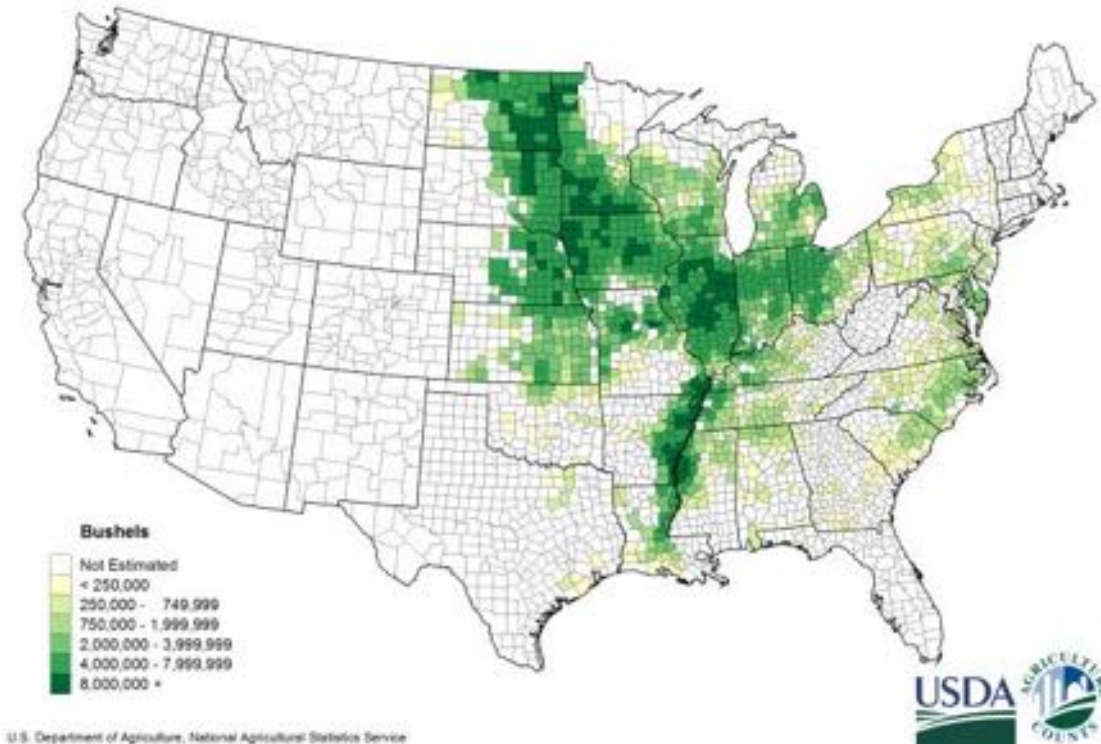


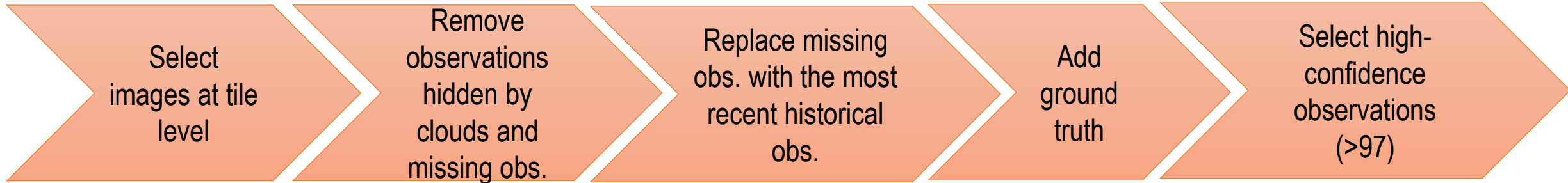


The approach exploits multiple data sources and creates a composite model:

- Random Forest model based on optical data
- Bayesian model based on USDA historical series

The model has been developed on different test area, therefore considering differences in climate and growing crops.





- Images can be seen as a multidimensional matrices where each value (i,j) represents a set of spectral bands.
- USDA classification is used as ground truth to train ML models.
- An extensive tuning procedure was applied to fit the best set of hyperparameters at single test area level.
- Class labels were grouped to train a set of binary models, final prediction was assigned according to the highest probability label.



Sentinel-2 May 30, 2018



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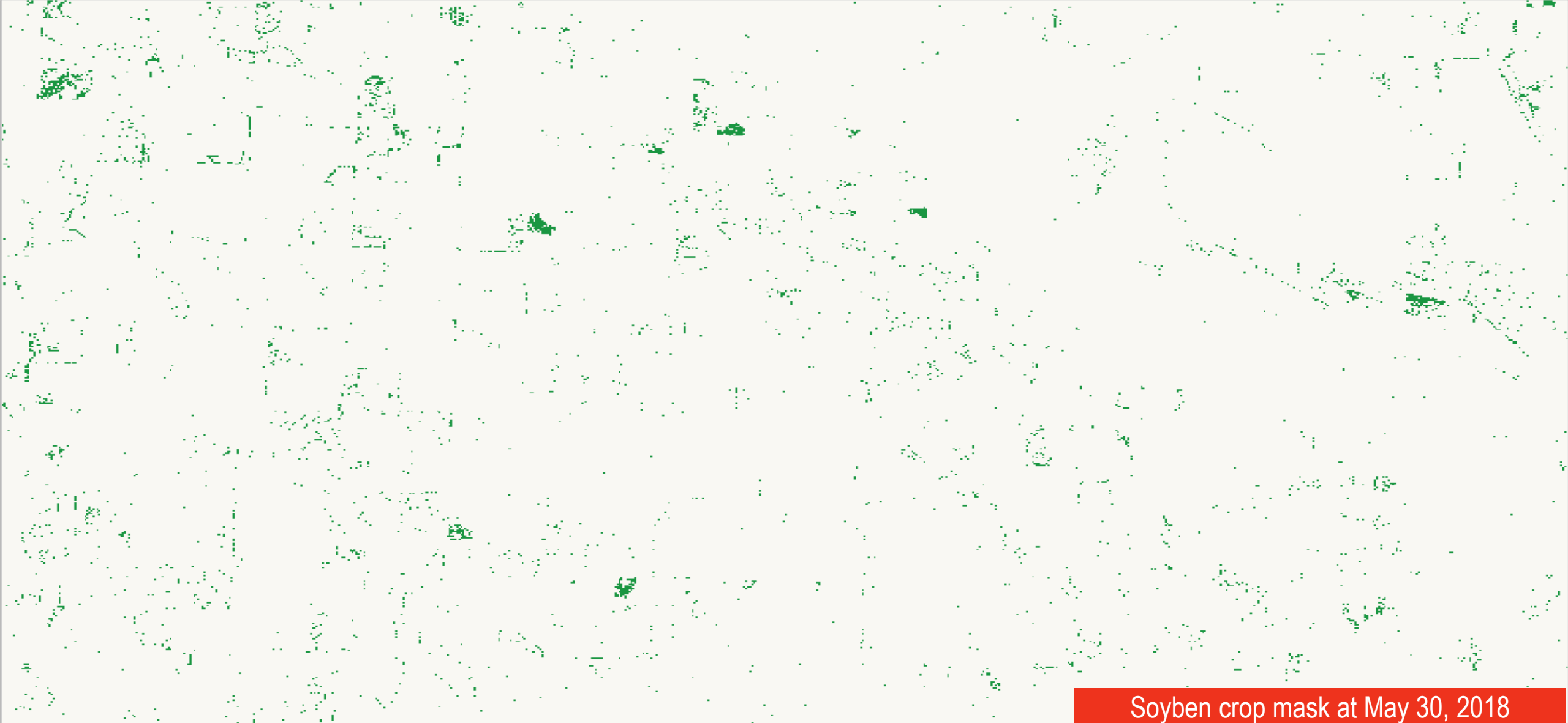
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Soyben crop mask at May 30, 2018



