# Cities from space: new portraits of the global urban fabric

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Center for Sustainability and the Global Environment (SAGE) University of Wisconsin-Madison

#### Main Questions

Which urban map is most accurate?

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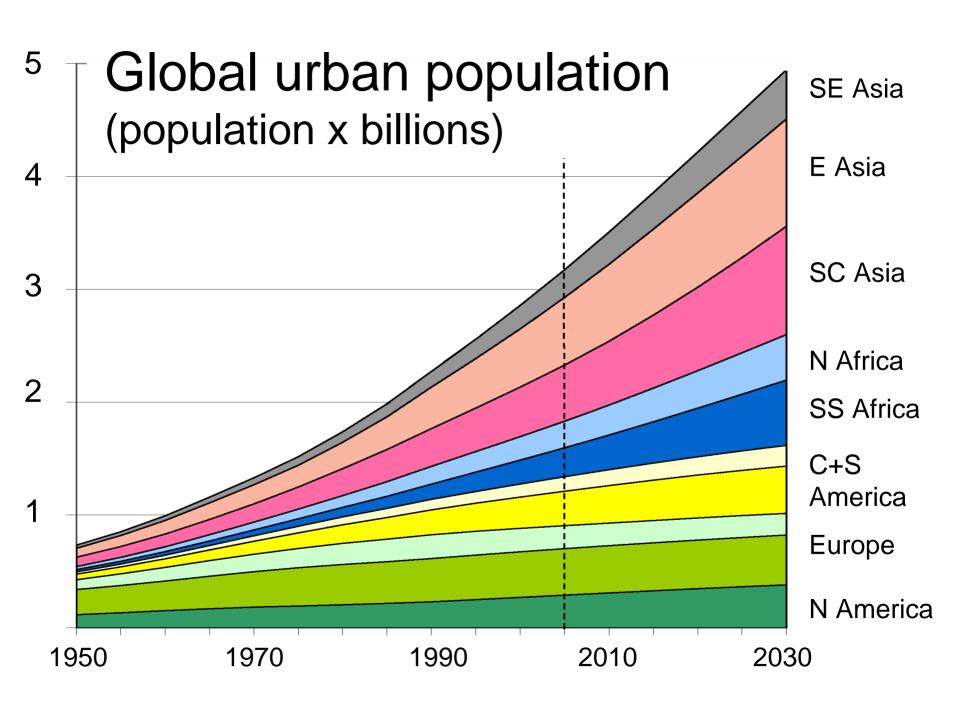
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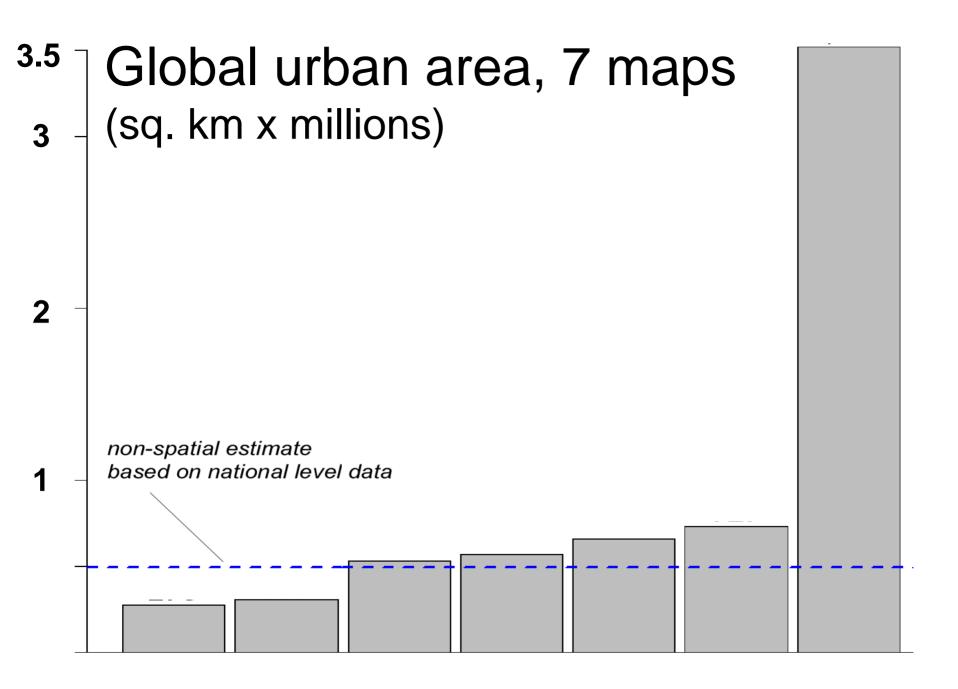
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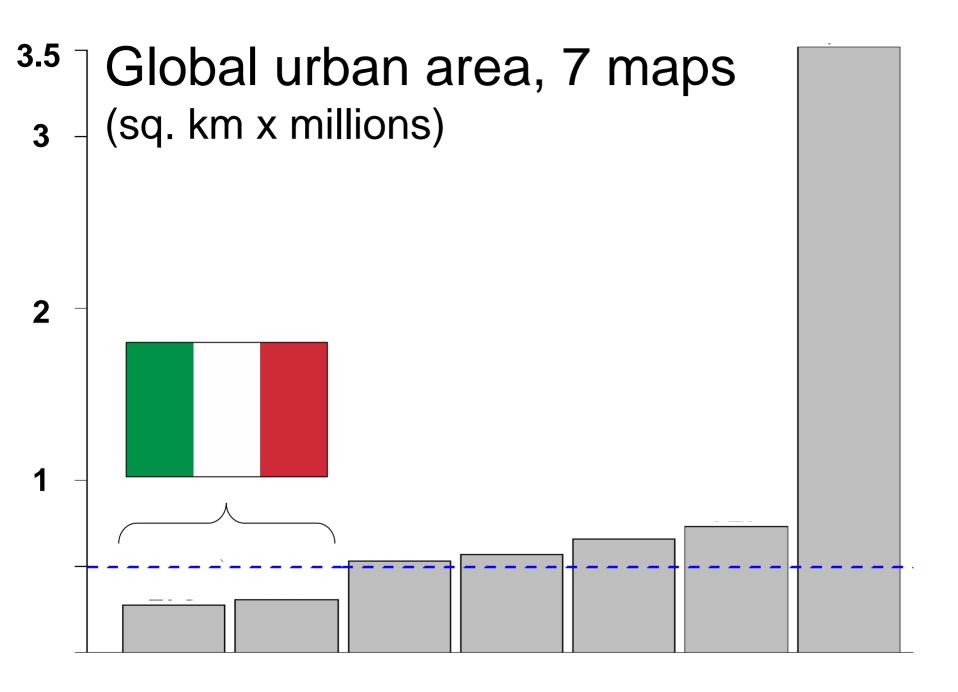
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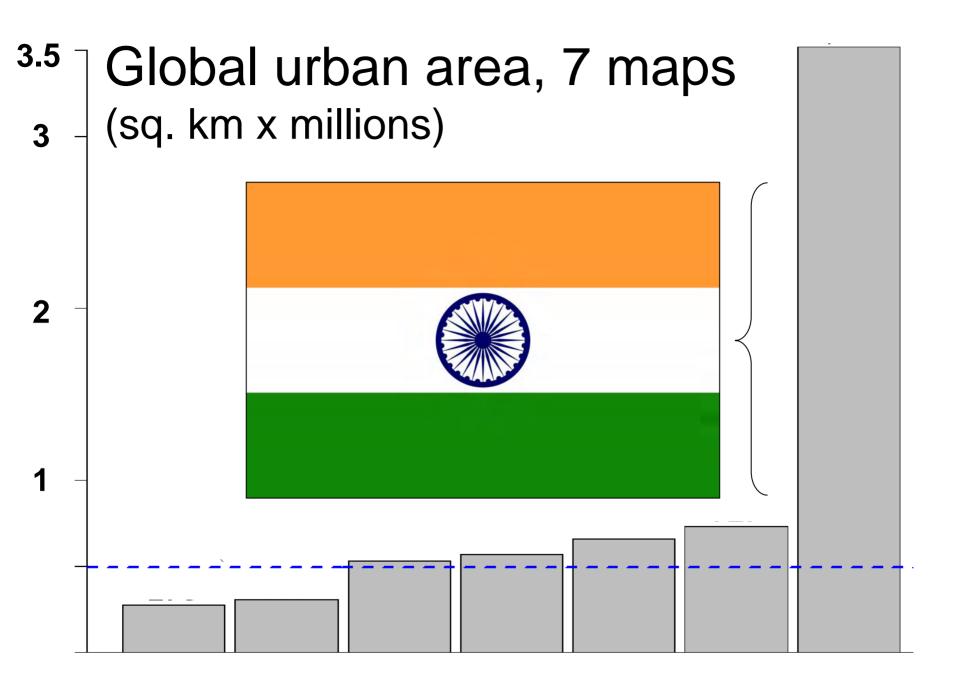
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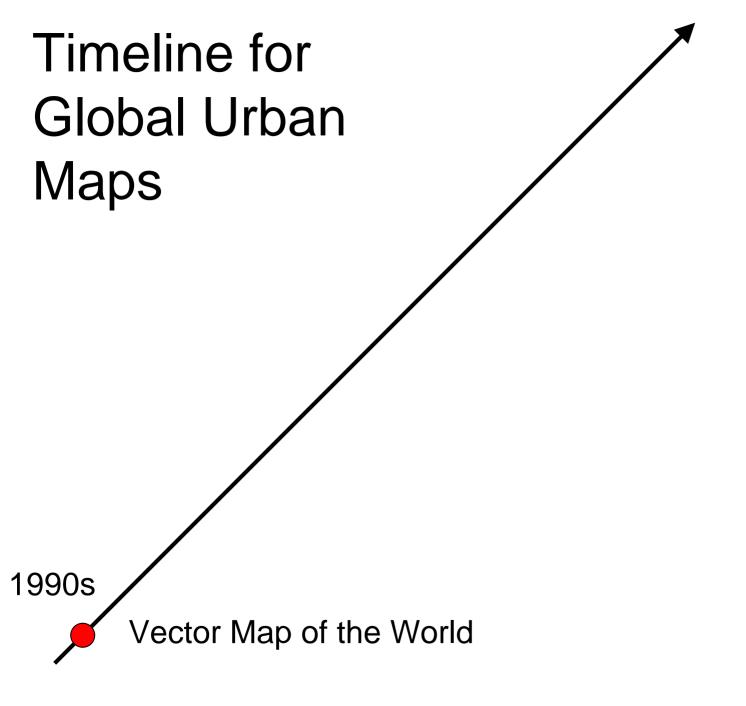


