

# Polarimetric Response of Rice Fields at C-band: Analysis and Applications



Juan M. Lopez-Sanchez  
Fernando Vicente  
J. David Ballester-Berman

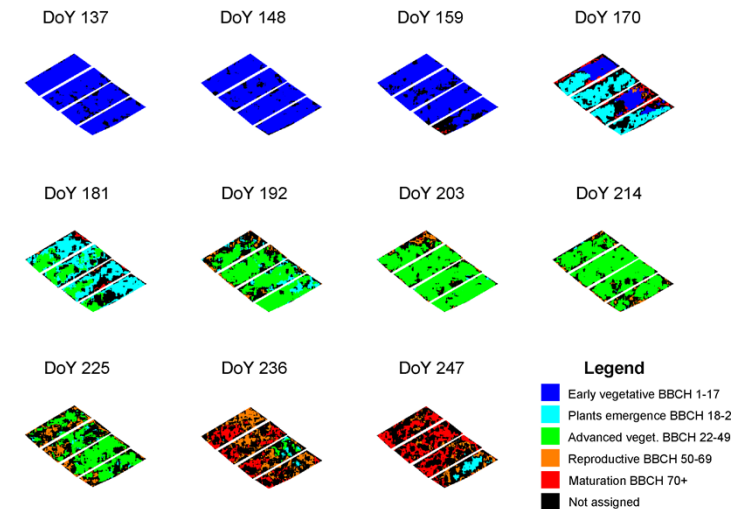
Shane R. Cloude



- Coherent dual-pol HHVV images acquired by TerraSAR-X showed the sensitivity of polarimetry to track and retrieve phenology of rice fields

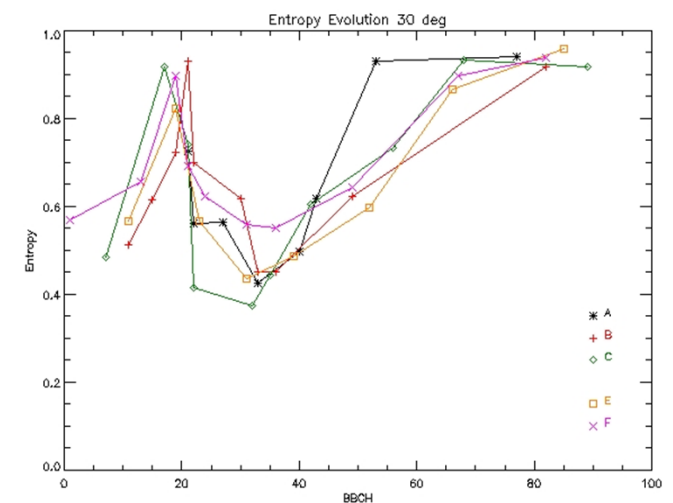
## – Results:

- Five phenological intervals can be identified
- Phenology estimated from just one acquisition
- Usefulness:
  - At pixel level: different growth rates within a parcel and cultivation problems
  - At parcel level: overall development rate for planning and triggering of cultivation practises



## – Limitations:

- Ambiguity: Start of tillering (stages 18-21) and maturation (stages 70+) present high entropies and cannot be distinguished in many cases
- Small swath (low spatial coverage)
- Low SNR at some stages (NESZ ~ -19 dB)



# Pending questions

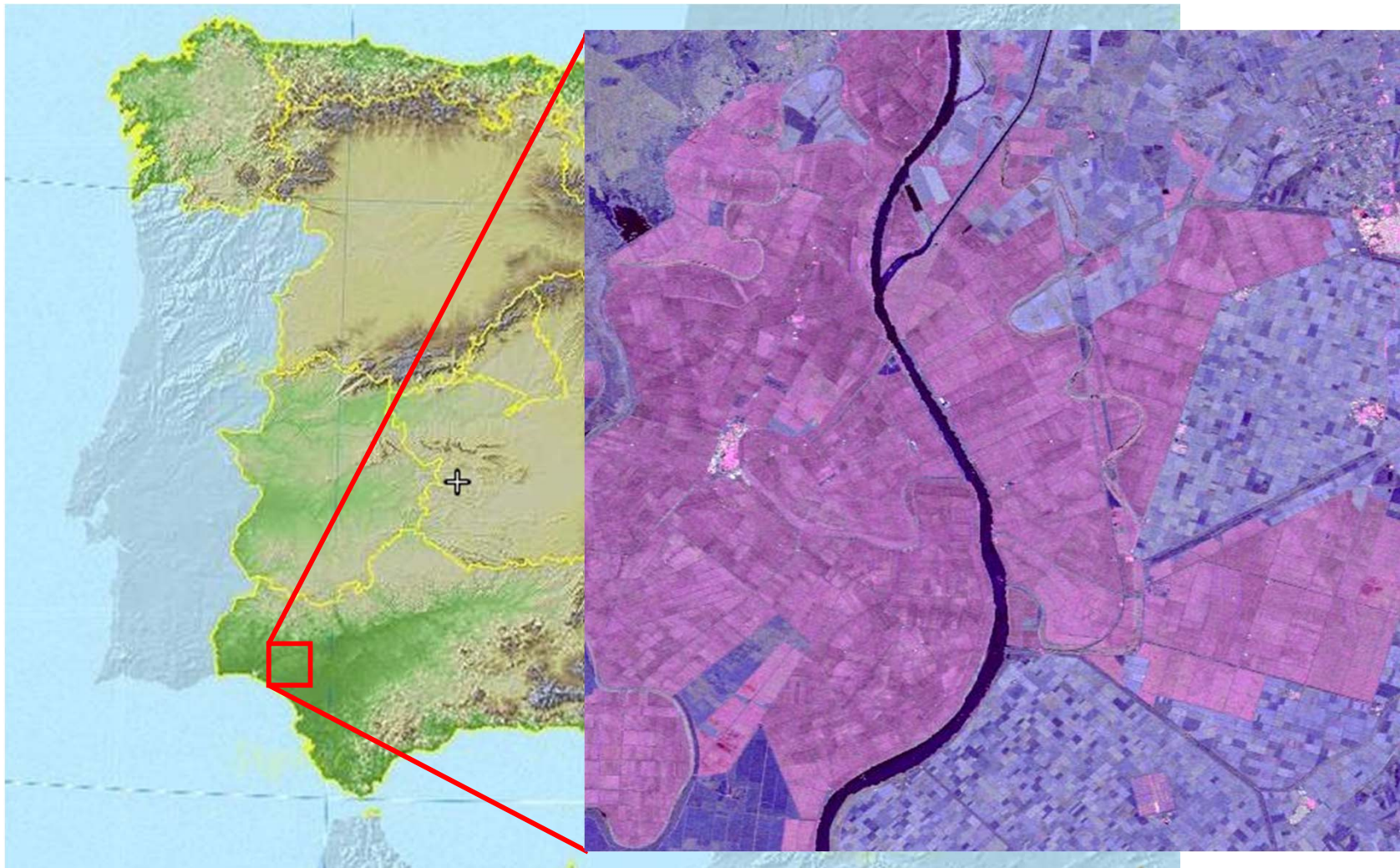
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- Could the ambiguities found with HHVV images be solved by full polarimetry?
  - Test it with Radarsat-2...
  - But acquisitions during 2009 were restricted to the first half of the campaign [Lopez-Sanchez et al. \[POLinSAR2011\]](#)
- What is the influence of frequency band (C vs X) on the polarimetric observables as a function of phenology?
- Can phenology be retrieved with a single Radarsat-2 image?
- Is full polarimetry strictly required for such an application? What about compact-pol or conventional dual-pol?
  - Interest for RCM, Sentinel-1, etc.
  - Increased spatial coverage



# Test site

Mouth of the Guadalquivir river, Seville, Spain



Radarsat-2, 6-Aug-2010  
Pauli RGB composite

# Ground campaign: 2009 and 2010

- Ground data provided at 5 and 6 parcels
  - Weekly update
  - Phenological stages in BBCH scale
  - + Additional info:

