

Remote Sensing to Scale Analysis

Farmscapes to Landscape Level



Pastoral



Agropastoral



Rainfed



Tree-based



Irrigated

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Workshop on Integrating Biodiversity and Ecosystem Services into Foresight Models
May 7-8, 2015, Rome

Earth Observation





Role of Geospatial Science, Technology and Applications (GeSTA) in Agro-Ecosystems



Youth & Capacity Dev.
Engaging and empowering young gen. by creating opportunities



156 Remote sensing missions in orbit°
>12 Sensors potential in CRPs/IRPs, etc.
>6 are free

5 **Regions**

1) The West African Sahel and dry savannas , 2) East and Southern Africa , 3) North Africa and West Asia 4) Central Asia , and 5) South Asia.

Quantification of existing agricultural production systems

Characterization of vulnerable areas for increasing resilience and assist in identifying mitigation pathways with biophysical, socioeconomic and stakeholder feedback as well as specific needs & constraints

Characteristics of agricultural and livestock production in small holder farming systems and rural livelihoods



Biodiversity

Spatial enrichment and its role in food security, risk mitigation, & sustainability



Mapping the extent of existing & traditional practices, indigenous knowledge, diversity, potential areas for modern & improved, productive, profitable, and diversified dryland agriculture, & linkages to markets

People 2.5b
Live in Drylands

Livestock

1.5b Depend on Drylands

Improved Livelihoods



Health
Changing diet patterns, nutrition and health



Efficiency Productivity

Assessing the impact of outcomes in Action Sites, post-project implementation, & M&E

Farmers, stakeholders, policymakers, mobilization, & marketing

Geospatial commons , KM sharing, stakeholder feedback

Measuring the impact at spatial scales, rate, magnitude, synergy among the systems, CRPs, cross-regional synthesis

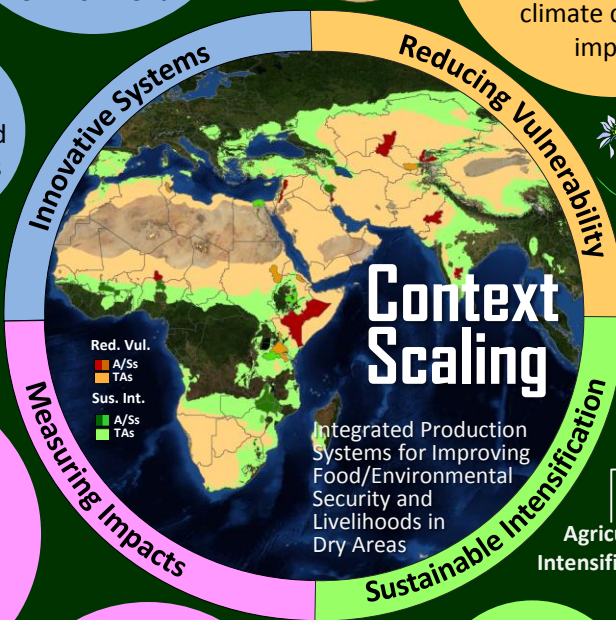


Gender
Address social inequities, greater roles and priorities

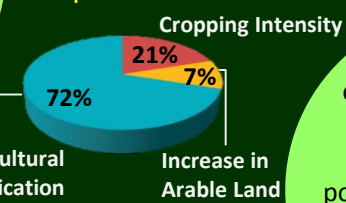
\$ Startup 35.47m
Total 122.7m

Cooperative Research and Partnerships

Drylands 41%
Earth's land area



Food production potential sources



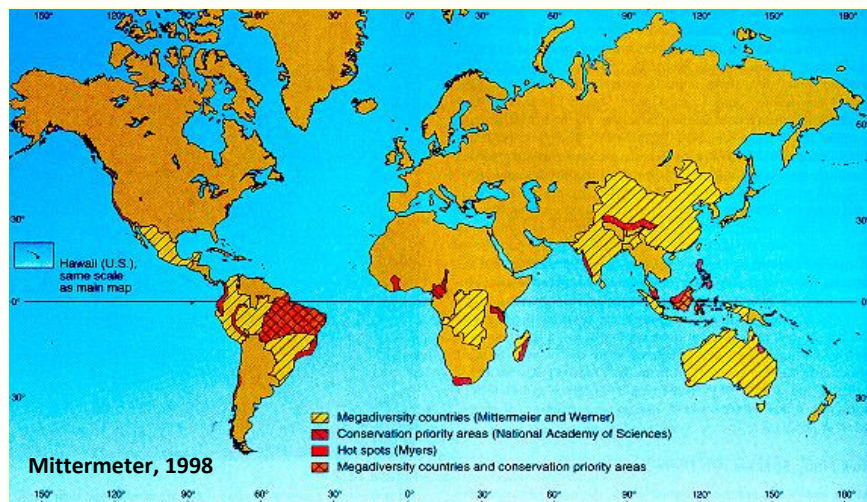
Delineation of potential, suitable areas for sustainable intensification, and diversification of ag. Innovation production systems

Status & trends of existing production systems

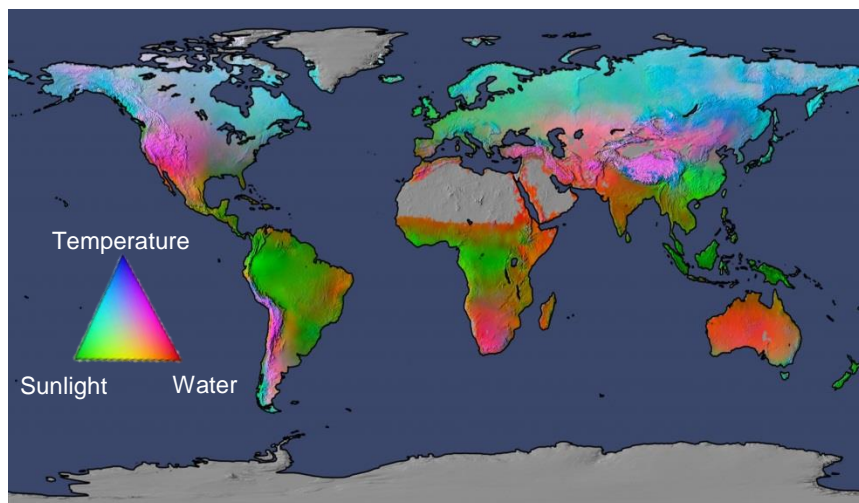


RESEARCH PROGRAM ON
Dryland Systems

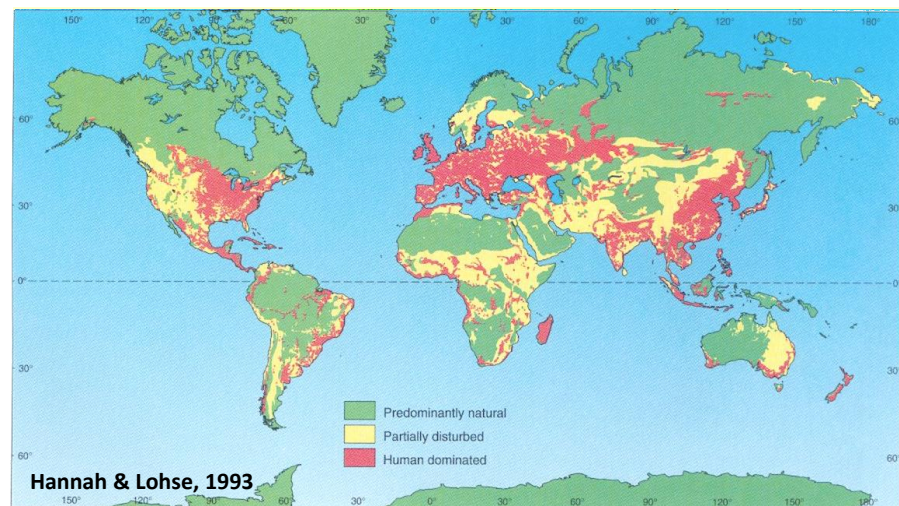
Biological Richness



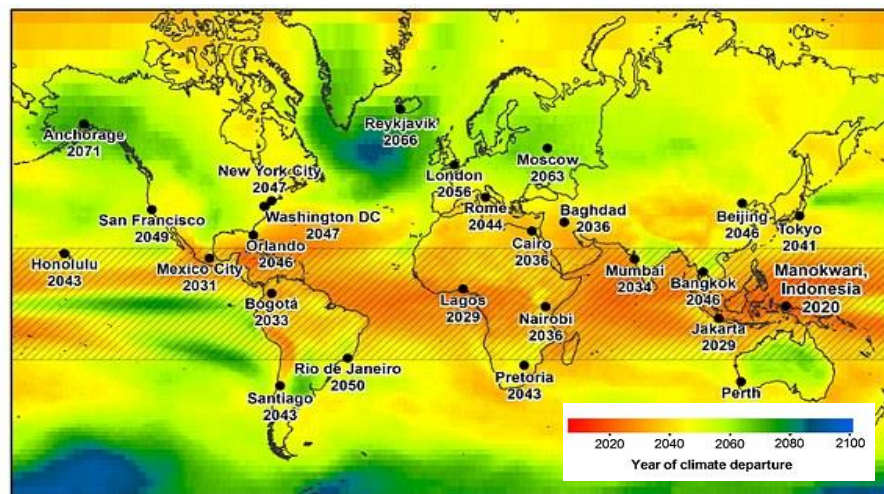
Potential Climate Limits

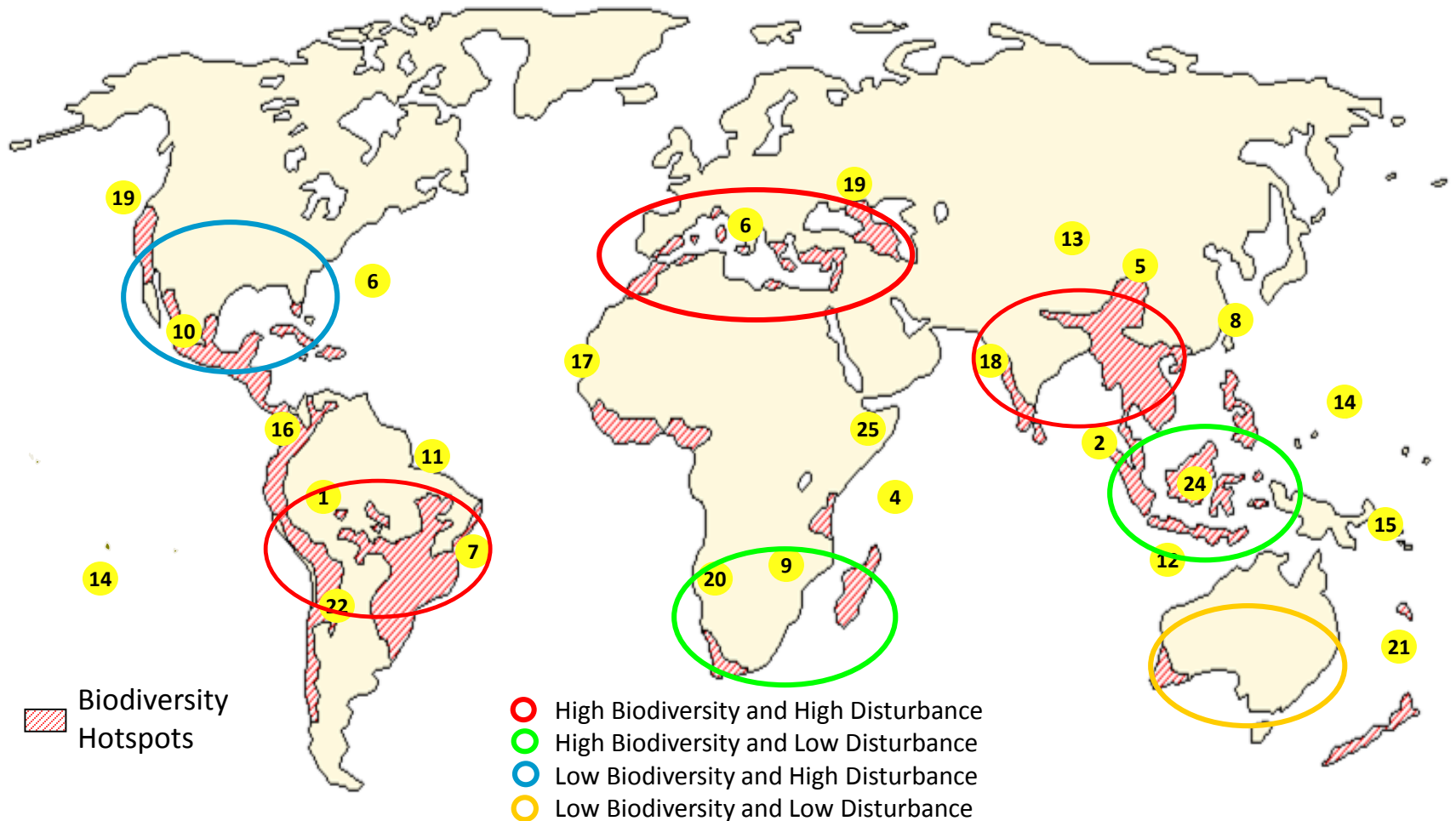


Human Induced Disturbance



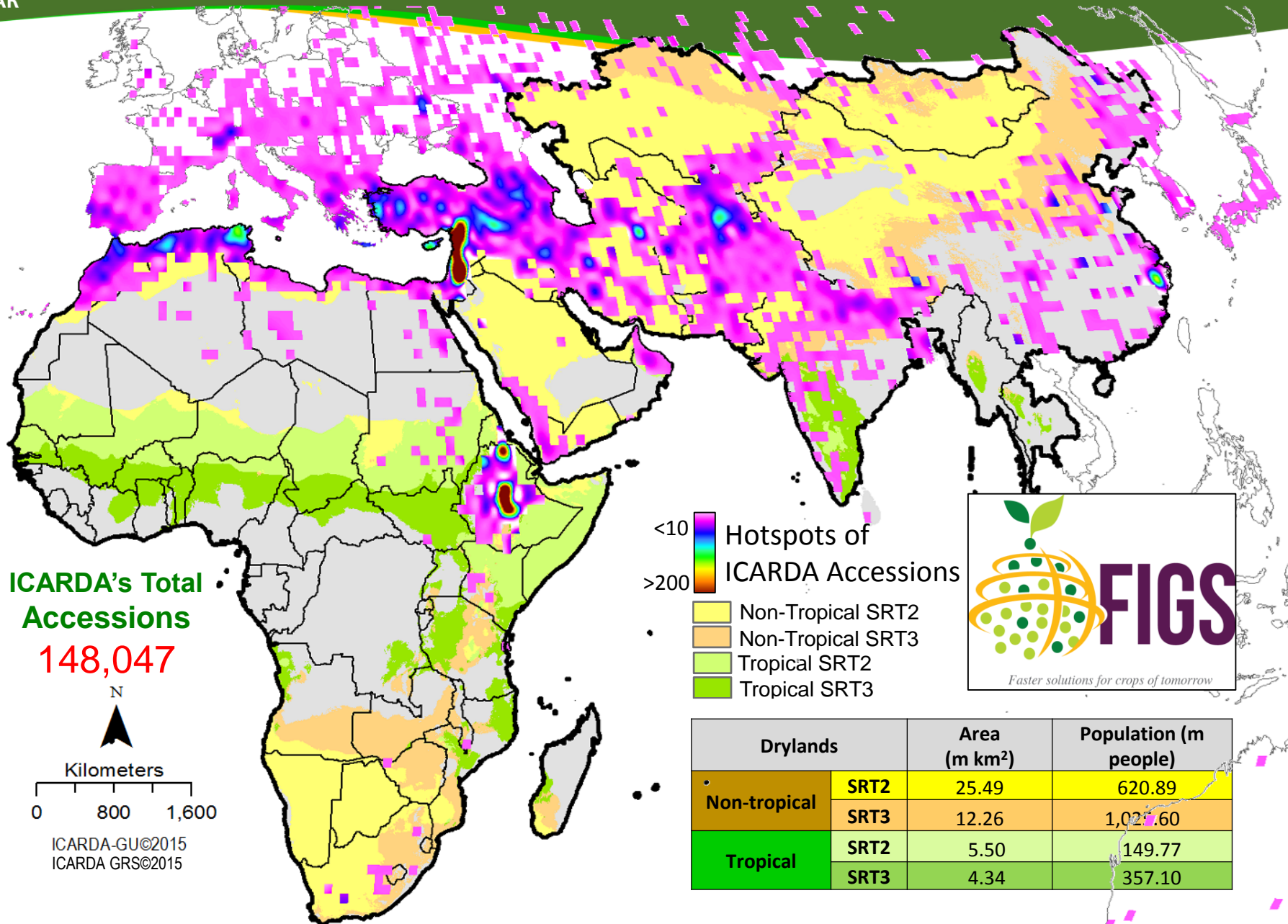
Ever Changing Climate



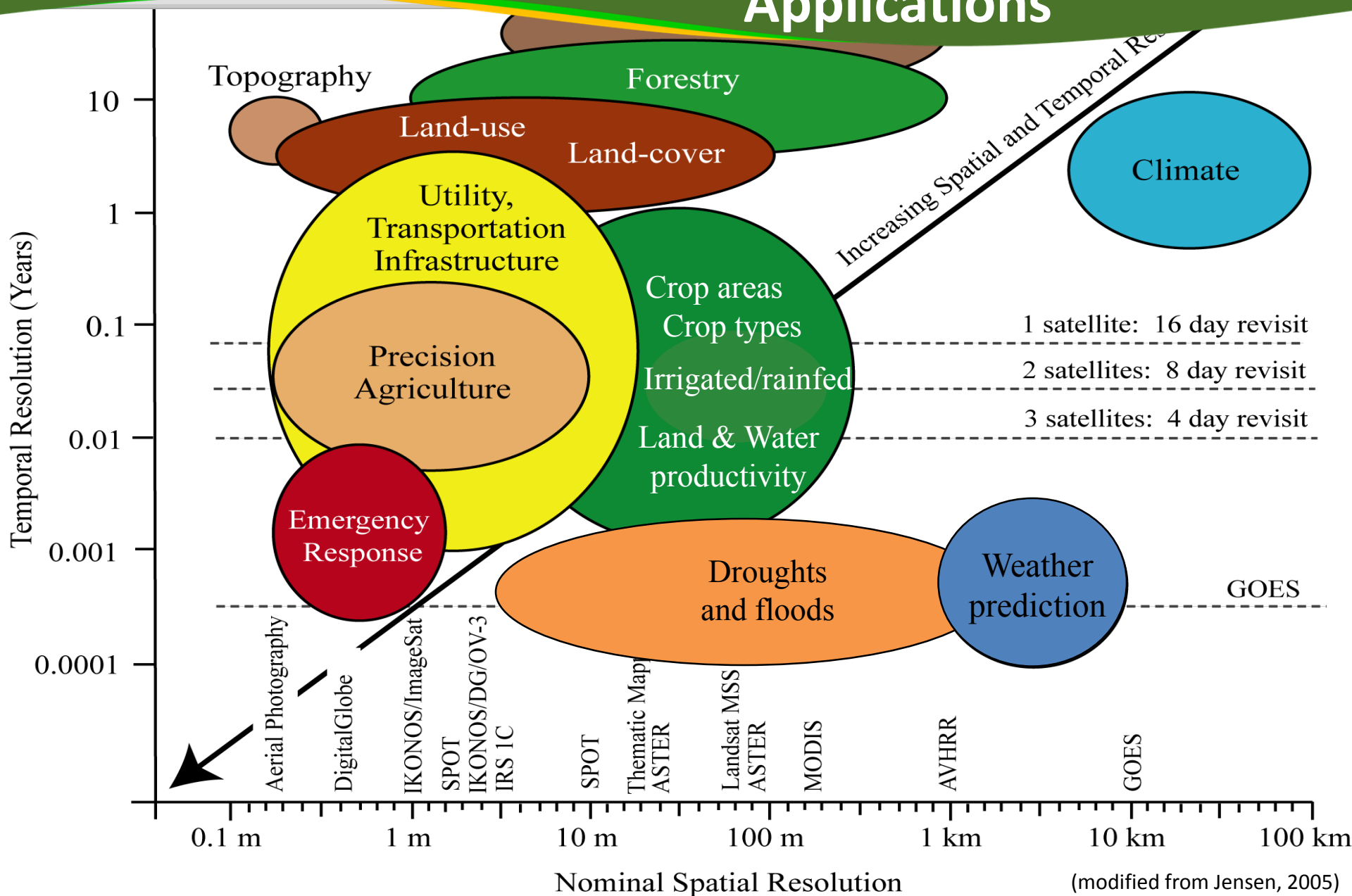


1. Tropical Andes, 2. Sundaland, 3. Mediterranean Basin, 4. Madagascar & Indian Ocean Islands, 5. Indo-Burma, 6. Caribbean, 7. Atlantic Forest Region, 8. Philippines, 9. Cape Floristic Province, 10. Mesoamerica, 11. Brazilian Cerrado, 12. Southwest Australia, 13. Mountains of South-Central China, 14. Polynesia/Micronesia, 15. New Caledonia, 16. Chocó-Darién-Western Ecuador, 17. Guinean Forests of West Africa, 18. Western Ghats & Sri Lanka, 19. California Floristic Province, 20. Succulent Karoo, 21. New Zealand, 22. Central Chile, 23. Caucasus, 24. Wallacea, 25. Eastern Arc Mountains & Coastal Forests of Tanzania & Kenya