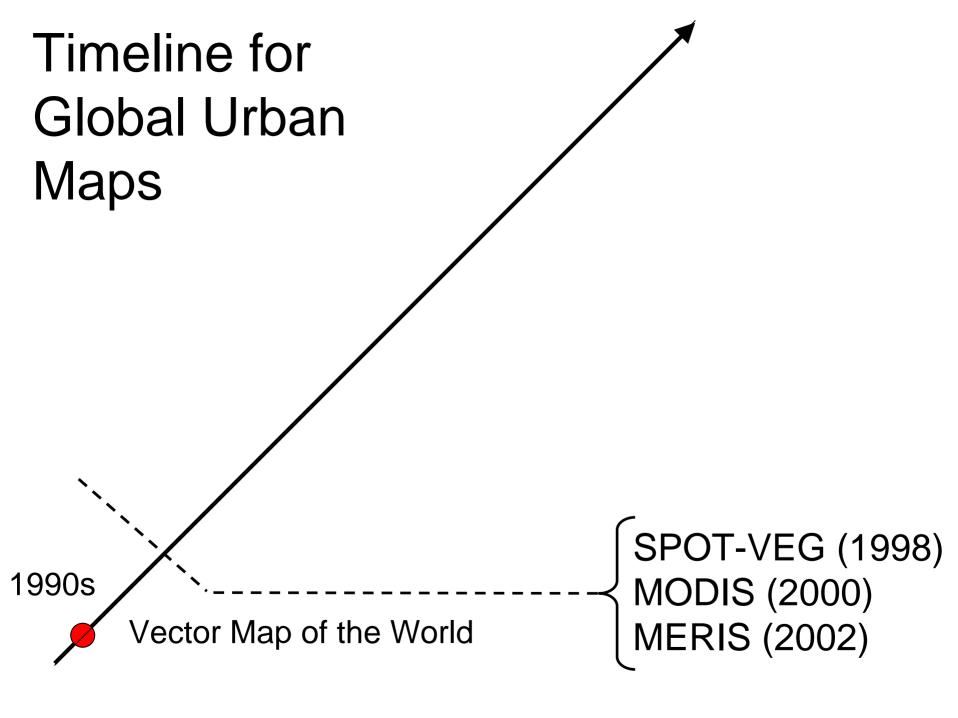
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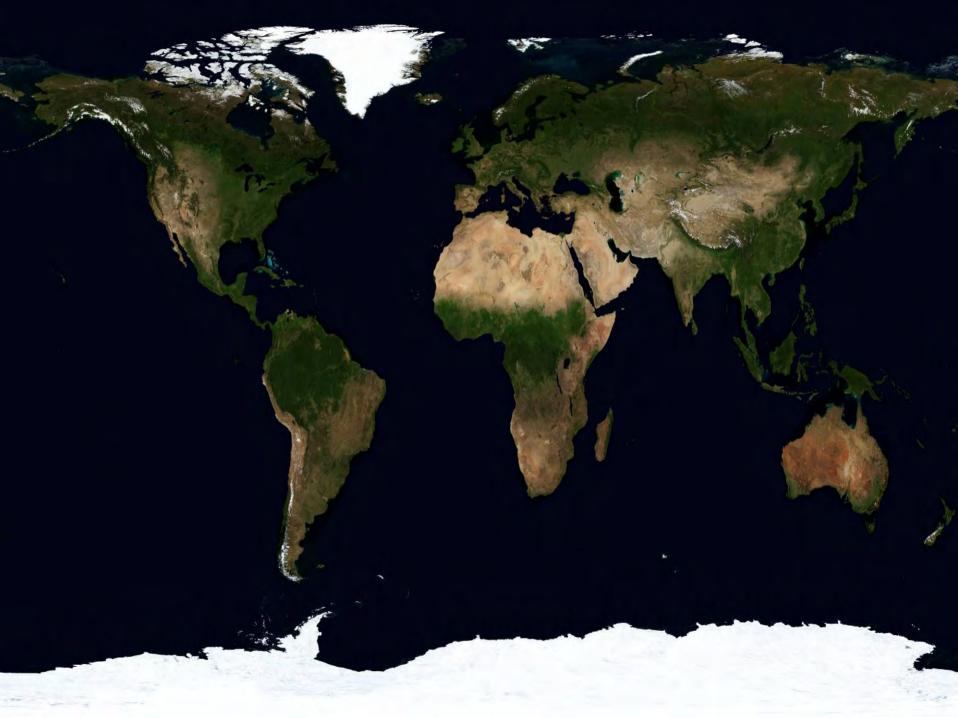
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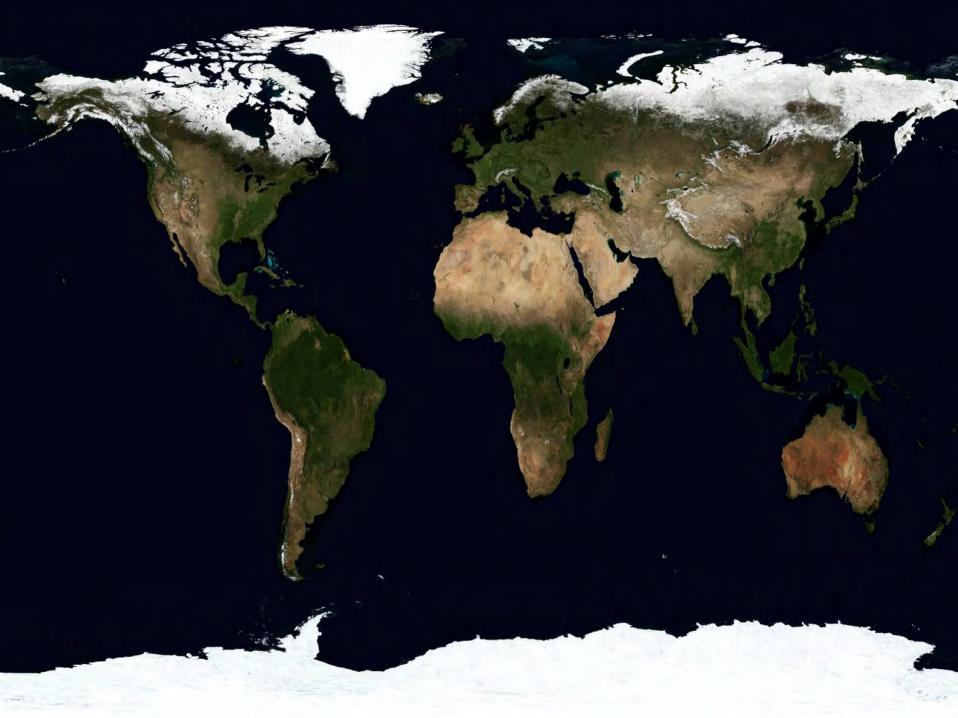
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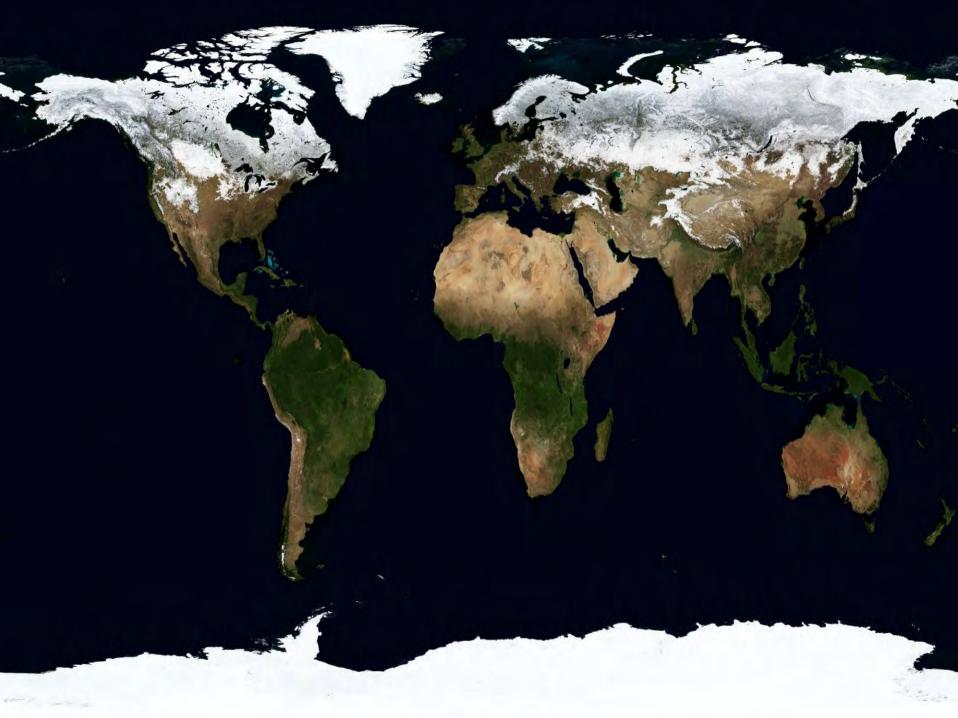