2009						
Label	Surface (ha)	Sowing date (DoY)	Plants/m <sup>2</sup>	Panicles/m <sup>2</sup>	Harvest date (DoY)	Yield (kg/ha)
A	13.14	17-may (137)	315	530	07-oct (280)	8.949
B	12.47	15-may (135)	350	600	29-sep (272)	8.729
C	40.5	07-may (127)	850	1300	25-sep (268)	10.400
D	4.34	24-may (144)	400	512	08-oct (281)	10.060
E	17.26	15-may (135)	450	580	14-oct (287)	9.000

2010						
Label	Surface (ha)	Sowing date (DoY)	Plants/m <sup>2</sup>	Panicles/m <sup>2</sup>	Harvest date (DoY)	Yield (kg/ha)
A	13.14	22-may (142)	469	620	19-oct (292)	9.493
B	12.47	22-may (142)	464	510	18-oct (291)	8.400
C	40.5	17-may (137)	425	560	02-oct (275)	10.057
D	4.34	23-may (143)	350	640	13-oct (286)	10.495
E	17.26	02-jun (153)	183	549	04-nov (307)	9.500
F	9.68	27-may (147)	380	540	27-oct (300)	9.403

Ground data acquired by the  
*Federación de Arroceros de Sevilla*

# Available radar data

- 10 Radarsat-2 images

<b>Mode</b>	Fine Quad-Pol.
<b>Beam</b>	FQ13
<b>Avg. Incidence angle</b>	33 degrees
<b>Pass</b>	Descending
<b>Acquisition time</b>	6:30 a.m.
<b>Pixel spacing</b>	4.7 x 4.7 m

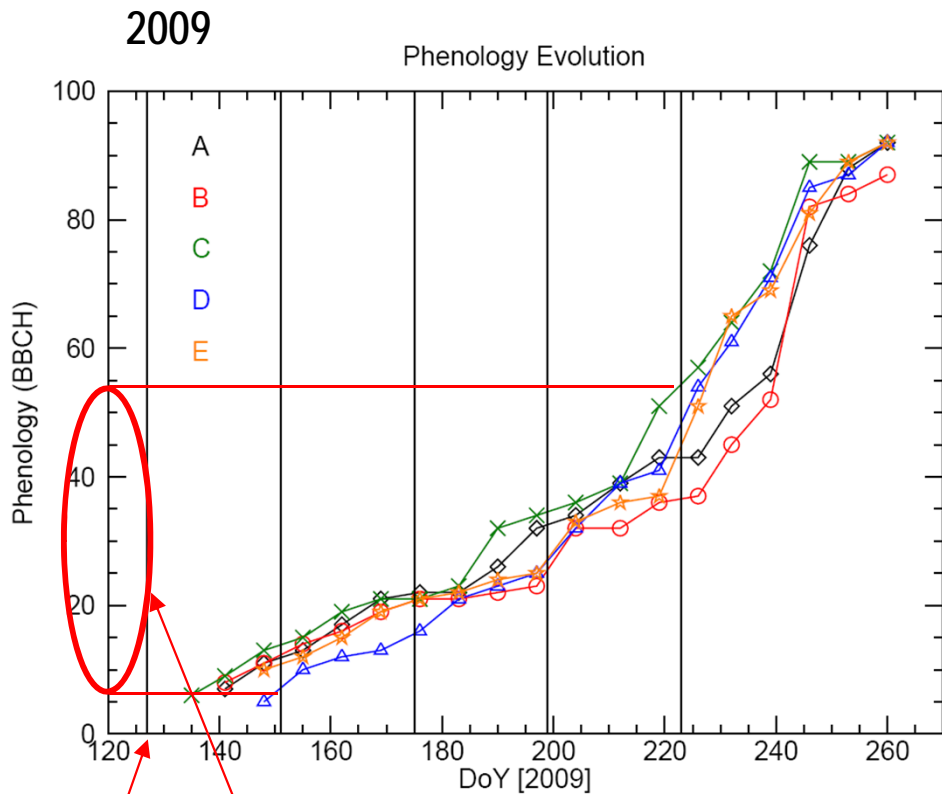
Date	DoY
07-May-2009	127
31-May-2009	151
24-Jun-2009	175
18-Jul-2009	199
11-Aug-2009	223
26-May-2010	146
19-Jun-2010	170
06-Aug-2010	218
23-Sep-2010	266
17-Oct-2010	290

Every 24 days

Gaps (missed acquisitions)

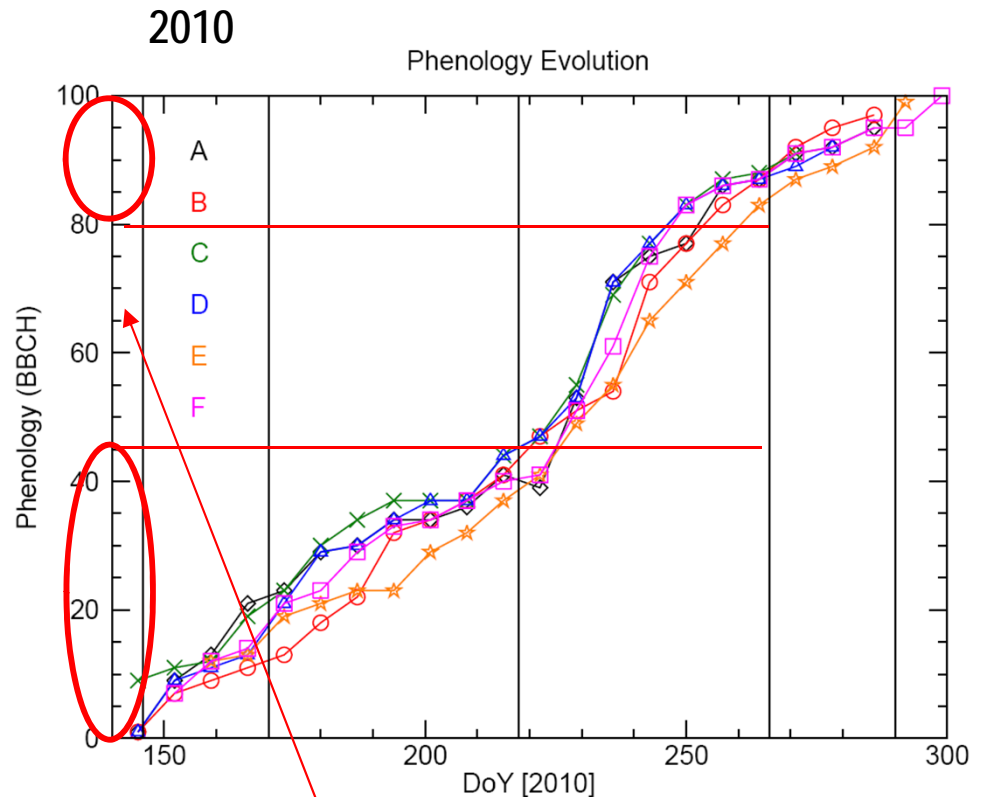
Images provided by MDA and CSA under the SOAR project 2125