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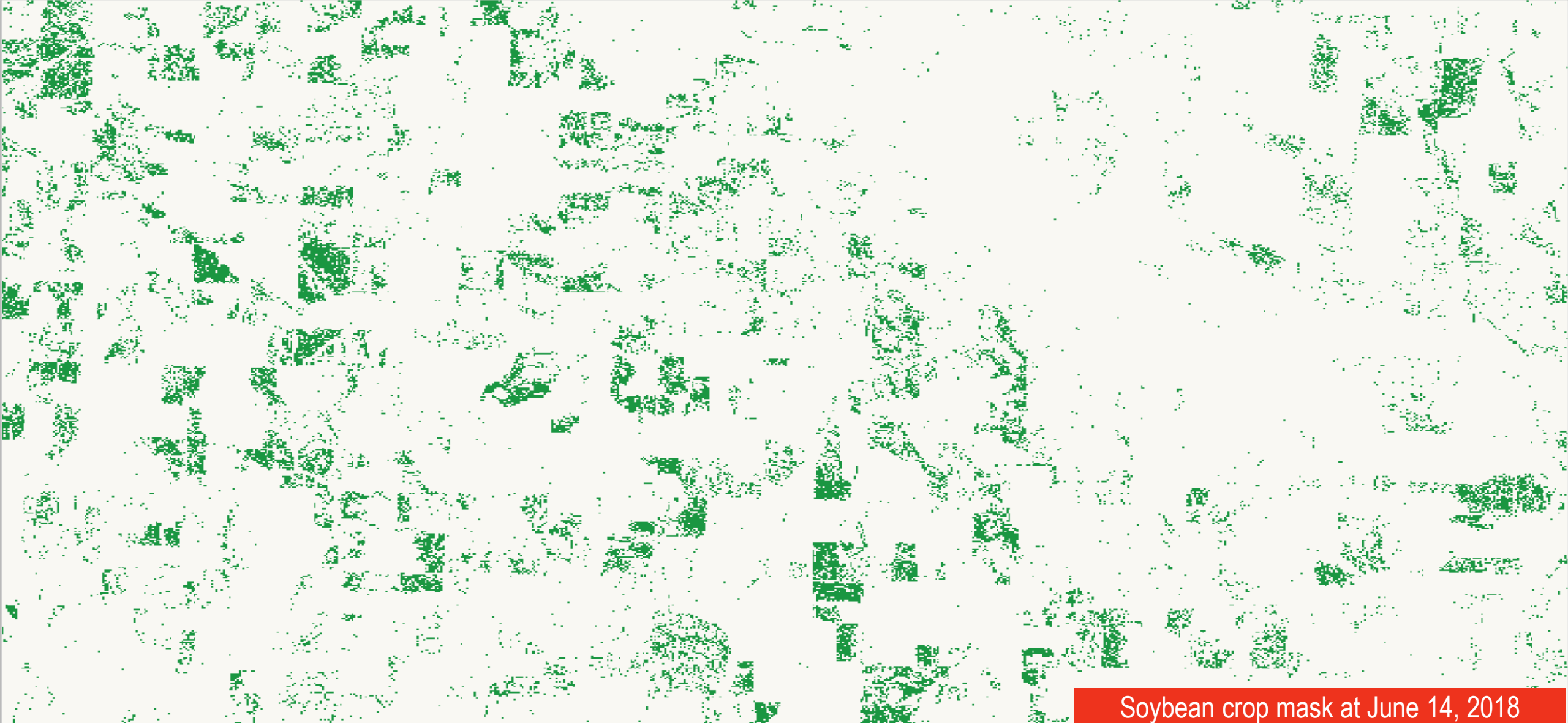
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Soybean crop mask at June 14, 2018



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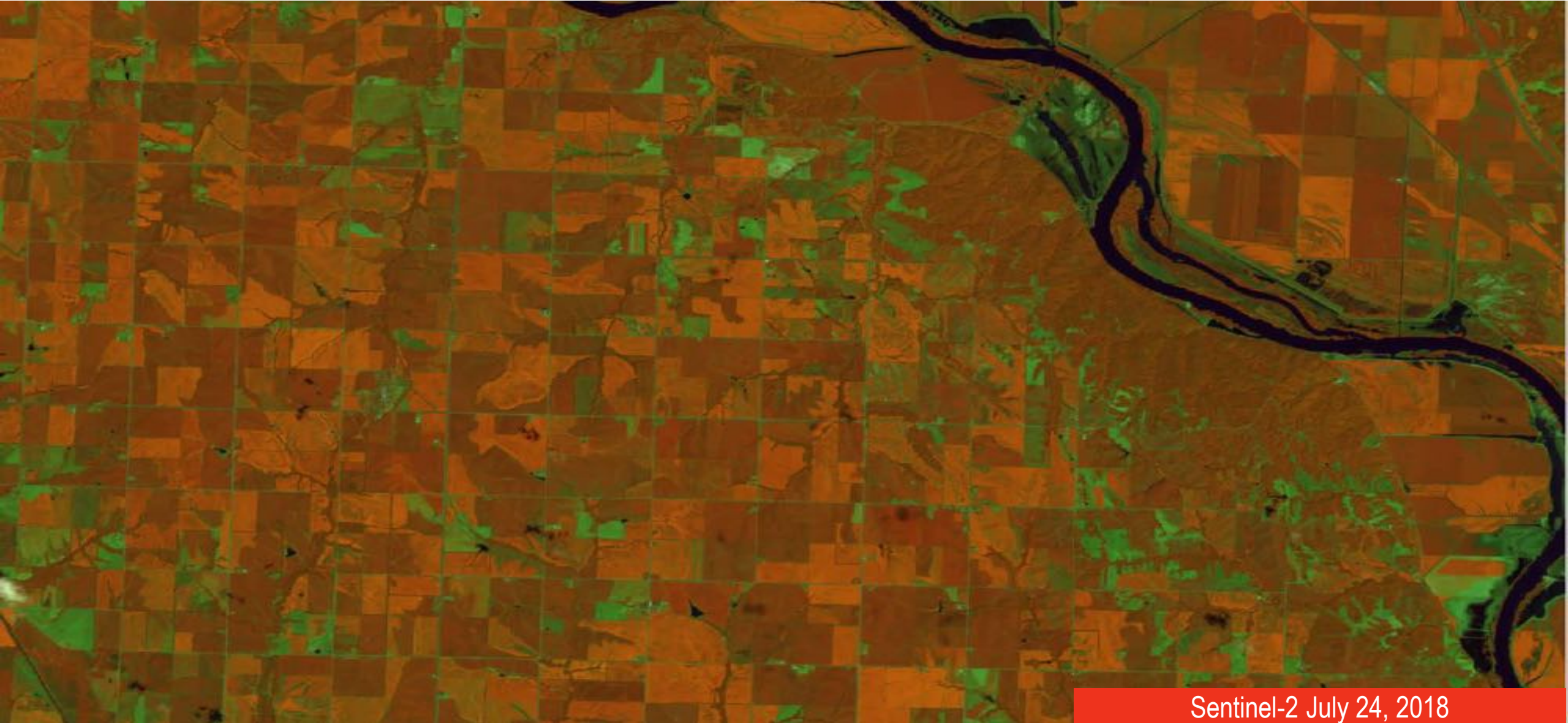
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Sentinel-2 July 24, 2018