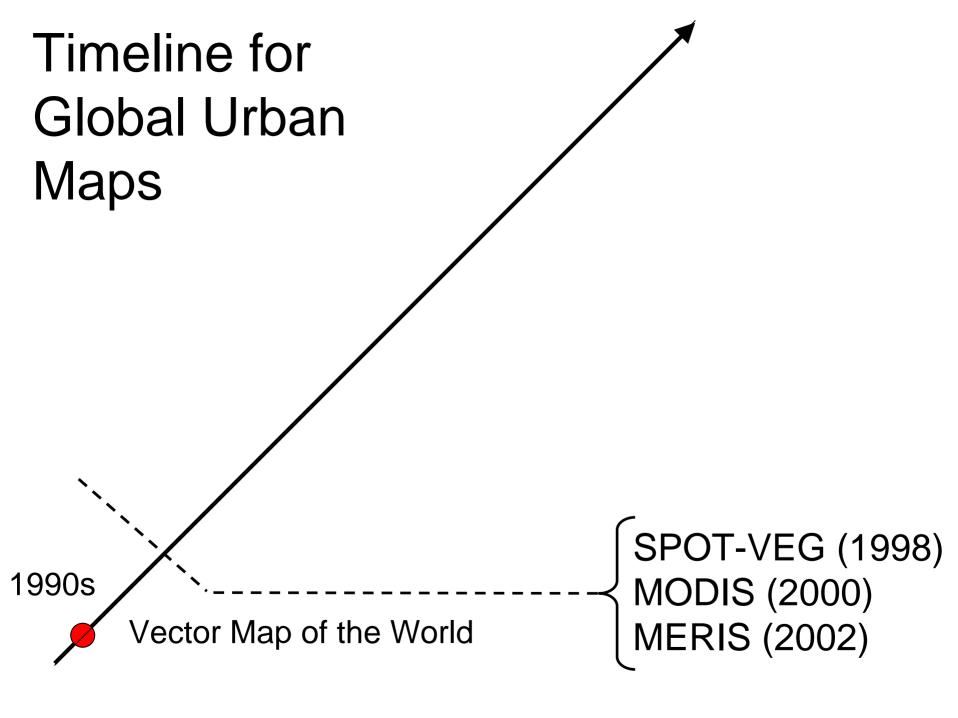


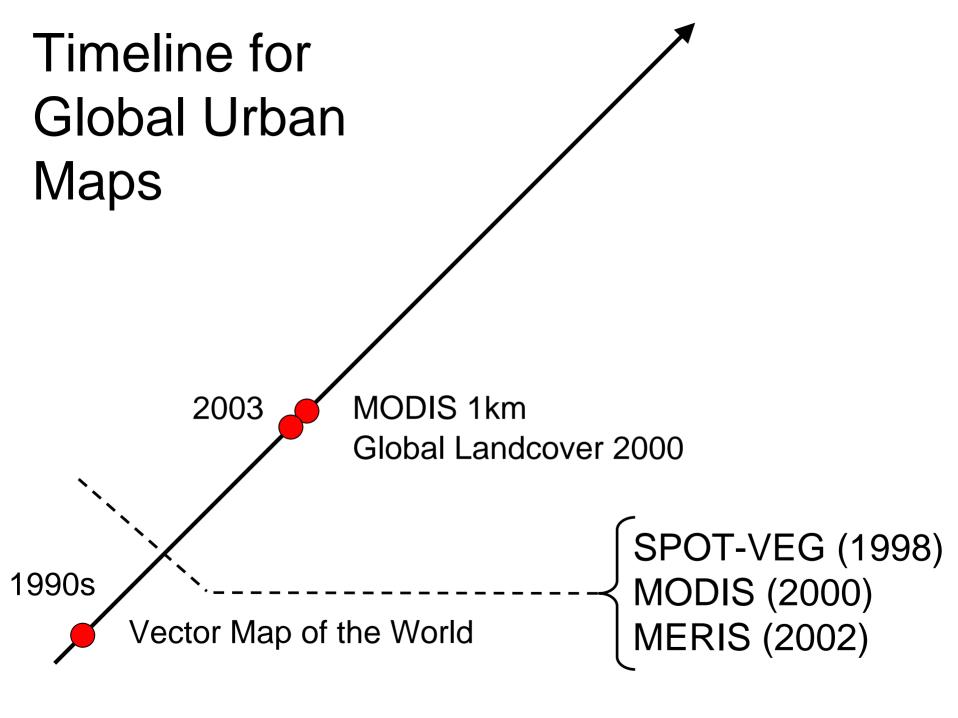


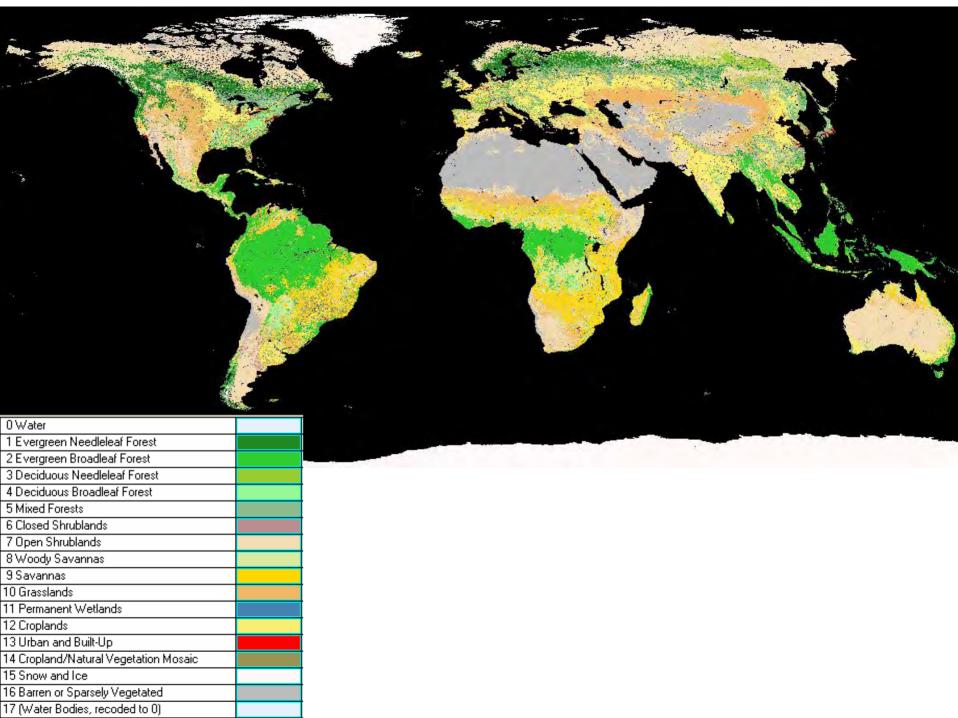


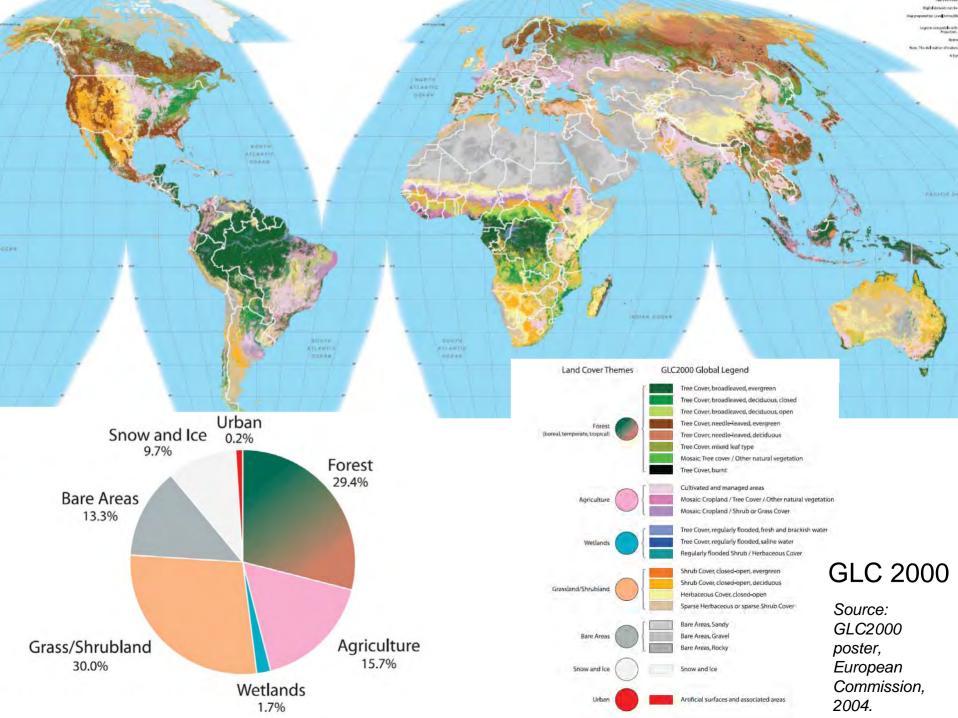


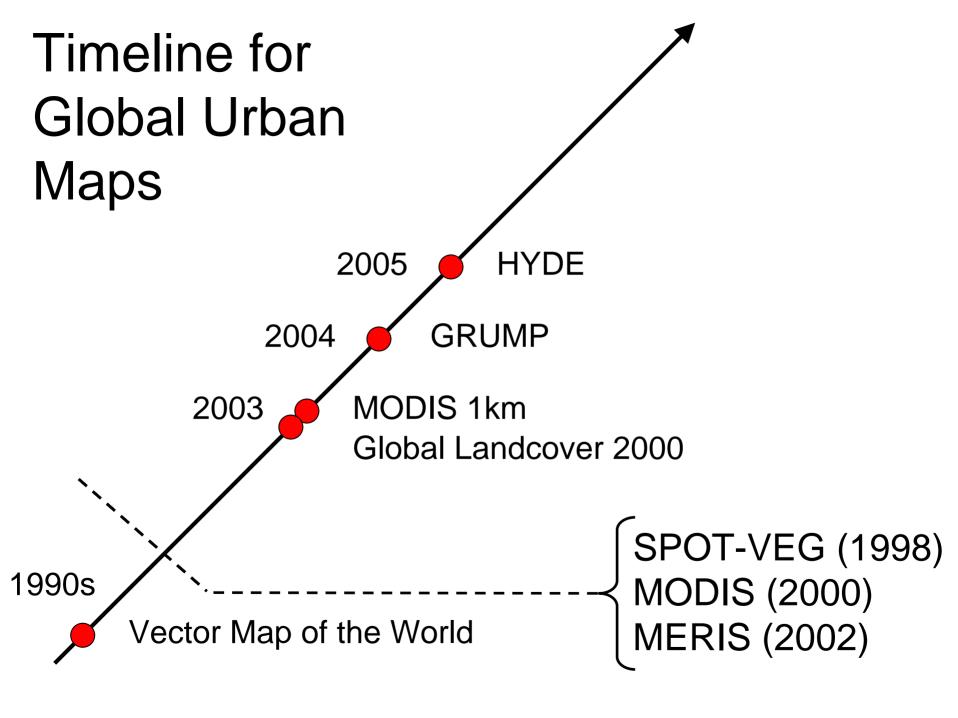


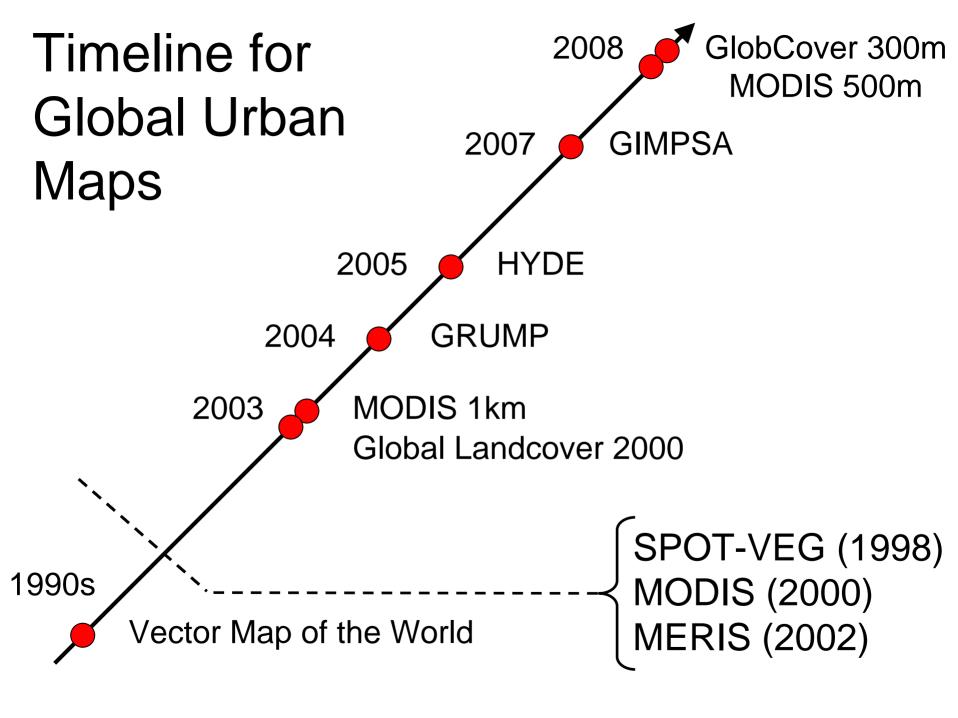


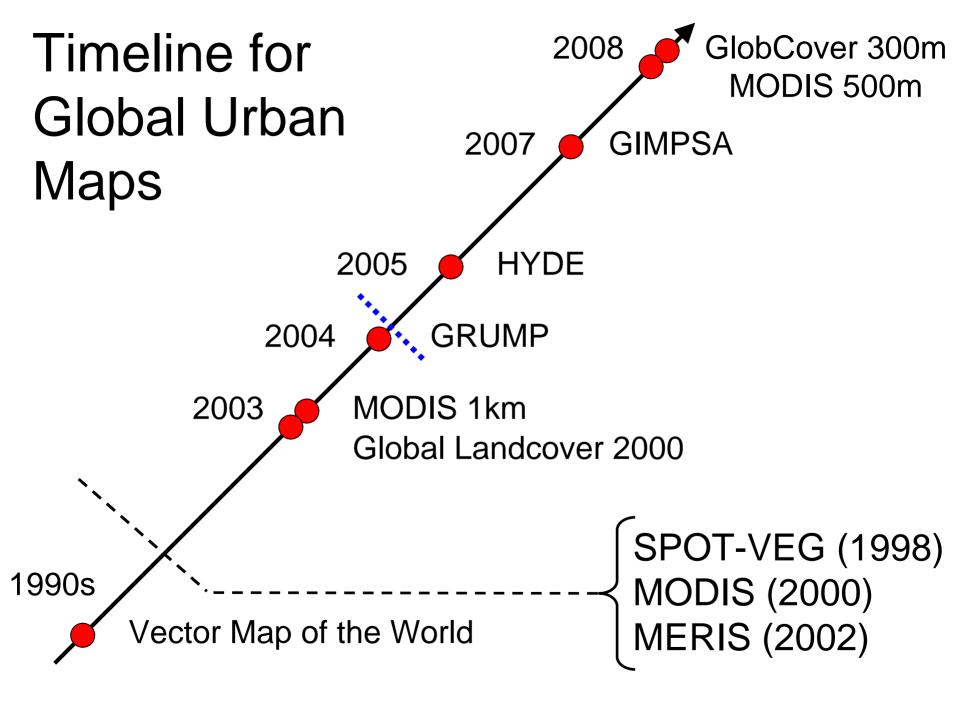


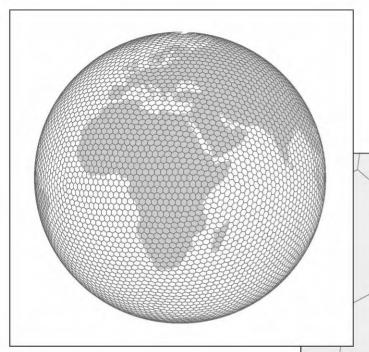




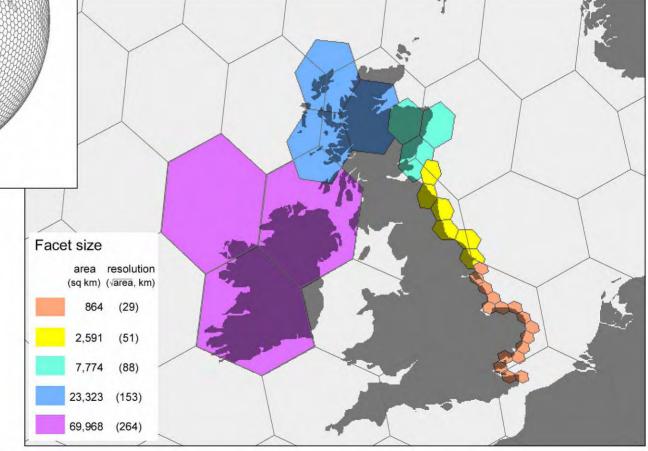




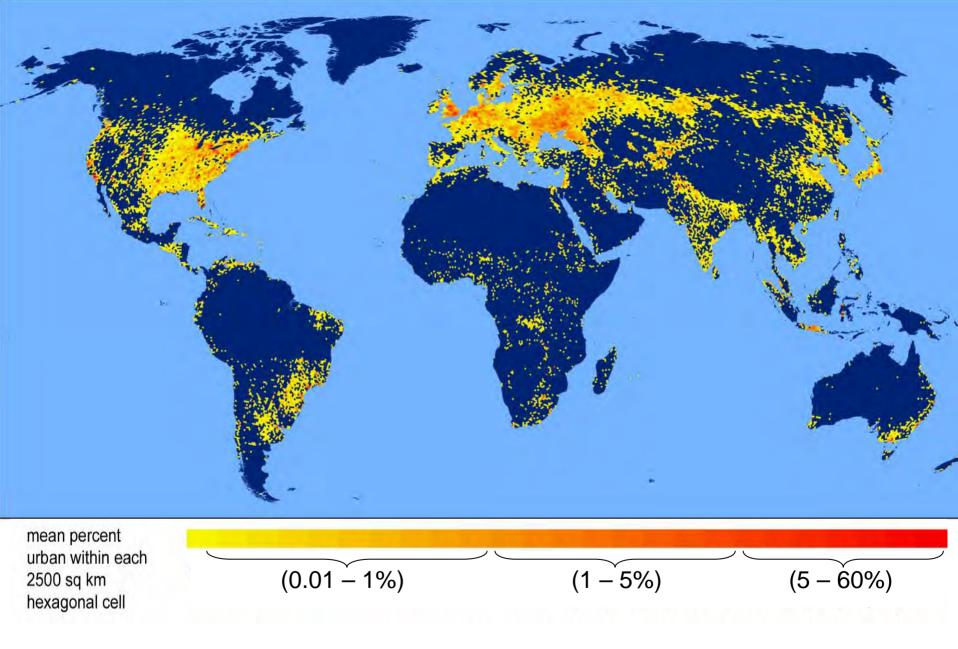




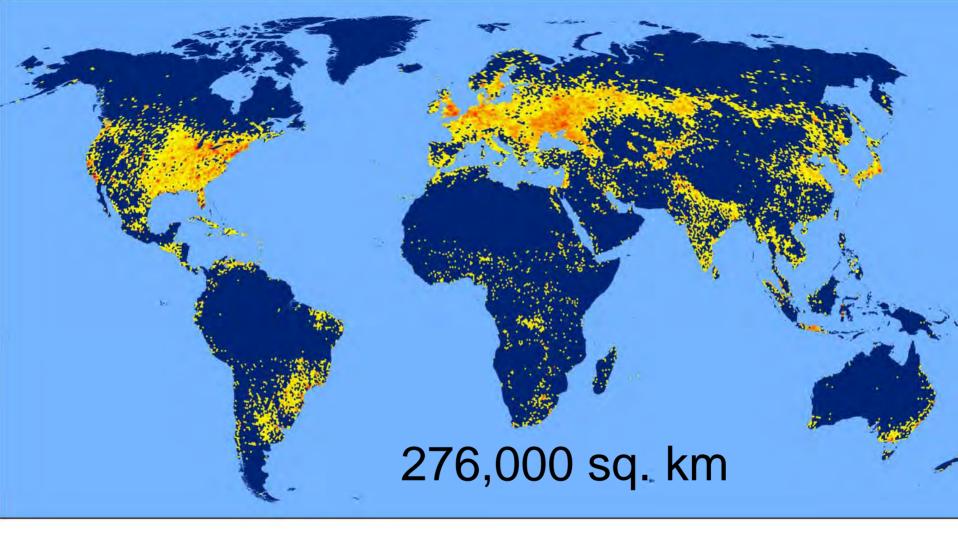
# Map visualization with Discrete Global Grids



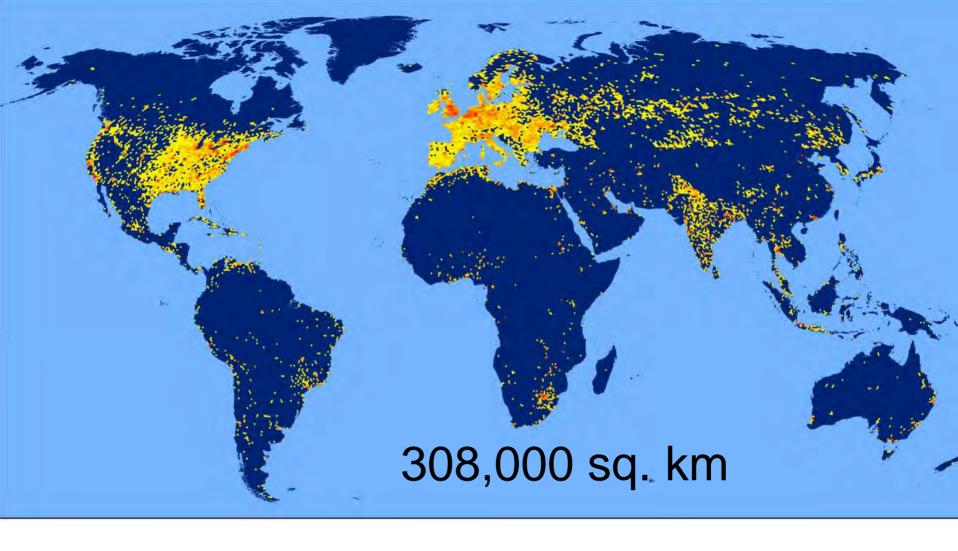
Sahr *et al.*, 2003. Birch *et al.*, 2007.



