

**Integrating crop growth
simulation and remote
sensing:
some recent experiences**

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Presentation largely based on:

**Integrating crop growth simulation
and remote sensing
to improve resource use efficiency
in farming systems**

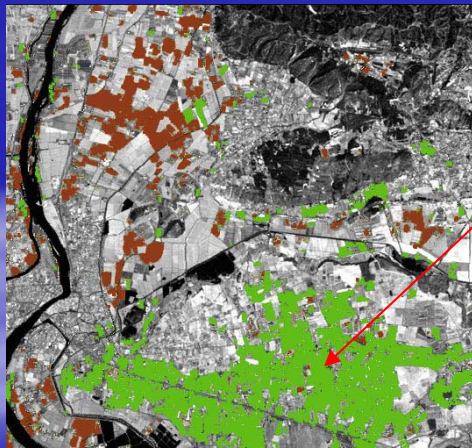
Raymond Jongschaap

AN EXPERIENCE

Predicting wheat production at regional scale by integration of remote sensing data with a simulation model

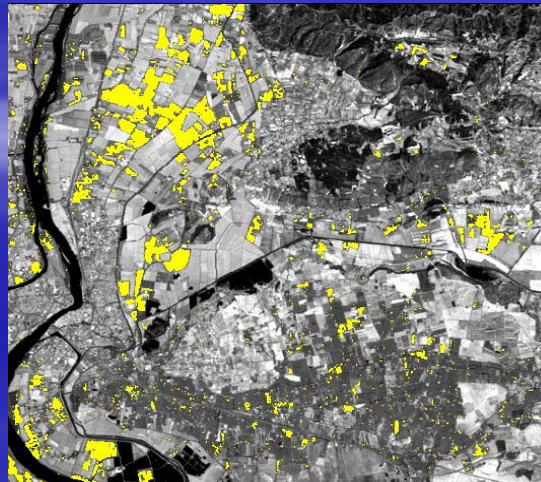
METHODOLOGY

1. Optical remote sensing data (SPOT HRV XS and Landsat 5 TM) to **locate** winter wheat crops in the region



GRASS

WHEAT

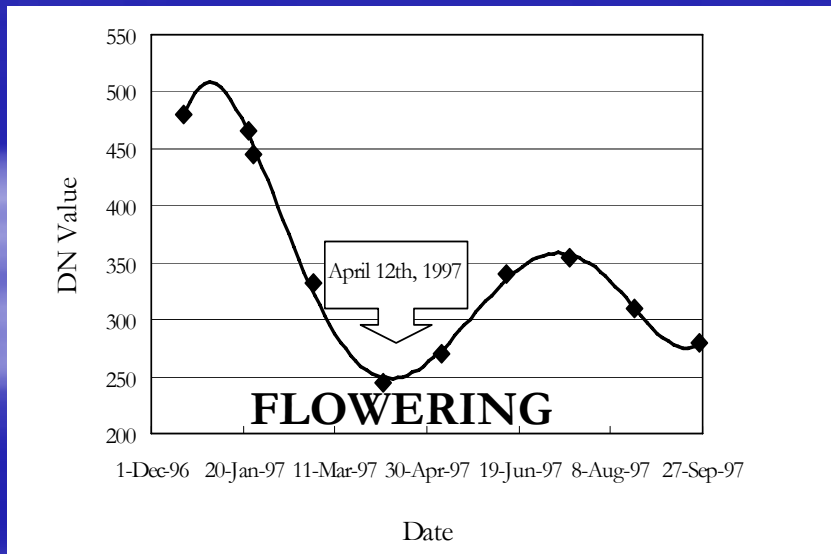


GREEN IN LATE SUMMER -
NDVI

GREEN IN WINTER
- NDVI

METHODOLOGY

2. Radar remote sensing data (ERS-SAR C-band) to **determine** wheat **flowering** dates for the region



MOISTURE IN
GROWING CROP
'MASKS' RADAR SIGNAL
FROM SOIL

DURING RIPENING
RADAR SIGNAL OF
SOIL RE-APPEARS

RADAR SIGNALS IN TIME

METHODOLOGY

3. Field observations from pilot areas to **calibrate a wheat growth model** to local conditions
4. **Flowering dates** combined with regional **soil data to extrapolate** the simulation model **from a point-based to a regional application**

METHODOLOGY

5. Potential and sub-optimal conditions for wheat growth are assumed to **determine the yield gap**, the difference between (simulated) potential and (simulated and observed) actual production