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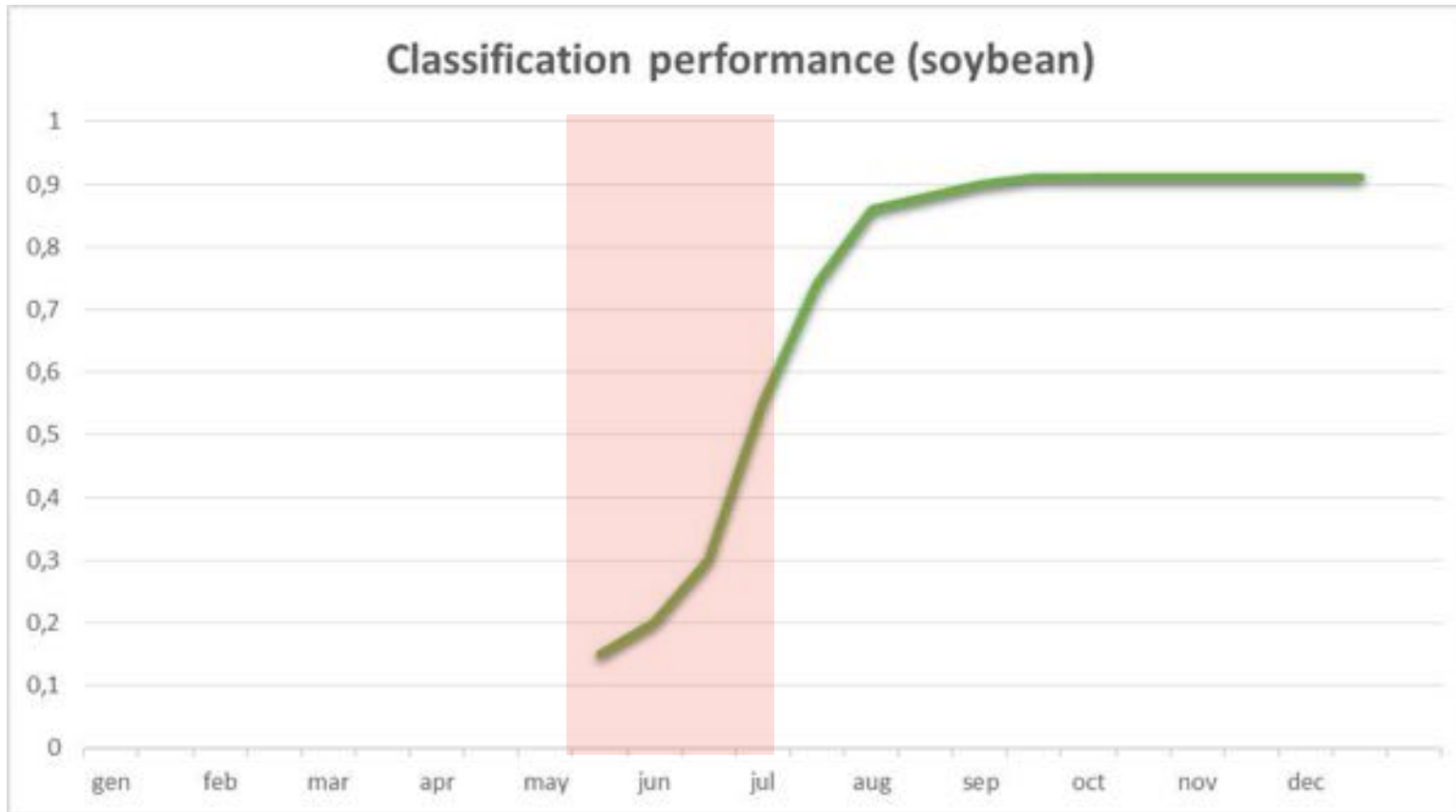
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Classification performance (soybean)



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National Agricultural Statistics Service



2017



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2016



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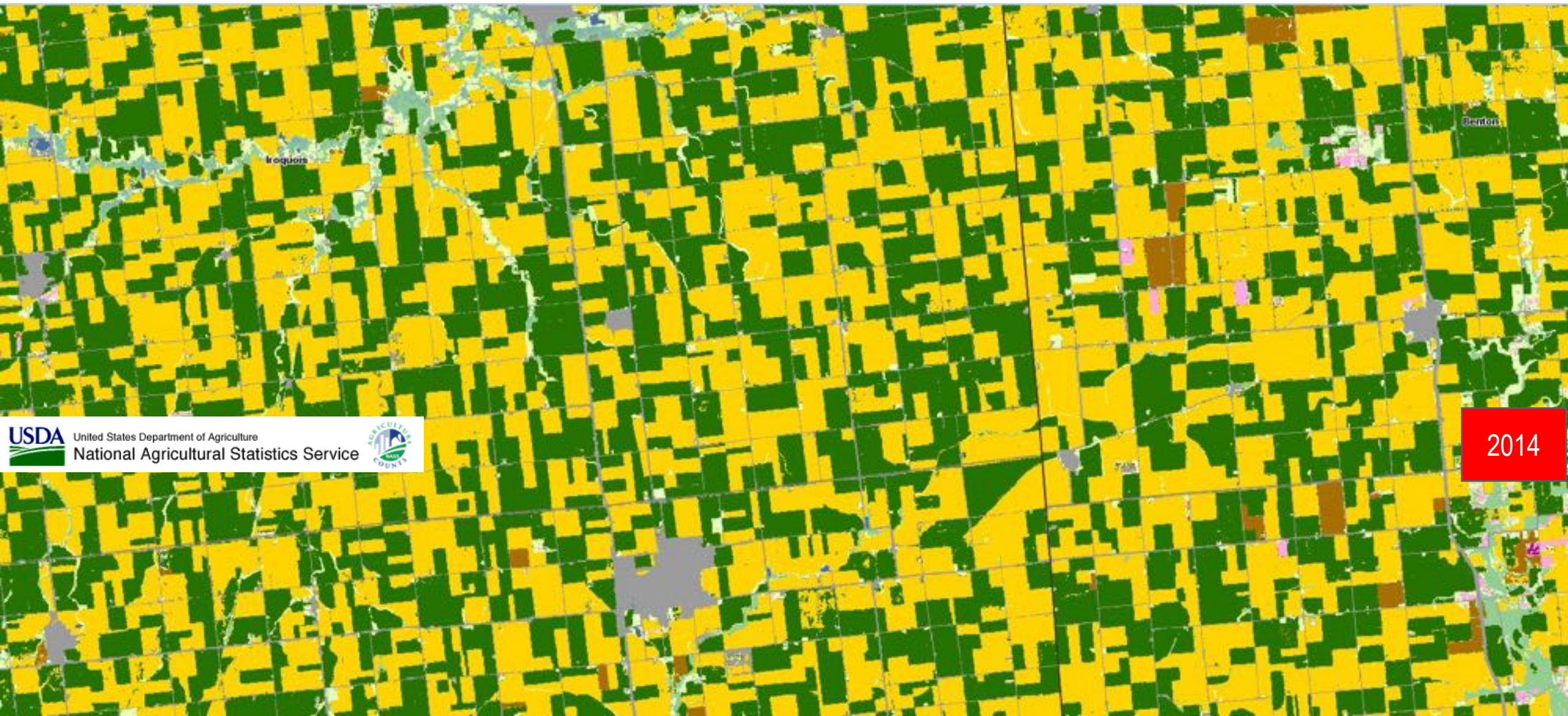


2015



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USDA United States Department of Agriculture
National Agricultural Statistics Service



2014



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USDA United States Department of Agriculture
National Agricultural Statistics Service