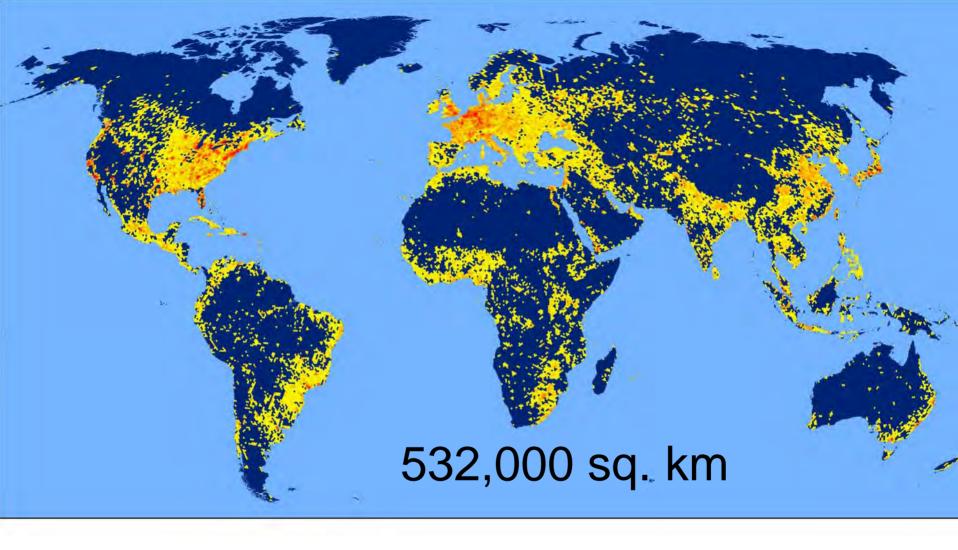
Potere and Schneider, 2008.



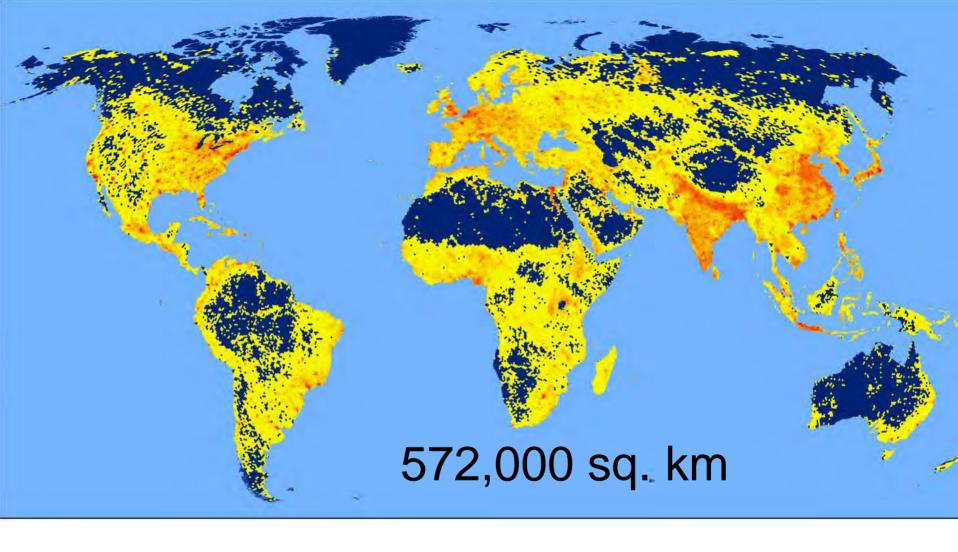
#### Vector Map Level Zero



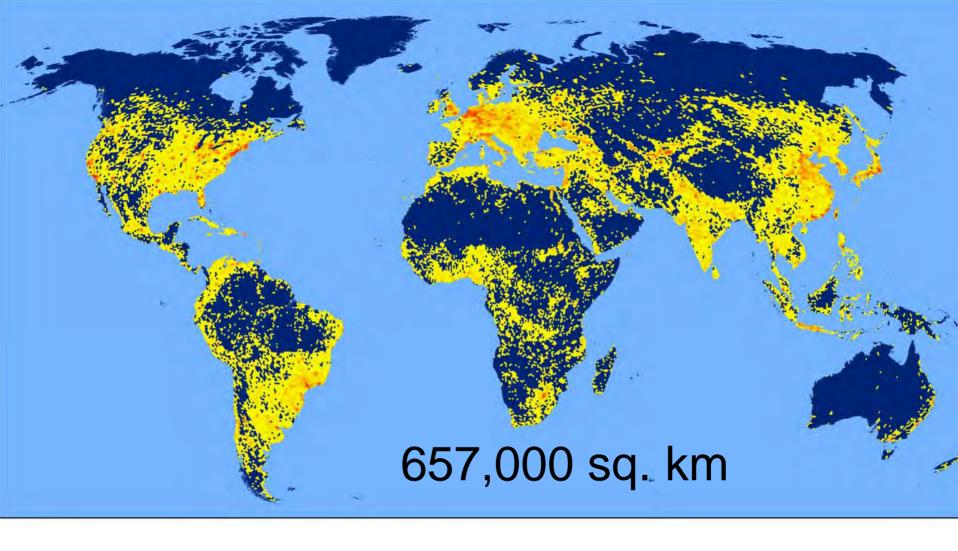
#### Global Landcover 2000



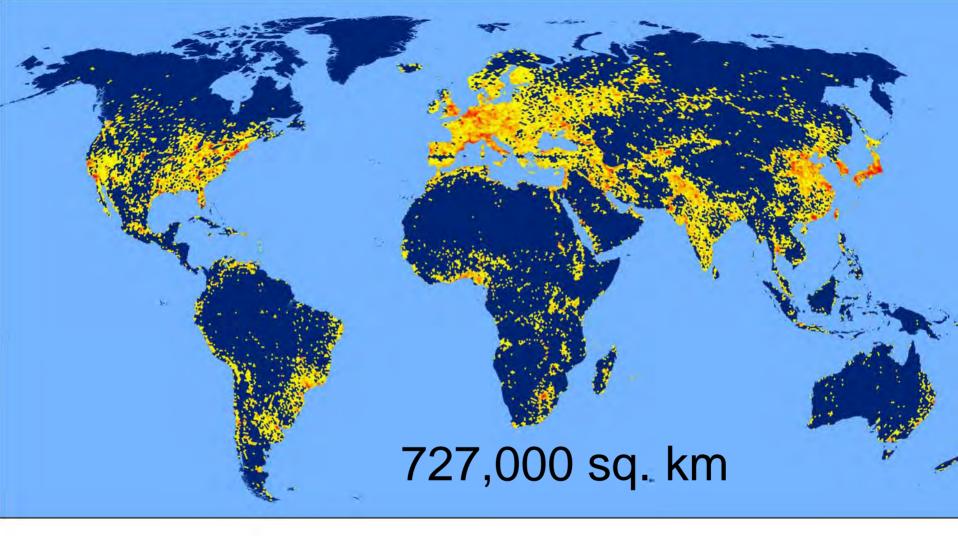
# History Database of the Global Environment v3



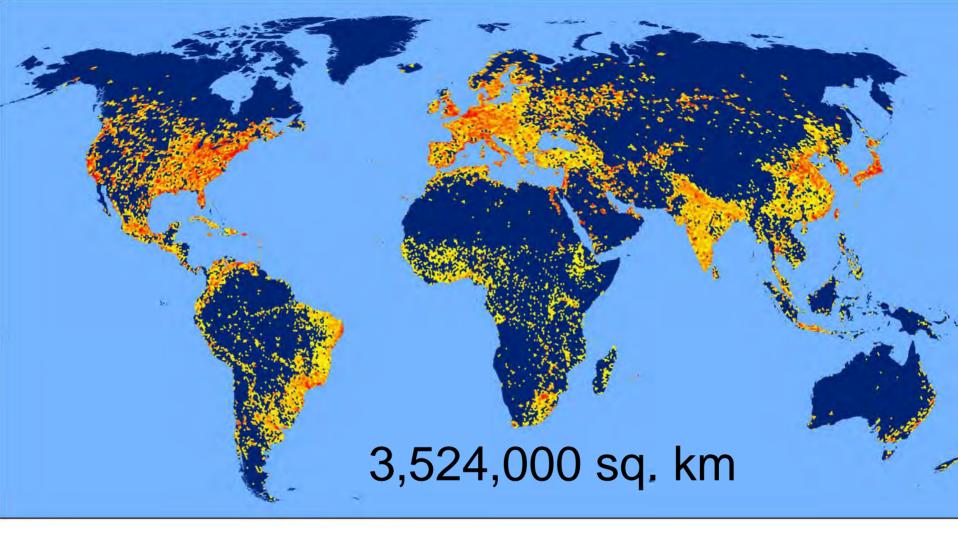
### Global Impervious Surface Area



#### MODIS 500m urban



#### MODIS 1km urban



# Global Rural Urban Mapping Project (GRUMP)

### Choosing a global urban map

Global scope
Adequate spatial resolution (500 m – 1 km)
Current (circa-2000)