# Phenology at radar acquisition dates



Observation in 2009 is restricted to stages below 55

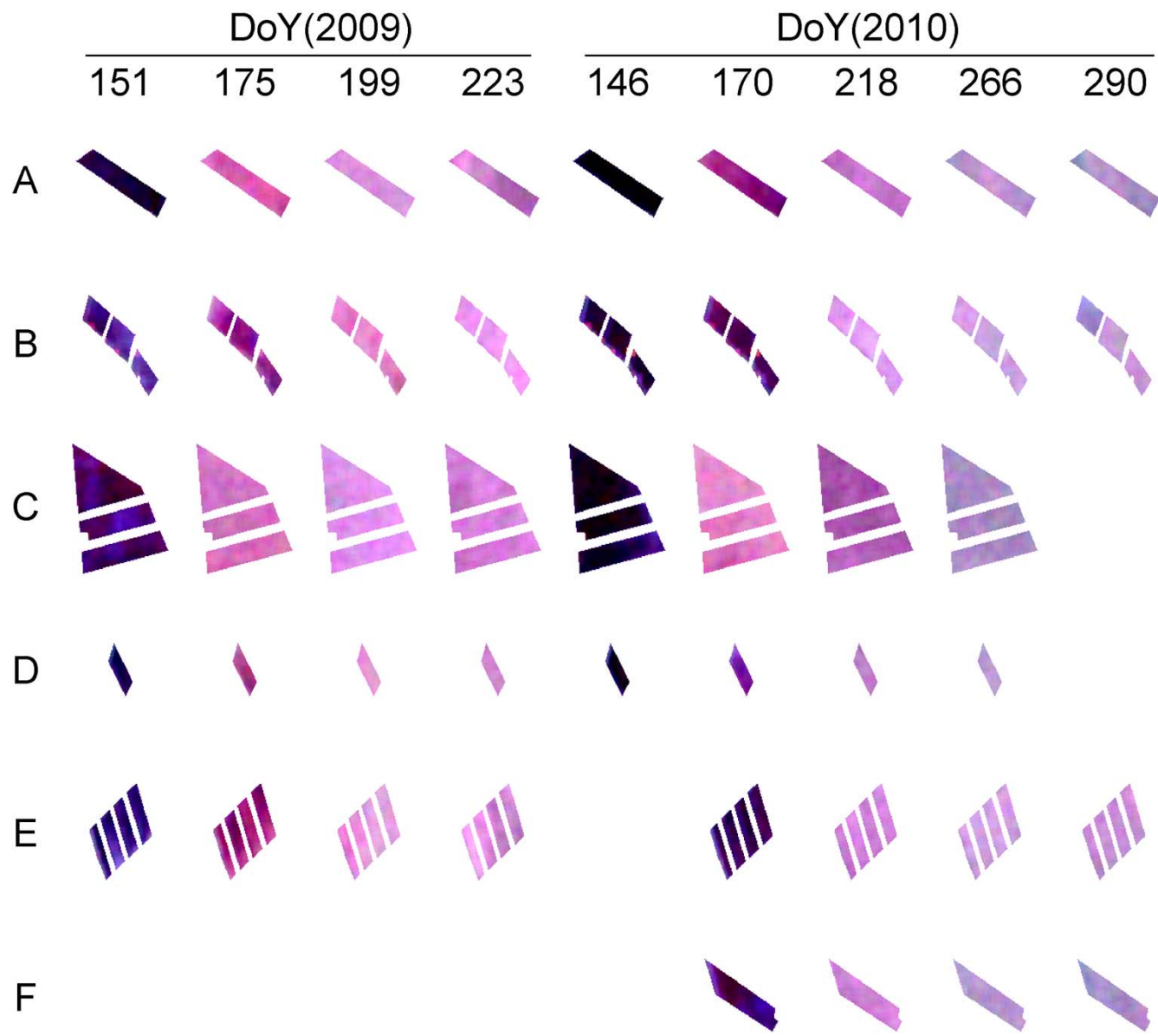
The first image in 2009 was acquired before sowing any field: discarded



There are not observations during the reproductive phase and early maturation: stages 55-80