Agro-Biodiversity in Dry Areas



Applications

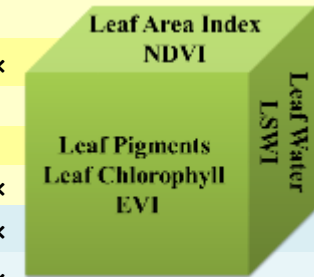


Remote Sensing Matrix at Farmscape to Landscape

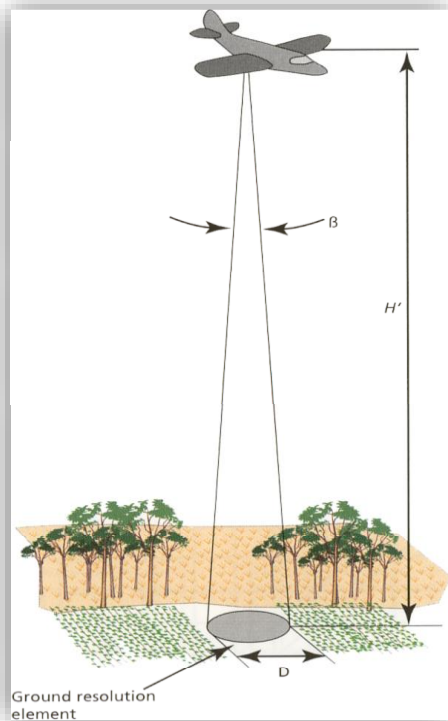
Biospectral – Biophysical

Example of One Sensor in each Platform/Scale

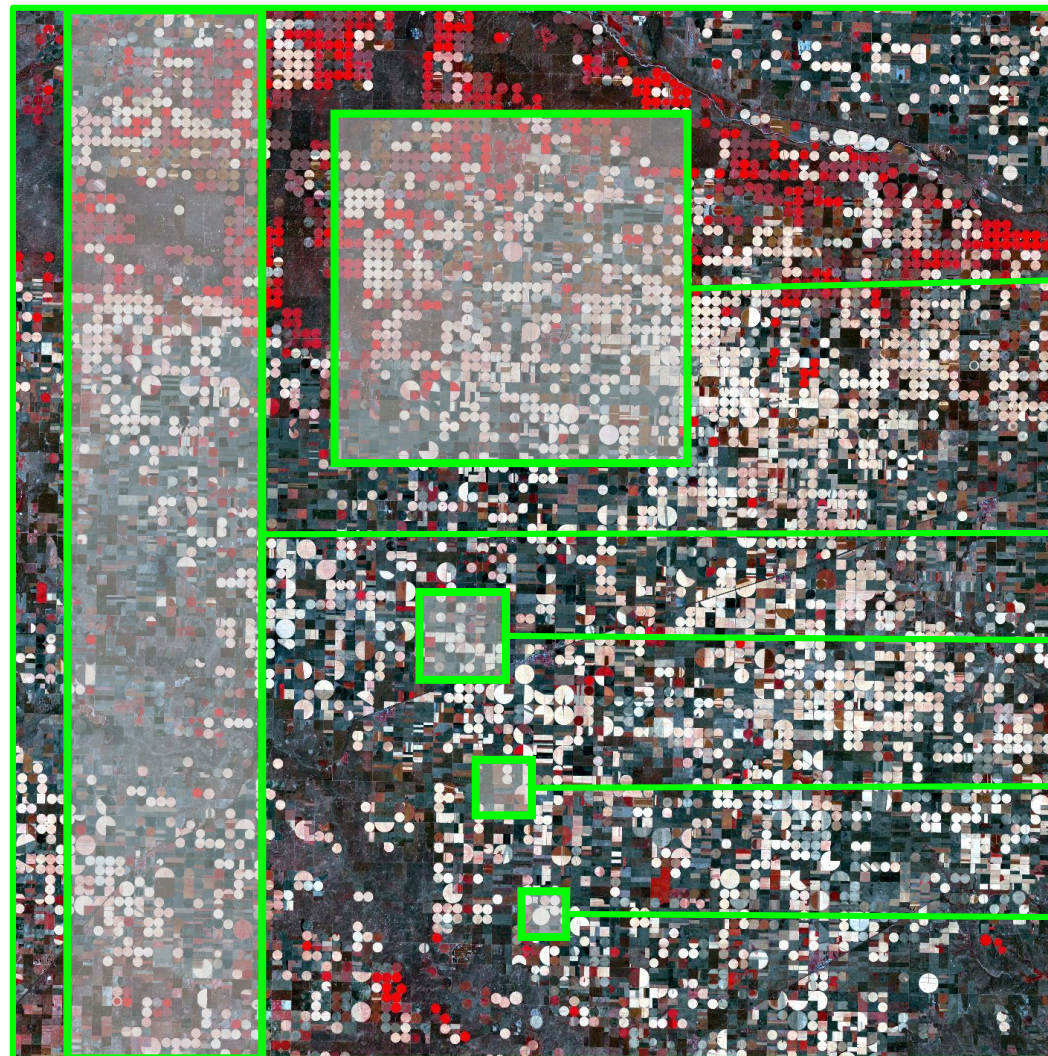
	Platforms	Ground/in-situ		Airborne		Spaceborne				
	Mode	Hyperspectral	Multispectral	Optical	LiDAR	Optical			LiDAR	SAR
RS data characteristics	Sensor	ASD FieldSpec	Mx Camera	APs/UAVs	Lidar	WorldView-2	Landsat	MODIS	ICESat*	PALSAR
	Spectral	350-2500nm	4 bands	3-4 bands	1264nm	8 bands	7 bands	7/36 bands*	1264 & 532nm	L band
	Spatial resolution	0.1-1.5m	0.1-0.2m	1-m	20 - 80cm	0.46m Pan; 1.84m MS	15m Pan; 30m MS	250m, 500m, 1000m MS	70m	10m, 20m, 100m
	Swath	1-4m	2-10m	--	1-2km	16.4km	185km	2330km		35-250km
Biophysical	Revisit	--	--	3-year	--	1.1 days	16 days	1 day	91 days	46 days
	Plant biomass	x	x		x	x	x	x		x
	Plant height				x				x	x
	LAI, fPAR, LST	x	x			x	x	x		
	NDVI, EVI, LSWI	x	x	x		x	x	x		
Biochemical	Erosion, Salinity	x	x	x	x	x	x	x		
	Soil moisture	x	x	x		x	x			x
	Chlorophyll	x	x	x		x	x	x		
	Nitrogen	x	x	x		x	x			
	Phosphorous	x	x			x				
	Plant water	x	x			x		x		
Production	GPP	x	x	x		x		x		
	NPP	x				x	x	x		
LULC	land cover/use	x	x	x		x	x	x		x
	phenology	x	x				x	x		x
	Irrigation	x	x	x		x	x	x		x
Terrain	DEM		x	x	x	x			x	x
	Derivatives		x	x	x				x	x
Scale	Tier 1 AOIs	x	x	x	x	x	x	x	x	x
	Tier 2 action sites	x	x	x			x	x	x	x
	Tier 3 AEZs	x	x	x				x	x	x
	Tier 4 Target			x				x		x



Scaling trade-off



Instantaneous field of view (IFOV) and altitude determines the ground area sensed by the sensor at a given instant



Landsat
(183 x 170 km)

ASTER, SPOT
(~60 x 60 km)

EO-1 ALI
(~32 x 170 km)

QuickBird
(~13 x 13 km)

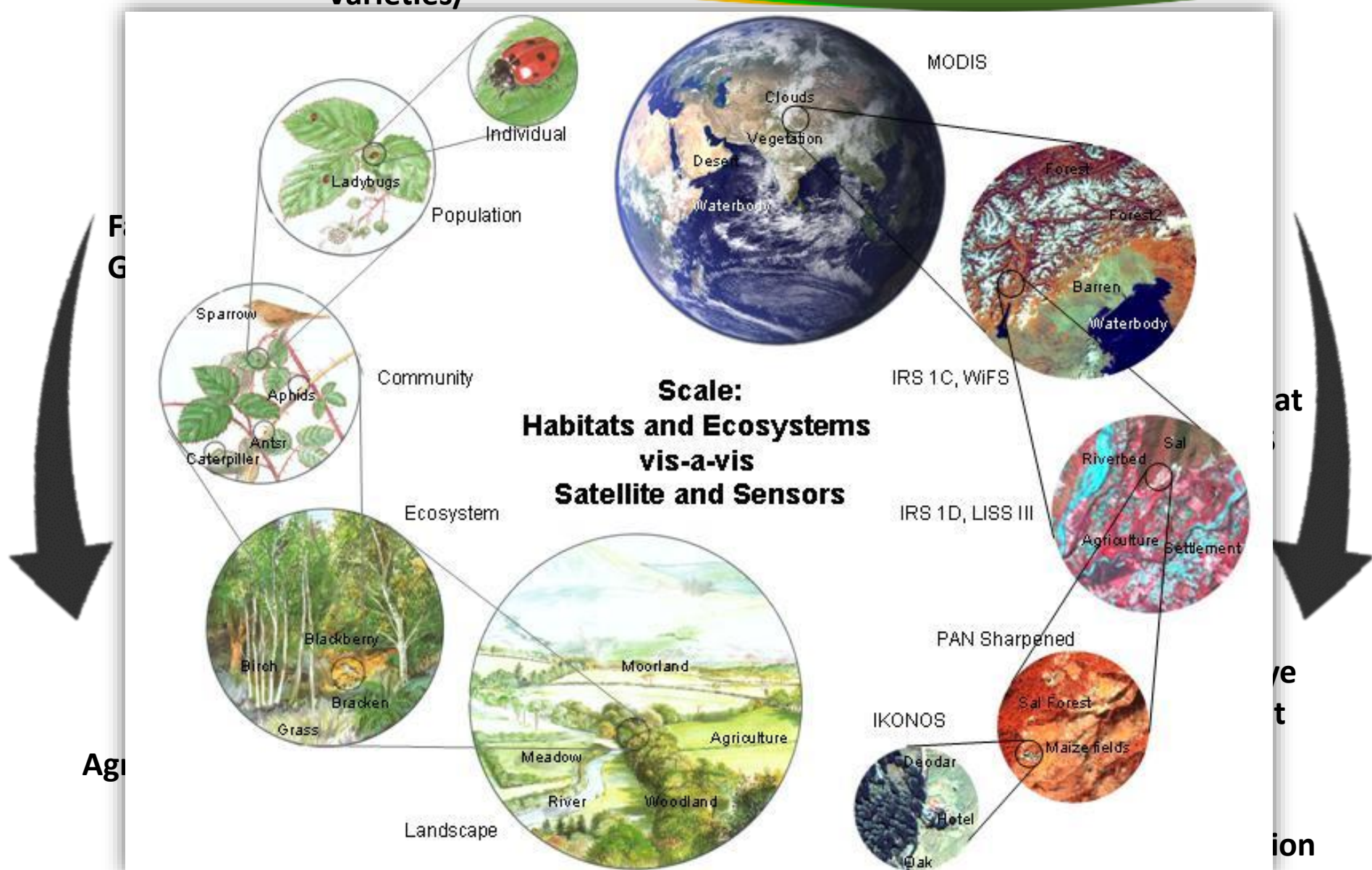
IKONOS
(~10 x 10 km)

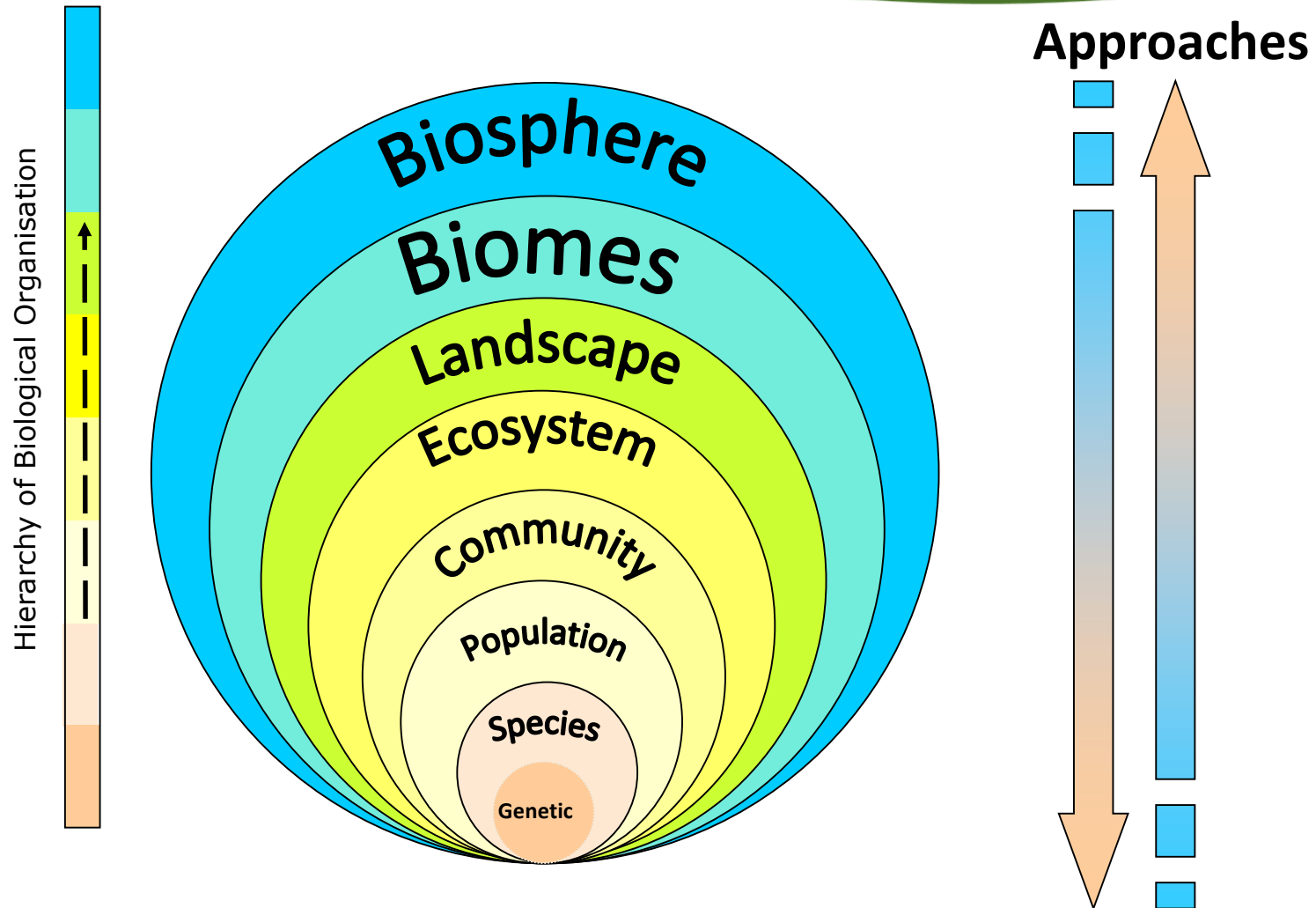
OrbView-3
(~7 x 7 km)

(USGS)

Varieties/

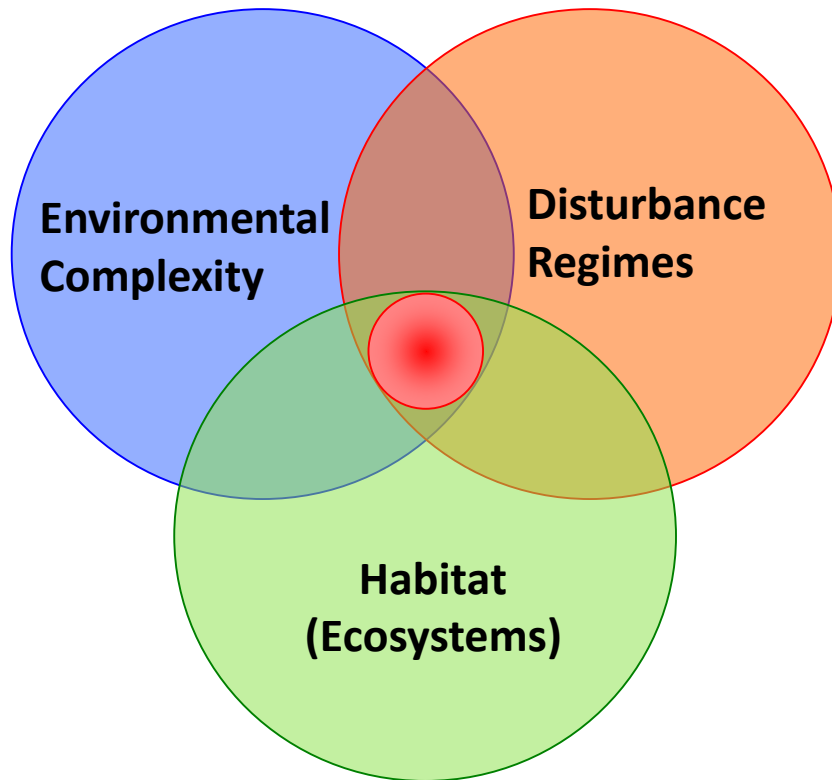
Pixel to national/regional



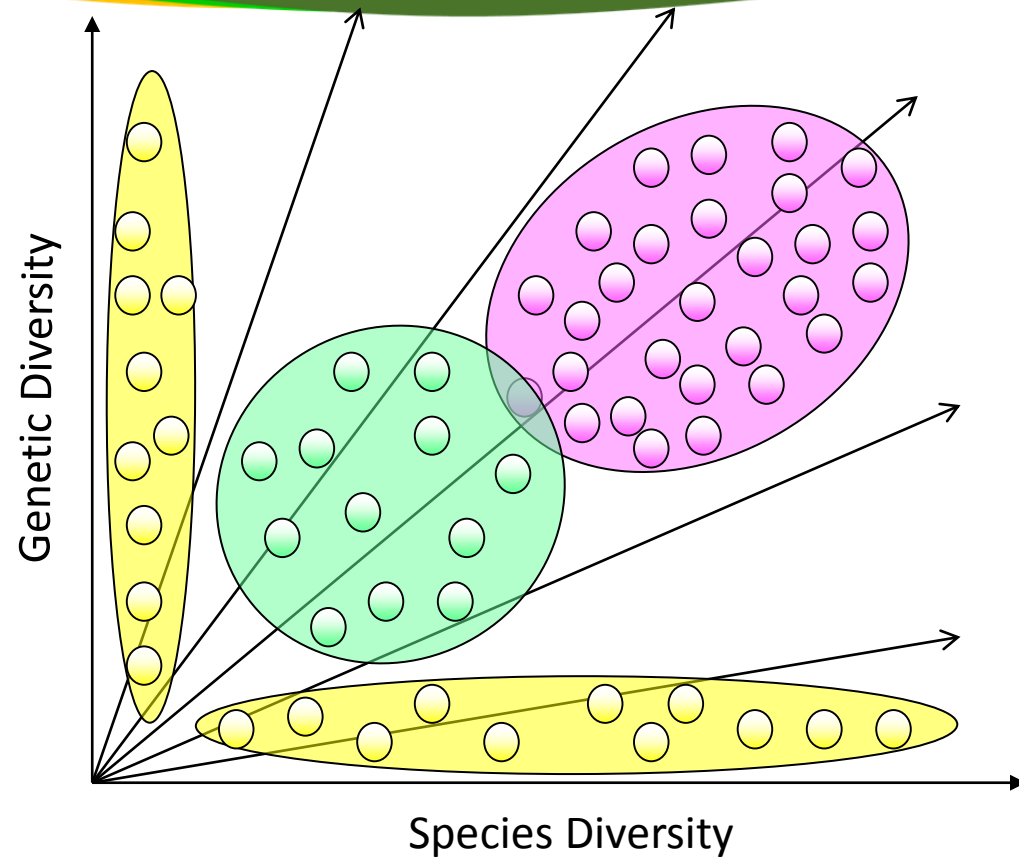


 Time Consuming; Due to High extinction rate? It is overtaking inventory process

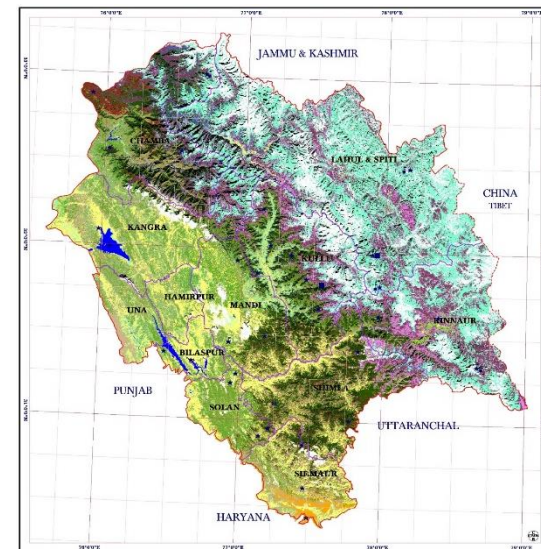
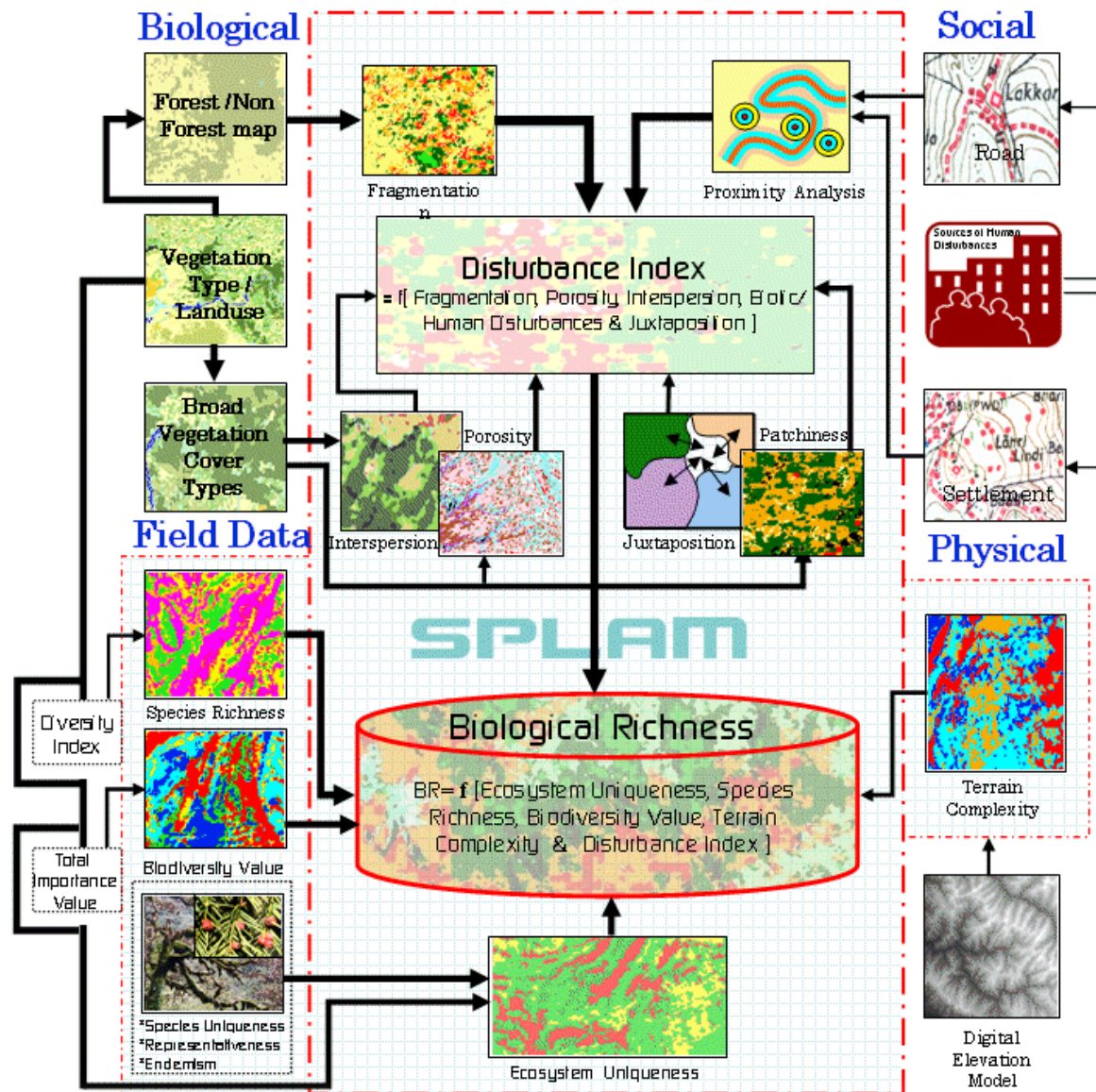
 Stratified approach; Extrapolation on large landscapes possible, Systematic Monitoring and Spatial Environmental Database