### Choosing a global urban map

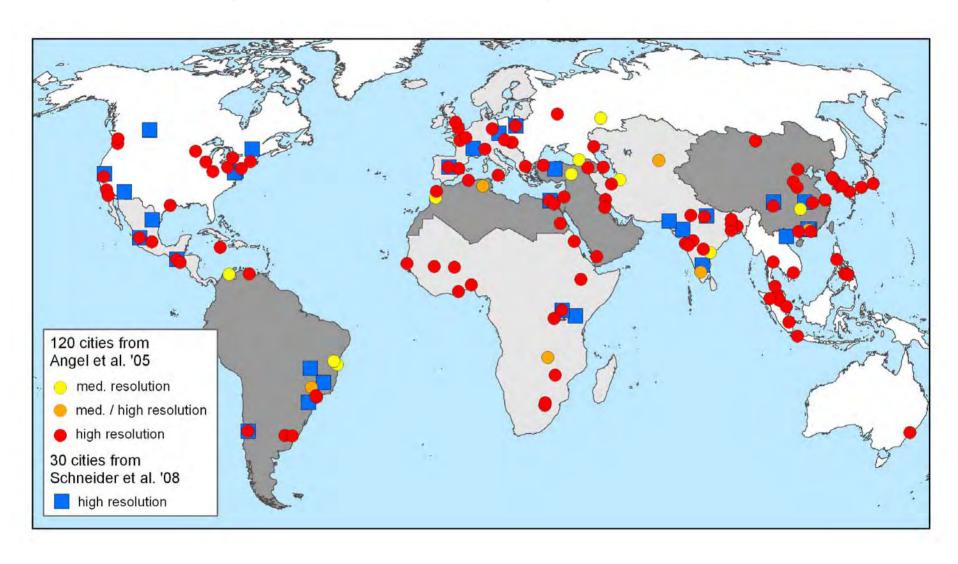
Global scope

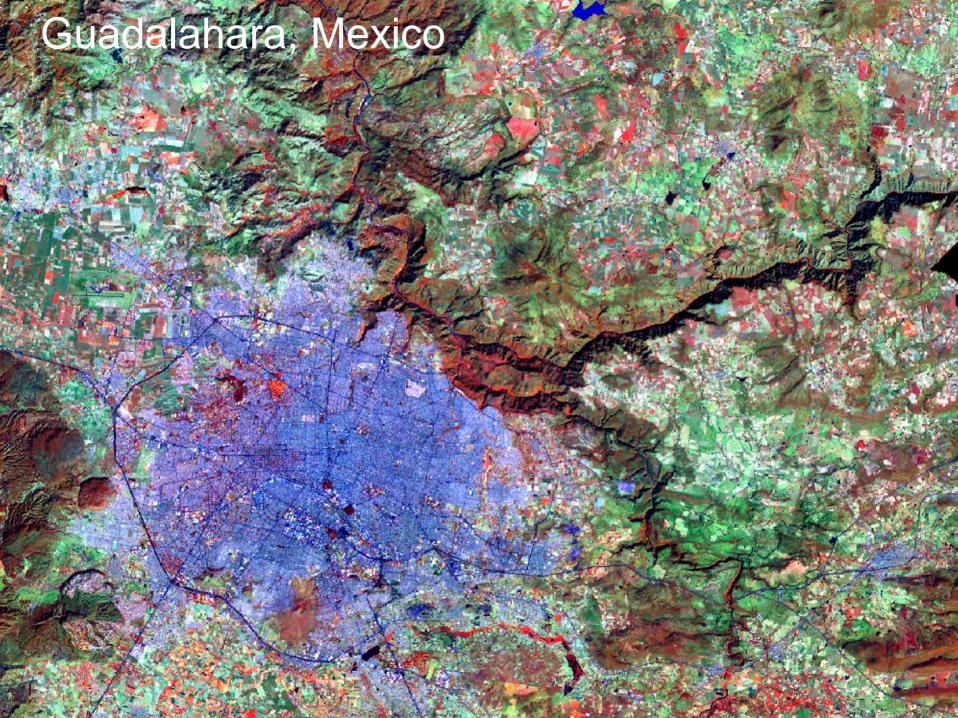
Adequate spatial resolution (500 m – 1 km) Current (circa-2000)

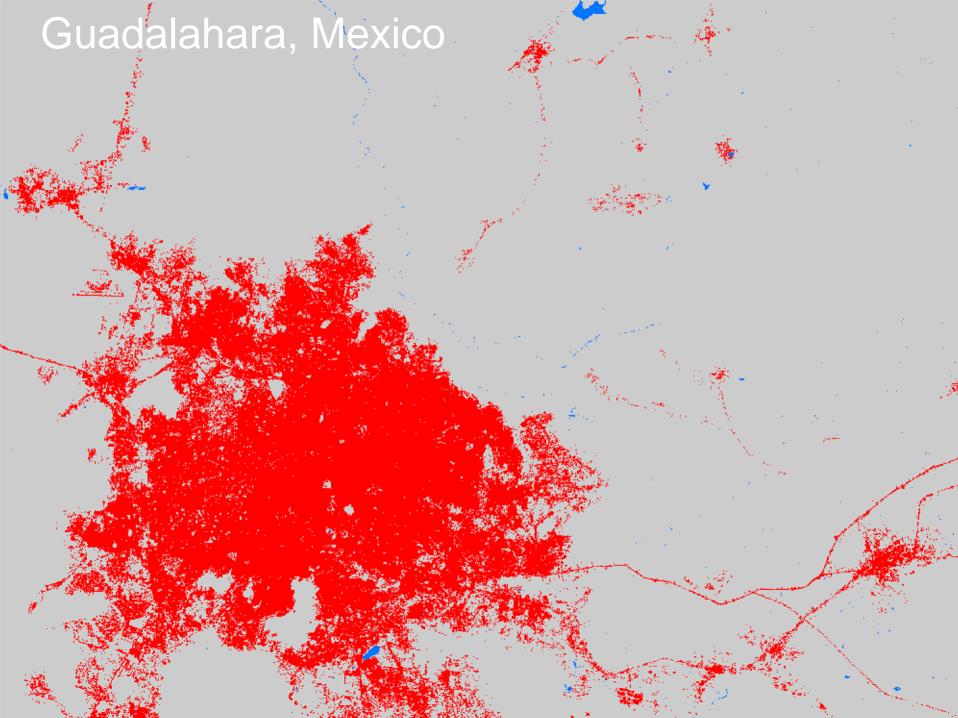
#### Accurate

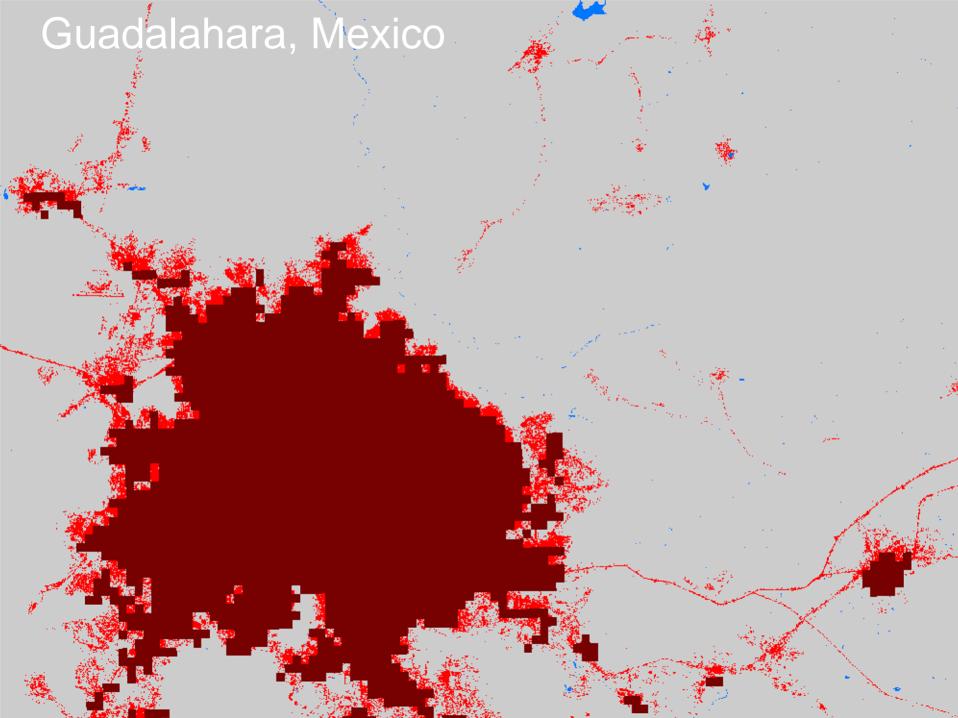
- Includes all major cities
- Maps city shape correctly
- Maps city size correctly

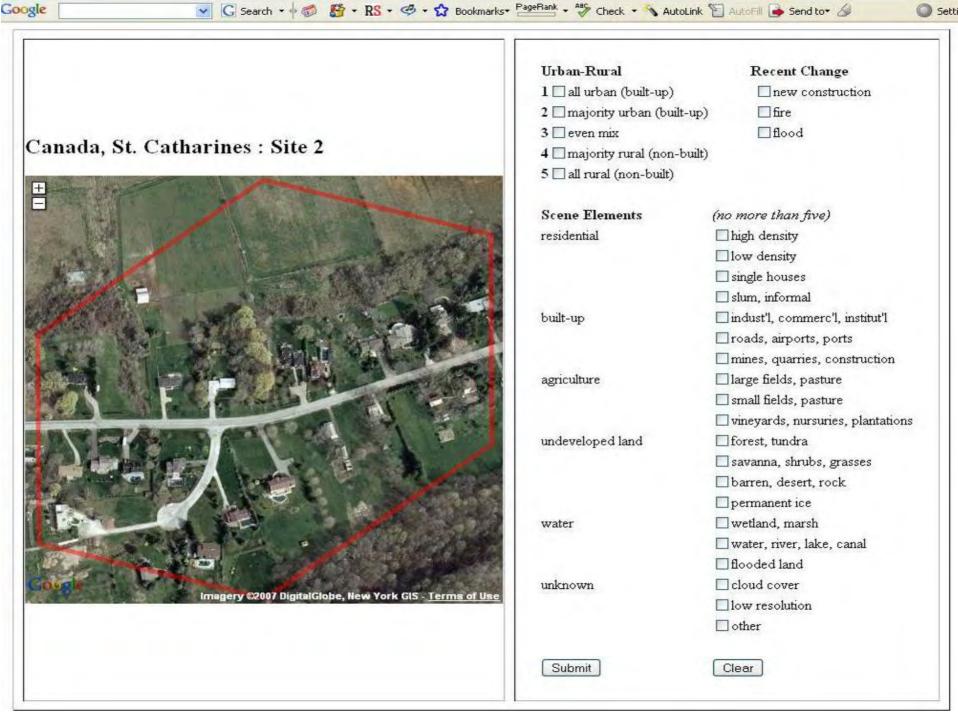
#### Landsat city maps for accuracy assessment