2013



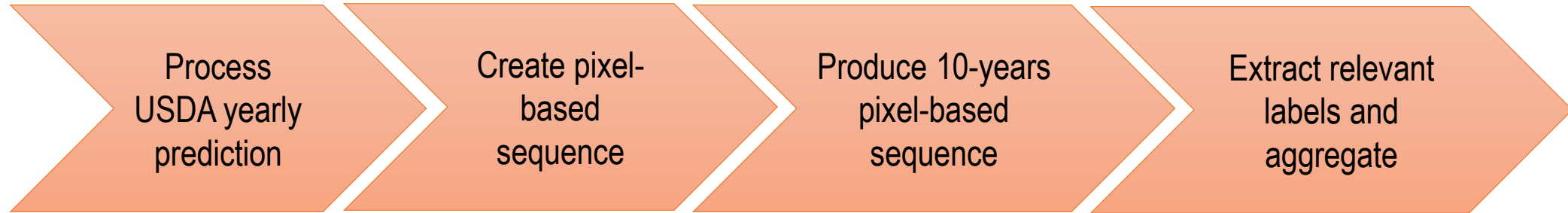
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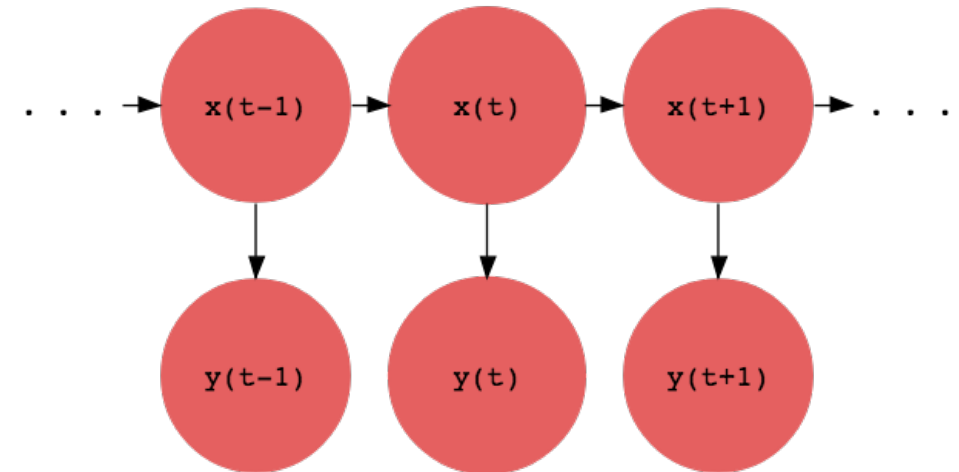
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The Bayesian model



The Bayesian model considers 10 years of historical data and estimates periodic crop variation at test area level.

The model comprises a pattern based component to account for longer sequences variation.