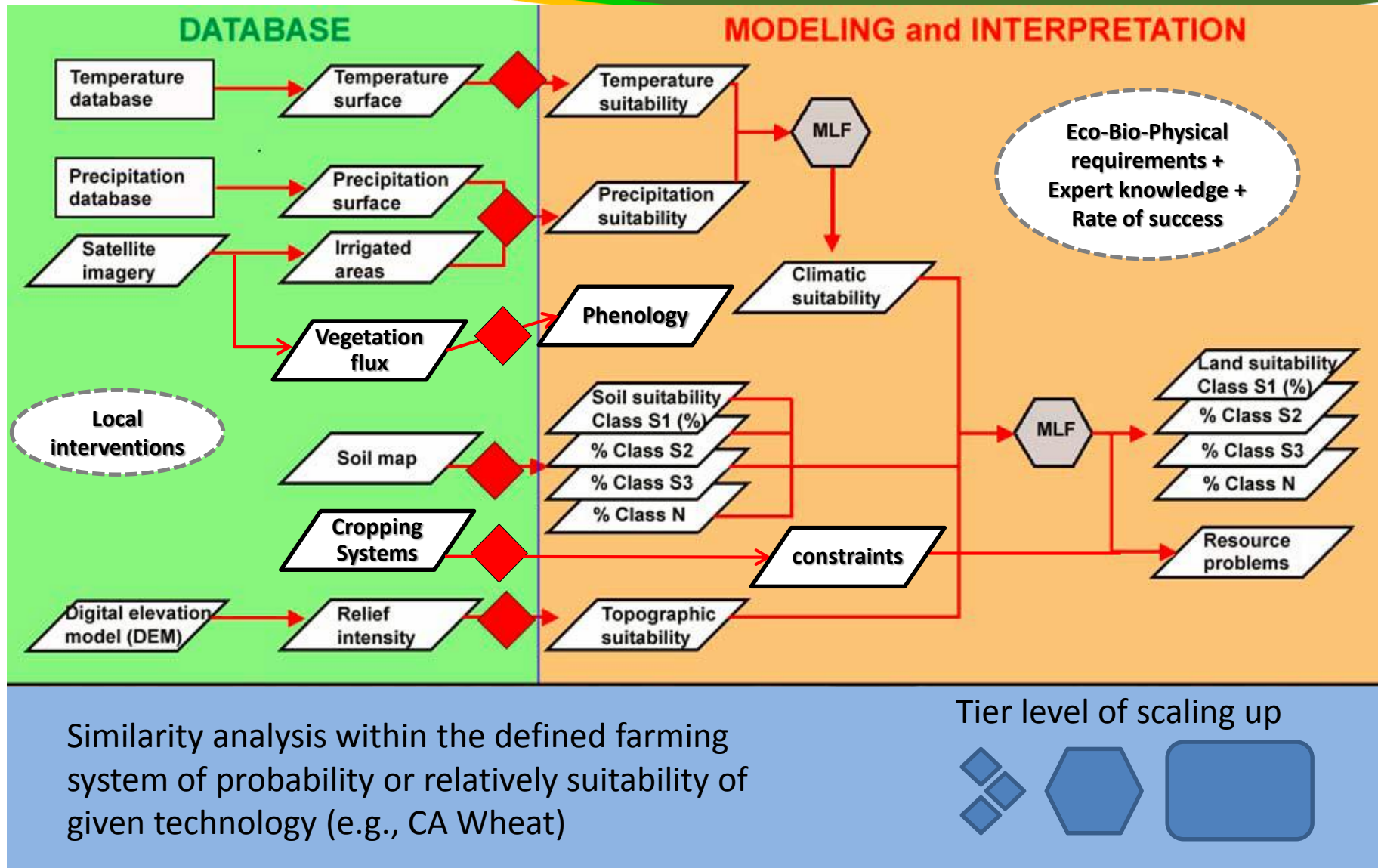


Biodiversity Prioritization



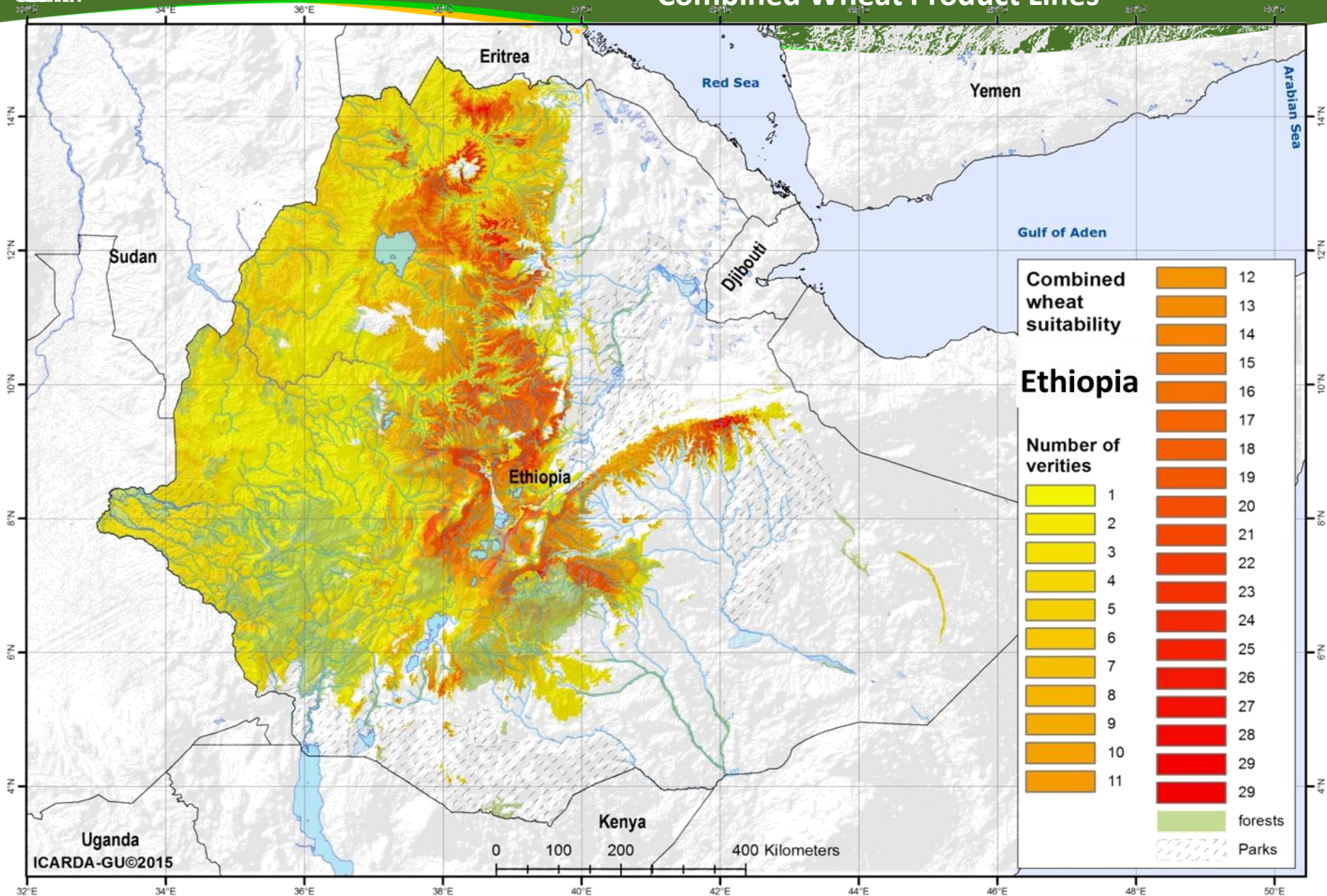
- High Species & Genetic Diversity
- Moderate Species & Genetic Diversity
- Low Species Diversity & Low Genetic Diversity



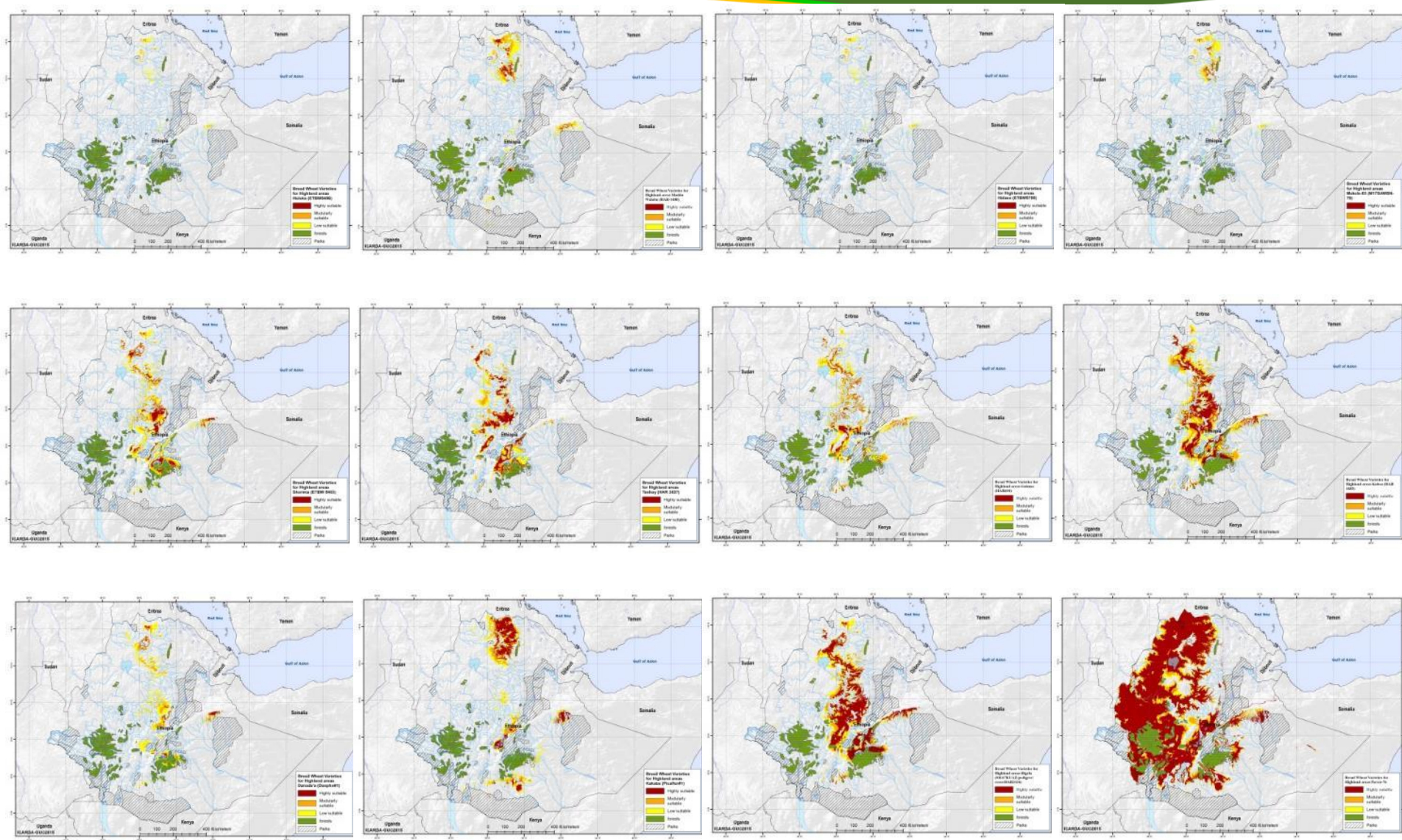


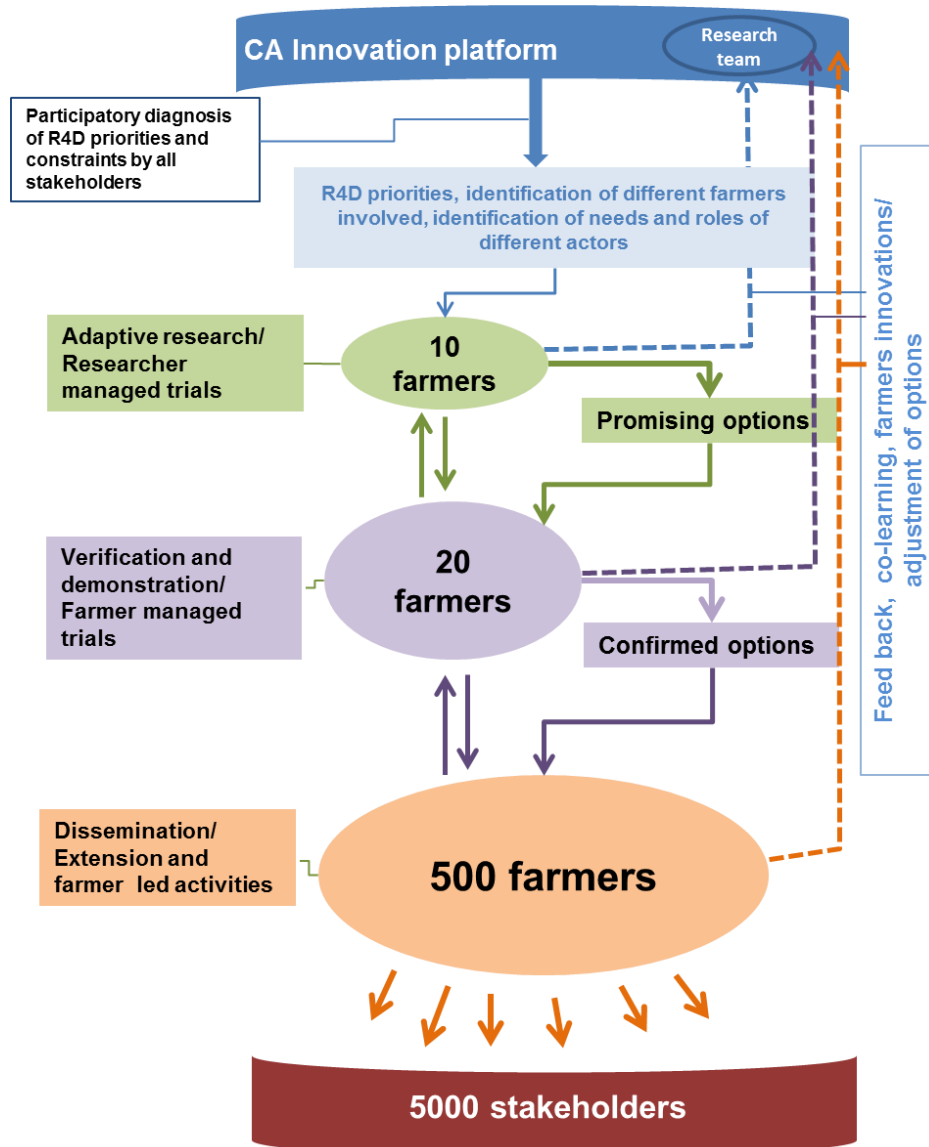
Potential Area for Wheat Expansion

Combined Wheat Product Lines

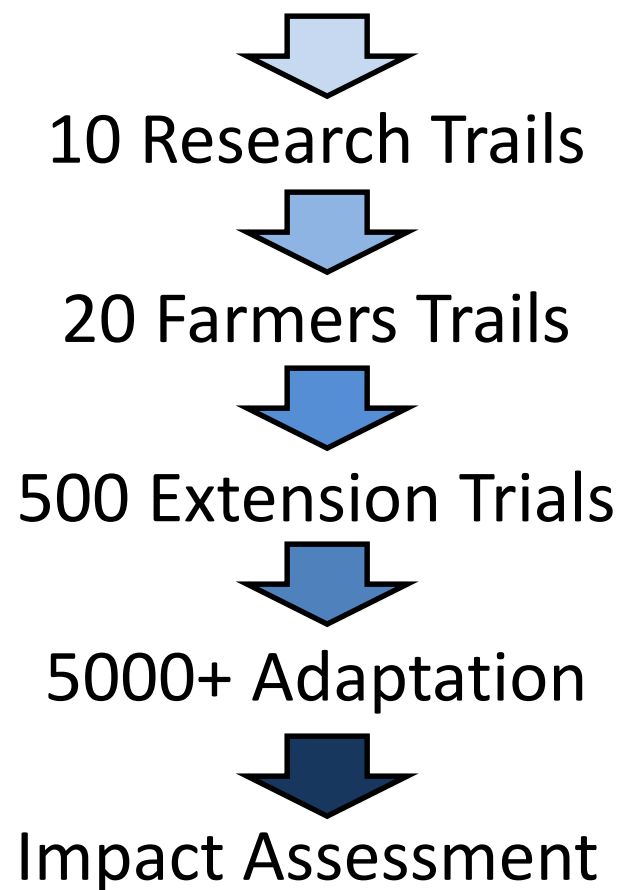


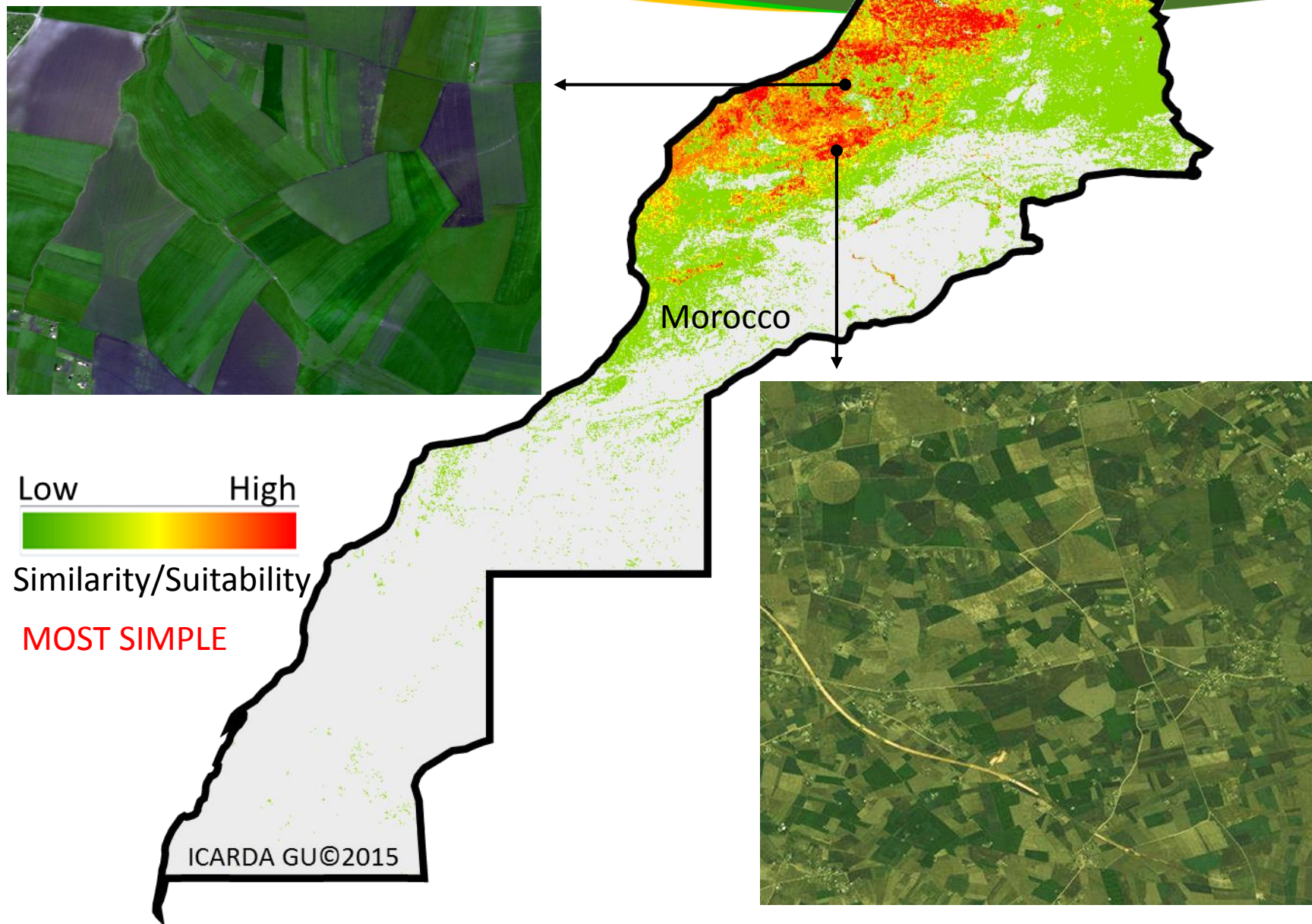
Bread Wheat Varieties for Highlands





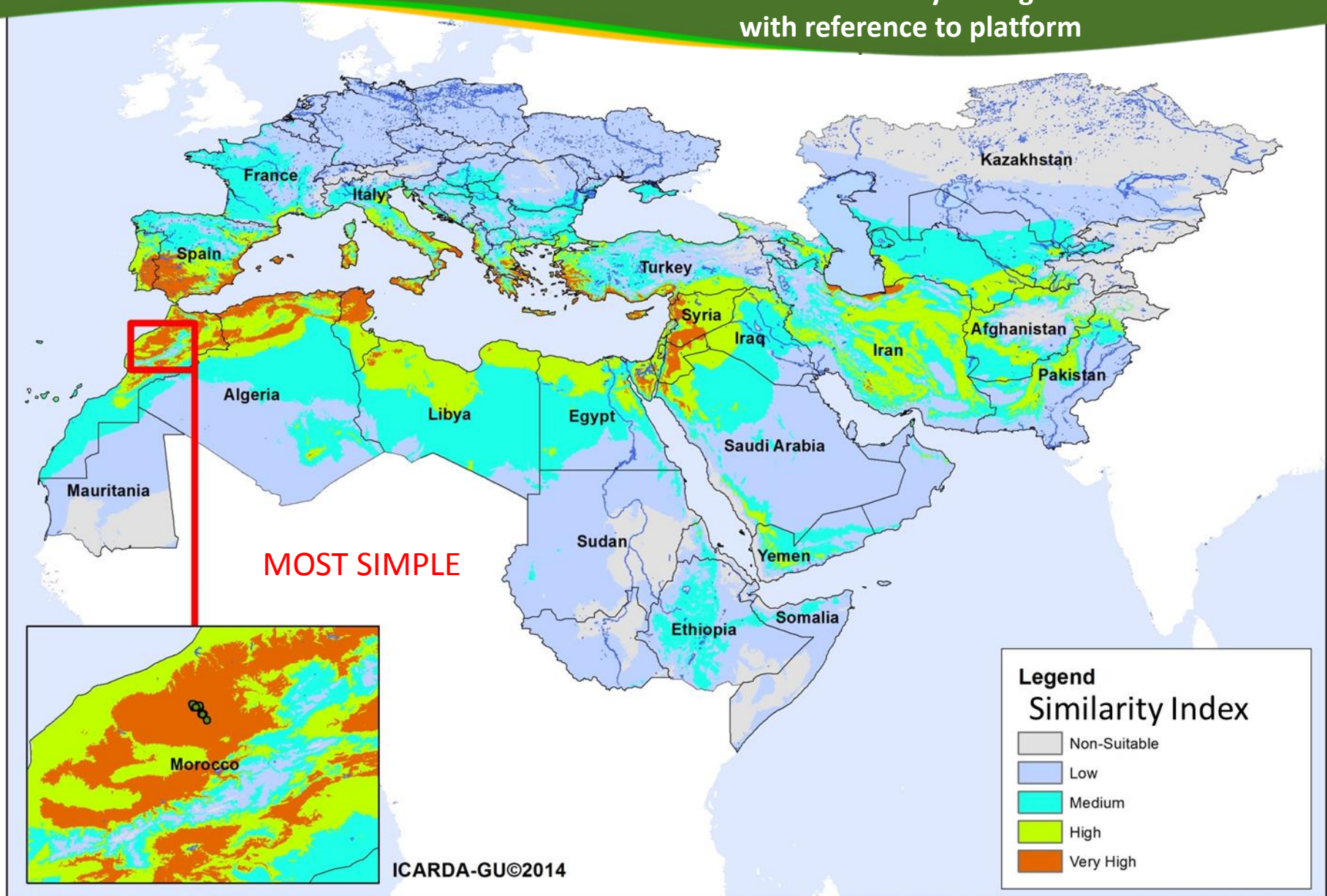
Mapping and Monitoring (distribution, condition, residue, productivity)