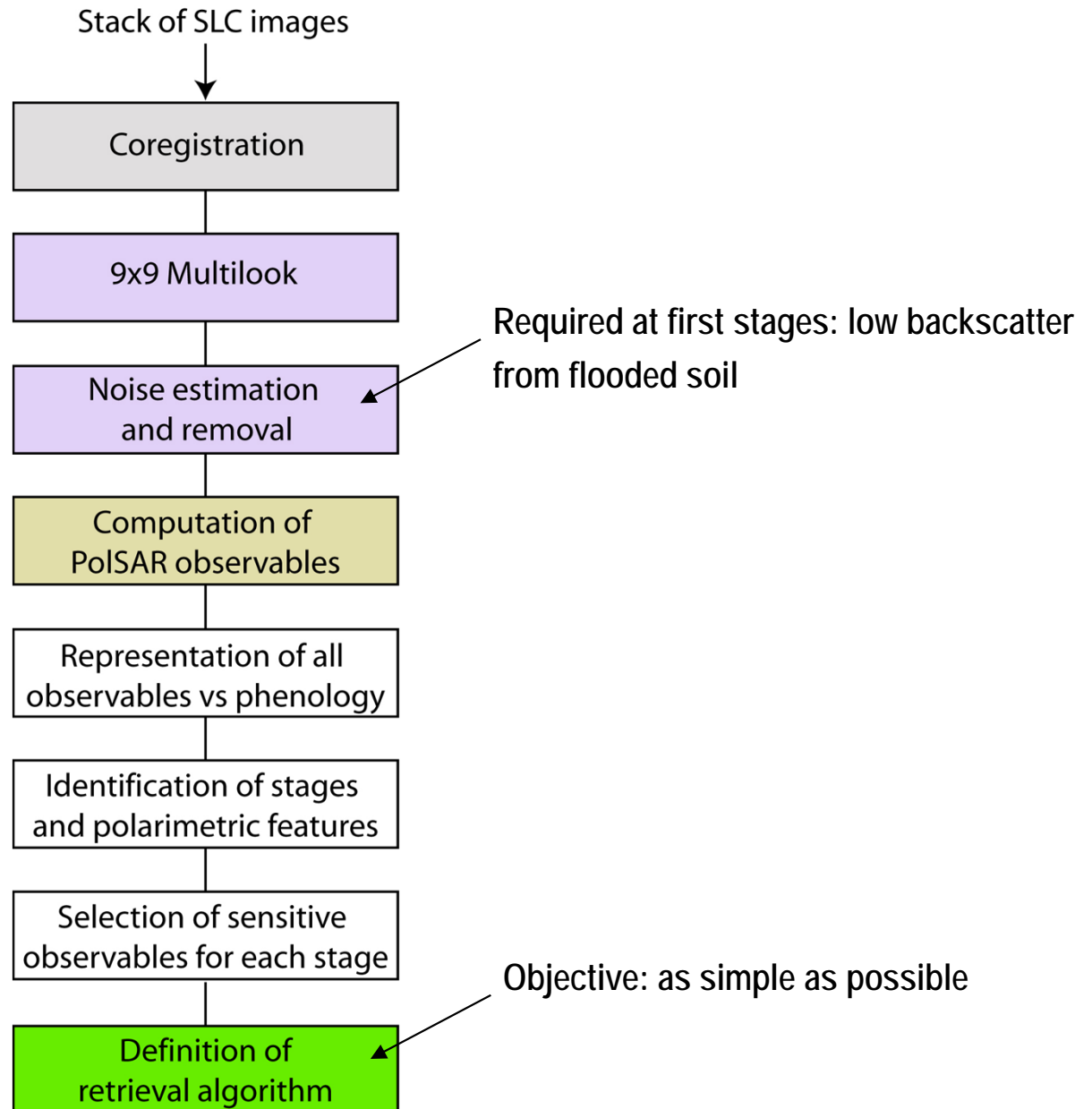
# Observations at every parcel and date



Pauli RGB composite

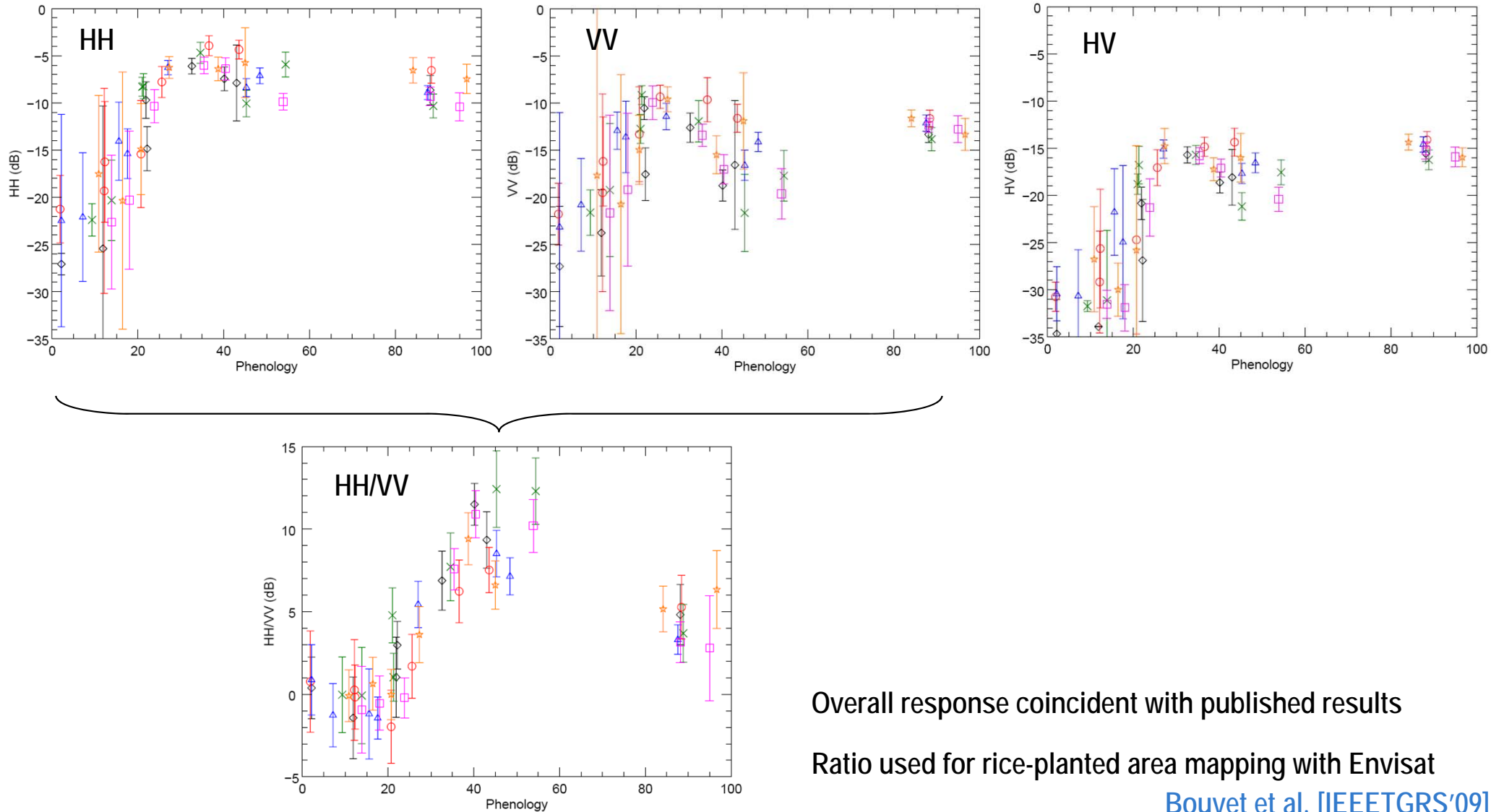


# Data analysis



# Observables vs phenology

## Backscattering coefficients



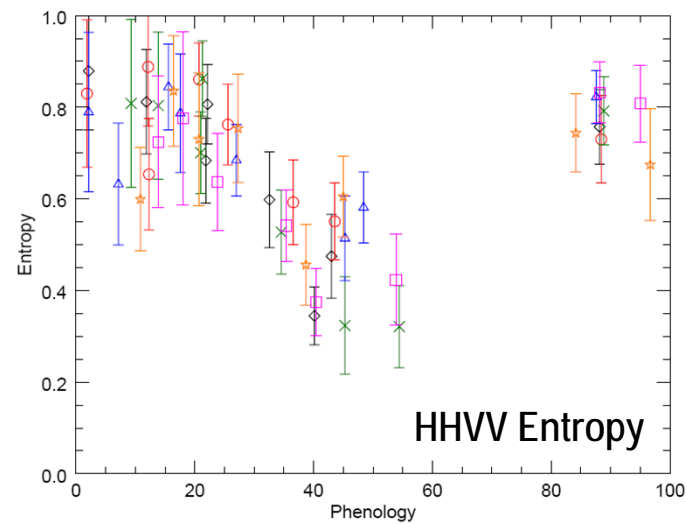
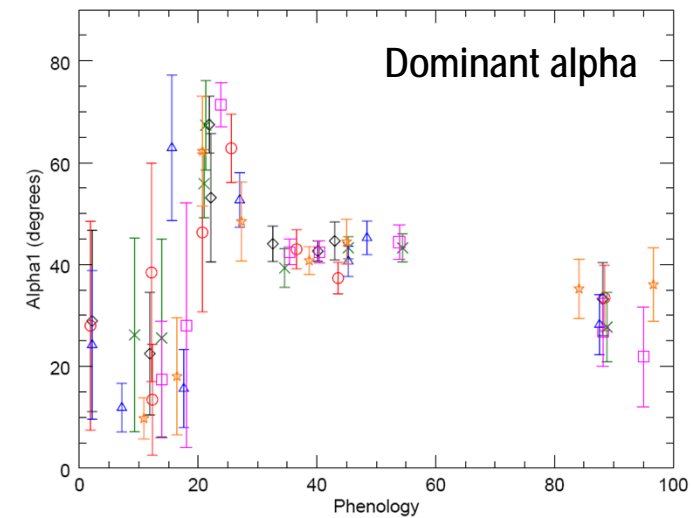
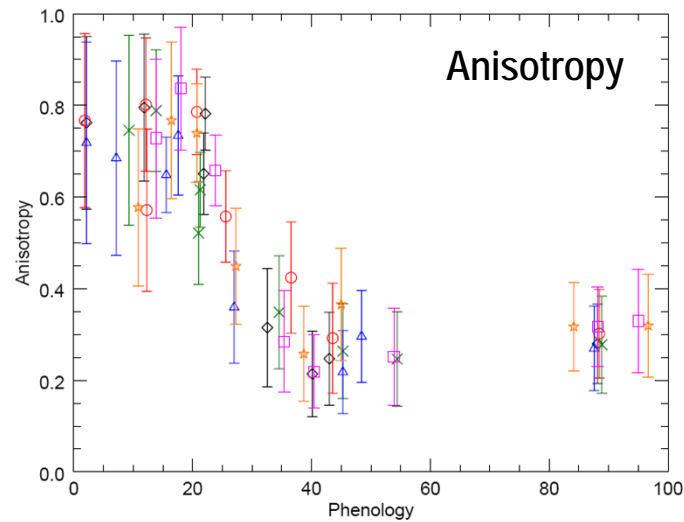
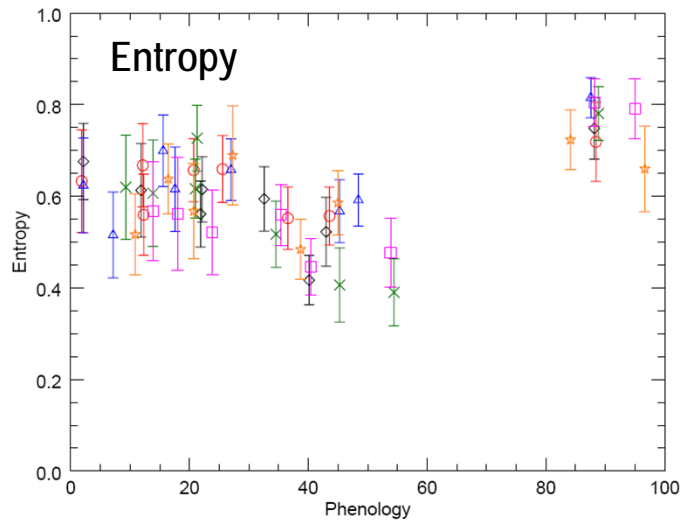
Overall response coincident with published results

Ratio used for rice-planted area mapping with Envisat

Bouvet et al. [IEETGRS'09]