Sentinel-2, May 30, 2018



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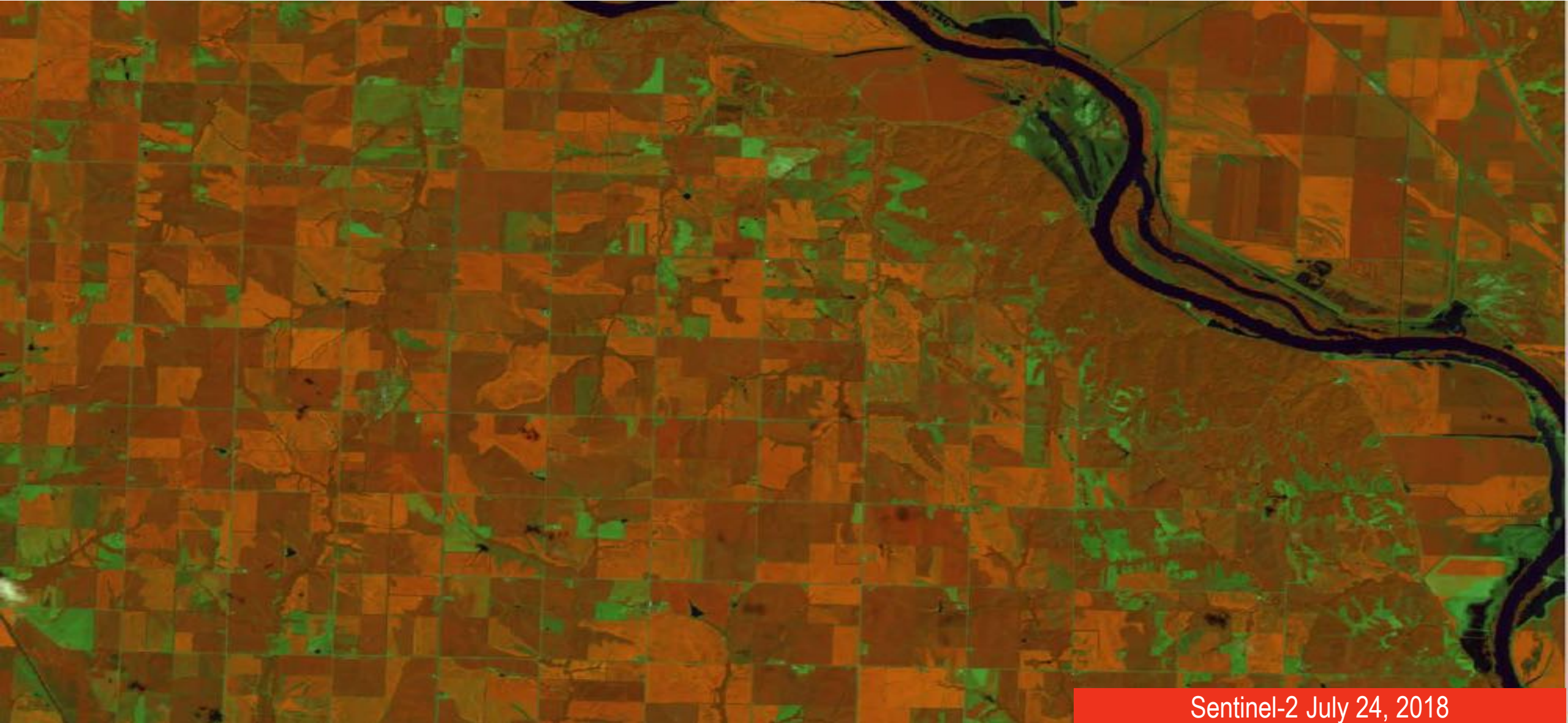
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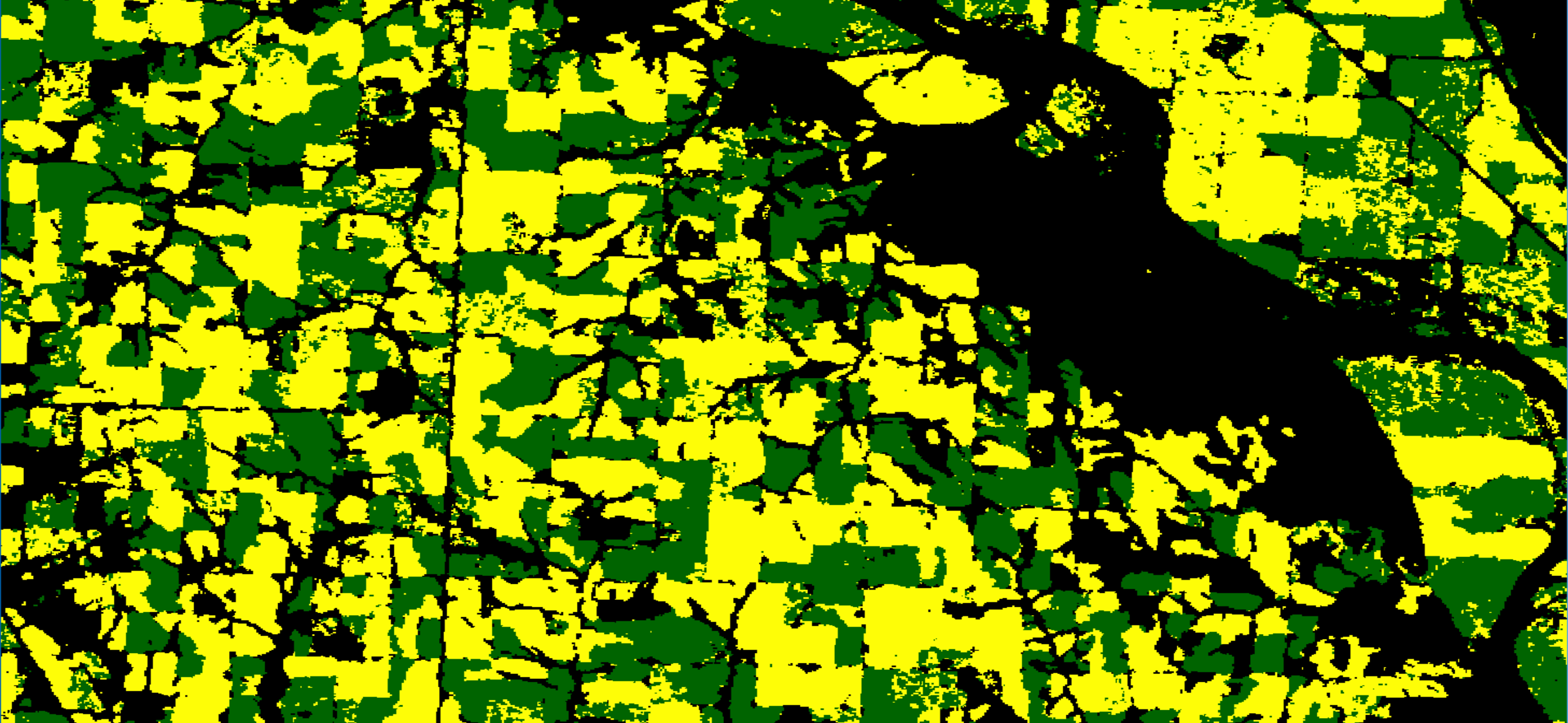
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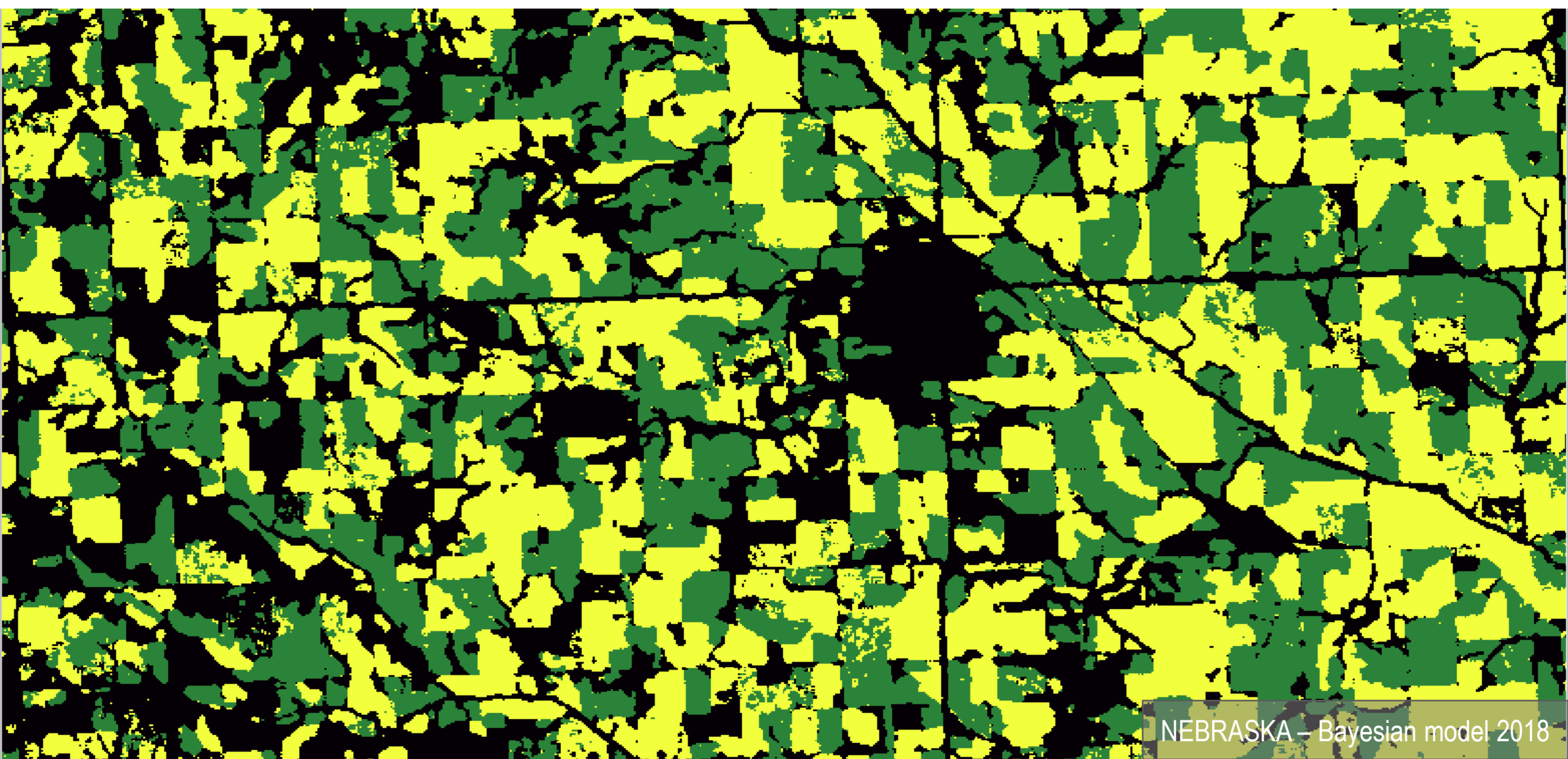
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NEBRASKA – Bayesian model 2018