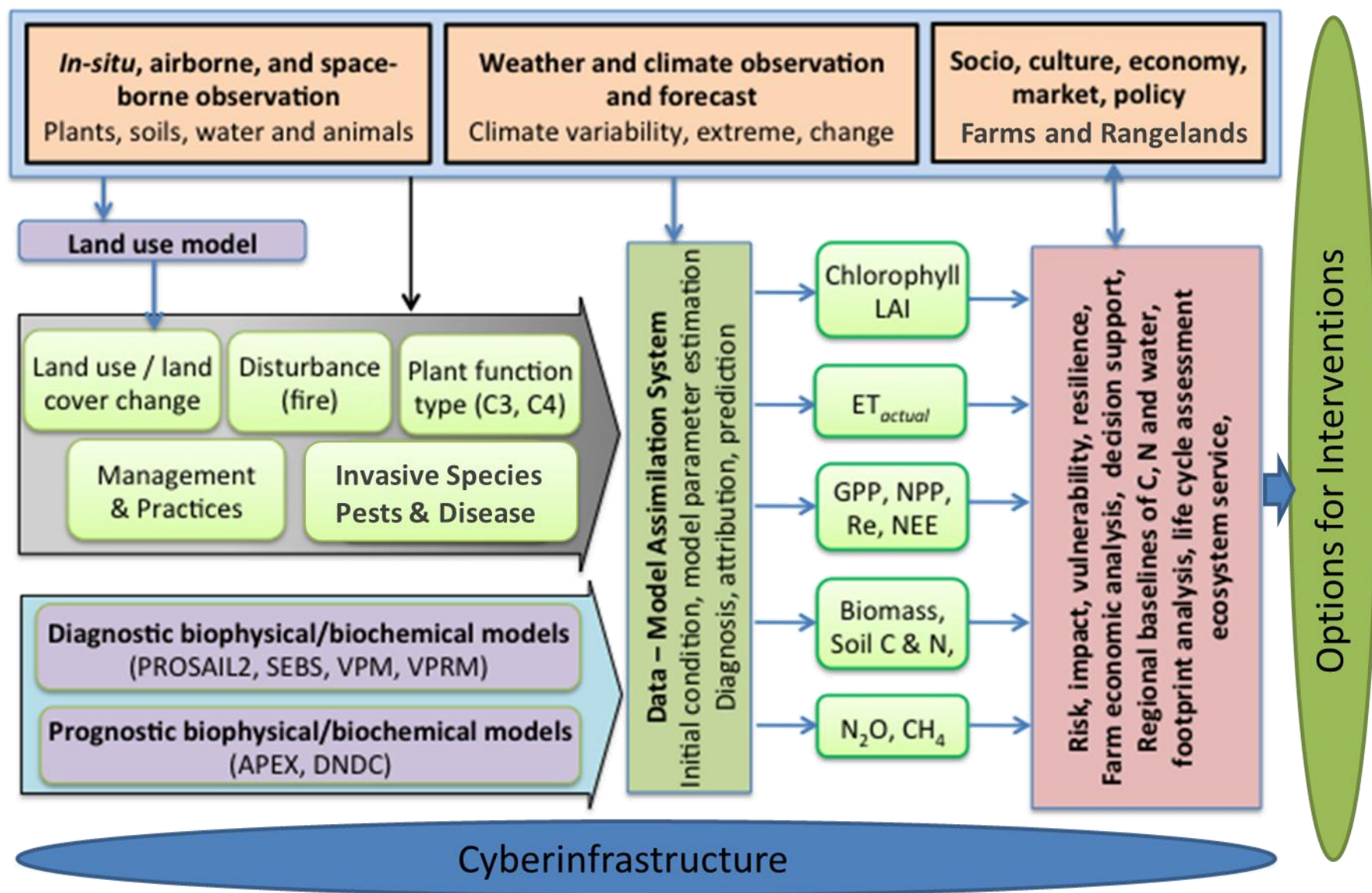


Regional Similarity for Morocco Platform

Bioclimatic similarity in target areas
with reference to platform

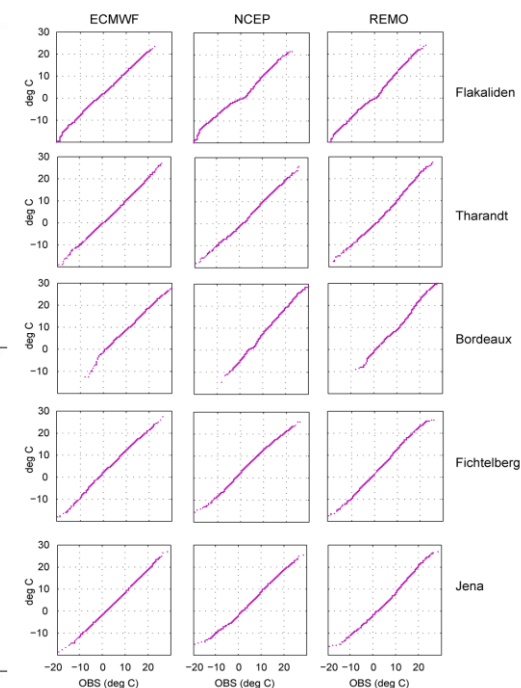
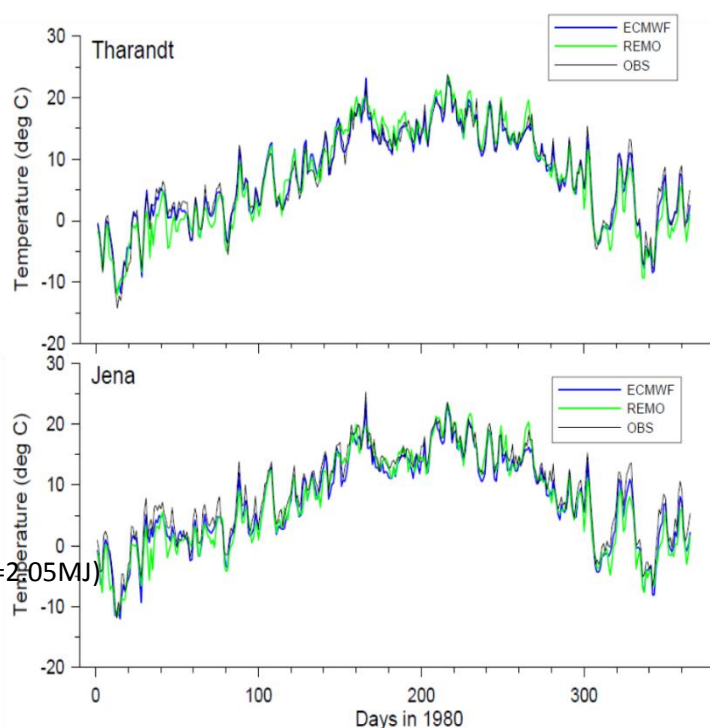
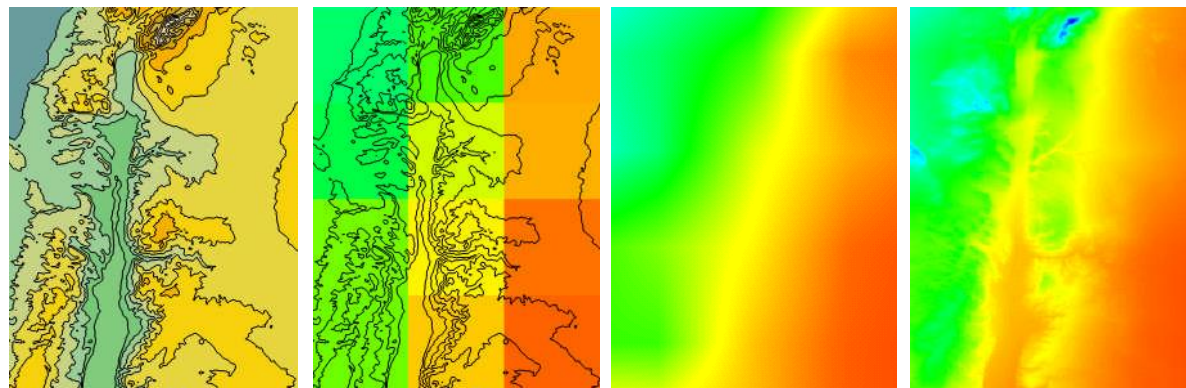
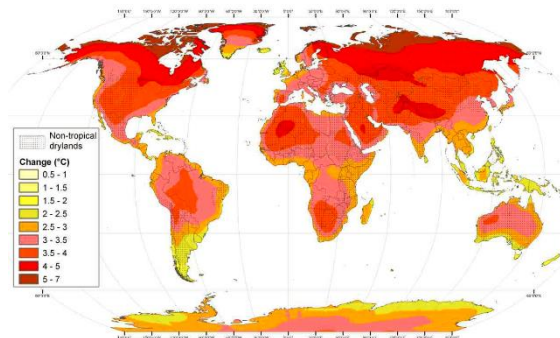
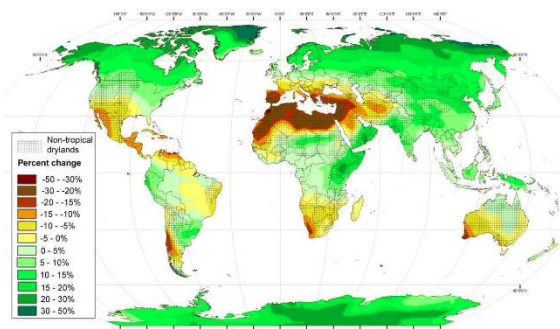


EVEN MORE COMPLEX



1979/2013 to 2080/2099

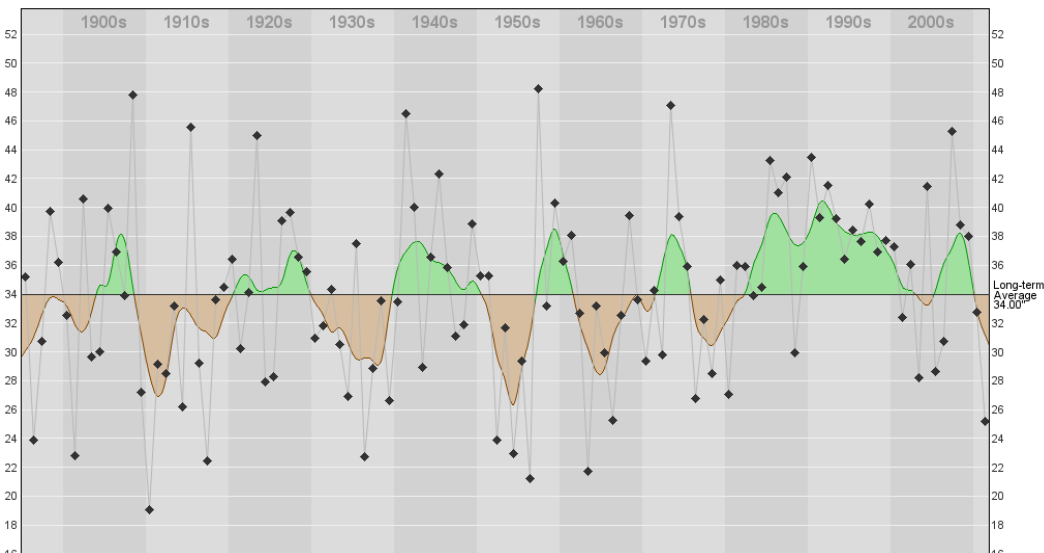
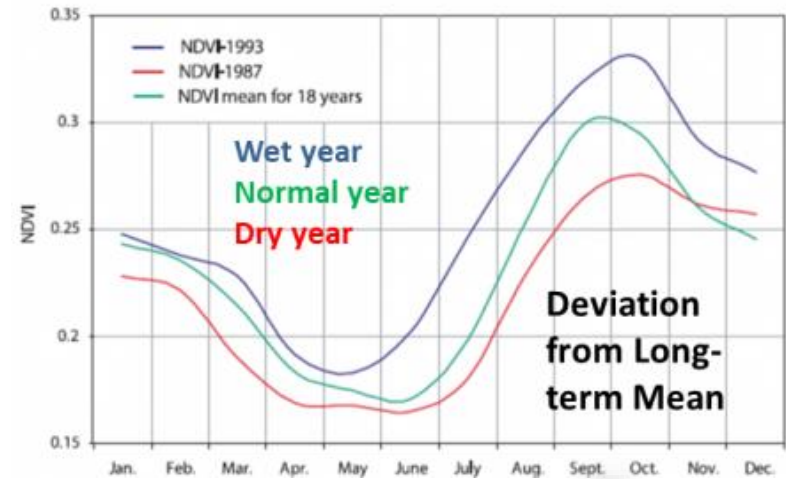
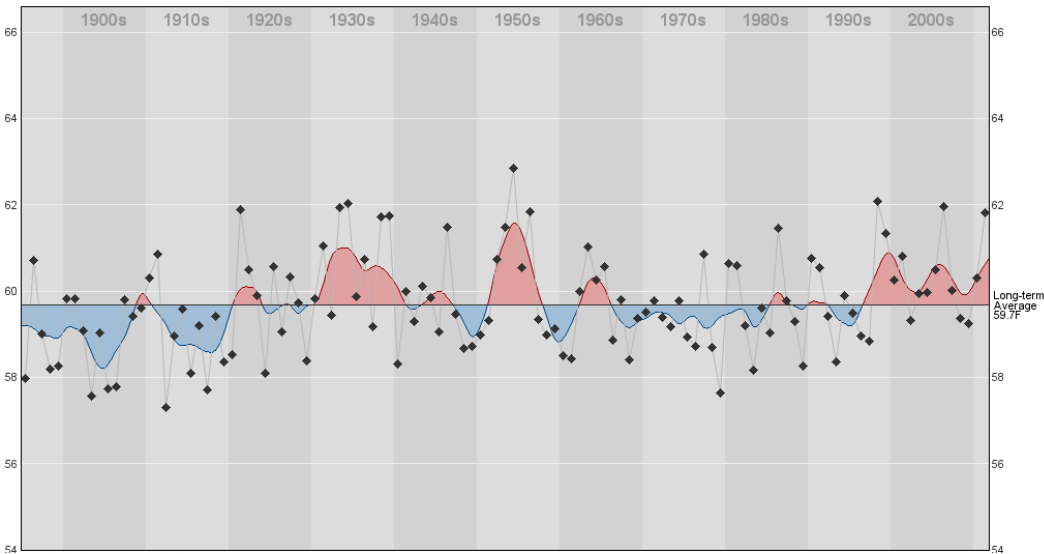
1km, Daily, 21 bioclimes



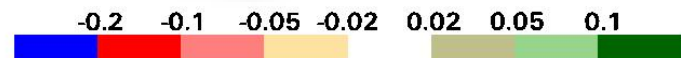
- tmax---maximum temperature at 2 meter (degC)
- tmin---minimum temperature at 2 meter (degC)
- precip---precipitation (mm)
- ABSH---absolute humidity(kg/m3 scaled by 106)
- RHY---ralative humidity(%)
- PAR---photosynthesis active radiation (mol PPFD=205MJ)
- uwind---wind at east-west direction(m/s)
- vwind---wind at north-south direction(m/s)
- VPD---vapor pressure deficit(Pa)

Climate Extremes

National to Local Scale

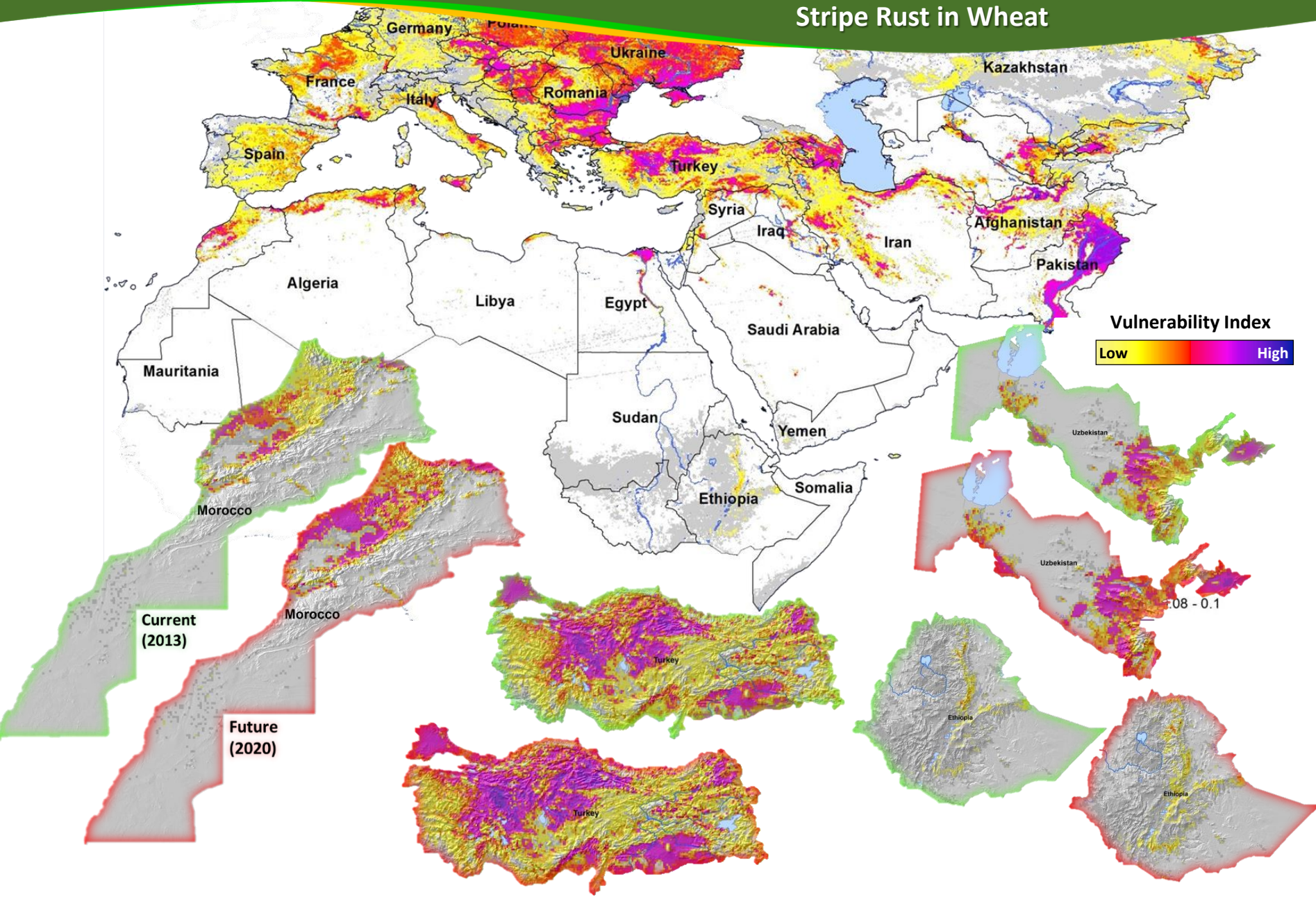


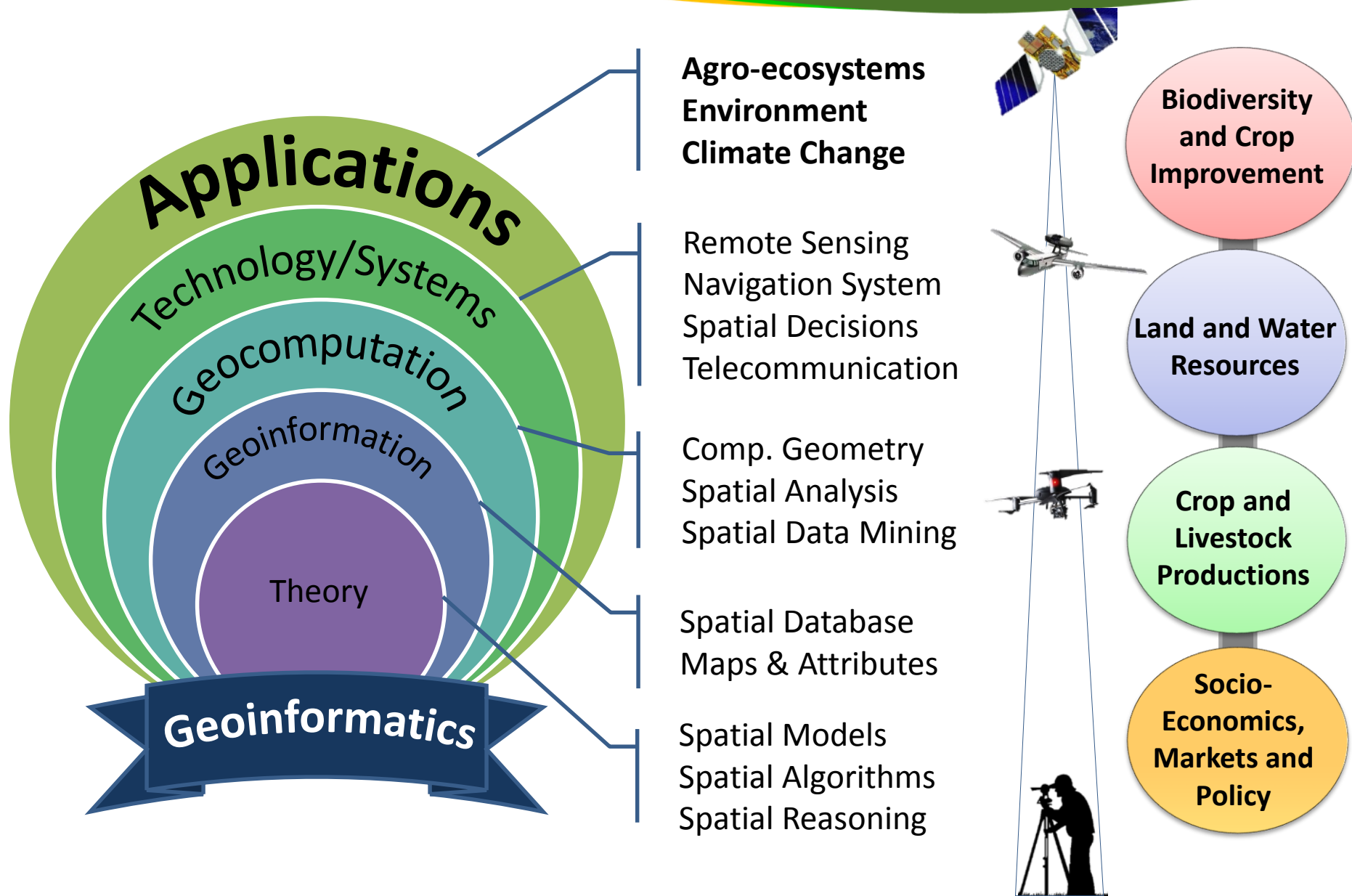
Climate
Deviation
from long-
term mean



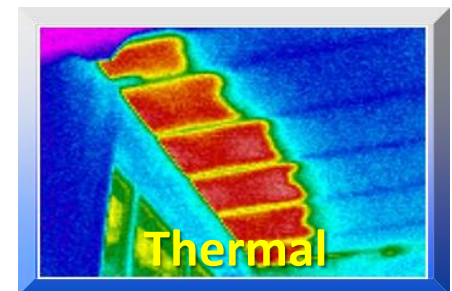
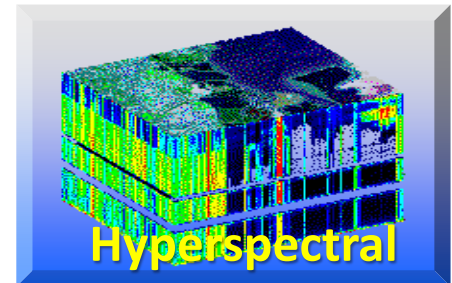
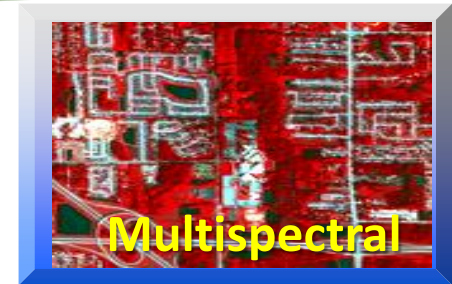
Mapping Pest & Disease Risk

Stripe Rust in Wheat





- **Increased Spatial Resolution**
 - ~50cm, 1m, 2.5m, 4m, 5m...
- **Increased Spectral Resolution**
 - hyperspectral, ultraspectral, thermal, SAR,...
 - specific bands for agricultural applications...
- **Increased Temporal Resolution**
 - daily @ higher spatial resolution...
- **Increased Computational speed**
 - high end PCs/WS, cloudC, multithreading...
- **Improved Image Processing Techniques**
 - VMs, Feature Ex, Fusion, KBCs, Decision trees...
- **Decreased Cost of the Hardware**
 - servers and storage systems ...
- **Decreased Software cost:**
 - open source programs/OS ...
- **Decreased RS Data cost**
 - free and open access data sharing...



Satellite	Resolution(m)*	Pixels/ac	Pixels/ha	\$/km ²
AVHRR	1000	0.004	0.01	Free
SPOT	1000	0.004	0.01	Free
MODIS	500	0.016	0.04	Free
Landsat	30	4.5	11.1	Free
PALSAR	10	40	100	Free
AWiFS	60	1.11	2.7	0.01
IRS Liss3	23.5	7.3	18.1	0.15
ASTER	15	18	44.4	0.04
IRS Liss4	5	160	400	1.19
Blackbridge	5	160	400	1.23
IKONOS	4	253	625	5.02
Cartosat1	2.5	640	1600	6.59
GeoEye1	2	1012	2500	12.5
WorldView2	2	1012	2500	14.5
PLEIADES	2	1012	2500	17

* Multispectral

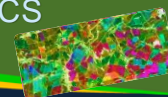


Very High Resolution (Up to - 1 m)

Satellite Sensors	Resolution			Swath (km)
	Spatial (m)*	Temporal (days)	Spectral (Bands)	
GEOSAT-1	1.65 (0.41)	1	B, G, R, IR, P	15.2
IKONOS	3.2 (0.82)	14	B, G, R, IR, P	11.3
PLEIADES-1A	2 (0.5)	1	B, G, R, IR, P	20
PLEIADES-1B	3 (0.5)	1	B, G, R, IR, P	20
Quick Bird	2.4 (0.6)	3.5	B, G, R, IR, P	16.5
WorldView-1	(0.4)	1.2	P	17.6
WorldView-2	1.8 (0.4)	1.2	P, C, B, G, Y, R, RE, IR (2)	16.4
CARTOSAT-2	1	5	P	9.6
CARTOSAT-2a	<1	4	P	9.6
CARTOSAT-2B	<1	4	P	9.6
SKYSAT-1	2 (0.9)	<1 (hourly)	B, G, R, IR, P	8
KOMPSAT-3	2.8 (0.7)	14	B, G, R, IR, P	16.8
KOMPSAT-2	4 (1)	14	B, G, R, IR, P	15
OrbView-3	4 (1)	3	B, G, R, IR, P	14

High Resolution (1 to 5 m)

Satellite Sensors	Resolution			Swath (km)
	Spatial (m)*	Temporal (days)	Spectral (Bands)	
CARTOSAT-1	(2.5)	5	P	30
FORMOSAT-2	8 (2)	1	B, G, R, IR, P	24
SPOT-5	5, 30 (2.5, 5)	2-3	G, R, IR, SW, P	60 to 80
SPOT-6 (1.5)	6 (1.5)	2-3	B, G, R, IR, P	60
RapidEye	5	1	B, G, R, RE, IR	77
RESOURCESAT-1	5.8	5	G, R, IR	23, 70
GOKTURK-2	10, 20 (2.5)	2.5	B, G, R, IR, SW, P	20
TH-2	10 (2)		B, G, R, IR, P	60
EROS-A	(1.8)	2.1	P	14
Theos	15 (2)	3	B, G, R, IR	96
BEIJING-1	32 (4)	1	R G, IR	600
PROBA/HRC	18, 34 (5)	7	18	15



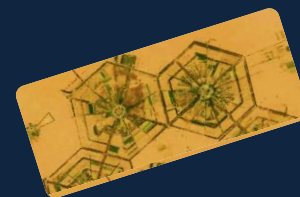
Satellite	Multispectral resolution (m) B, s		Swath width (km)
ASTER (15m)			
VNIR (Visible Near Infrared)	15	VIR (4)	60
SWIR (Shortwave Infrared)	30	SW (6)	60
TIR (Thermal Infrared)	60	TIR (5)	60
CBERS-2			
WFI	260	R, IR	890
CCD	20	B, G, R, IR	113
IRMSS	(2.7)	P	27
LANDSAT 5TM -7ETM	30 (14.8)	B, G, R, IR, SW1, TIR, SW2, P	185
Nigeriasat-X	22	G, R, IR	-
Resourcesat-2A/Liss-III	23.5	R, G, IR, SW	141
Deimos-1	22	G, R, IR	600
UK-DMC-2/SLIM6	22	G, R, IR	638
BILSAT-1	26 (12)	R, B, G, IR, P	640
Nigeriasat-1	32	G, R, IR	640
ALSAT-1	32	G, R, IR	640
UK-DMC/EC (DMC)	32	G, R, IR	600
EO-1/ALI-MS	30	B (2), G, R, IR (3), SW (2), P	37
EO-1/ Hyperion	30	220 bands	7.7
ASTER (15m)	15, 30, 90	G, R, IR (2) SW(6), TIR (4)	60
LANDSAT 7ETM+	30m (14.5)	B, G, R, IR, SW (2), TIR, P	185
SPOT-4	20 (10)	G, R, IR, SW, P	60
SPOT-5	20 (10)	G, R, IR, P	60
JERS-1	24 (18)	G, R, IR, IR	75
SPOT-2	20 (10)	G, R, IR	60
SPOT-1	20 (10)	G, R, IR	60
LandSat 5/MSS	80	G, R, IR, IR	185
LandSat 5/TM	30, 120	B, G, R, IR, SW, SW, TIR	185
RESURS-01-1	45	G, R, IR	600