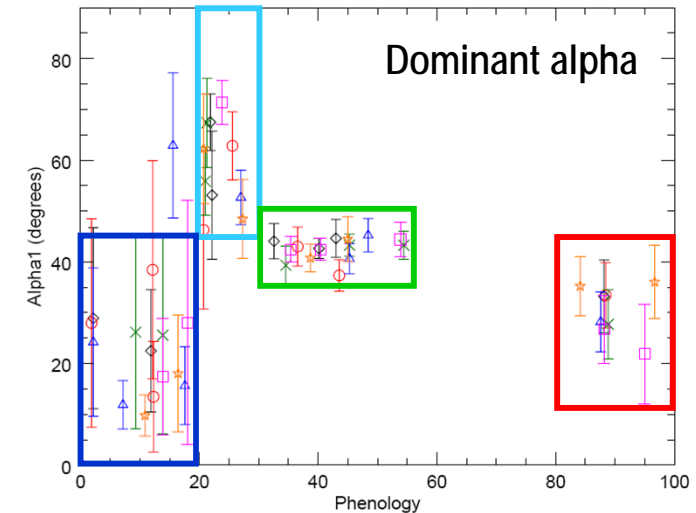
# Observables vs phenology

## Eigenvalue/vector decomposition



# Physical interpretation

- **Early vegetative (0-20)**
  - Dominated by surface scattering (flooded ground) with short vegetation
  - Only two scattering mechanisms: surface and double-bounce
- **Tillering (20-30)**
  - Dominated by double-bounce: interaction between stems/tillers and flooded ground
- **Advanced vegetative (30-55)**
  - Linearly polarised backscatter (horizontal), due to double-bounce and differential extinction
- **Maturation (80-100)**
  - Approaching a random volume: high entropy and low anisotropy



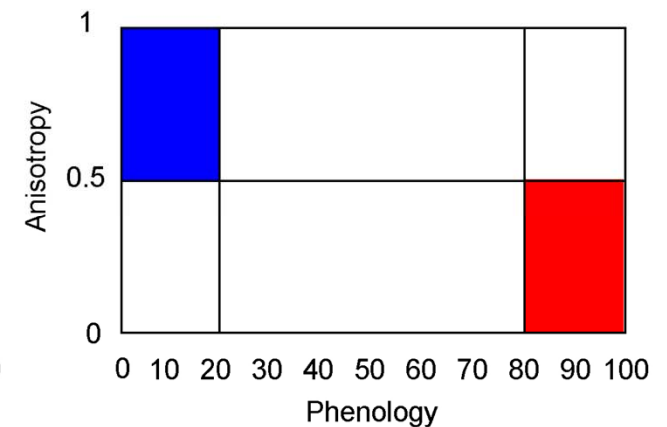
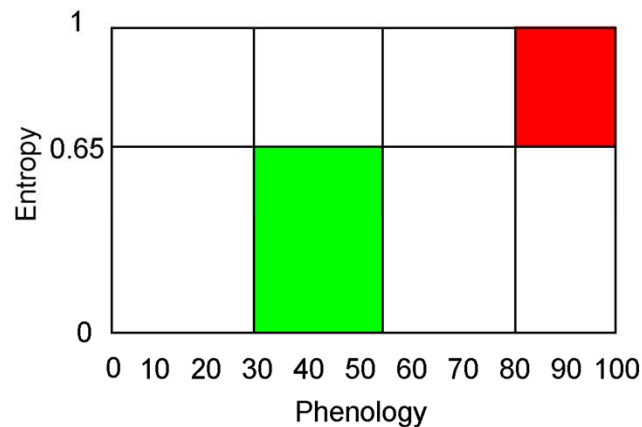
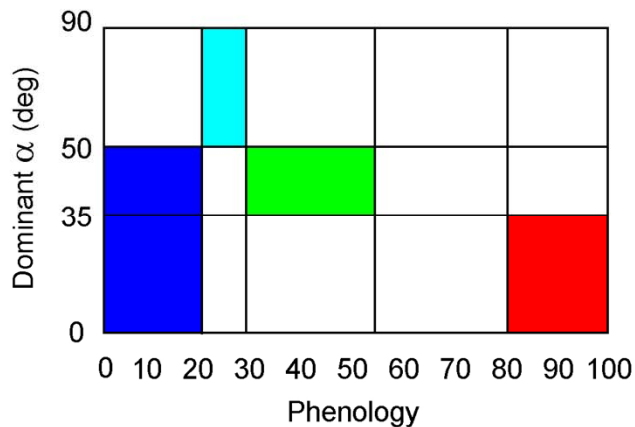
## C-band vs X-band

- Overall response similar to X-band
- One main difference:
  - At X-band the dominance of the double bounce around tillering phase starts before and ends quickly: stages 18-21
  - At C-band, however, it lasts from stage 20 to 30
  - Justification: size of the tillers in terms of the wavelength

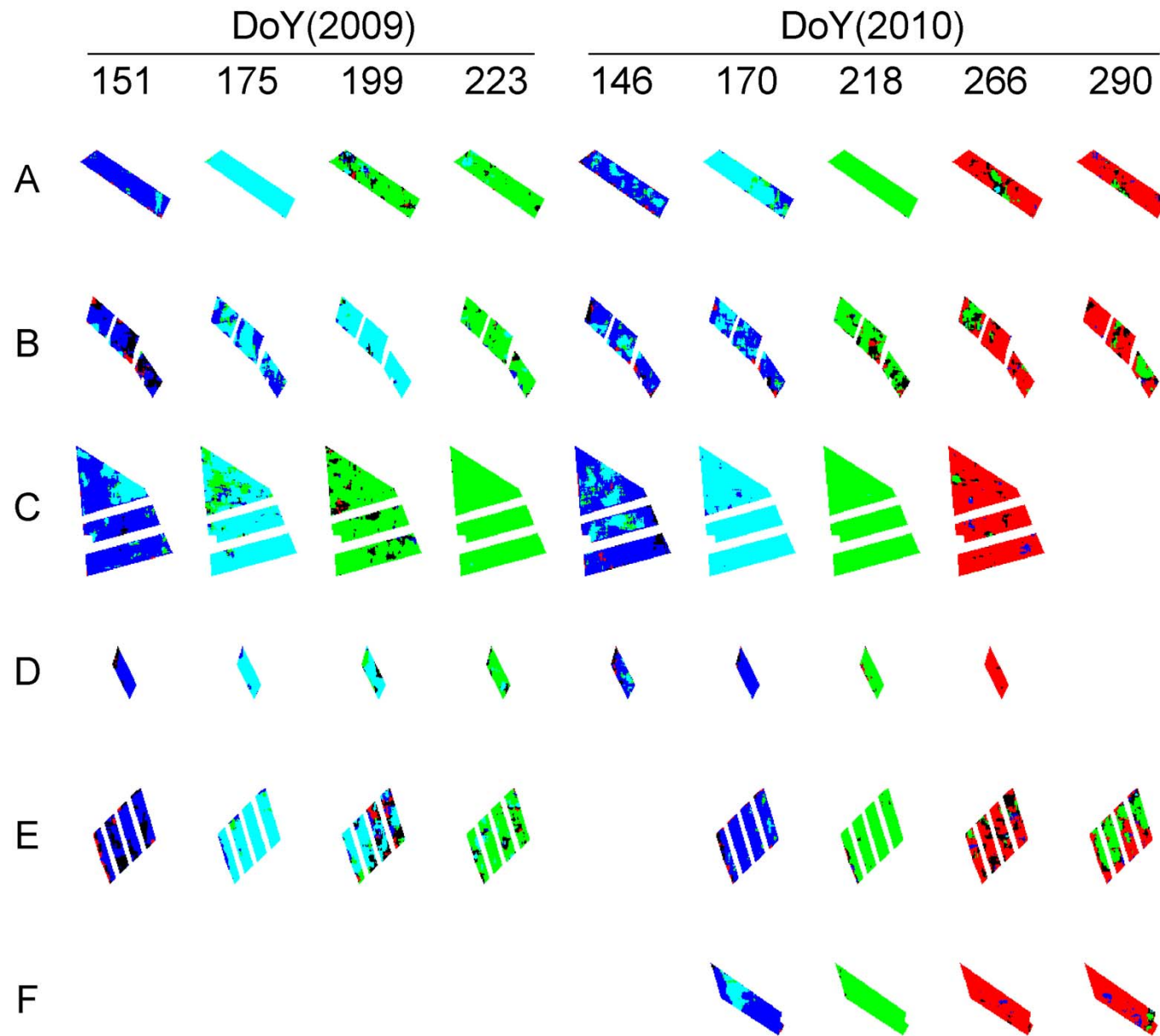


# Phenology retrieval: algorithm with quad-pol

- Identification of radar response for 4 phenological intervals:
  - **Early vegetative (0-20)**
  - **Tillering (20-30)**
  - **Advanced vegetative (30-55)**
  - **Maturation (80-100)**
- Reproductive and early maturation (55-80) are not available
- First proposal with 3 parameters:  $\alpha_1$ ,  $H$ ,  $A$
- Rules based on physical interpretation