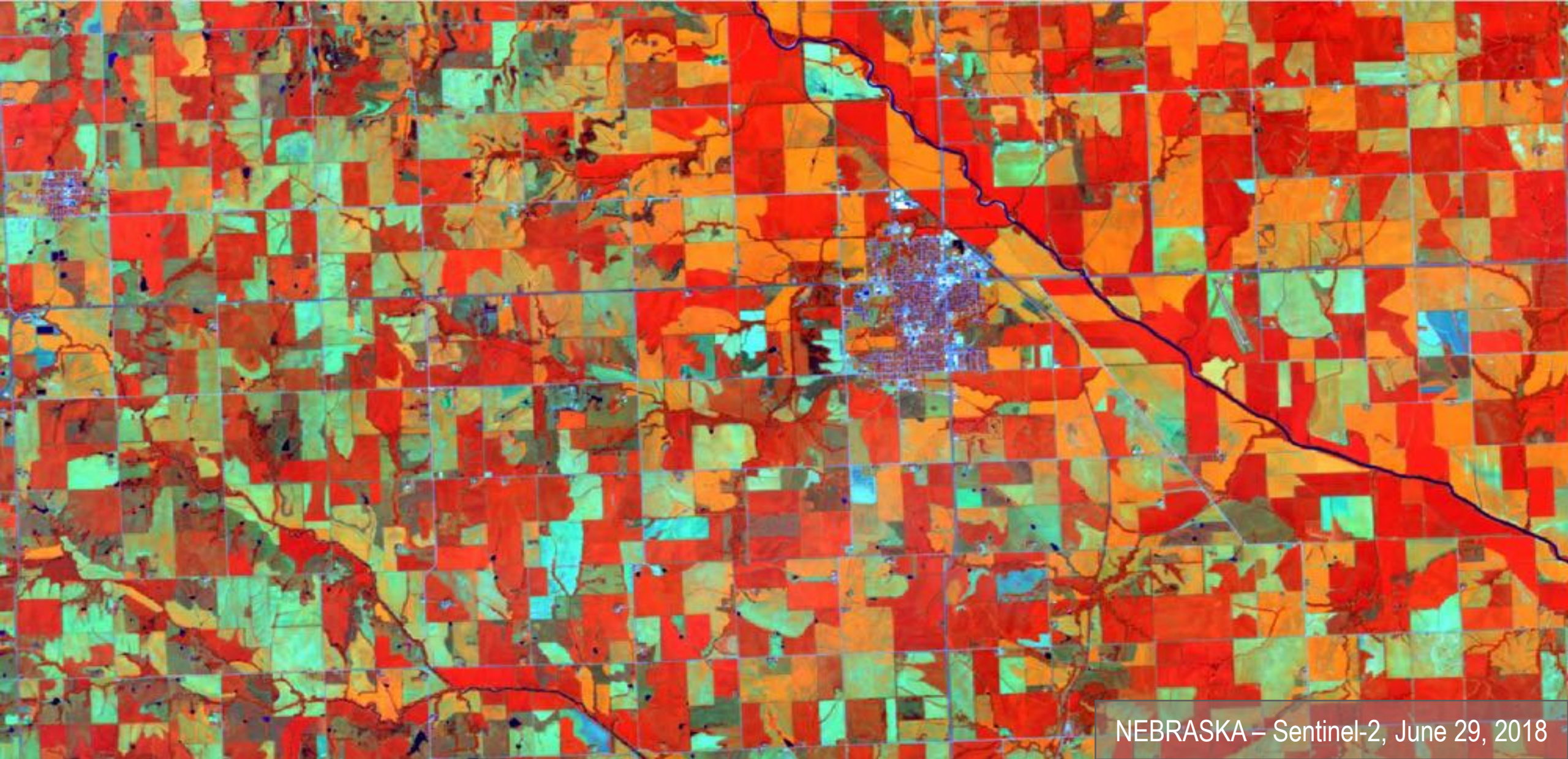
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NEBRASKA – Sentinel-2, June 29, 2018



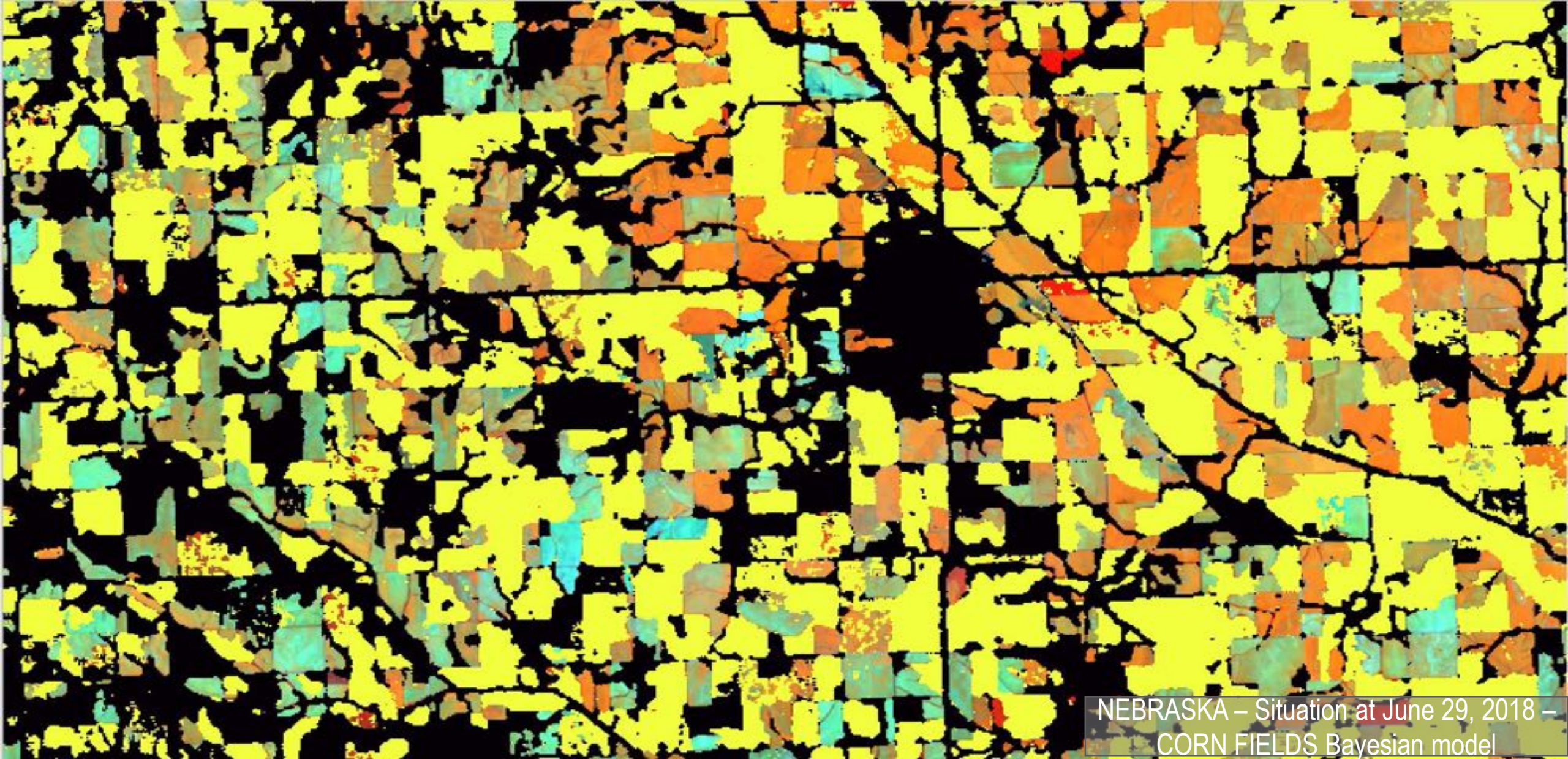
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NEBRASKA – Situation at June 29, 2018 –
CORN FIELDS Bayesian model