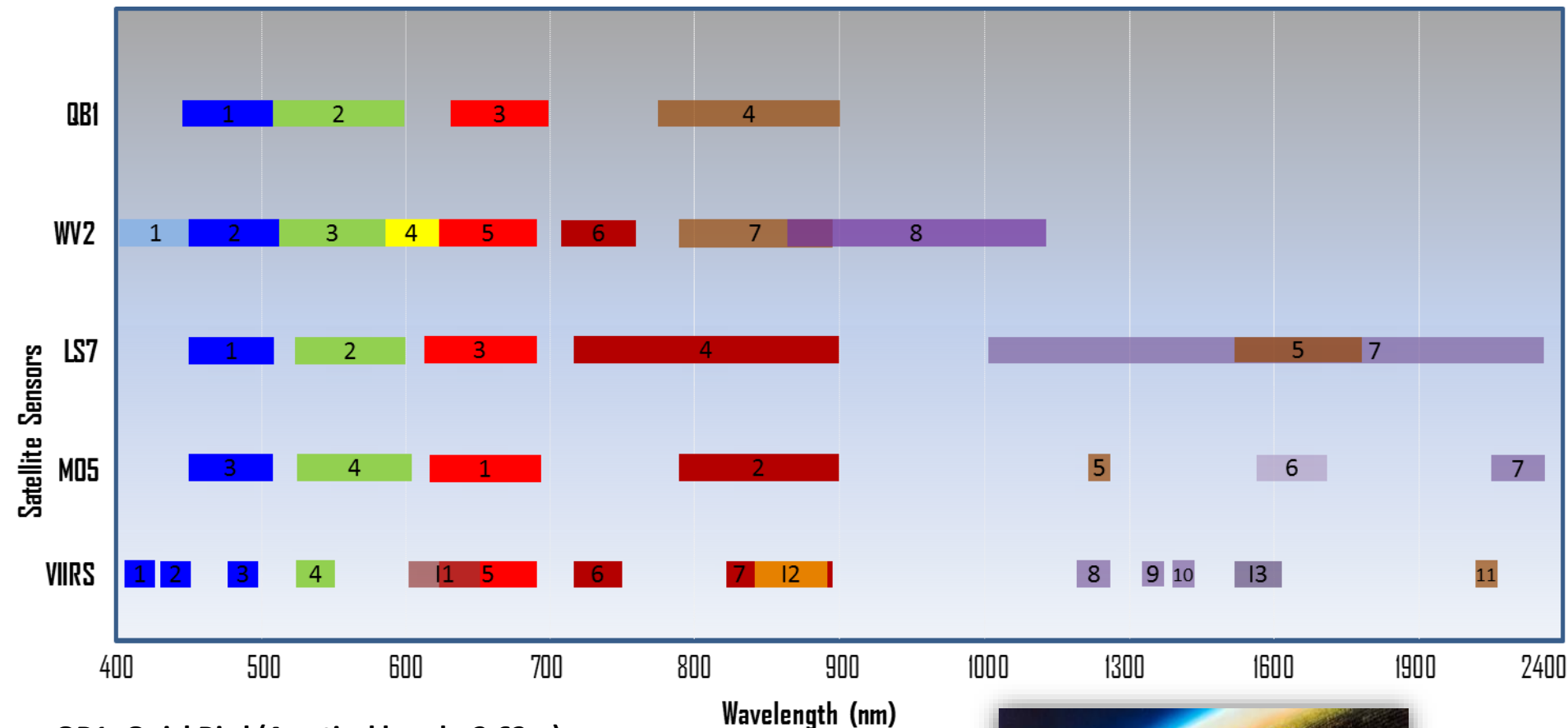
Low or Medium resolution

Satellite	Multispectral resolution (m) B, s		Swath width (km)
LandSat 8	30 (14.8)	P, C, B, G, R, IR, SW (3)	185
VIIRS	375, 750	220, s	3000
ASAR	(12.5)	VV 1	5 - 406
MERIS	300	15 b, s	1150
Metosat MSG			
GERB	40000	7	-
SEVIRI	1000, 3000	12	-
SPOT5/VEGETATION 2	1000	B, R, IR, SW (4)	2250
MODIS	250, 500, 1000	36	2330
SPOT4/VEGETATION 1	1000	B, R, IR, SW (4)	60
IRS-1D/ WIFS	188	R, IR (2)	774
Orbview-2/ SeaWiFS	1130	B(2), G (3), IR (8)	2800
IRS-1C/ WIFS	188	R, IR (2)	810
RESURS-01-1/ MSU-S	240	G, R, IR (3)	600
RESURS-01-1/ MSU-SK	170, 600	R, G, IR(2), TIR	600
ResourceSat/AWIFS	56	R, G, IR, SW	740
LandSat 2/ MSS	80	G, R, IR, IR	183
LandSat 2/ RBV	80	G, R, IR	183
LandSat 1/ MSS	80	G, R, IR, IR	183
LandSat 1/ RBV	80	G, R, IR	183

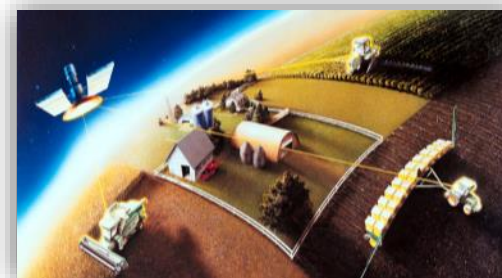
Radar Satellites

Satellite	Bands	Band (Polarity)	Swath width (km)
Sentinel-1			
COSMO-SKYMED 4	1, 5, 15, 30, 100	X-B (HH, VV, HV, VH)	10, 40, 30, 100, 200
TanDEM-X	1, 3, 16	X-B (HH, VV, HV, VH)	1500
COSMO SKYMED 2	1, 5, 15, 30, 100	X-B (HH, VV, HV, VH)	10, 40, 30, 100, 200
RADARSAT 2	3, 8, 12, 18, 25, 30, 40, 50, 100	C-B (HH, HV, VV, VH, VV)	5 - 500
COSMO-SKYMED 1	1, 5, 15, 30, 100	X-B (HH, VV, HV, VH)	10, 40, 30, 100, 200
Terra SAR-X	1, 3, 16	X-B (HH, VV, HV, VH)	1500
ALOS (PALSAR)	10, 20, 30, 100	VH)	70
ENVISAT (ASAR)	12.5	C-B (VV)	5 - 406
RADARSAT 1 (SAR)	8, 25, 30, 35, 50, 100	C-B (HH)	50 - 500
ERS 2 (AMI)	25	C-B (VV)	100
ERS 1 (AMI)	25	C-B (VV)	100

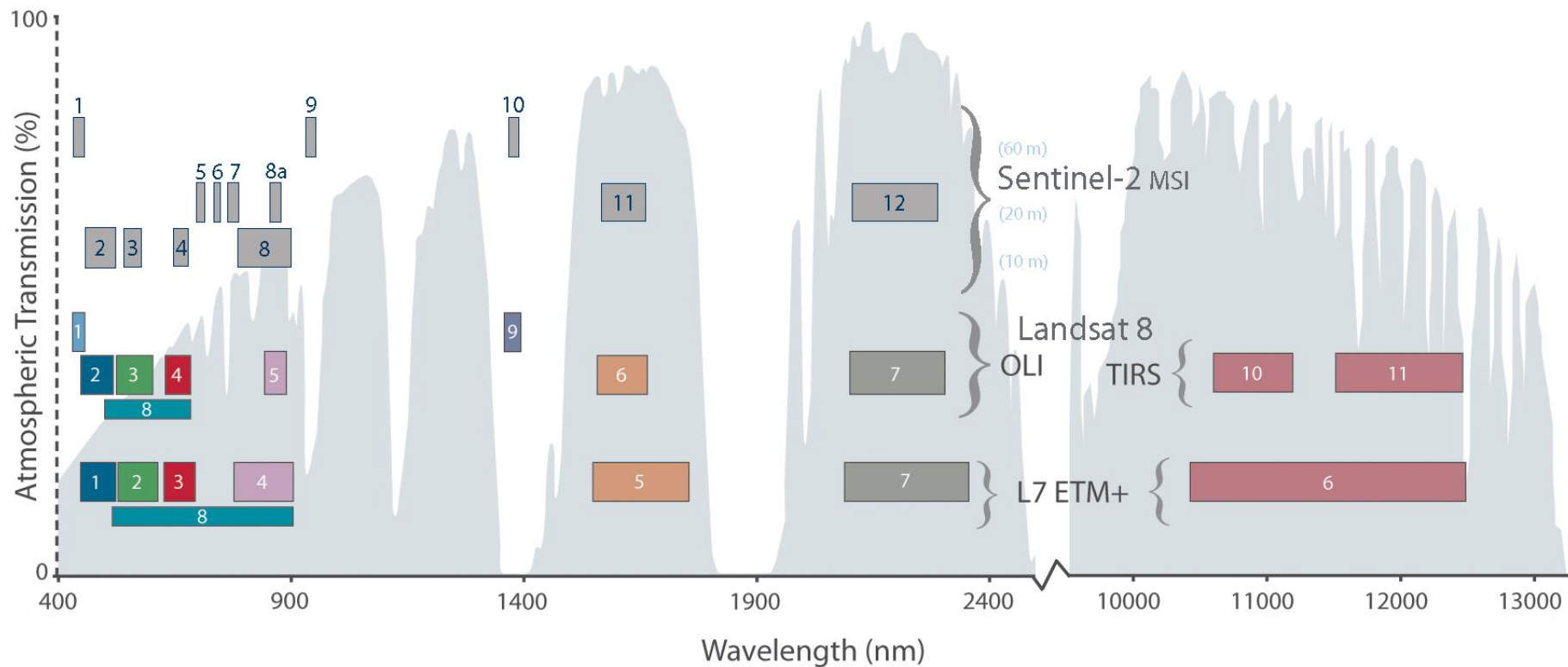


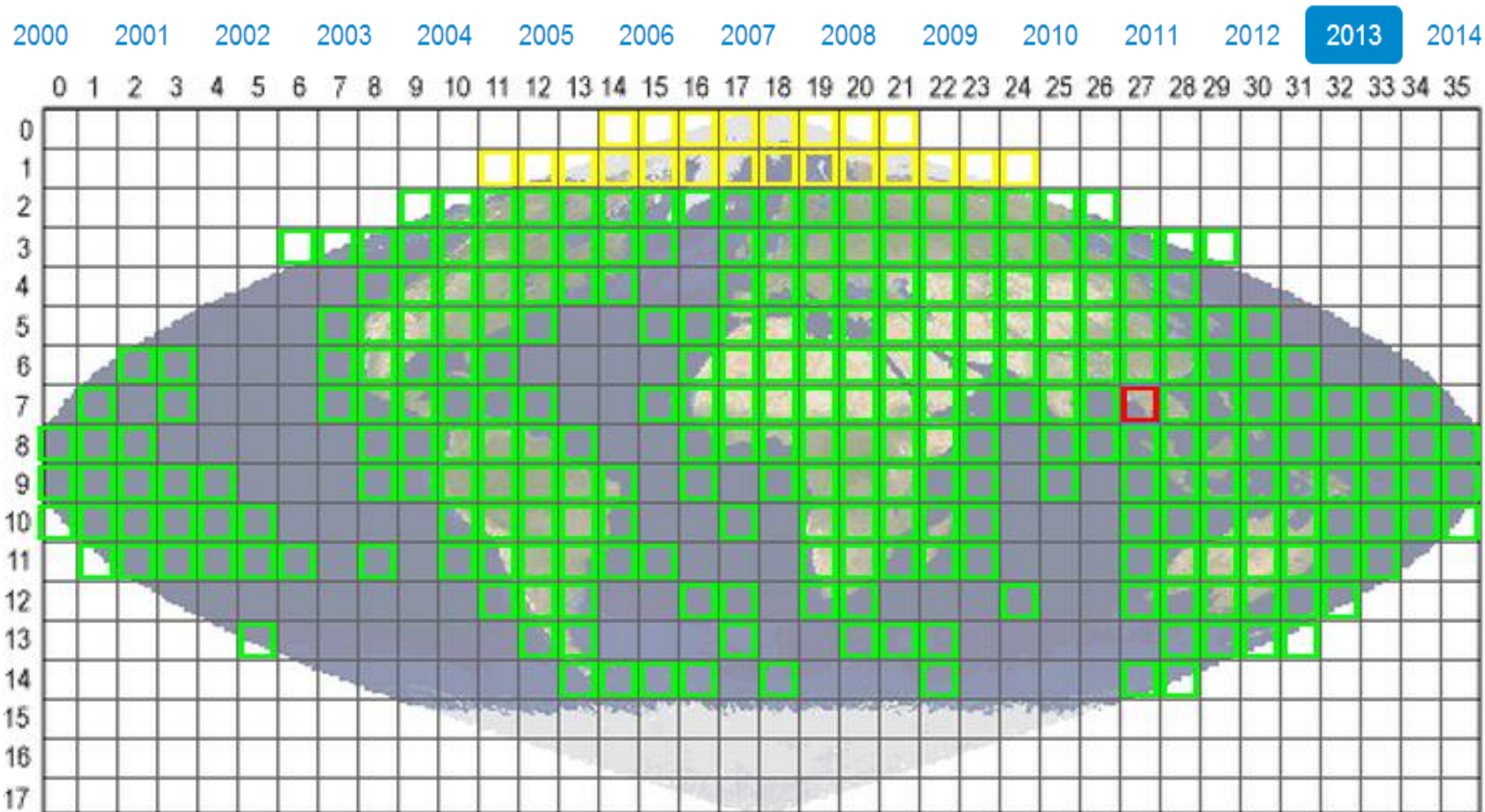


QB1- QuickBird (4 optical bands 2.62m)
WV2-WorldView2 (8 optical bands, 2.4m)
LS7-Landsat ETM+ (6 optical bands, 30m)
MO5-MODIS MOD09A1 (7 optical bands, 500m)
VIIRS-NPOESS VIIRS (11 optical bands, 375-750m)

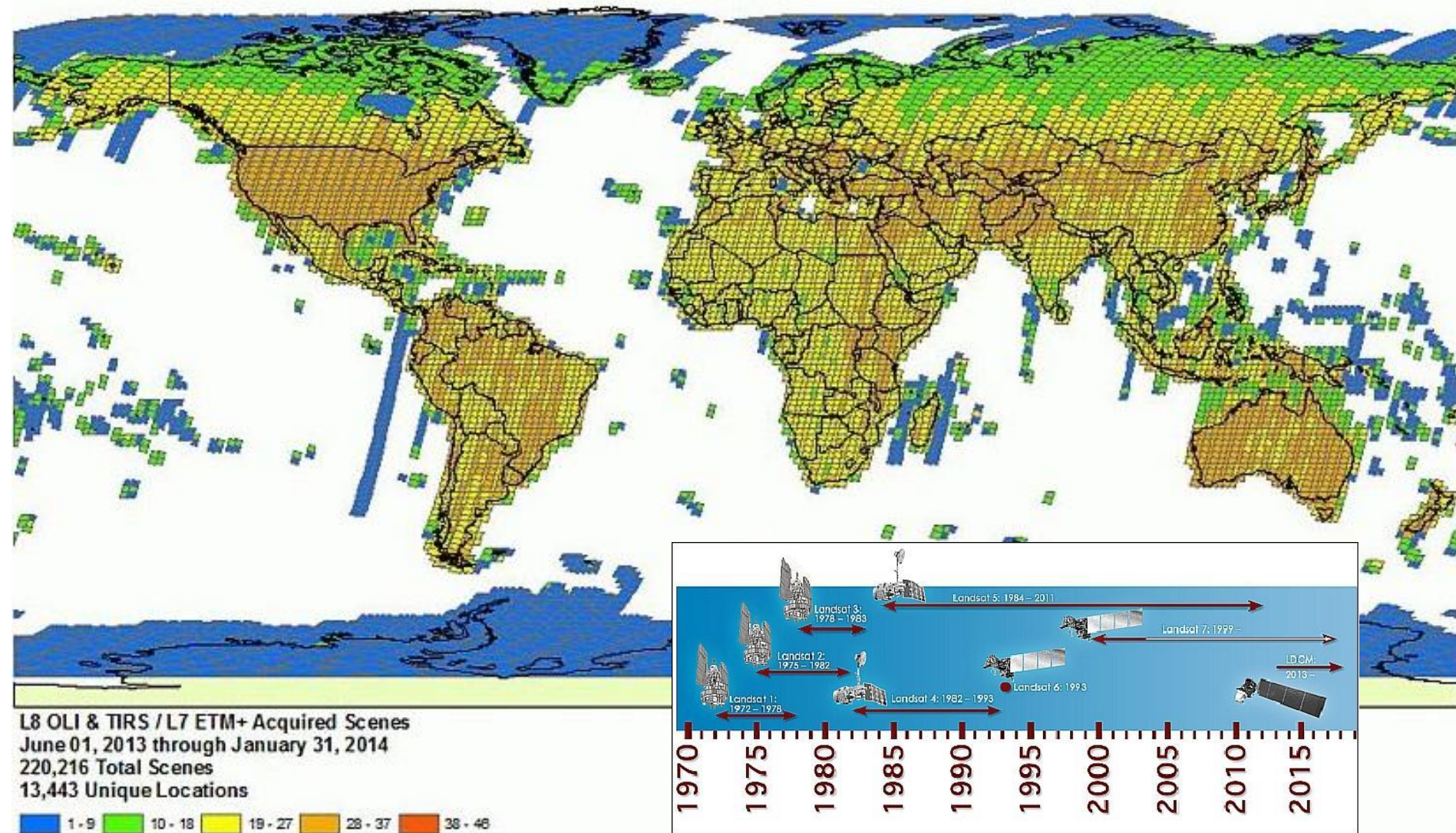


Comparison of Landsat 7 and 8 bands with Sentinel-2





FY13/FY14 L8 OLI & TIRS / L7 ETM+ Acquisitions



@ 10/20/60-m spatial resolution

Wide Swath

SPOT-5 60 x 60 km x 2
IRS P6 LISS III 141x141 km
Landsat ETM+ 180 x 172 km
Sentinel-2 290 x 290 km

290Km

20 m

10 m

B2 B3 B4

B6

Vegetation
Red-edge

Continuity with SPOT

400 nm 600 nm 800 nm 1000 nm 1200 nm 1400 nm

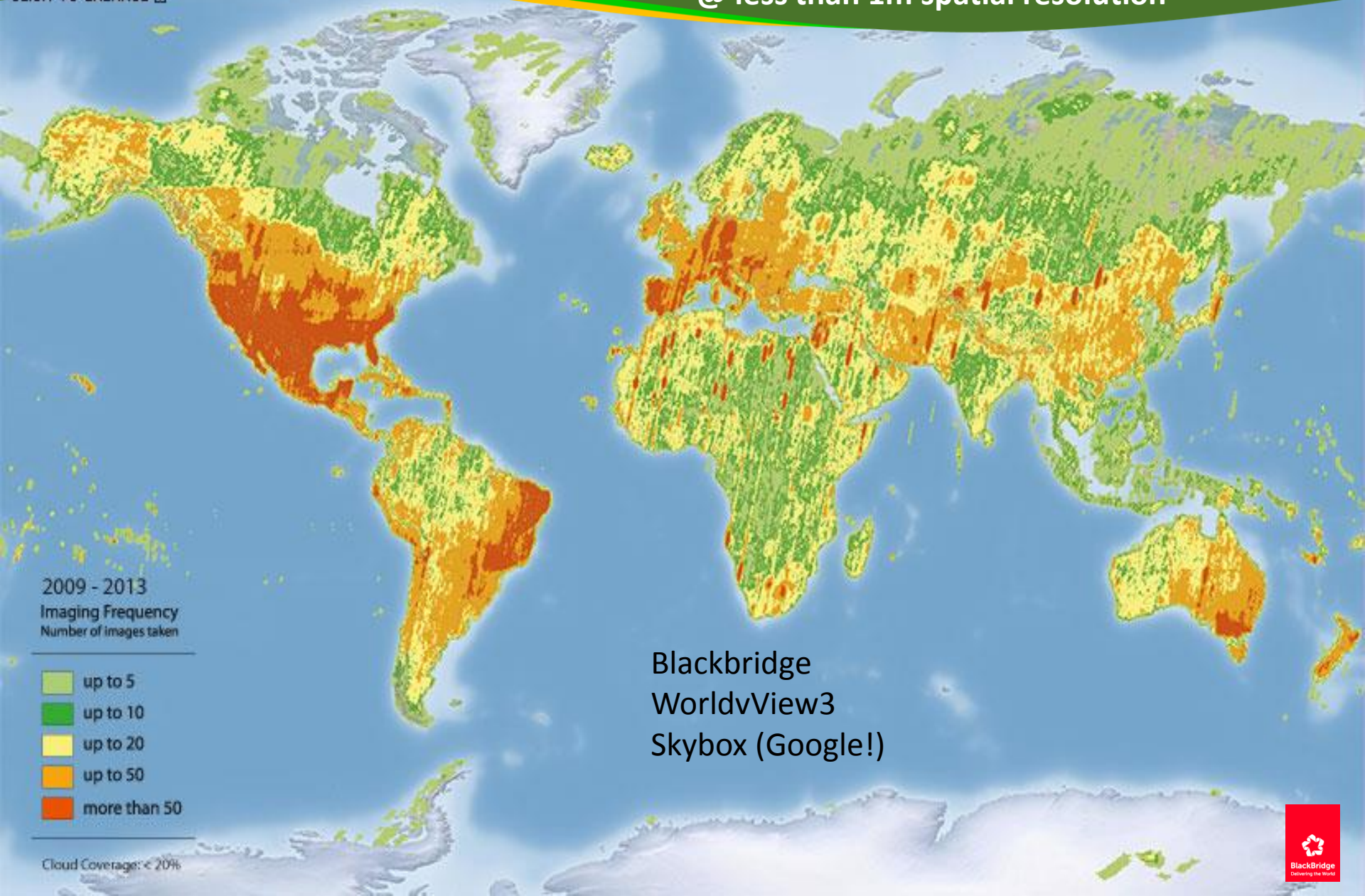
Frequent Revisit

Days

>85
80-85
75-80
70-75
65-70
60-65
55-60
50-55
45-50
40-45
35-40
30-35
25-30
20-25
15-20
10-15
5-10
0-5