# Phenology retrieval: results with quad-pol



# Phenology retrieval: results with quad-pol

- Validation at parcel level:
  - The most retrieved value (mode) within each parcel is compared with ground campaign
  - Example for a parcel:

PARCEL A

RETRIEVAL RESULT: NUMBER OF PIXELS

DoY – Acquisition	Not assigned	1	2	3	5	Total pixels
151 (2009)	8	1891	109	35	44	2087
175 (2009)	0	1	2078	8	0	2087
199 (2009)	297	76	104	1566	44	2087
223 (2009)	85	0	126	1874	2	2087
146 (2010)	66	1496	364	96	65	2087
170 (2010)	1	294	1587	205	0	2087
218 (2010)	2	0	2	2083	0	2087
266 (2010)	264	11	29	154	1629	2087
290 (2010)	133	59	2	72	1821	2087

PERCENTAGE OVER ASSIGNED PIXELS

1	2	3	5
91,0	5,2	1,7	2,1
0,0	99,6	0,4	0,0
4,2	5,8	87,5	2,5
0,0	6,3	93,6	0,1
74,0	18,0	4,8	3,2
14,1	76,1	9,8	0,0
0,0	0,1	99,9	0,0
0,6	1,6	8,4	89,4
3,0	0,1	3,7	93,2

GROUND DATA

Phenology
12
22
32
43
2
22
40
88
92+

- Complete statistics:
  - 44 right estimates of 46 cases: **96% coincidence**

# Alternative observables

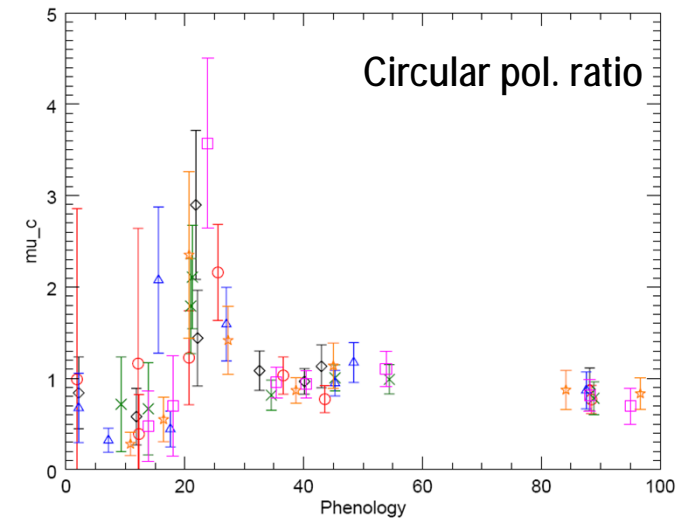
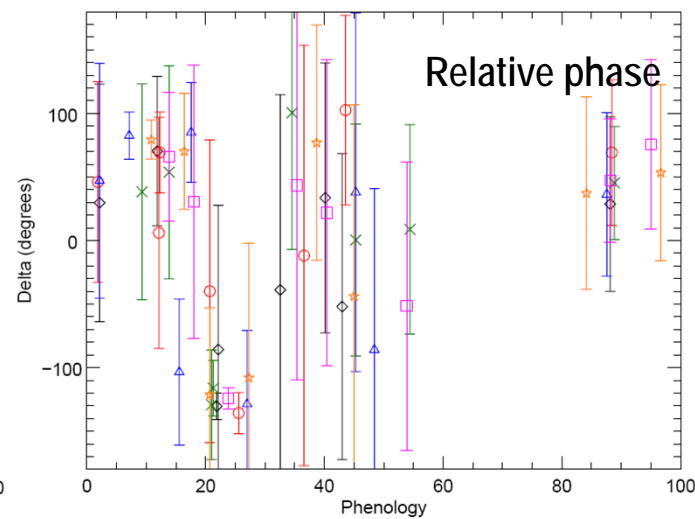
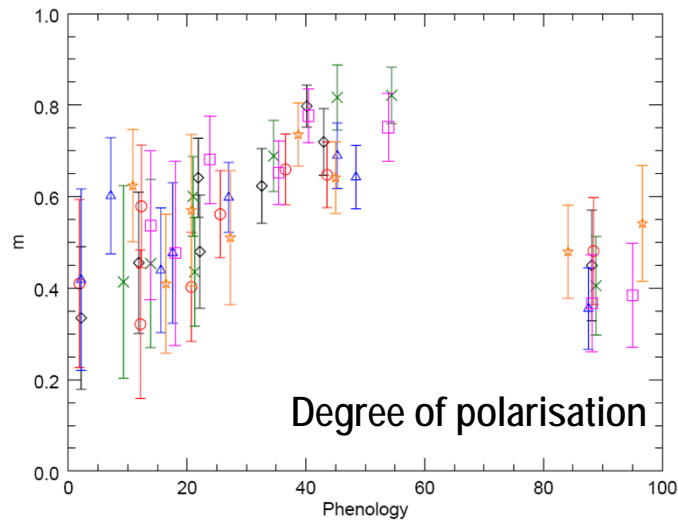
<b>Early vegetative (0-20)</b>	HH/VV $\approx$ 0 dB
	Moderate to high correlation between HH and VV
	Phase difference between HH and VV $\approx$ 0
	Freeman-Durden: Ratio of volume-to-ground scattering $\approx$ -5 dB
	Freeman-Durden: Odd-bounce > double-bounce (above 5 dB)
<b>Tillering (20-30)</b>	Phase difference between HH and VV below -90 degrees
	Freeman-Durden: Double-bounce > odd-bounce (above 5 dB)
<b>Advanced veg. (30-55)</b>	HH/VV > 6 dB
	High correlation between the first two Pauli channels
<b>Maturation (80-100)</b>	Freeman-Durden: Ratio of volume-to-ground scattering around or above 0 dB