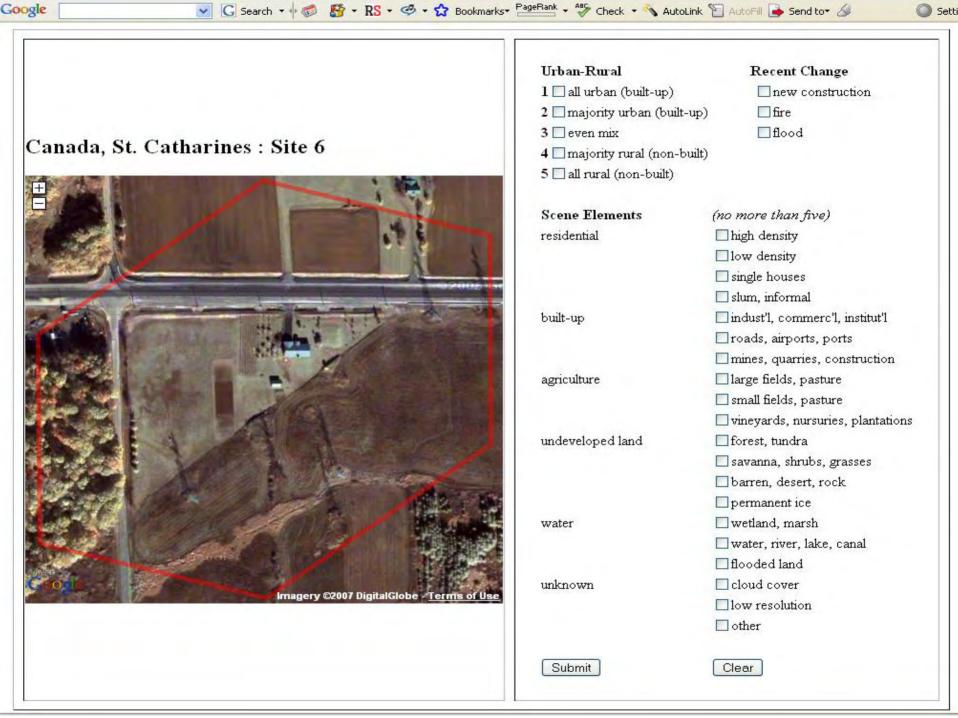


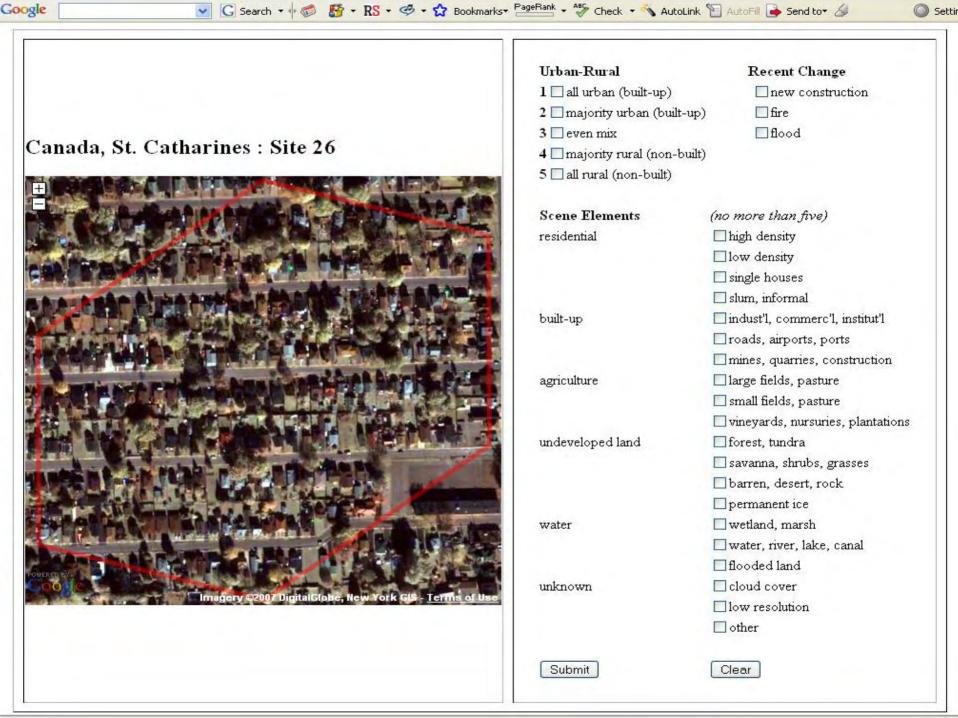












## Choosing a global urban map

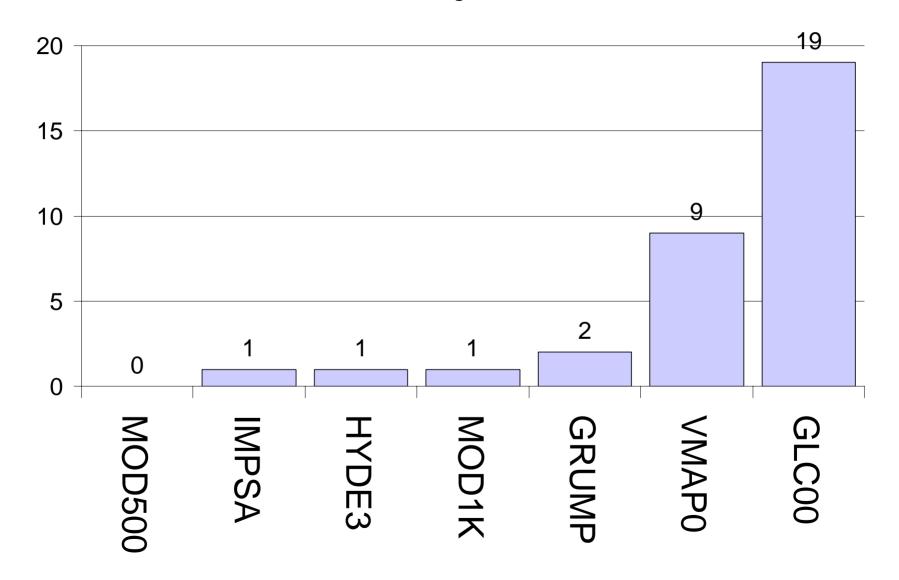
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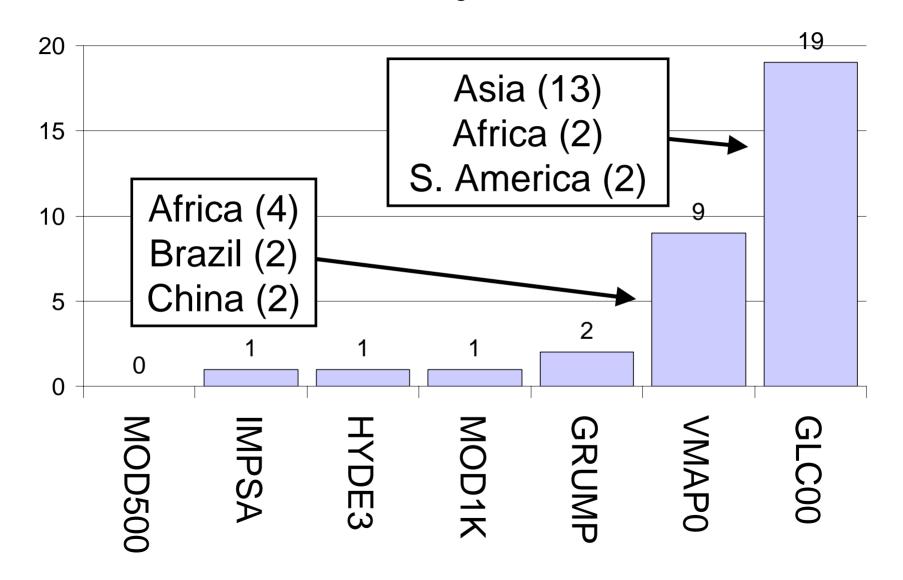
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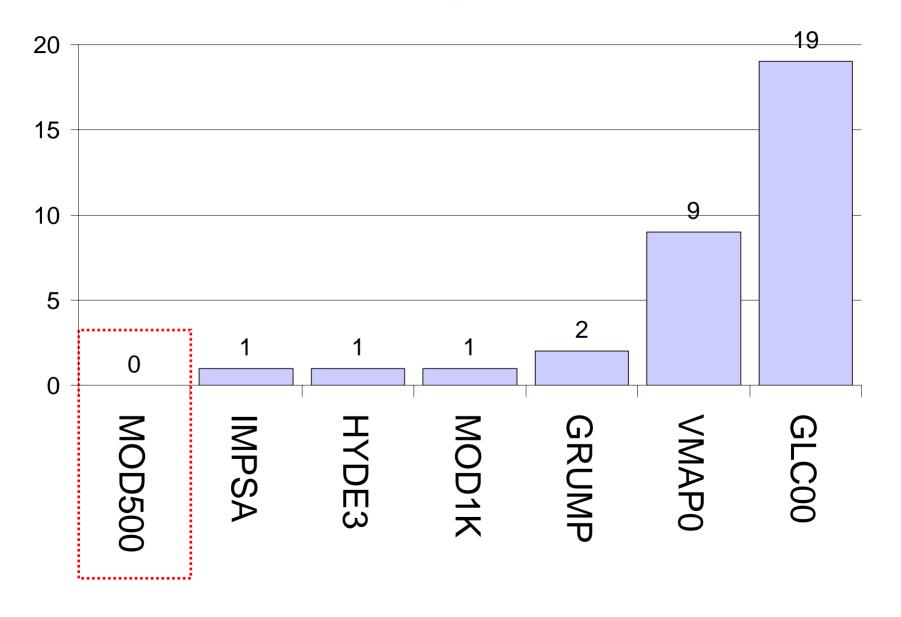
### Omissions of major cities



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## Choosing a global urban map

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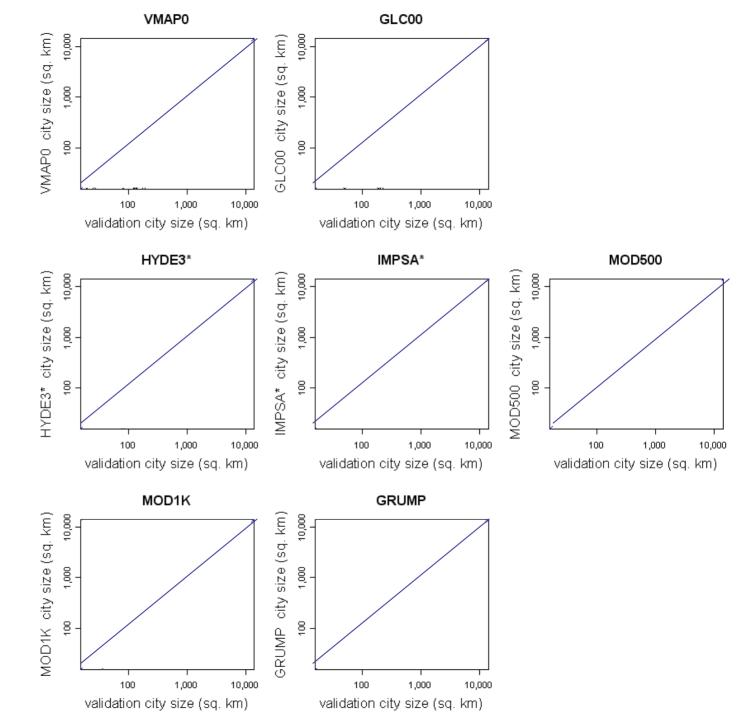
Adequate spatial resolution (500 m – 1 km) Current (circa-2000)

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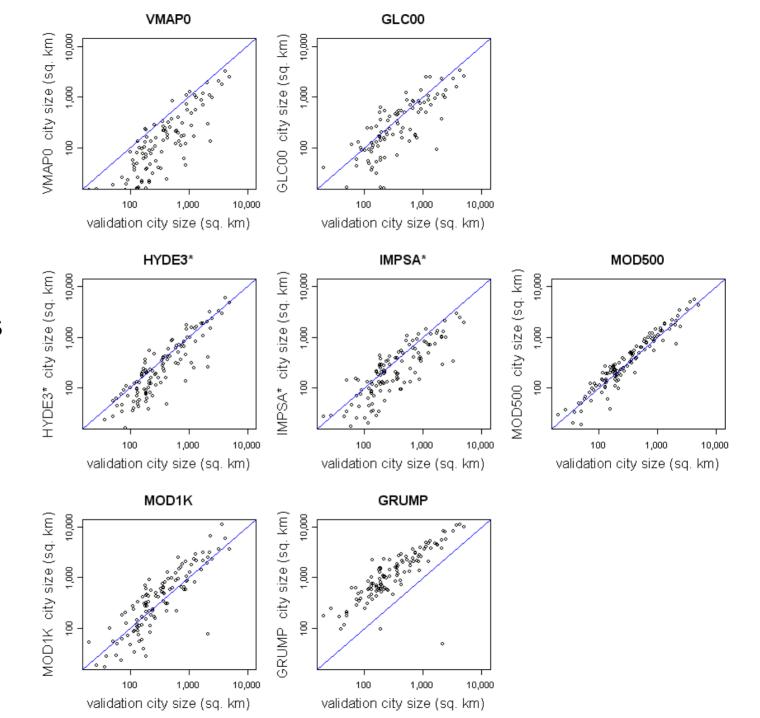
Scatterplots of city size (n=120)