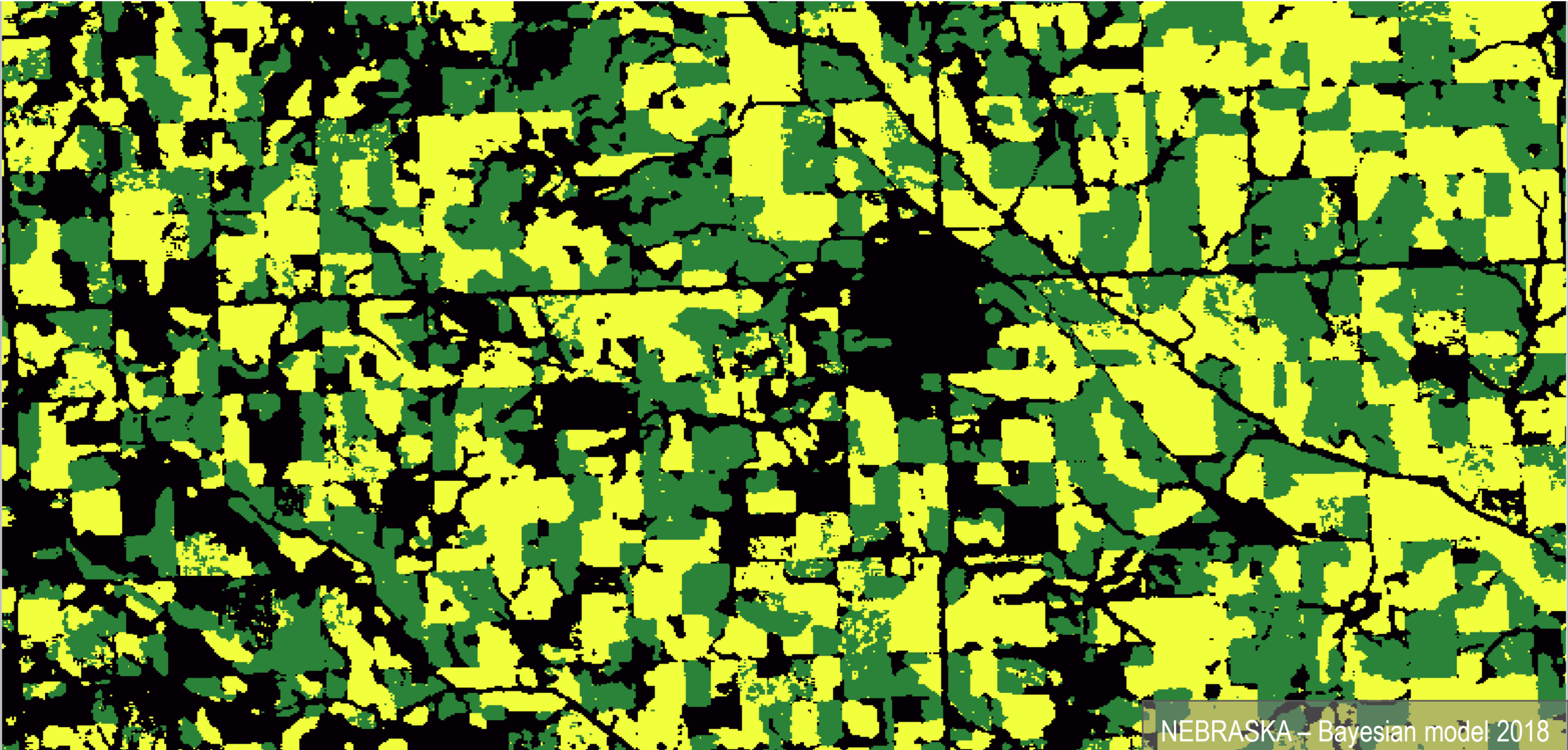
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NEBRASKA – Bayesian model 2018



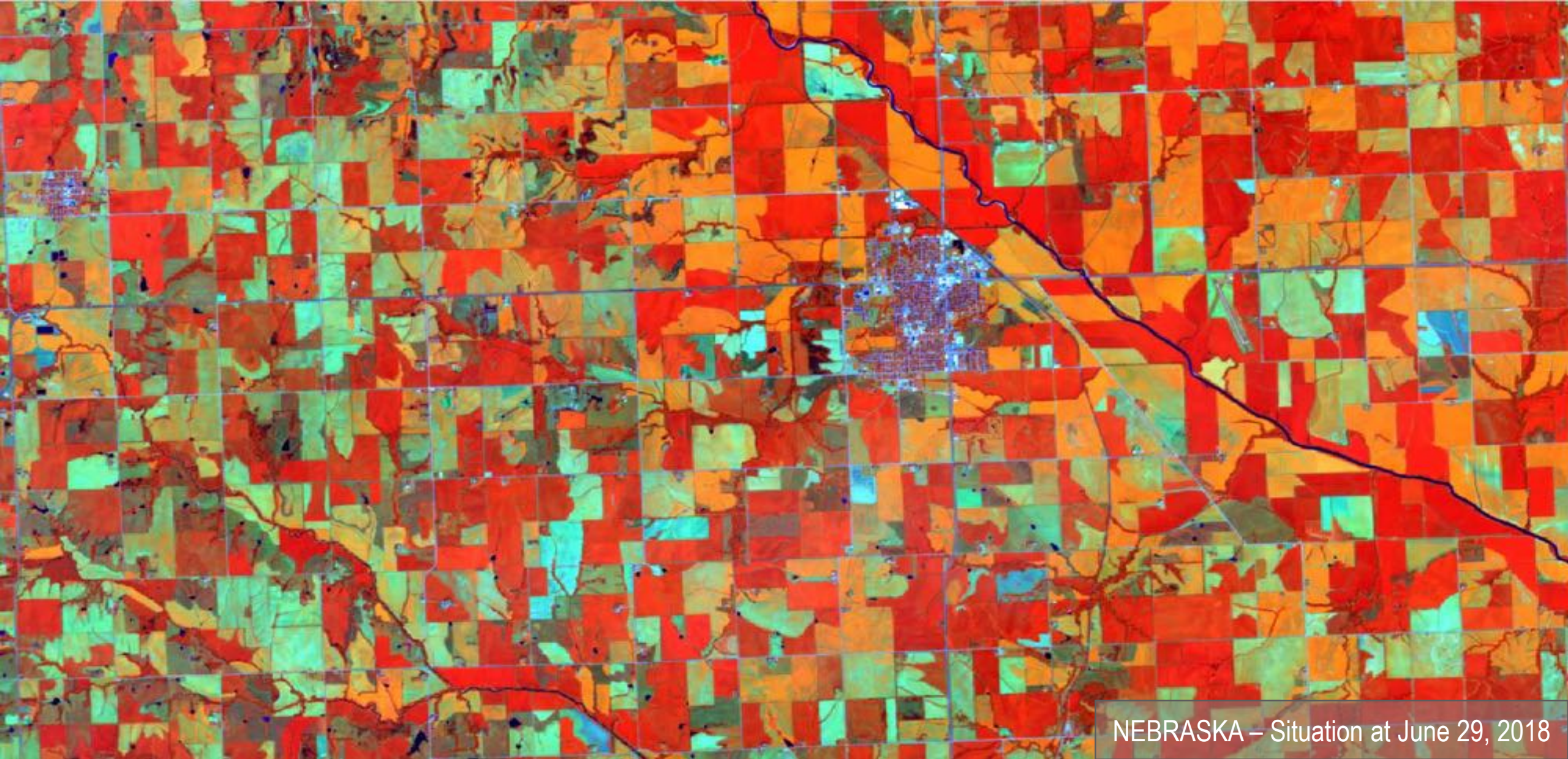
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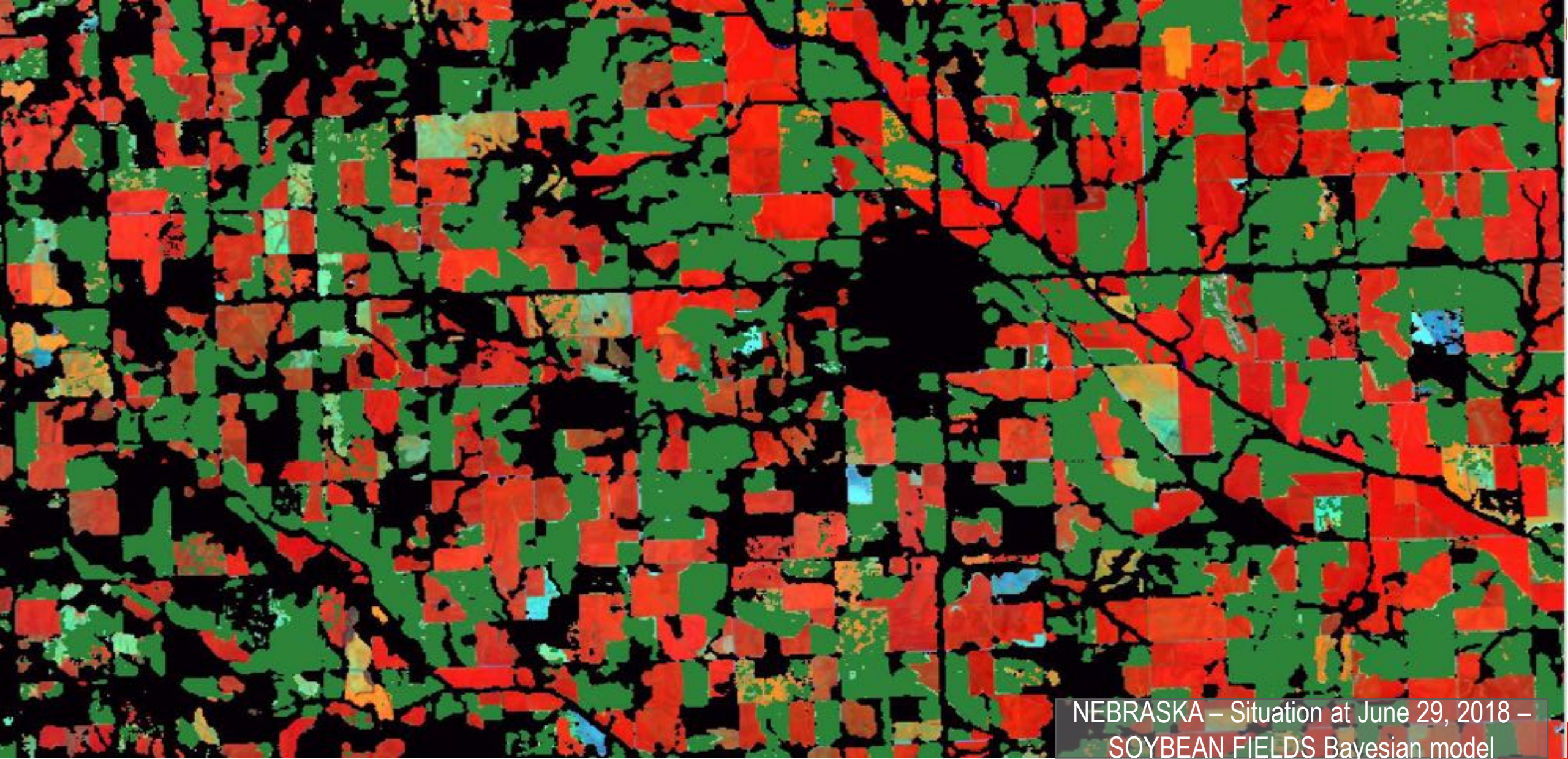
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NEBRASKA – Situation at June 29, 2018 –
SOYBEAN FIELDS Bayesian model