@ less than 1m spatial resolution

CLICK TO ENLARGE

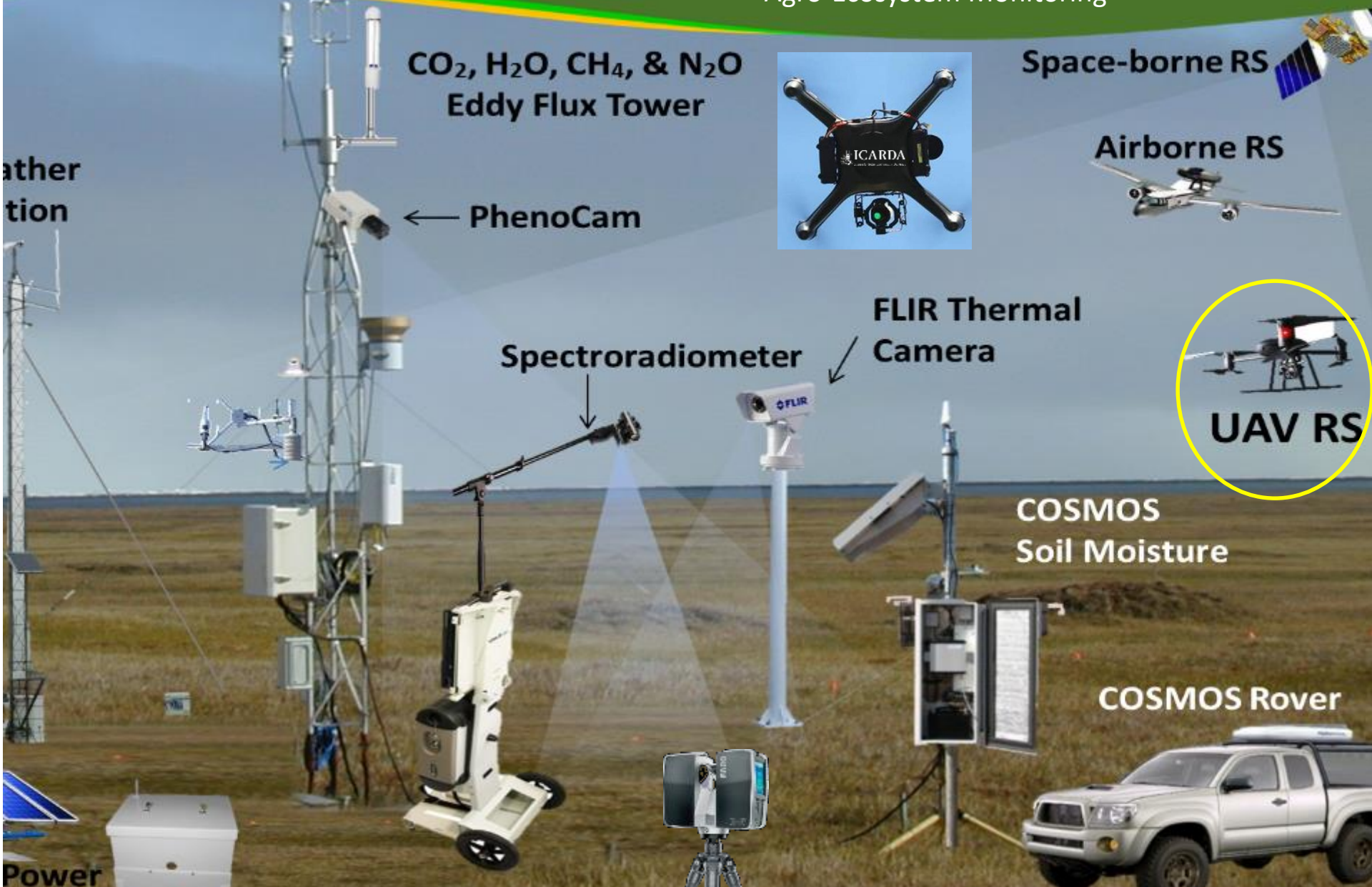


2009 - 2013
Imaging Frequency
Number of images taken

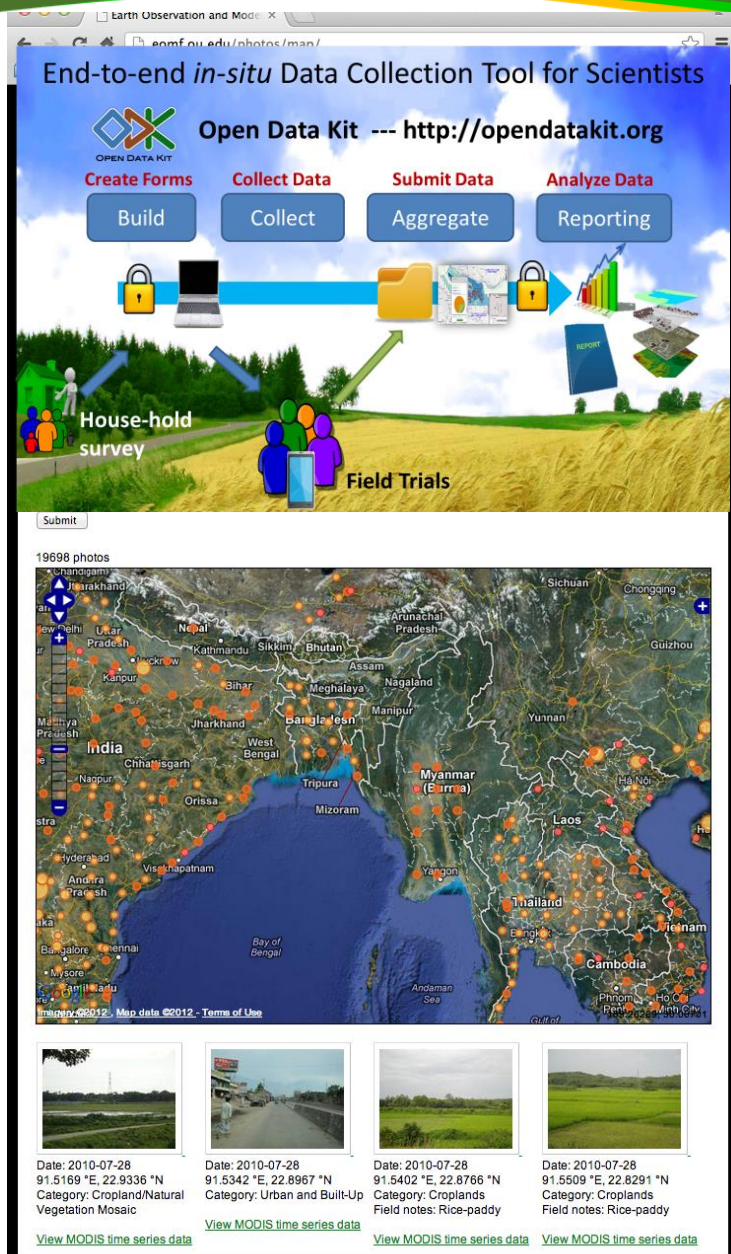
up to 5
up to 10
up to 20
up to 50
more than 50

Cloud Coverage: < 20%

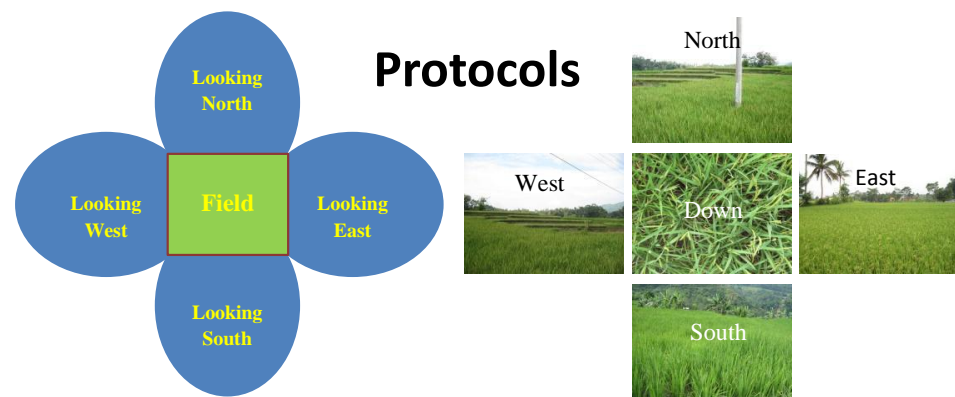
Blackbridge
WorldView3
Skybox (Google!)



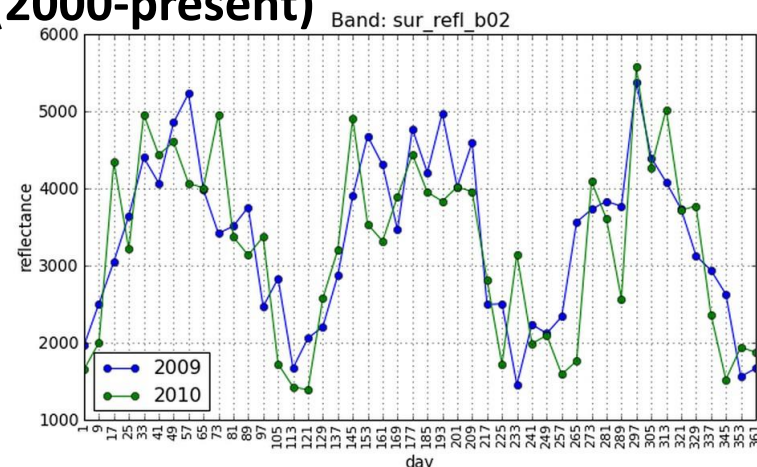
Georeferenced Field Photos



1. Apps “Field Photo” and 
2. OA Geo-ref. field photo library
3. Images (MODIS, Landsat, PALSAR)



Individual photos are linked with time series MODIS data (2000-present)



Open Access without personal info



RESEARCH
PROGRAM ON
Dryland Systems



Data Table

Show entries

Search:

ID	Longitude	Latitude	Altitude	Date	Actions
371605dd-0898-4569-9142-9c62d45334a7	35.8632484451	32.5194345647	605.8000000000	2014-04-15 08:33:59	Zoom To Show Photos
22a04847-4038-446d-982a-d423ca5074f9	35.8629390690	32.5175026199	632.8000000000	2014-04-15 08:33:10	Zoom To Show Photos
0bfc95dc-60eb-485e-8b08-c0fb04b6410d	35.8665131126	32.5255138334	622.9000000000	2014-04-15 08:32:10	Zoom To Show Photos
6408d4c6-160a-4fcd-92c6-fb3b8bbe25e8	35.8668613806	32.5261460384	620.2000000000	2014-04-15 08:25:04	Zoom To Show Photos
217e9b46-a874-4c86-add1-a12f97131546	35.7929547038	31.5707051754	716.3000000000	2014-04-12 14:38:13	Zoom To Show Photos
99be01b4-d63a-4e3f-acd9-5843e1475a04	35.7852115855	31.5556243295	529.7000000000	2014-04-12 14:09:12	Zoom To Show Photos
a384d1d5-6f5e-4d26-b137-57d848caa8aa	35.7435396966	31.6170065152	827.7000000000	2014-04-12 13:25:57	Zoom To Show Photos
2b470642-4087-457f-8620-9dc709892a0c	35.7441195566	31.6194619518	1067.2000000000	2014-04-12 13:14:35	Zoom To Show Photos
43c485f4-05e0-48db-a8dd-f3b41d1c7d51	35.7869502436	31.6719519440	800.0000000000	2014-04-12 12:57:02	Zoom To Show Photos
5300eed4-552c-49f4-a10b-5545c7b85362	35.7779035717	31.6694164183	833.1000000000	2014-04-12 12:53:47	Zoom To Show Photos

Showing 1 to 10 of 57 entries

First Previous 1 2 3 4 5 Next Last

Agricultural Livelihood Systems



Pastoral



Agropastoral



Rainfed



Tree-based



Irrigated

Thank You



RESEARCH
PROGRAM ON
Dryland Systems

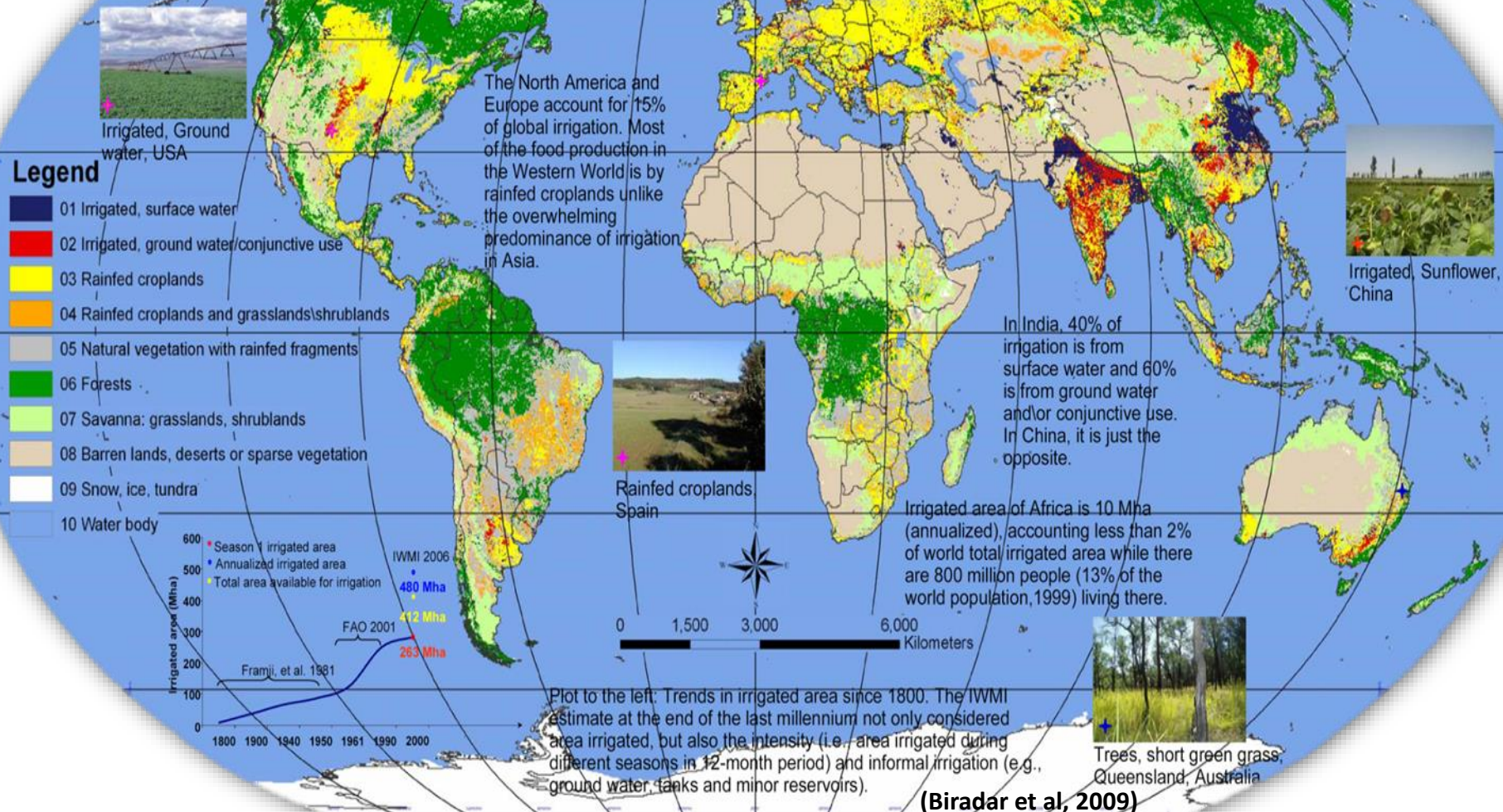
c.biradar@cgiar.org



If time left?

Some Examples

Satellite Sensor Based Global Irrigated and Rainfed area map with other Classes



Changing Cropping Intensity

Integrated Production Systems

Diversification & Intensification

Crop Fallow Areas

Conservation Agriculture

Thematic Land Suitability

Climate Change Impact?



Cropping Intensity

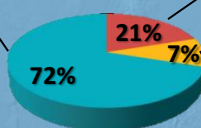
Double crops
Triple crops

Population Density

Year 2000

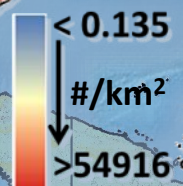
Double Crops
Triple Crops

Agricultural Intensification



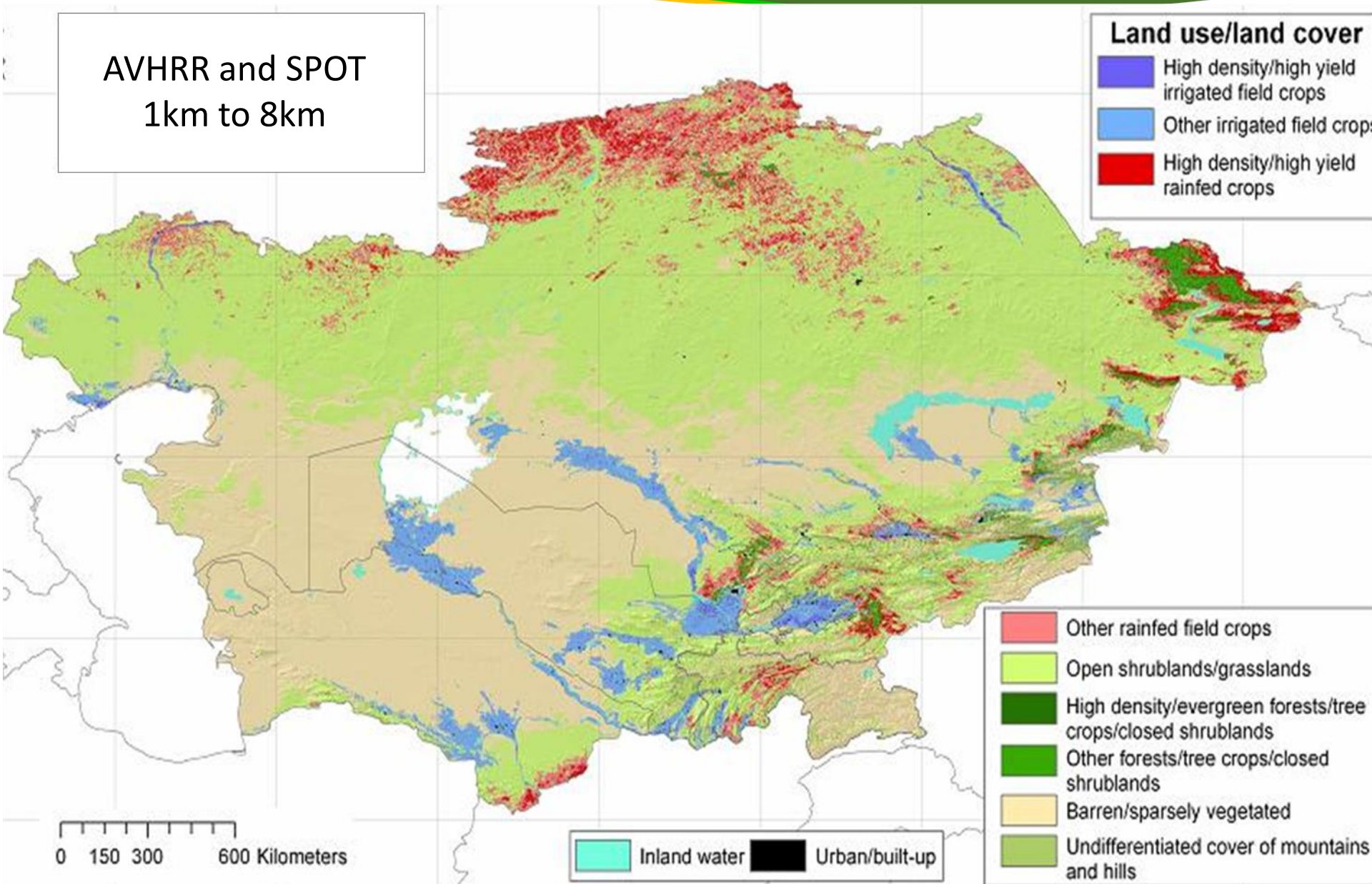
Cropping Intensity

Increase in Arable Land



(Biradar & Xiao, 2010)

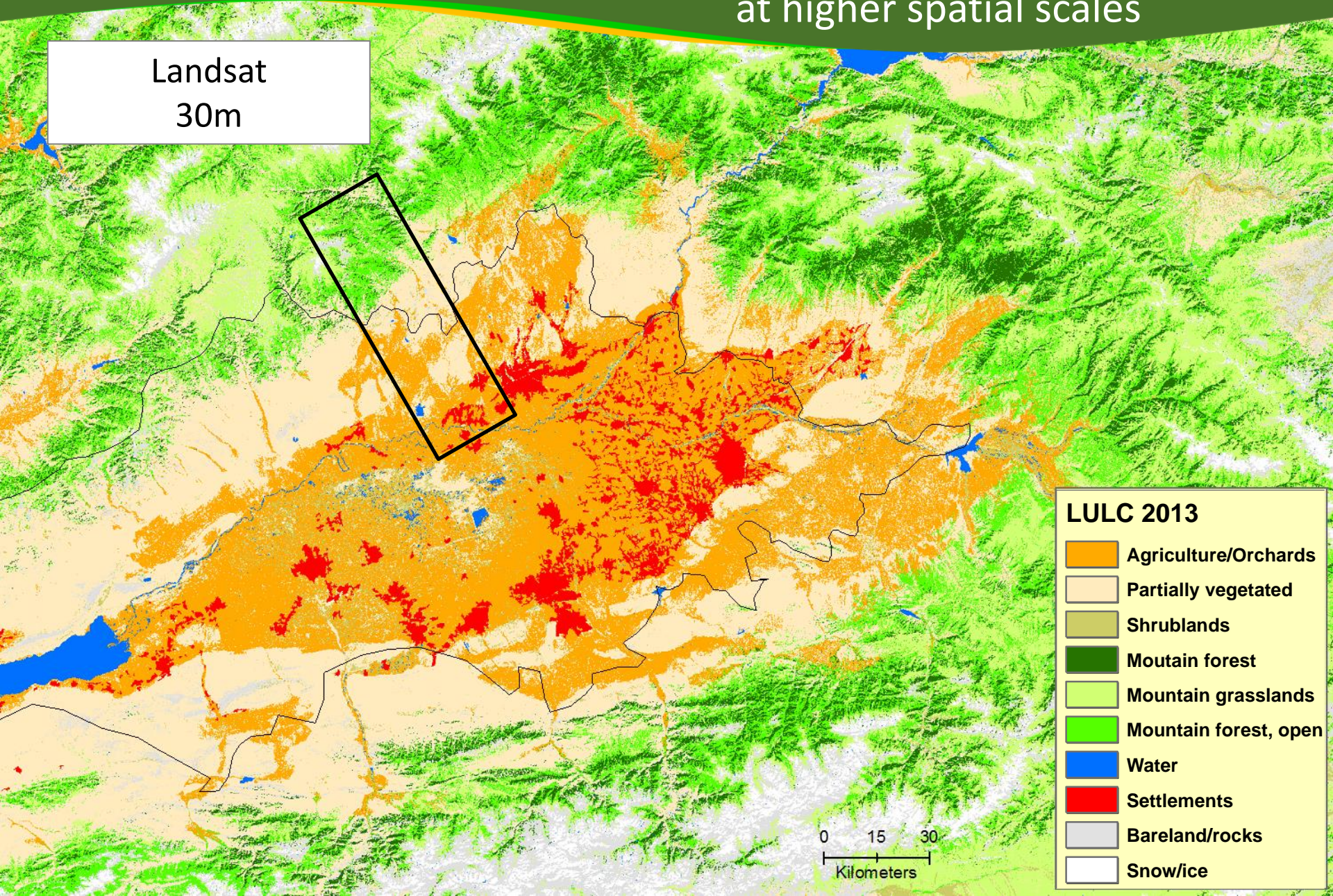
AVHRR and SPOT
1km to 8km



Land use and land cover

at higher spatial scales

Landsat
30m



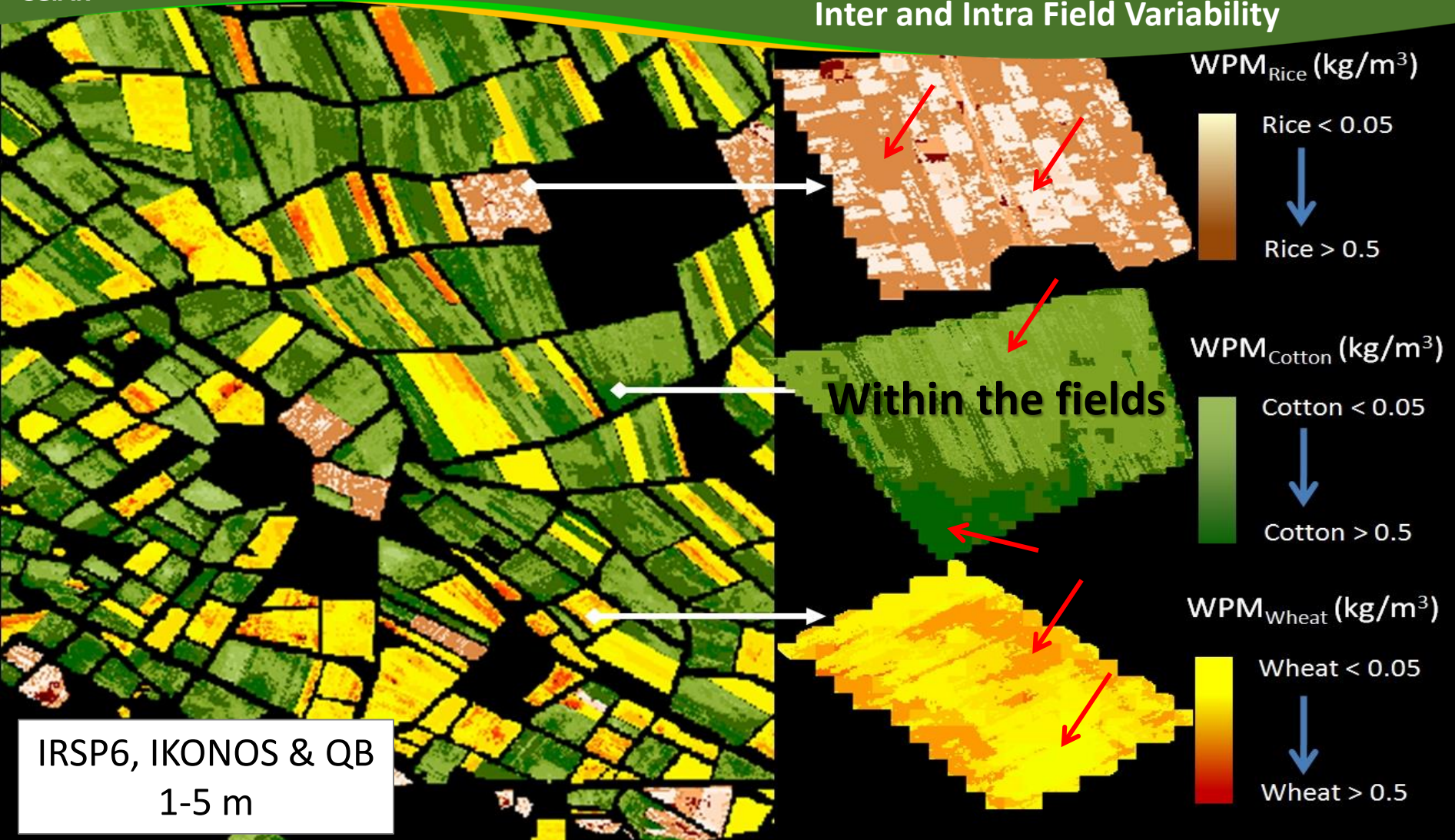
LULC 2013

- Agriculture/Orchards
- Partially vegetated
- Shrublands
- Mountain forest
- Mountain grasslands
- Mountain forest, open
- Water
- Settlements
- Bareland/rocks
- Snow/ice