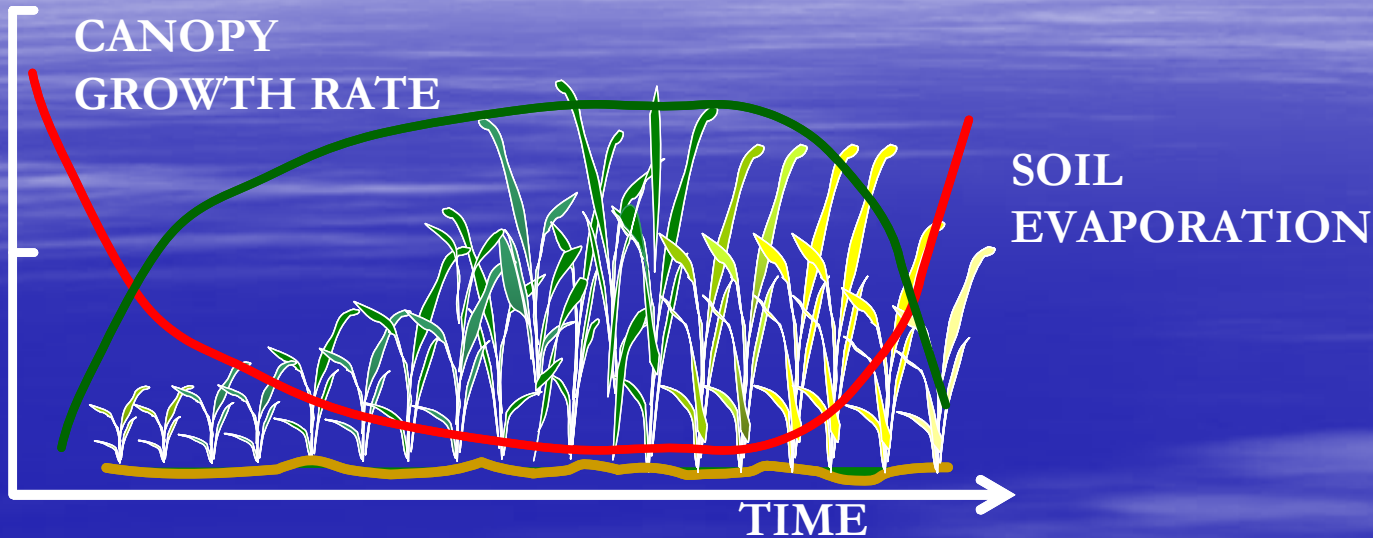
Scenario	Soil type	Area (ha)	Yield (t ha ⁻¹)	Production (P) (t)	Regional production (t)
1 Potential	-	3000	11.35 (1.02)	34050	34050
2 Water-limited	1	2700	6.08 (0.51)	16416	17997
	2	300	5.27 (0.39)	1581	
3 Water- and nitrogen-limited	1	2700	4.70 (0.28)	12690	13947
	2	300	4.19 (0.21)	1257	

METHODOLOGY

6. Actual **production statistics** from the production region are used to **evaluate** simulation results.

Department	Region	Total Production	Area	Yield	SIMULATED SOIL1/SOIL2
		(t)	(ha)	(t ha ⁻¹)	
82	<i>Midi-Pyrénées (MP)</i>	540600	104400	5.18	5.84/5.02
83	<i>Provence Alpes-Côte d'Azur (PAC)</i>	518500	98100	5.29	4.53/4.05

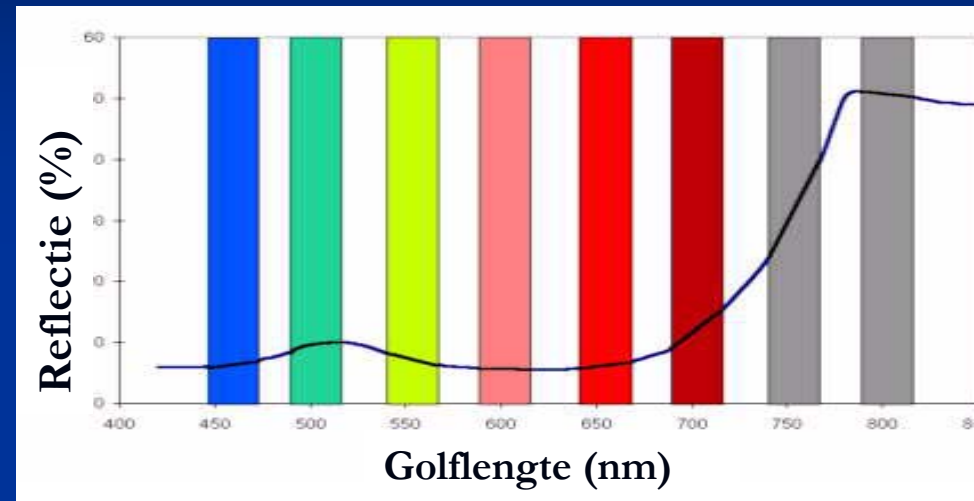
ANOTHER EXPERIENCE



Run-time calibration of simulation models by integrating remote sensing estimates of leaf area index and canopy nitrogen