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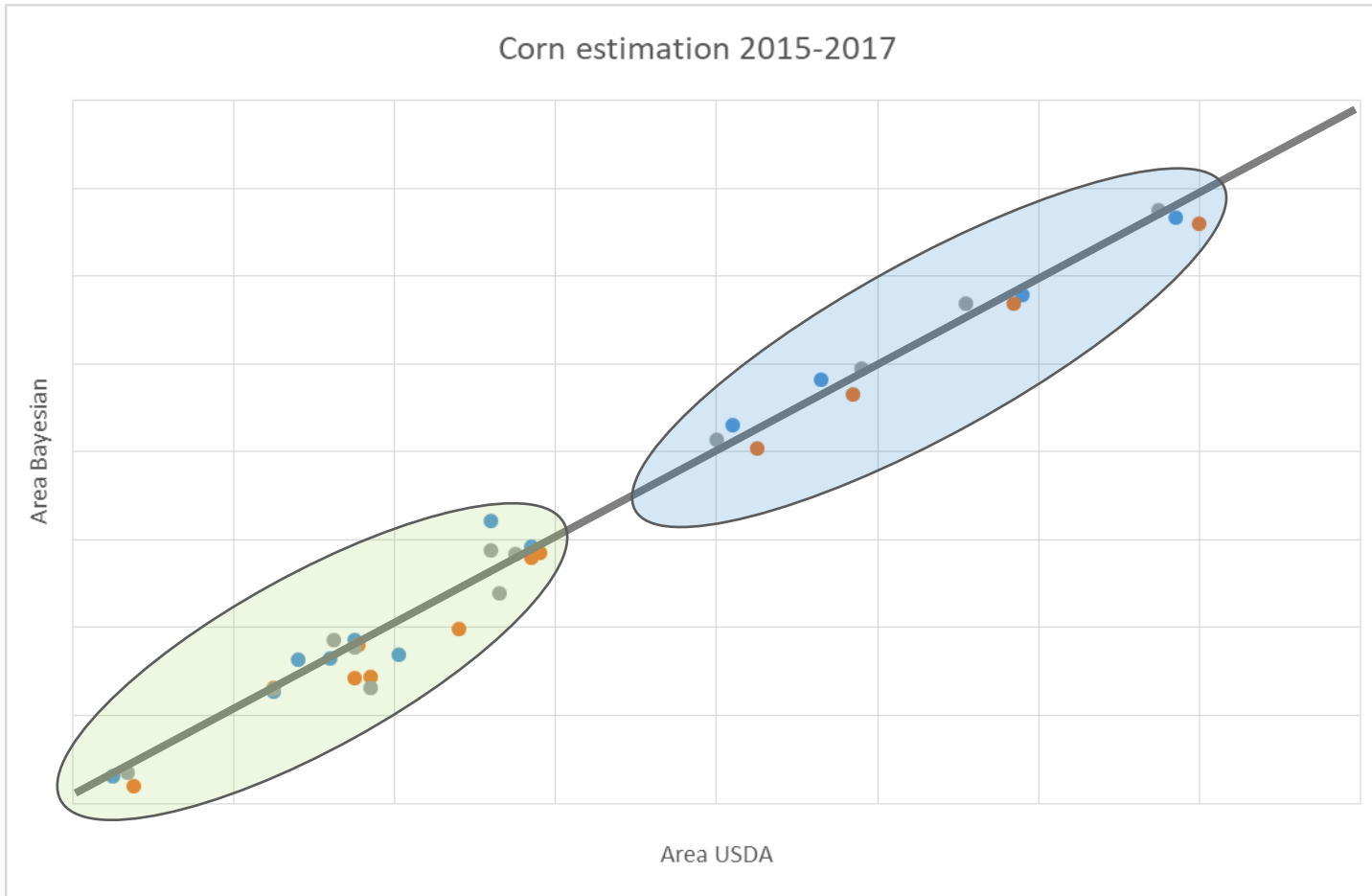
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- Average difference between predicted and reference value:
- For larger acreage : 3.2%
- For smaller acreage : 11.5%



Summary

- Satellite time series are a powerful enabler for EO services dedicated to agriculture
- By leveraging on these time series, e-Geos is adopting its Agrigeo platform for products generation and services provision, also carrying out research activities for enlarging and improving service portfolio.
- Together with Politecnico of Milano has been analyzed the computation of crop acreage over administrative units, with focus on its continuous update during the growing season
- A promising solution is based on the integration of a bayesian model for the provision of crop acreage in the very early stage, with an RF model for later stages

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