0 15 30
Kilometers

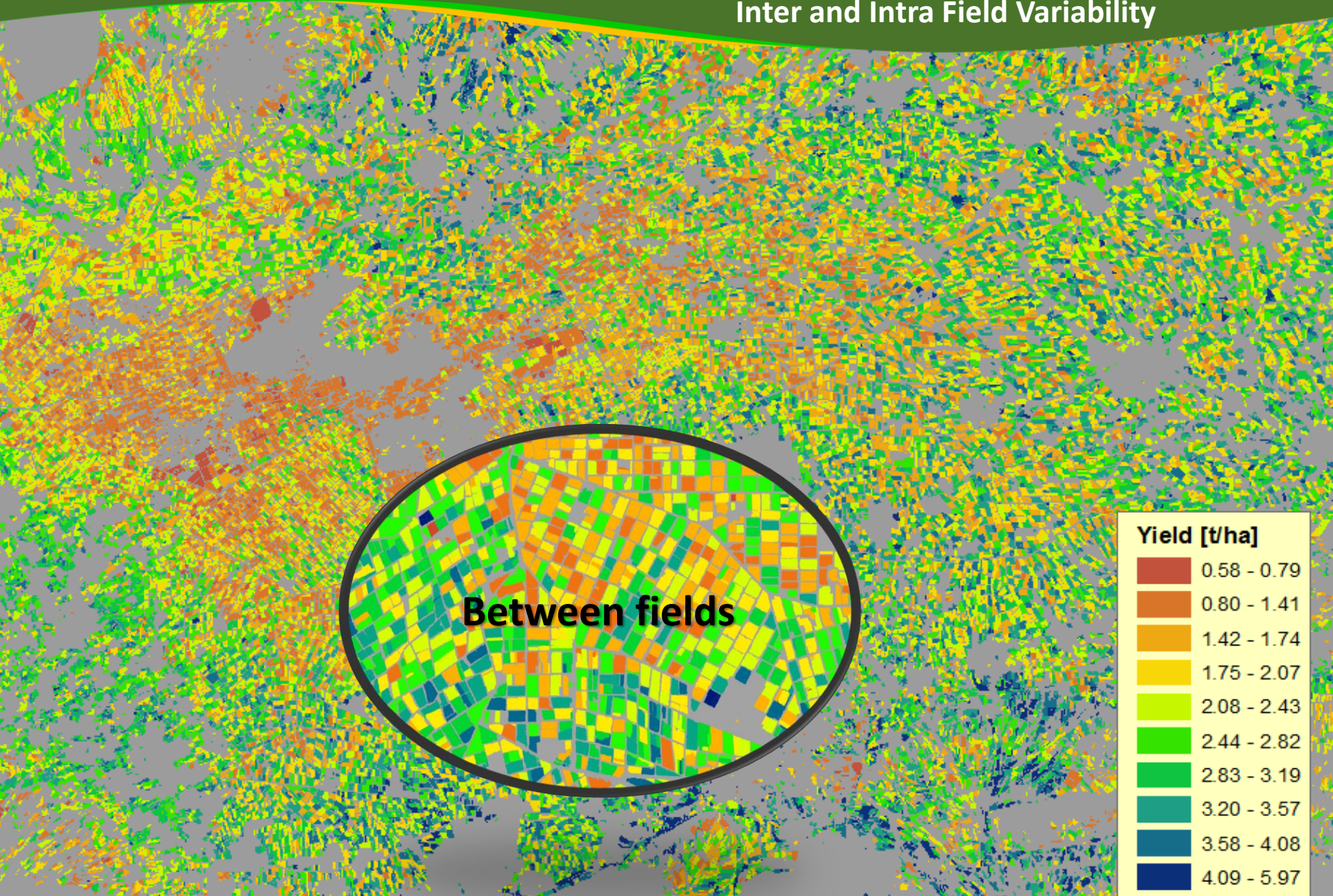
Yield/Productivity Gaps

Inter and Intra Field Variability



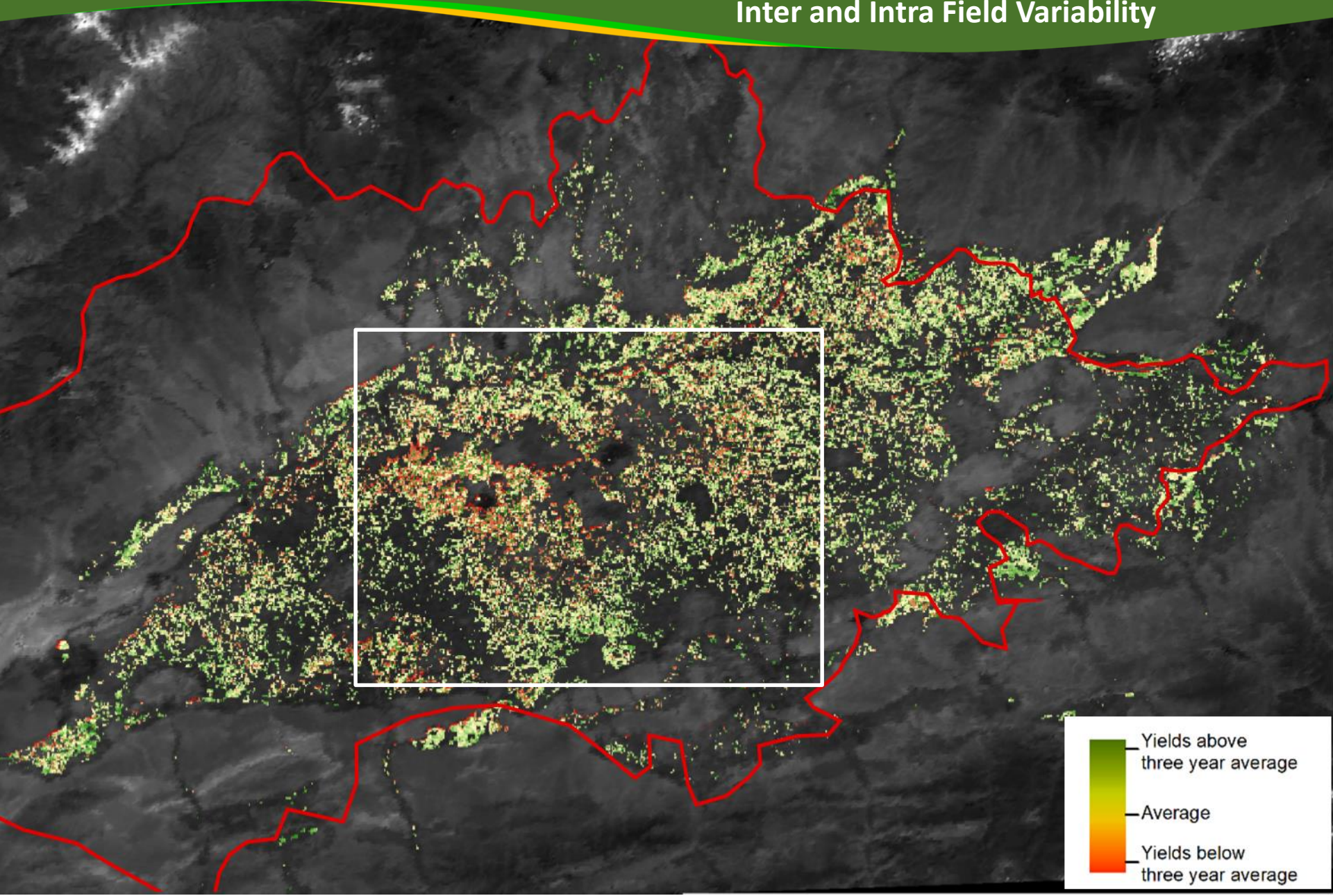
Water productivity (WP) is defined as the kg of yield produced/m³ of water used or, alternatively, as value in \$ of yield produced/m³ of water used.

WP of Cotton	0.42 kg/m ³	0.50 USD/m ³
WP of Wheat	0.60 kg/m ³	0.33 USD/m ³
WP of Rice paddy	0.50 kg/m ³	0.10 USD/m ³

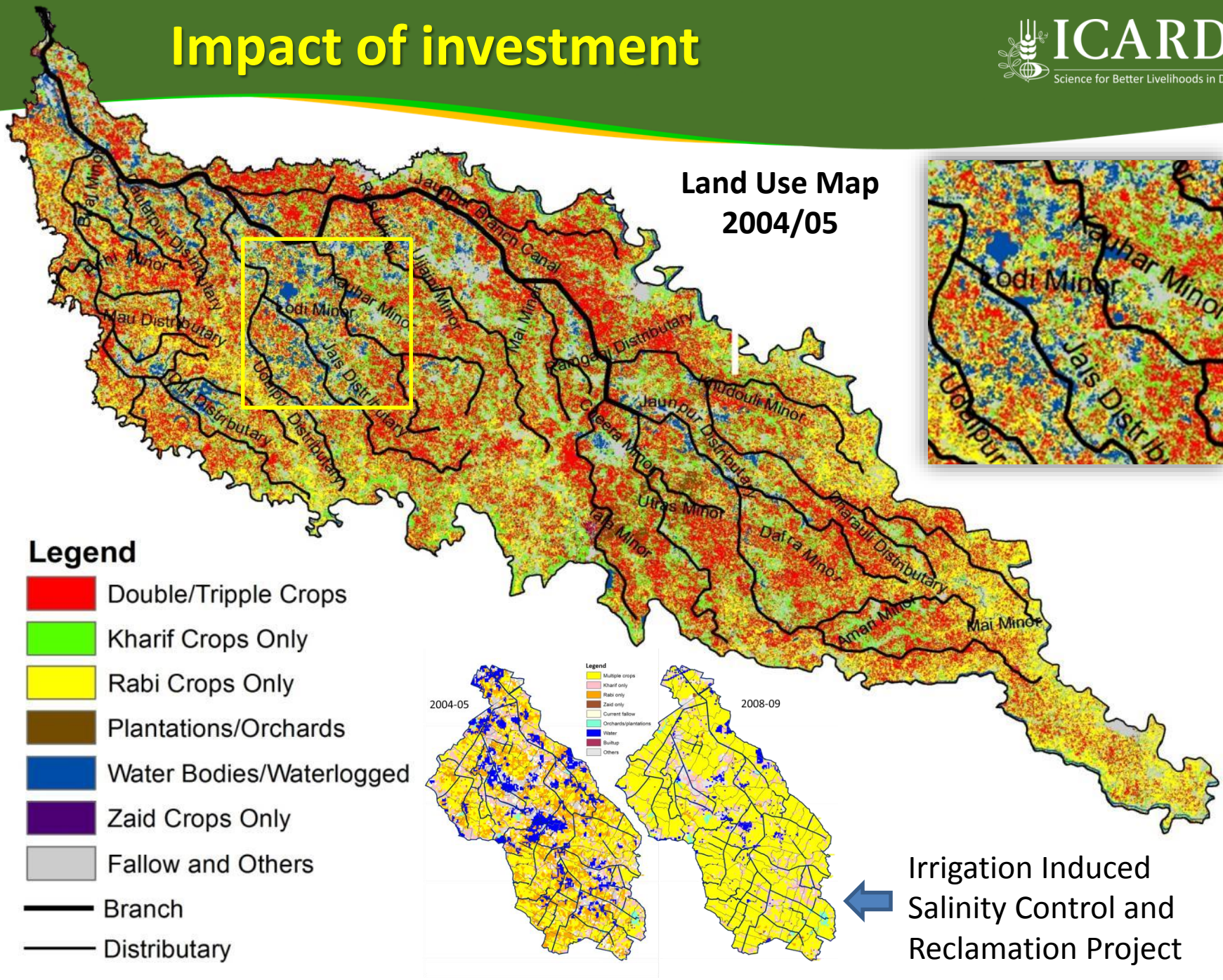


Dynamics of Degradation?

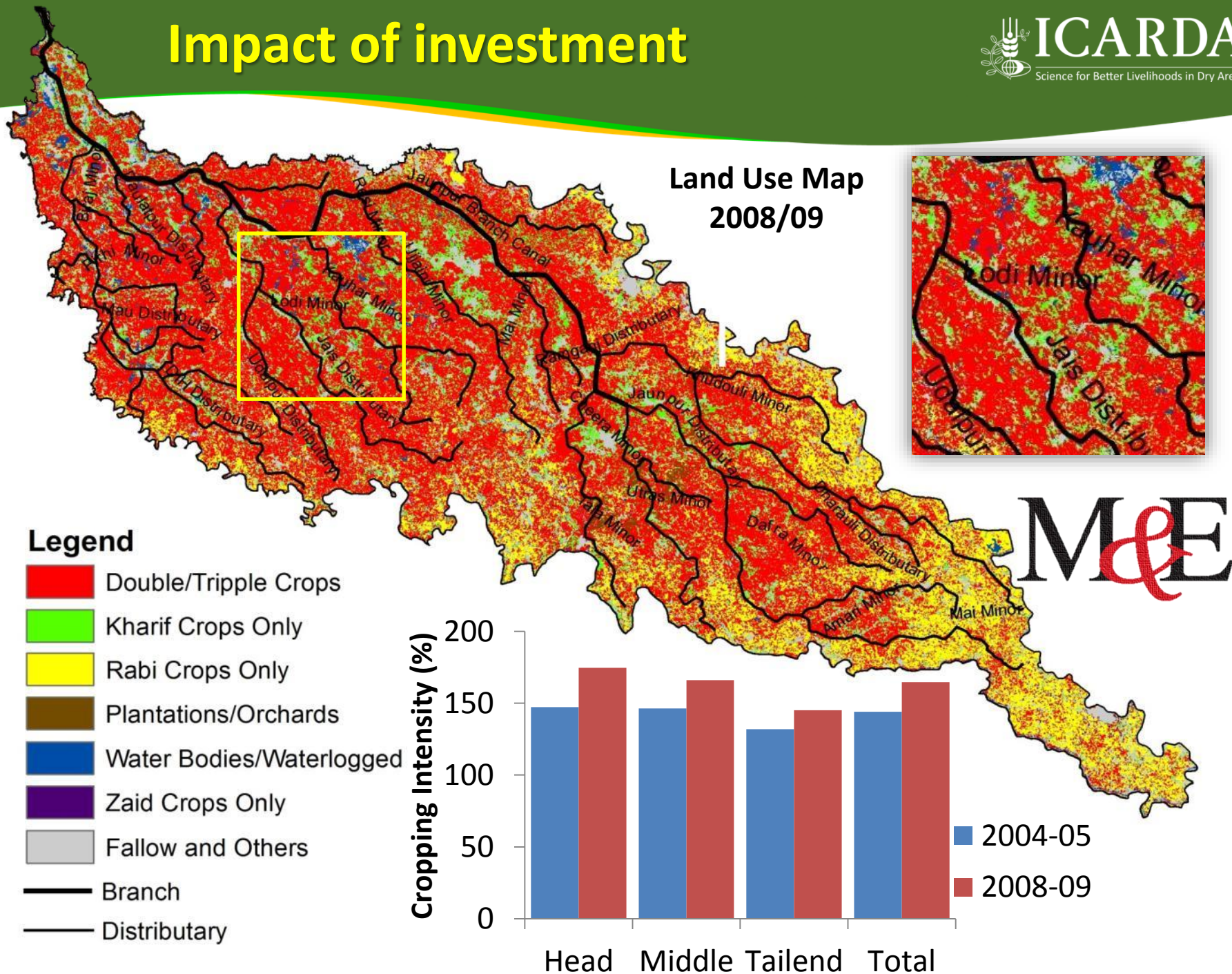
Inter and Intra Field Variability



Impact of investment



Impact of investment



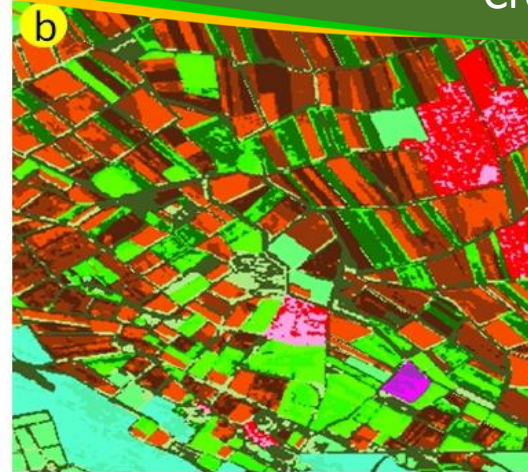
Mapping Agriculture: Scaling Trade-offs

Crop Types



- Cotton (low vegetation)
- Cotton (medium vegetation)
- Cotton (high vegetation)
- Rice paddy (low vegetation)
- Rice paddy (medium vegetation)
- Rice paddy (high vegetation)
- Fallow fields (sparse vegetation)
- Fallow fields (wet soil)
- Fallow fields (dry soil)
- Other LULC (Canals and Trees)
- Other LULC (Woody shrubs and grass)
- Other LULC (roads, bare soil)
- Home gardens and plantations)
- Home gardens and fallow)
- Home gardens and settlements
- Settlements and avenue trees
- Settlements and home gardens
- Settlements (mostly buildings)
- Abandoned (saline soils and halophytes)
- Abandoned (bare soil)

a. Quickbird 2.4m



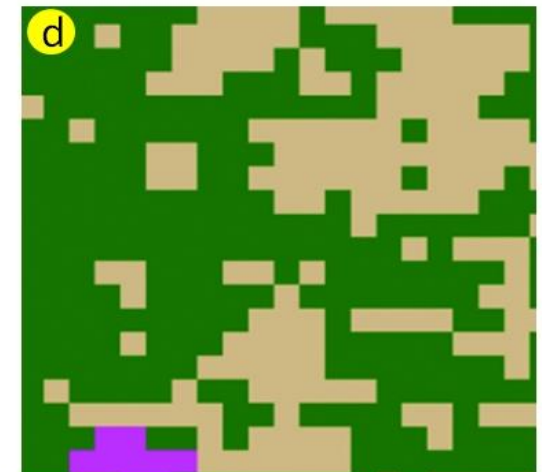
- Wheat (low vegetation)
- Wheat (medium vegetation)
- Wheat (high vegetation)
- Rice paddy (fallow)
- Fallow fields (sparse vegetation)
- Fallow fields (wet soil)
- Fallow fields (dry soil)
- Home gardens and plantations)
- Home gardens and fallow)
- Home gardens and settlements
- Other LULC (canals, tree and woods)
- Other LULC (grass, roads and bare soil)
- Settlements and avenue trees
- Settlements (mostly buildings)
- Abandoned (saline soils and halophytes)
- Abandoned (bare soil)

b. IRS P6 23.5m



- Cotton
- Rice paddy
- Fallow fields
- Other LULC and abandoned
- Settlements

c. MODIS 250m



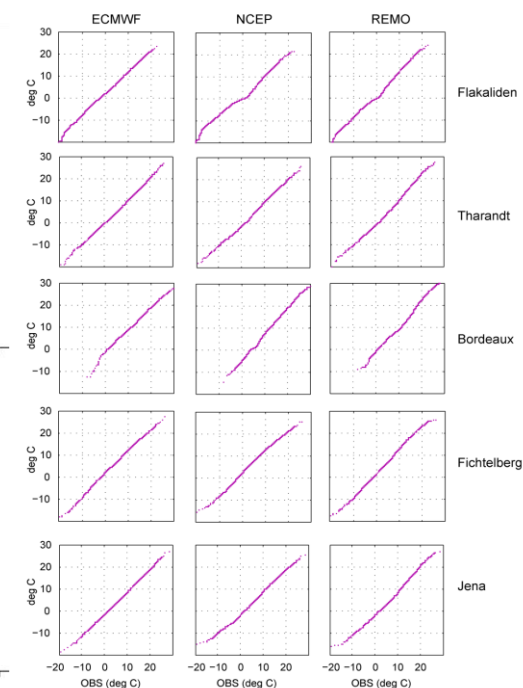
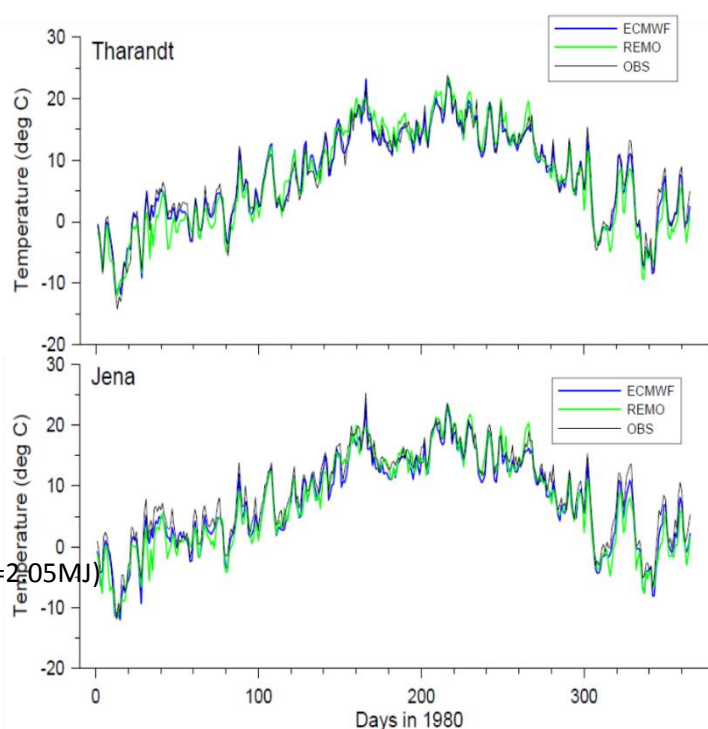
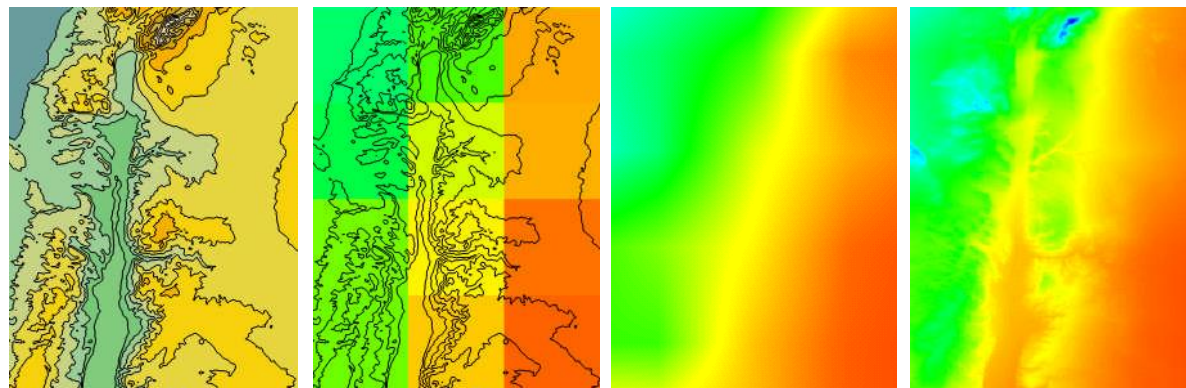
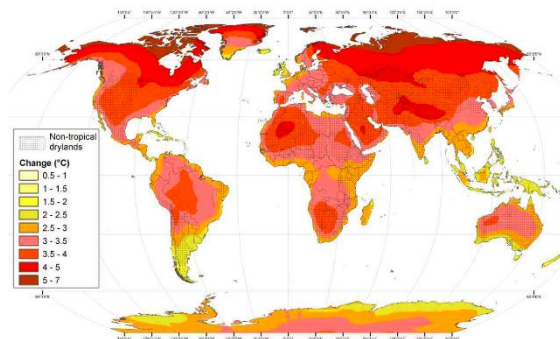
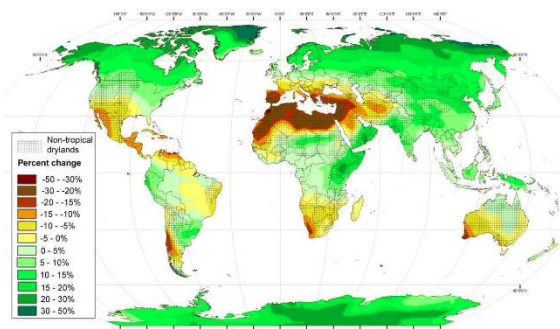
- Cotton
- Fallow fields and other LULC
- Abandoned and other LULC

d. MODIS 500m

What scale?

