Artificial intelligence for smart agriculture, Atos Montpellier Feedback

Amine Chemchem, PhD Data scientist Researcher Senior Expert in Artificial Intelligence Lamine.chemchem@atos.net



Atos

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Content overview





01. Who Are we?





Atos Worldwide

At Atos, our purpose is to help design the future of the digital space



Learn more : <u>https://atos.net/en/raison-detre</u>

Our expertise and services support the development of knowledge, education and research in a multicultural approach and contribute to the development of scientific and technological excellence.

Across the world, the group enables its customers and employees, and members of societies at large to live, work and develop sustainably, in a safe and secure digital space.





Atos: A proximity Network in France





ATOS Montpellier

Data Driven Intelligence department





ATOS Montpellier : Focus innovation

InnoLab South of Atos « AI for Better Life »







02 some feedbacks on smart agriculture projects





My Feedbacks on smart agriculture In Atos Montpellier

- Digital soil mapping and enhancing the value of water resources
- Save water and suggest crops according to the soil available water capacity (SAWC)

→ TerraOccitanIA Project

- Chemical products are more and more limited and rejected by the UE and by the population,
- Weeds have dynamical interactions with the vines (could have positive and negative impact)
- Automatic Identification & localization of harmful weeds that negatively impact the growth of plants

→ DIVA Project







03 Terra OccitanIA : From text recognition to soil map generation



TerraOccitanIA Project

From text recognition to soil map generation

Processing of old soil data to produce more accurate soil maps First use case: soil available water capacity (SAWC) to control the irrigation of vineyards



TerraOccitanIA Project

From text recognition to soil map generation





TerraOccitanIA Project **Dataset of soil profiles**

- 4 different formats
- 9200 sheets processed

Format 1



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TerraOccitanIA Project

Workflow of the training process

Automatic Submission of soil sheets Model Training h[s] HYPERSCIENCI CARACTÉRISTIQUES FÉDOLOGIQUES FICHE DE SOL CARACTÈRES DU SOL EN PLACE atocoas CARACTÉRISTIQUES USAGE ACTUEL HYDRODYNAMIQUES INTERVATEUR ITAT DE LA SURFAC DATE INDUSTRALISE DATE INDUSTRALISE CARTE IN POLICET Nº LOCALITE CARTE I/JELEOS Nº NAME OF TYPE OU SO Manateo dea Polisedeur Coxieur Taeturo COORDONNEES



Data Labelling (20 sheets / format)





TerraOccitanIA Project Metrics of the digitisation model

Count of Submission	ID Column Labels 🔽						
Row Labels	↓ FALSE	TRUE	(blank) Grand Total	Cumulative Automation	Automation %	Cumulative Errors	Accuracy %
0.95-1		64	64	64	1,1%	0	100,0%
0.9-0.95	1	2884	2885	2949	51,2%	1	100,0%
0.85-0.9	1	902	903	3852	66,9%	2	99,9%
0.8-0.85	3	519	522	4374	75,9%	5	99,9%
0.75-0.8	4	286	290	4664	80,9%	9	99,8%
0.7-0.75	8	178	186	4850	84,2%	17	99,6%
0.65-0.7	6	100	106	4956	86,0%	23	99,5%
0.6-0.65	4	87	91	5047	87,6%	27	99,5%
0.55-0.6	5	65	70	5117	88,8%	32	99,4%
0.5-0.55	10	64	74	5191	90,1%	42	99,2%
0.45-0.5	9	59	68	5259	91,3%	51	99,0%
0.4-0.45	16	42	58	5317	92,3%	67	98,7%
0.35-0.4	11	55	66	5383	93,4%	78	98,6%
0.3-0.35	13	32	45	5428	94,2%	91	98,3%
0.25-0.3	17	37	54	5482	95,1%	108	98,0%
0.2-0.25	11	39	50	5532	96,0%	119	97,8%
0.15-0.2	24	45	69	5601	97,2%	143	97,4%
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0-0.05	55	1	56	5762	100,0%	259	95,5%
<0 or (blank)				5762	100,0%	259	95,5%
Grand Total	259	5503	5762				

Compromise between the automation and the Accuracy rates

Dataset

- 4 different formats
- 9200 sheets processed

Implementation of the system :

- Accuracy : 99,5 %
- Automation : 87,6 %
- 36 fields to be transcribed manually \approx 3 min / sheet

TerraOccitanIA Project Predictive AI model : soil available water capacity (SAWC)



Predicted SAWC in Lattes (south of Montpellier)

Predicted SAWC on the East of Herault department



157.9

140.4

122.8

105.3

70.2

52.6

35.1

- 17.5

04. DIVA : AI & Cover Crops for Weed Management





DIVA Project

Weeds need to be managed carefully in vineyards

> The facts:

- **Chemical products** are more and more **limited** and rejected by the population (the **glyphosate** example)
- Mechanical intervention is costly and time consuming
- Weeds have dynamical interactions with the vines (could have positive and negative impact)
- Timing is of essence

Solutions usually evolves around automation of treatment (robotics) but without necessarily providing recommendations; sometimes no action is better



DIVA Project

Identification & localisation of flora

L'Intelligence Artificielle à la portée des petites et

DIVA: An intelligent tool to assist in the flora management in viticulture, Implementation of a multi-stage image analysis pipeline based on different neural network architectures,

- **1** Take pictures from the inter rows
- **2** Detection and identification of the flora
- **3** Suggestion of actions



DIVA Project From raw images...





DIVA Project The algorithm detects, identifies and quantifies the species





DIVA Project One of the challenge is linked with the quality of the images





Diva Project Labelling was a tricky aspect





- > You cannot expect to find an expert to label the images!
- External data were used to auto-label content of generic "weed" boxes



Diva Project Model training and metrics

- Dataset of 1000 pictures
 - Five different classes of Weeds
- By using Label Studio (open source tool)
- 2 models are implemented
 - 1. Detect Weeds (Weeds/no weeds)
 - 2. Classify weeds into 5 classes.



ATO



Recall and precesion of the classification model

24

DIVA Project Examples that work





DIVA Project Examples that work





DIVA Project Examples to be improved





DIVA Project Conclusion & future works

- Several difficulties encountered
 - image quality shadows on the image data labelling
- The first results are encouraging but some classes need more data examples.

As future works :

- Take more pictures of certain weed classes and retrain the model.
- Transfer of the developed solution on mobile / edge in order to deploy the tool.



Funding from the Horizon 2020 DIVA project Collaboration with IFV to work on refining the use cases and in the context of finding alternative to the use of glyphosate.











EU Horizon 2020

Conclusion & Perspectives

Future works & collaborations

we plan to work on these topics but not only:

- Flood forecasting and management
- Water management and dryness prevention
- Remote sensing and GIS in agriculture
- Disease detection in plots

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Thank you!

For more information please contact: Tel +33 758789334 lamine.chemchem@atos.net

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