TRANSLATION

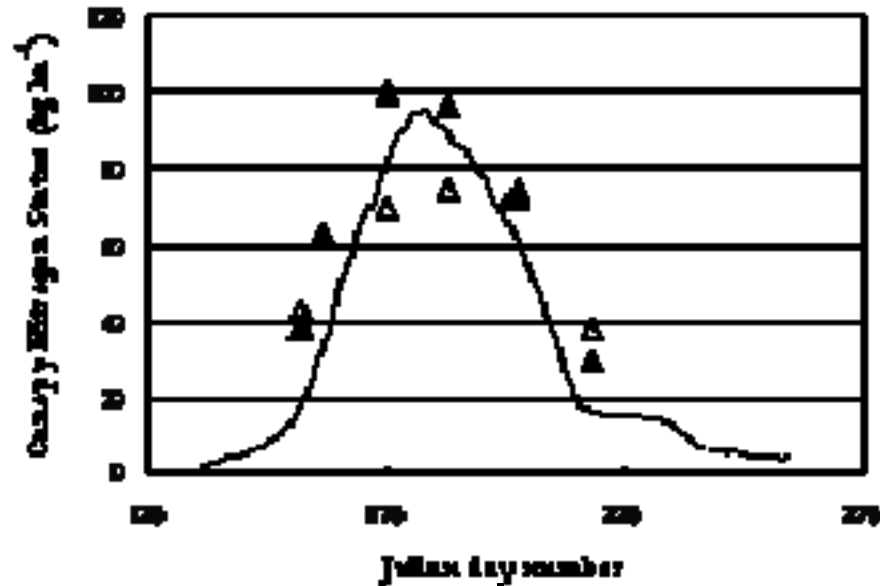
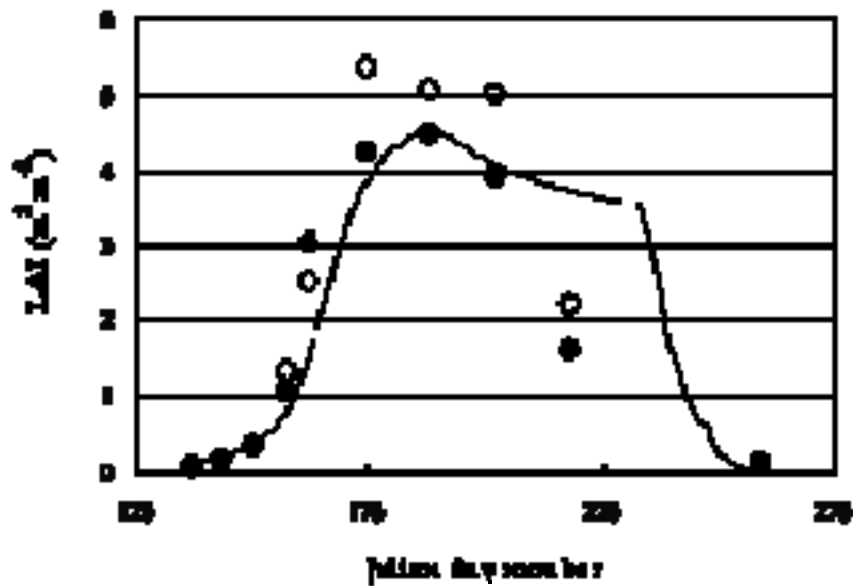
- Relation between sensor-information and important vegetation characteristics



Vegetation Index	Crop characteristic
NDVI	Green plant material
WDVI	Leaf area (index)
λ REP	Chlorophyll/Nitrogen content

CROP CHARACTERISTICS

OBSERVATIONS/BASE RUN



SIMULATED AND MEASURED LAI

SIMULATED AND MEASURED
CANOPY NITROGEN

RESETTING SIMULATION VALUES

THE SMALLER
THE BETTER

ROOT MEAN SQUARE ERROR

Scenario	Integration ^{a)}				Leaf area index (<i>n</i> =40)		Canopy nitrogen (<i>n</i> =34)		Soil inorganic nitrogen (<i>n</i> =27)	
	<i>LAI</i>	<i>N_{can}</i>	%	<i>S_n</i>						
0	-	-	-	-	0.84	(100)	13.7	(100)	30.4	(100)
1	+	-	-	-	0.61	(73)	12.2	(89)	24.1	(79)
2	-	+	-	-	0.86	(102)	12.0	(88)	33.3	(110)
3	+	+	-	-	0.61	(73)	12.0	(88)	26.0	(86)
4	+	-	-	+	0.61	(73)	12.2	(89)	24.2	(80)
5	-	+	-	+	0.85	(101)	12.0	(88)	34.7	(114)
6	+	+	-	+	0.61	(73)	12.0	(88)	29.3	(96)
7	+	-	+	-	0.61	(73)	12.7	(93)	23.3	(77)
8	-	+	+	-	0.85	(101)	12.0	(88)	33.3	(110)
9	+	+	+	-	0.61	(73)	12.0	(88)	24.9	(82)
10	+	-	+	+	0.61	(73)	12.7	(93)	23.3	(77)
11	-	+	+	+	0.85	(101)	12.0	(88)	34.7	(114)
12	+	+	+	+	0.61	(73)	12.0	(88)	28.9	(95)

BASE
RUN

INTERNAL ADJUSTMENT MODEL

CONCLUSION

introduction of **field-based remote sensing observations** for **run-time adjustment** of dynamic crop growth simulation models **enhances** simulation **accuracy** of important variables (such as LAI, canopy nitrogen status and soil inorganic nitrogen content)

HOWEVER.....

ACQUISITION OF SUCH INFORMATION IS

TIME-CONSUMING

LABORIOUS

UNCERTAIN

WE MOVE FORWARD, BUT SLOWLY...