1979/2013 to 2080/2099

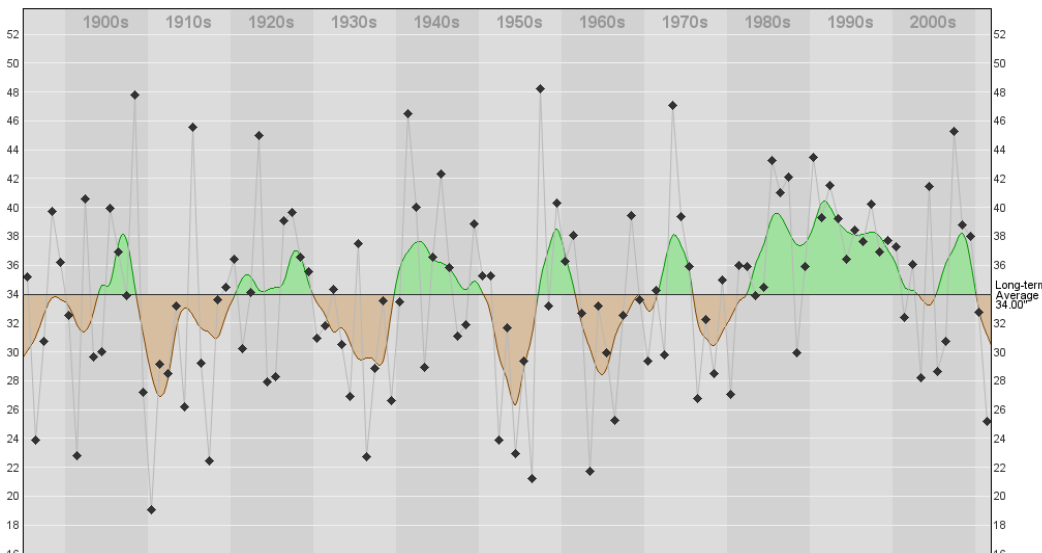
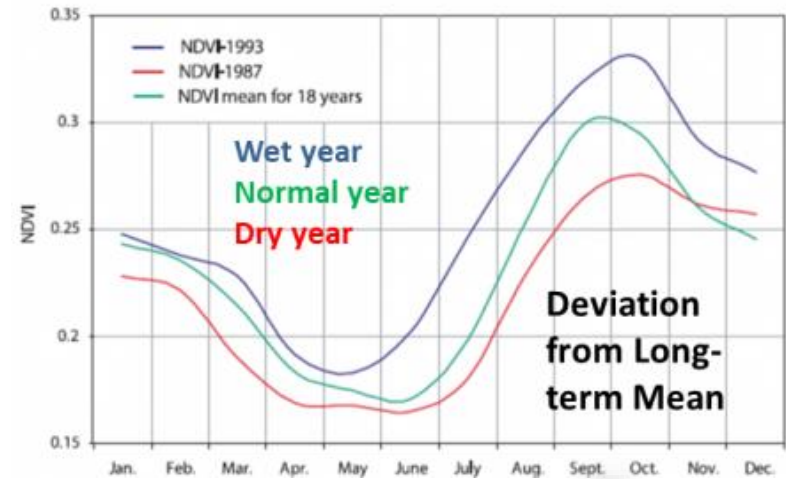
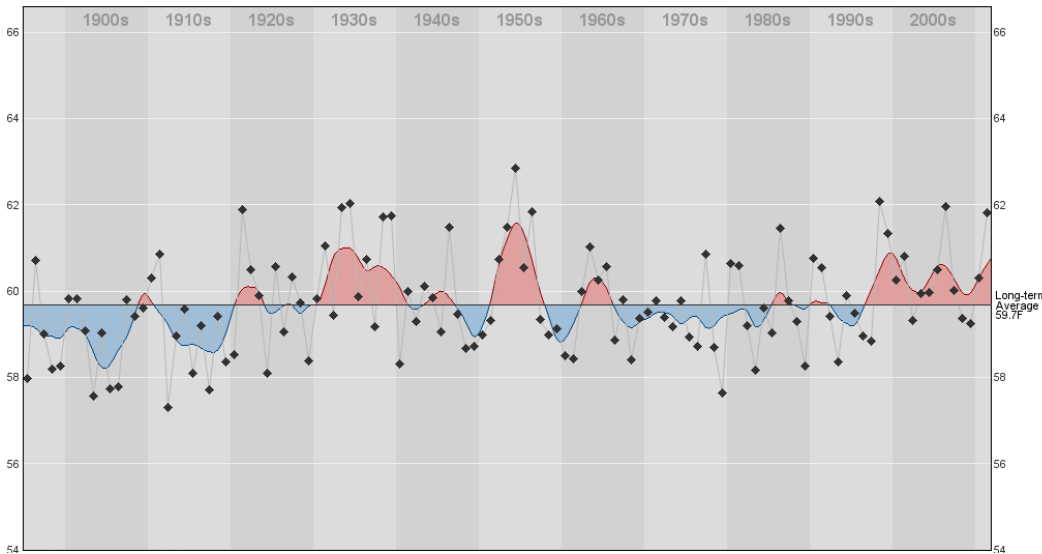
1km, Daily, 21 bioclimes



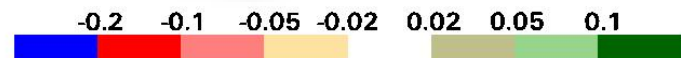
- tmax---maximum temperature at 2 meter (degC)
- tmin---minimum temperature at 2 meter (degC)
- precip---precipitation (mm)
- ABSH---absolute humidity(kg/m3 scaled by 106)
- RHY---ralative humidity(%)
- PAR---photosynthesis active radiation (mol PPFD=205MJ)
- uwind---wind at east-west direction(m/s)
- vwind---wind at north-south direction(m/s)
- VPD---vapor pressure deficit(Pa)

Climate Extremes

National to Local Scale

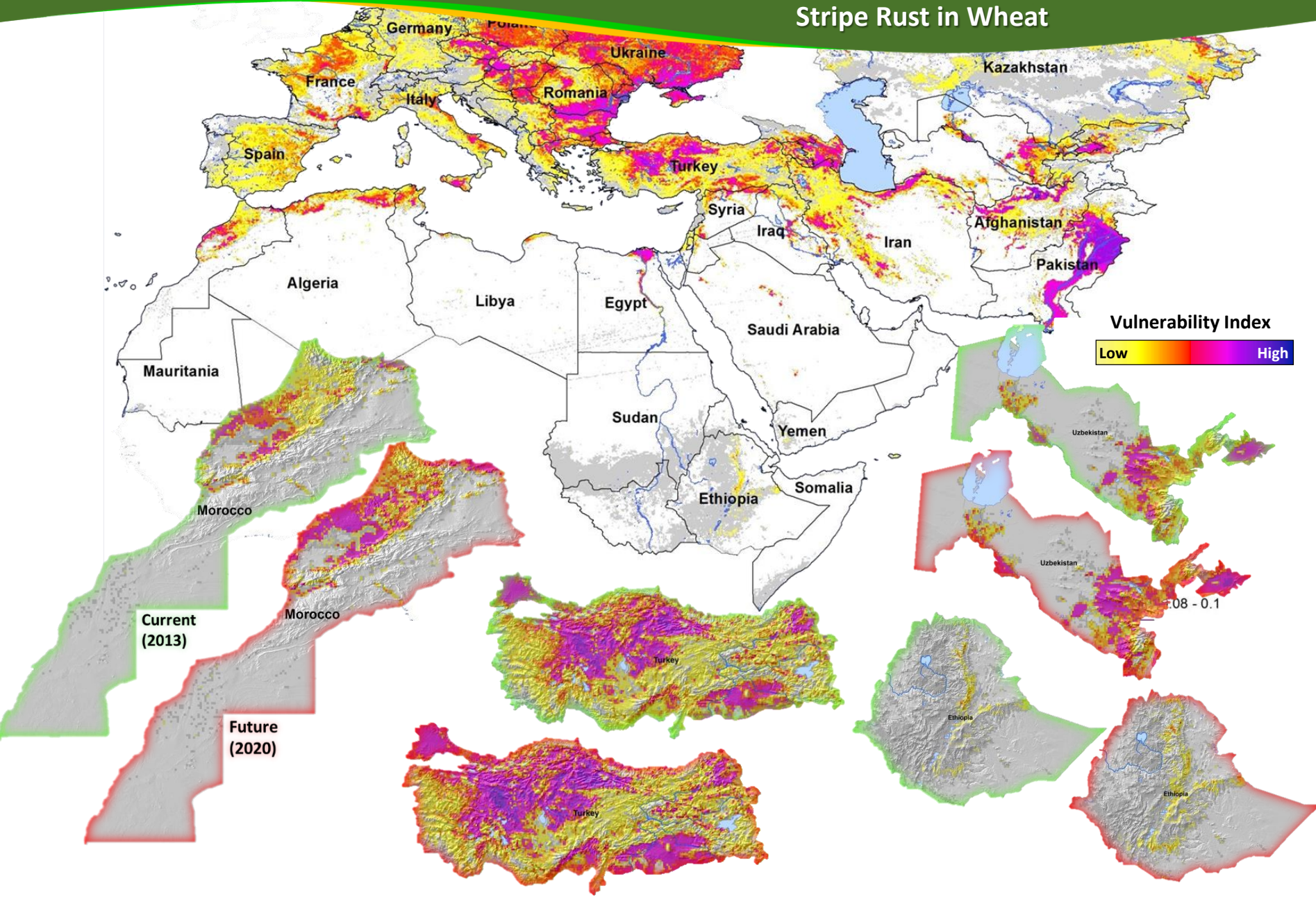


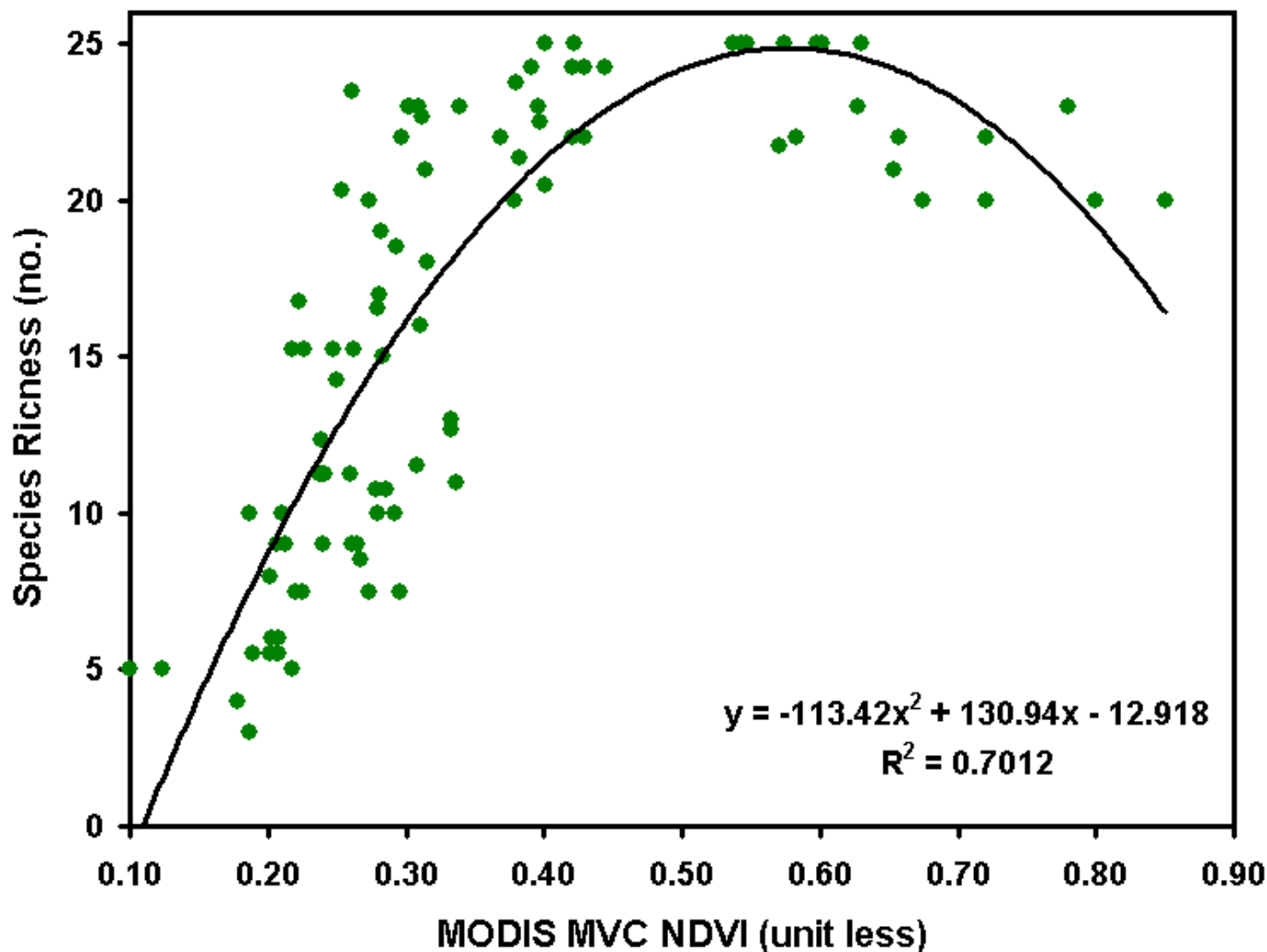
Climate
Deviation
from long-
term mean



Mapping Pest & Disease Risk

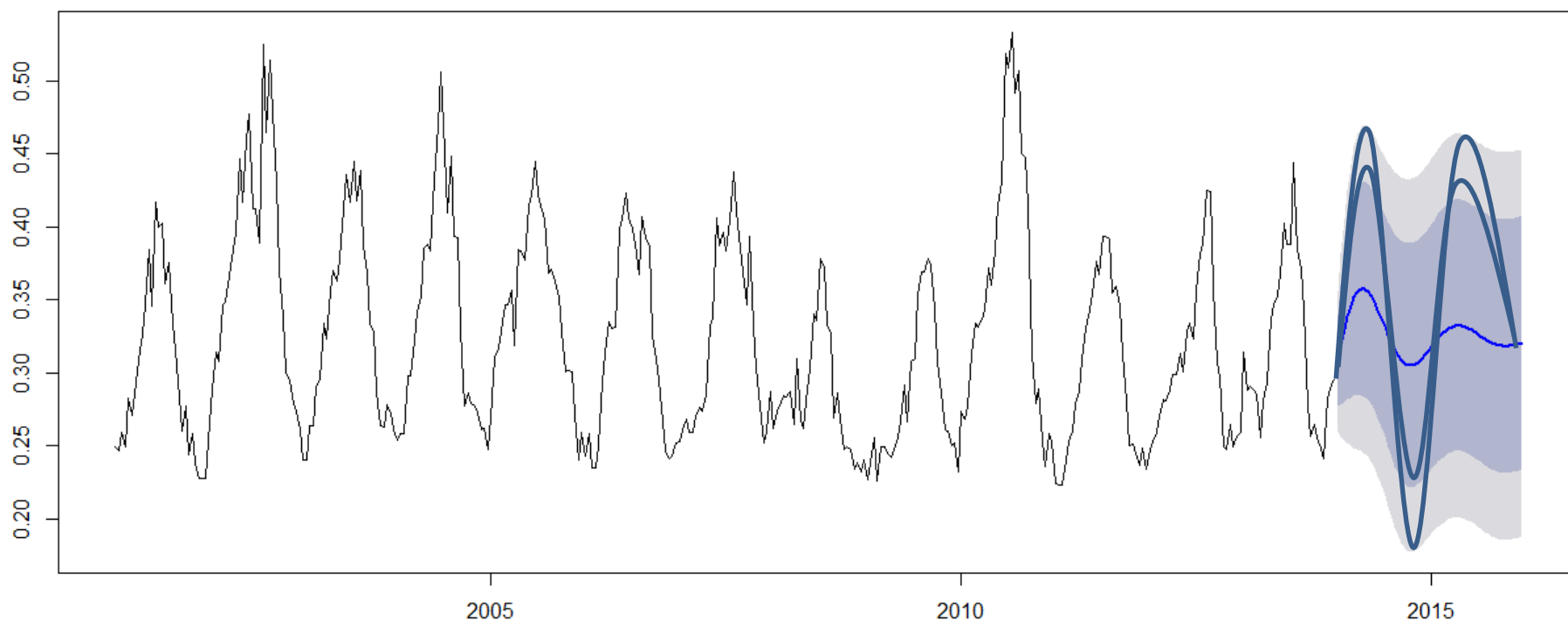
Stripe Rust in Wheat





ARIMA (Autoregressive Integrated Moving Average) model analysis for the period of 2000 to 2013 to forecast

Forecasts from ARIMA(2,0,2) with non-zero mean



<i>Variable</i>	<i>Definition</i>	<i>Spatial distribution</i>	<i>Source/Derivatives</i>
ALS	CRP-DS's ALS types	Pixel explicit	Major ALS: Irrigated, Rainfed, and Agro-pastoral
DRYLANDS	aridity index and drylands	Pixel explicit	ICARDA
CROPLANDS	Croplands probability	Pixel explicit	From MODIS
GPP/NPP	VPM Simulation	Pixel explicit	From MODIS and Climate Data
MARGINAL	Marginal lands	Pixel explicit	GMIA, GMRCA, IASSA, FAO
YIELD GAPS	Ratio Actual/Potential	Pixel explicit	IASSA, FAO, ICARDA*
FIGS	Accessions	Pixel explicit	ICARDA
CLIMATE-TREND	Long-term trends and bioclimatic variables	Pixel explicit	ECMWF and CRU
VEGETATION TREND	Long-term trends and deviations	Pixel explicit	From MODIS and AVHRR
BROAD-COVER	Broad class of land cover	Pixel explicit	Different sources available, but aggregated categories
PHENOLOGY	Start and End of Season, LGP, Crop Int., etc.	Pixel explicit	From MODIS time series
TREE-COVER	Tree density	Pixel explicit	MODIS-based and AVHRR-based
SLOPE	Surface slope (degree)	Pixel explicit	Calculated from SRTM 90m
SOIL-CONST.	Soil combined quality	Pixel explicit	From FAO-IIASA GAEZ 2008
DIST-ROAD	Distance to main road (km)	Pixel explicit	From global road network to generate
DIST-TOWN	Distance to district capital (km)	Pixel explicit	Use global settlement points
WATER- PROXIMITY	Proximity to water body (m)	Pixel explicit	Calculated from global water resource
POPULATION	Density, Urban/Rural, Male/Female, Age Group, Change,	Pixel explicit	From CIESIN datasets
GDP-CAPITA	Average GDP per capita	Pixel explicit	Gridding based on WB and CIESIN
GDP-GROWTH	Mean growth rate of annual GDP during period	Pixel explicit	Gridding based on WB and CIESIN
POVERTY	Poverty index	Nation/pixel explicit	Derived from WB and CIESIN
AGRI POVERTY	Ag resource poverty	Pixel explicit	ICARDA
PER CAPITA WATER	Green and blue water per person	Pixel explicit	ICARDA
WUE in Drylands	Water use efficiency	Pixel explicit	ICARDA*
SIMILARITY	Matching factor for outscalling	Pixel explicit	ICARDA*

Innovation Platforms

Package of Practices

Improved Crop Varieties

Integrated Pest & Disease Management

Increased Land & Water Productivity

Livestock Production Systems

Better Cropping Systems

Viable Agronomic Practices

Multi-purpose Tree/Orchard Systems

Socio-Economic Integrity Index)

Profitable Market Value Chains & Trade

Biodiversity and Crop Improvement

Land and Water Resources

Crop and Livestock Productions

Socio-Economics, Markets and Policy

Integrated Agricultural Production Systems Approach

Multicriteria Geospatial Analysis

Layers of Package of Practices

Land Use and Land Cover Types

Crop Types, Pattern & Intensity

Terrain Complexity & Adaphic Profiles

Expert Knowledge Base Systems

Climate Events & Trajectories

Land Tenure & Parcel Matrix

Location Based Service & Network Analysis

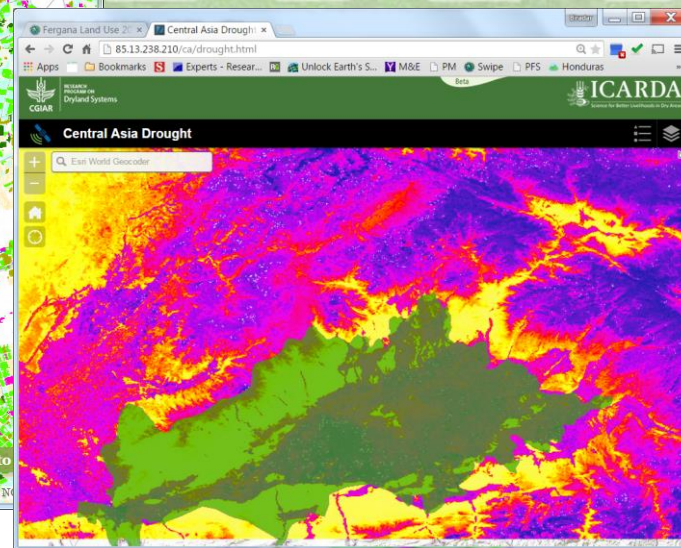
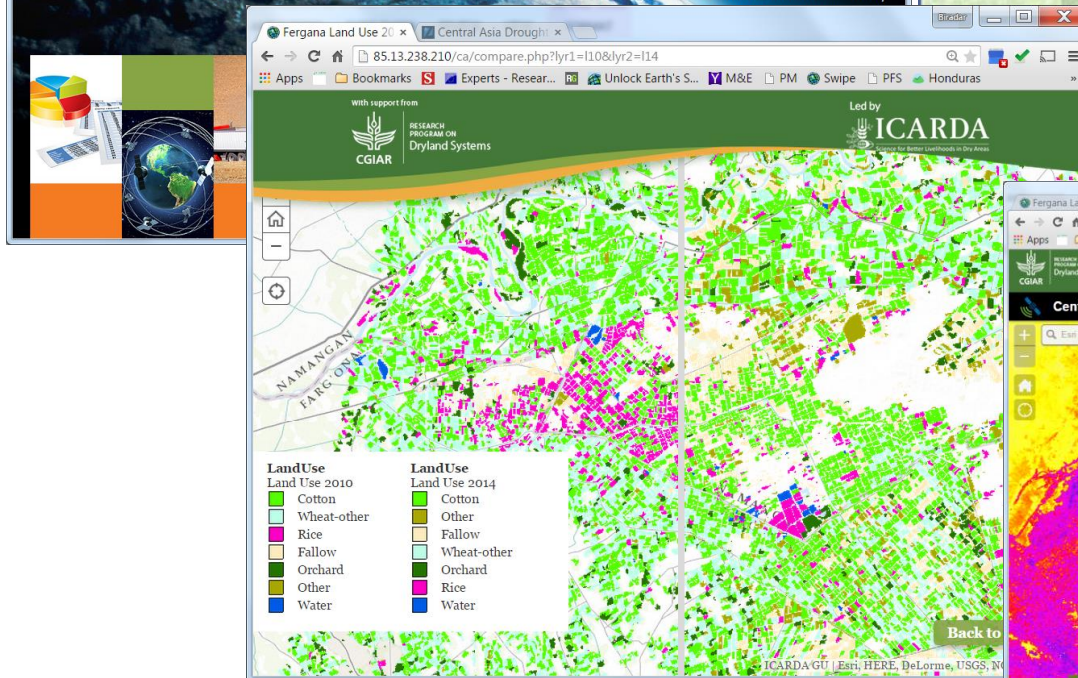
Land Suitability & Adoption Options

Socio-economy and demographic pattern

Priority Areas for Better Interventions

Out and Up-scaling (Target Areas)

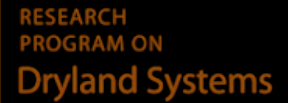
M&E
Impact Assessment (Ex-ante)





Irrigated

Thank You



c.biradar@cgiar.org