... and others with circular polarisation basis

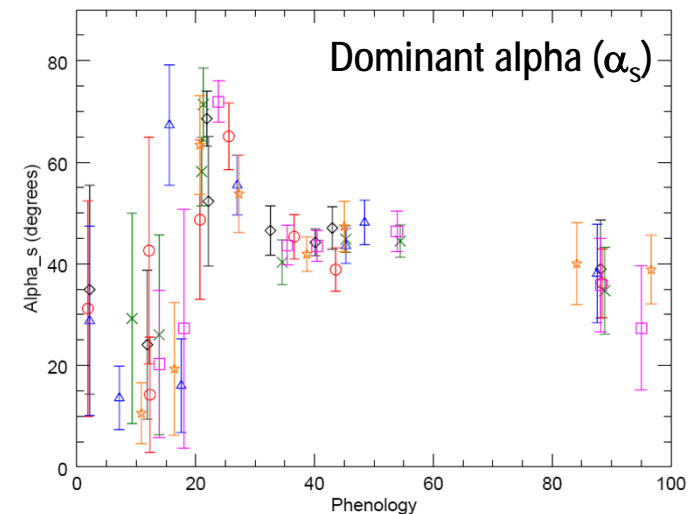


# Compact-pol observables

## Conventional hybrid-pol parameters



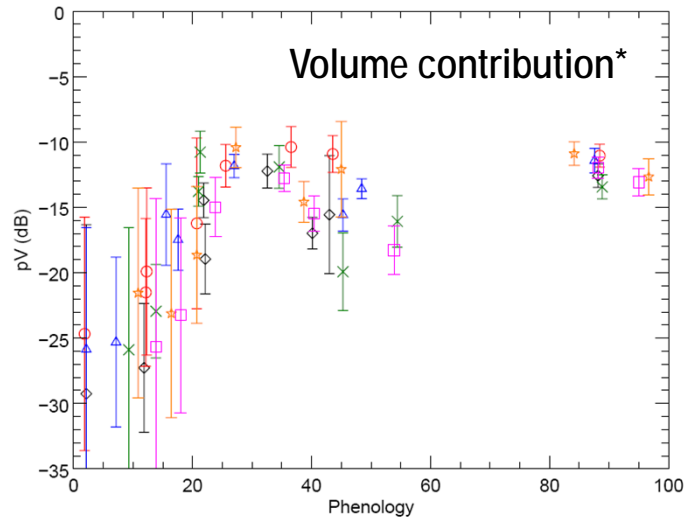
- Equivalent information provided by:
  - Degree of polarisation – entropy
  - Circular pol. ratio – dominant alpha
- But anisotropy cannot be measured equivalently



Cloude et al. [IEEEGRSL'12]

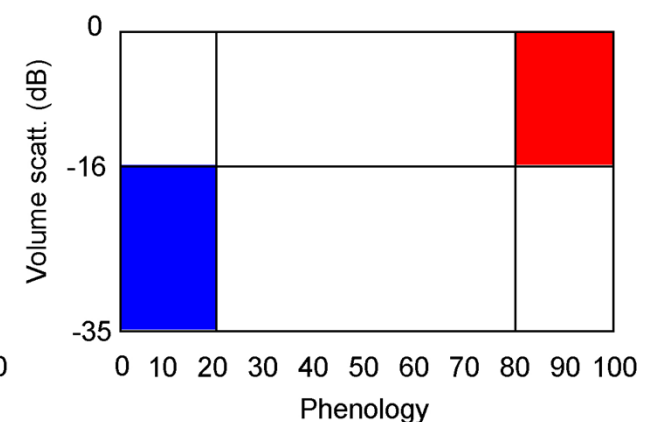
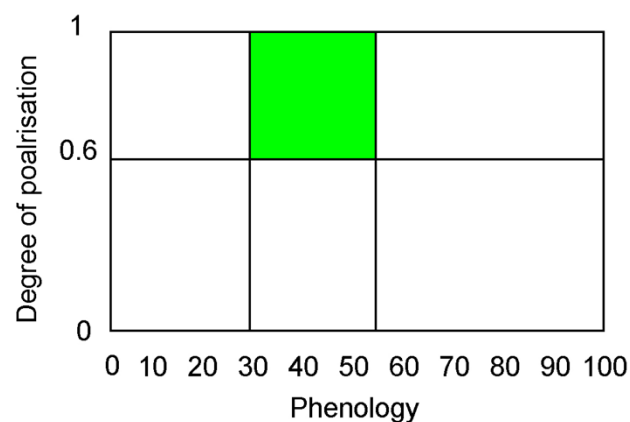
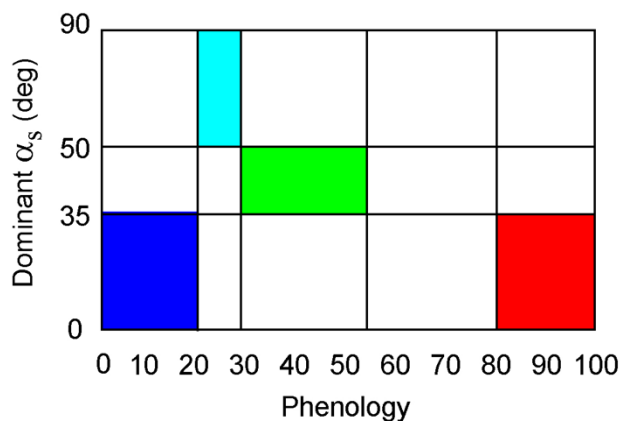
# Phenology retrieval: algorithm with compact-pol

- In quad-pol, anisotropy was used to discriminate the first and the last intervals. The same can be done with other parameters. For instance:

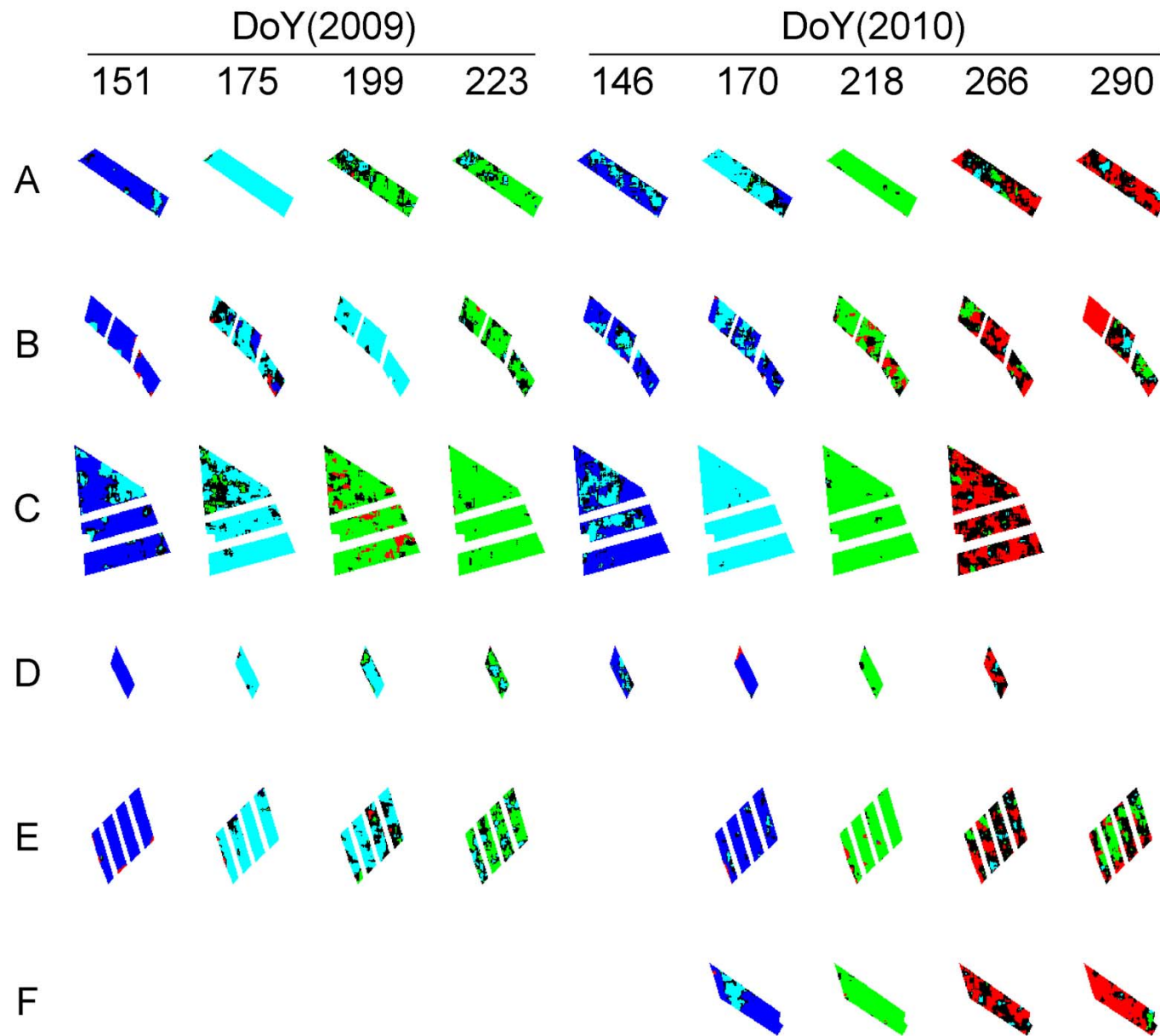


\*Model-based decomposition proposed in [Cloude et al. \[IEEEGRSL'12\]](#)