Landsat vs. 7 Global Urban Maps



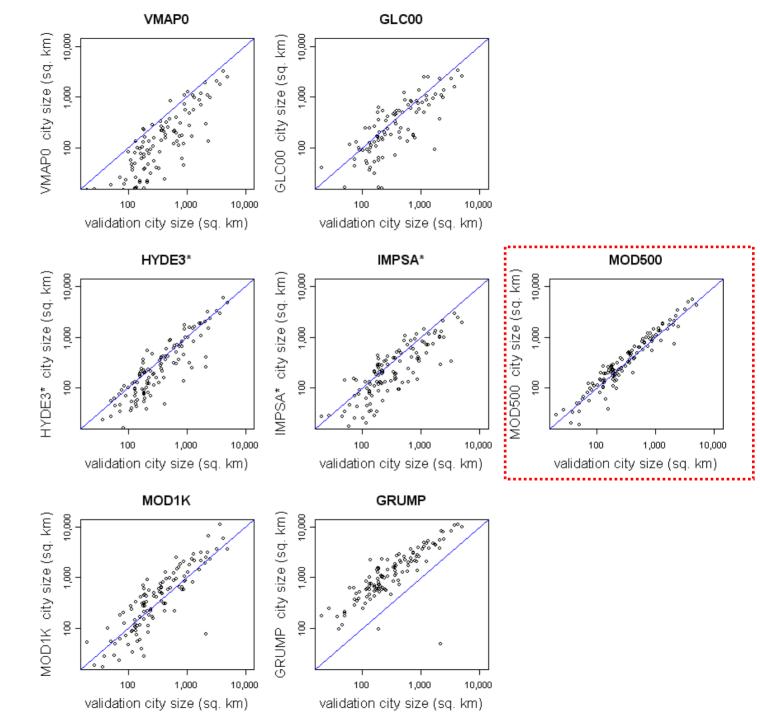
Scatterplots of city size (n=120)

Landsat vs. 7 Global Urban Maps



Scatterplots of city size (n=120)

Landsat vs. 7 Global Urban Maps



## Why global urban maps?

#### Main Questions

Which urban map is most accurate?

How will urban expansion impact conservation?

Why global urban maps?

#### Main Questions

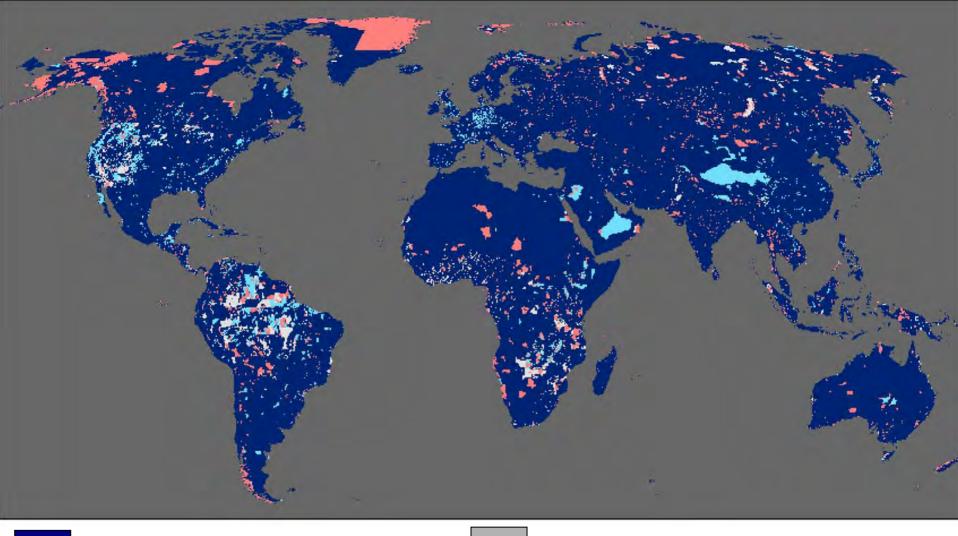
Which urban map is most accurate?

How will urban expansion impact conservation?

### Urban expansion and conservation

1) How do urban settlements impact protected areas at global and regional scales?

2) How will this relationship change as cities expand throughout the century?

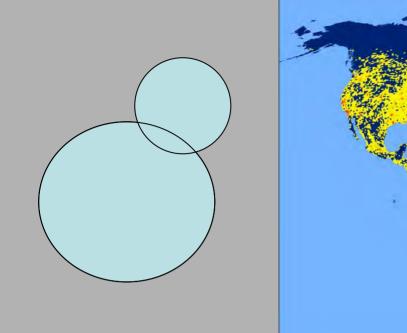


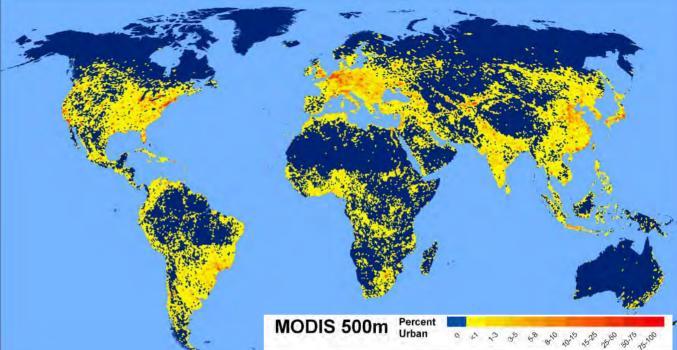
Unprotected (121)

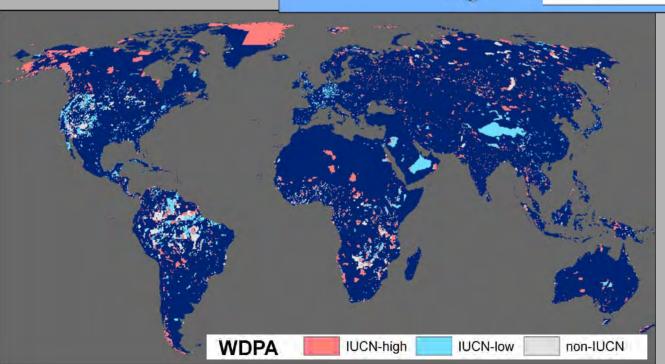
World Database of Protected Areas 2007 Unclassified (3.8)(5.5)

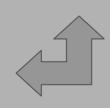
Sustainable

**Strict** (7.6)

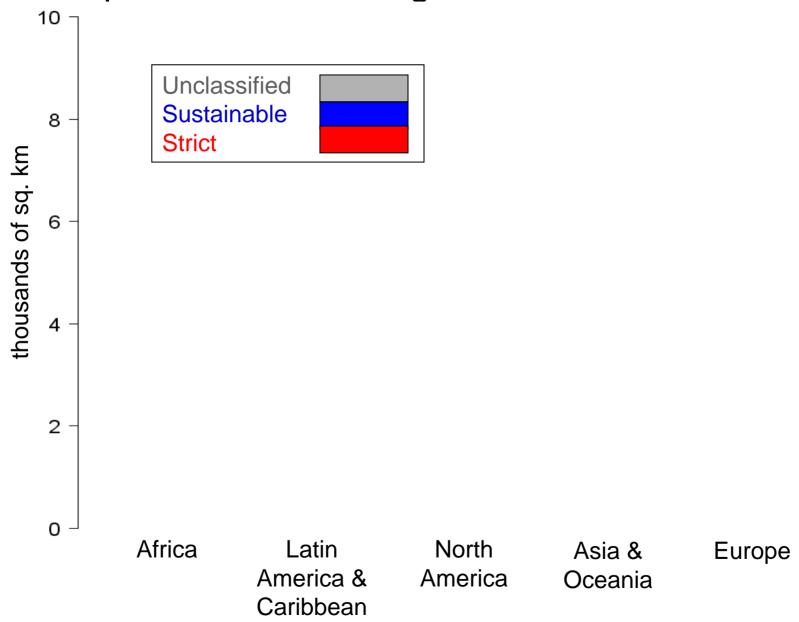




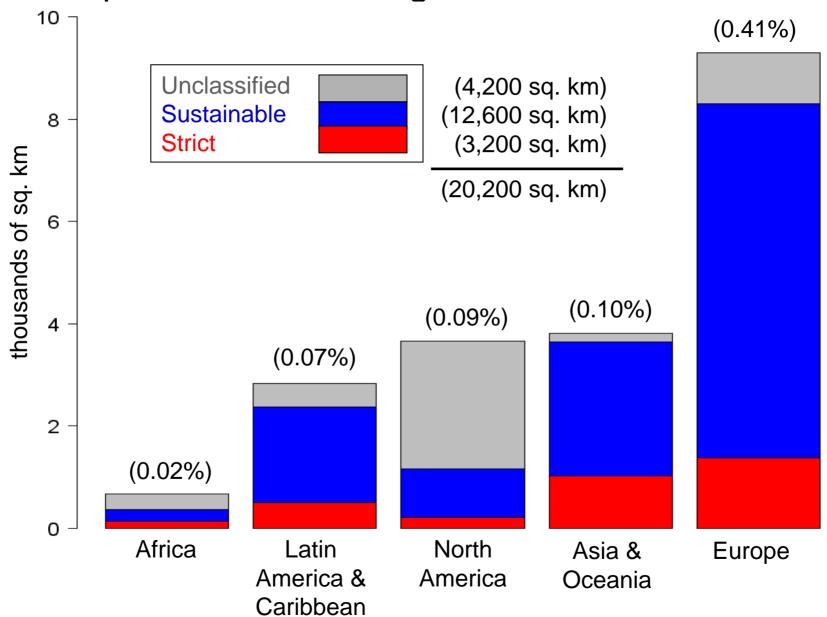




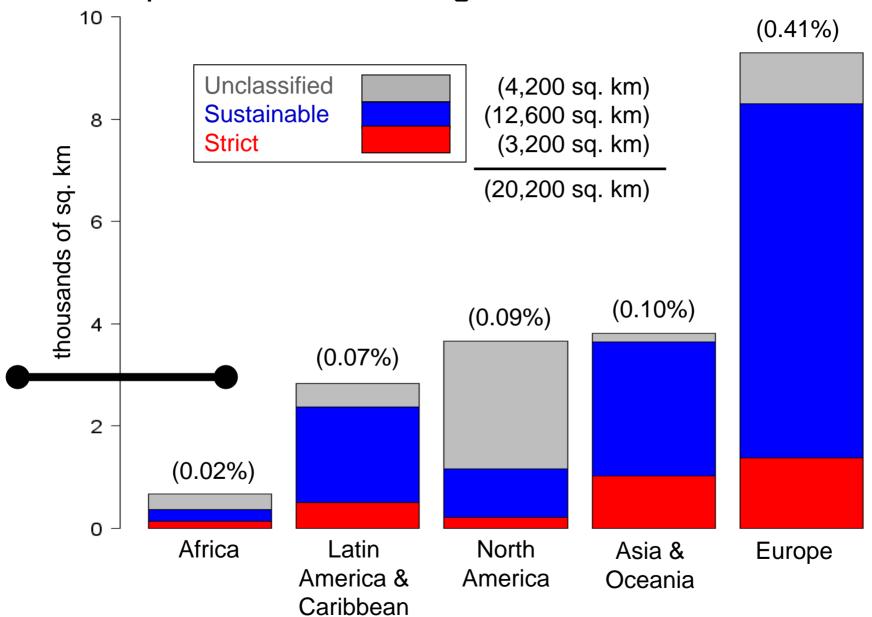
#### Overlaps: urban inholdings and incursions