- First proposal with 3 parameters:  $\alpha_s$ ,  $m$ ,  $p_V$



# Phenology retrieval: results with compact-pol



# Phenology retrieval: results with compact-pol

- Validation at parcel level:

- Example for a parcel:

PARCEL A

RETRIEVAL RESULT: NUMBER OF PIXELS

DoY – Acquisition	Not assigned	1	2	3	5	Total pixels
151 (2009)	179	1761	142	5	0	2087
175 (2009)	15	0	2068	4	0	2087
199 (2009)	787	0	181	1105	14	2087
223 (2009)	454	6	158	1469	0	2087
146 (2010)	548	1013	525	1	0	2087
170 (2010)	537	146	1368	34	2	2087
218 (2010)	38	0	2	2045	2	2087
266 (2010)	1137	0	147	157	646	2087
290 (2010)	932	2	146	10	997	2087

PERCENTAGE OVER ASSIGNED PIXELS

1	2	3	5
92,3	7,4	0,3	0,0
0,0	99,8	0,2	0,0
0,0	13,9	85,0	1,1
0,4	9,7	90,0	0,0
65,8	34,1	0,1	0,0
9,4	88,3	2,2	0,1
0,0	0,1	99,8	0,1
0,0	15,5	16,5	68,0
0,2	12,6	0,9	86,3

GROUND DATA

Phenology
12
22
32
43
2
22
40
88
92+

- Complete statistics:

- 44 right estimates of 46 cases: **96% coincidence**
    - Same performance as quad-pol at parcel level, but “noisier” results at pixel level



# Conclusions: answers to initial questions

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- Could the ambiguities found with HHVV images be solved by full polarimetry? **Yes**
- What is the influence of frequency band (C vs X) on the polarimetric observables as a function of phenology?
  - **Similar** overall response for all observables
  - Some stages (e.g. tillering) are shifted due to wavelength sensitivity
- Can phenology be retrieved with a single Radarsat-2 image? **Yes**
- Is full polarimetry strictly required for such an application? What about compact-pol or conventional dual-pol?
  - **Compact-pol is enough** for this application
  - HHVH and VVHV provide two real observables (reflection symmetry):
    - Limited applicability:
      - Low backscatter at early vegetative
      - Saturation and reduced ranges afterwards

# Outlook for rice

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- More experiments including images at the **reproductive phase** should be conducted. Expected results:
  - Stage characterised by a smooth transition between vegetative and maturation at all observables [Li et al. \[CJRS'12\]](#) , [Lopez-Sanchez et al. \[IEEETGRS'12\]](#)
  - Phenology retrieval at the two borders may result complicated
- From the **application** point of view:
  - 24 days revisit time is too large:
    - Different passes (asc/desc) and beams should be combined to provide a shorter refresh rate
  - The success with compact-pol envisages the exploitation of RCM for this application
    - ... but NESZ = -17 dB will complicate its performance.

# Phenology retrieval for other crop types?

An equivalent experiment has been carried out in the framework of the ESA-funded **PolSAR-Ap project** (AO 1-6707/11/I/NB), using the **AgriSAR2009** campaign dataset

## 5 crop types:

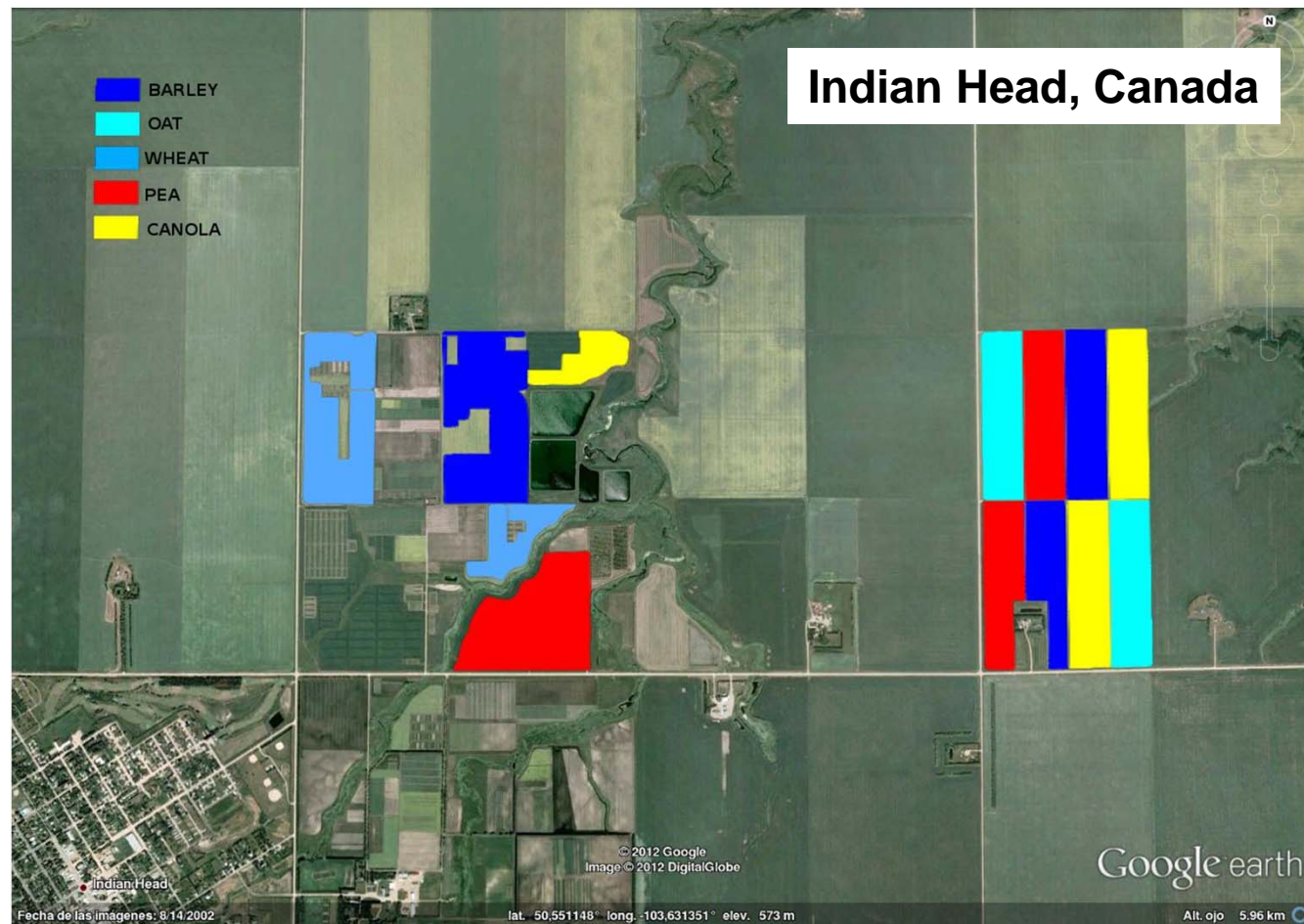
- Cereals: barley, oat & wheat
- Canola
- Field pea

## Phenology information:

- 1st June – 31 August
- Numerical scales
- Updated every 7-10 days
- Records: [min,max]

## Radarsat-2 images:

- 57 in total
- 20 used:
  - Restricted to 3 months
  - **All beams (22-39 deg)**



# Phenology retrieval for other crop types?

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- First conclusion: Polarimetry is relevant when phenological development entails morphological changes in the plants...  
*it depends on the crop type*
  - Cereals: OK for barley and wheat, not enough for oat
    - Compact-pol presents slightly lower performance than quad-pol
    - Conventional dual-pol (HHVH, VVHV) identifies less stages
  - Canola: HV is enough
    - Constant random structure but increasing amount (height) of vegetation volume
  - Pea: Polarimetry is not enough
    - Auxiliary information is required