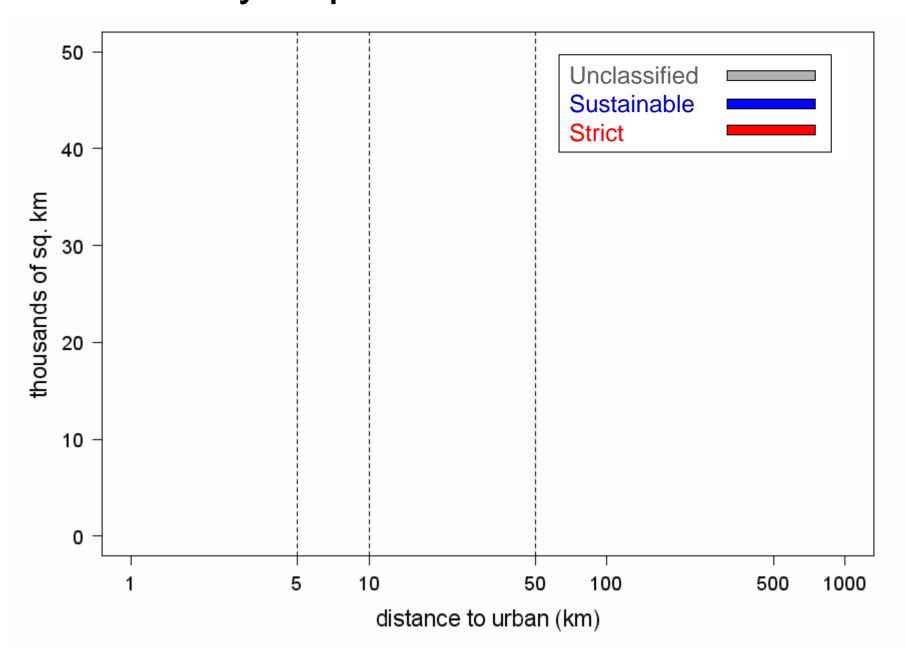


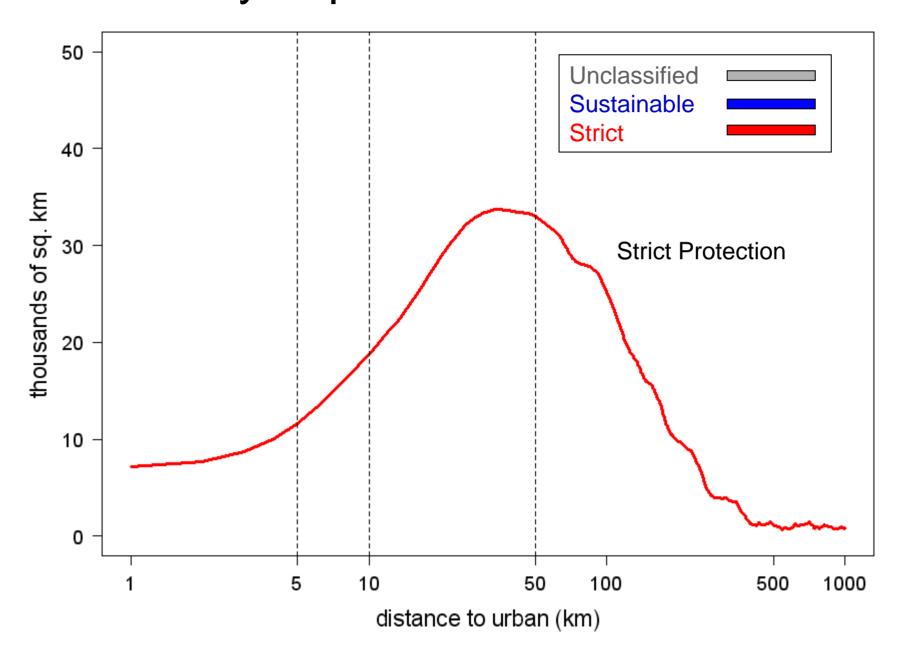
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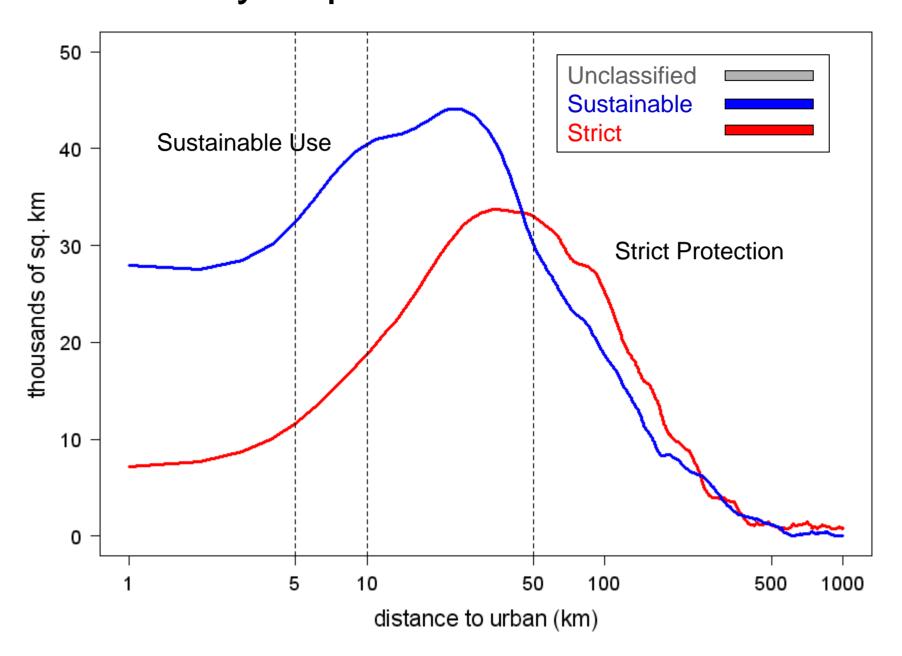


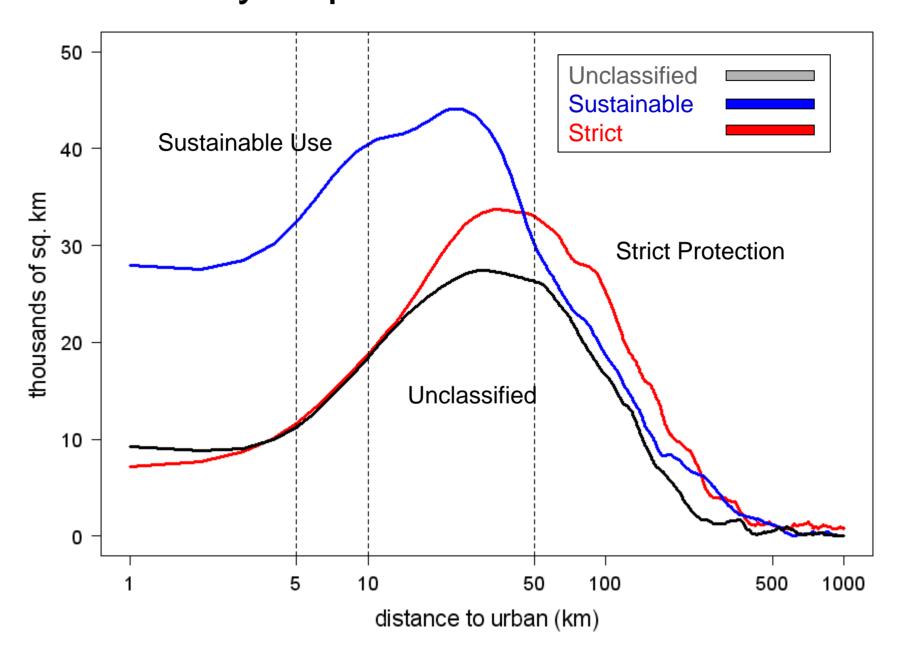
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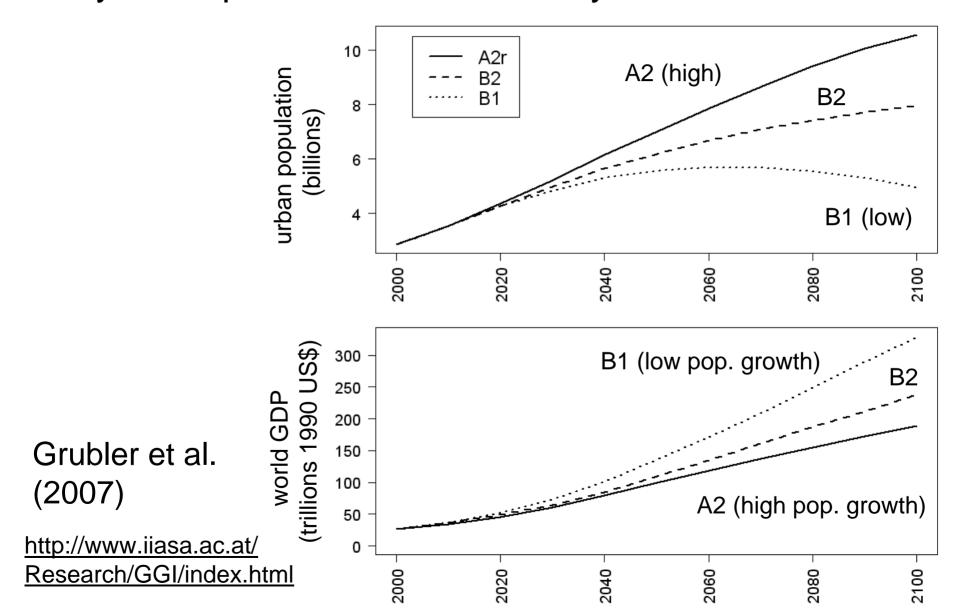


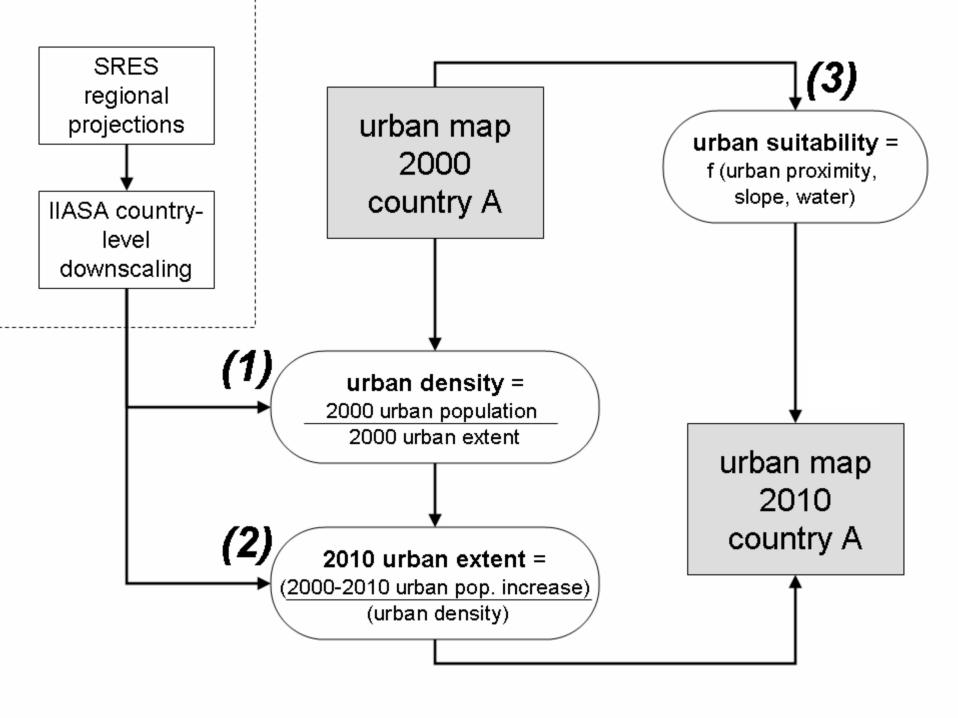


### Modeling urban expansion

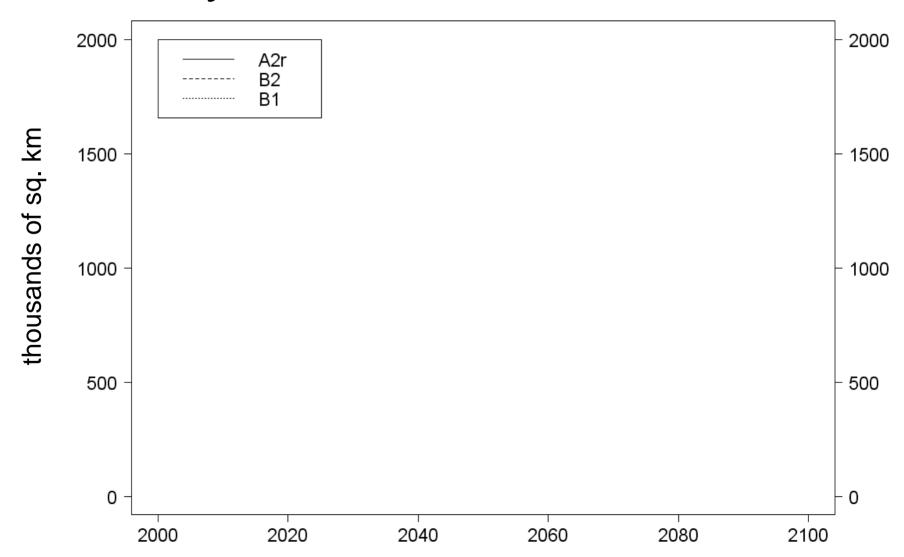
- Simple, both conceptually and computationally
- Embraces a wide range of demographic and economic futures
- Global in scope, medium spatial resolution, decadal time-steps

## IPCC-Special Report on Emissions Scenarios (SRES), Storylines updates and modified by IIASA

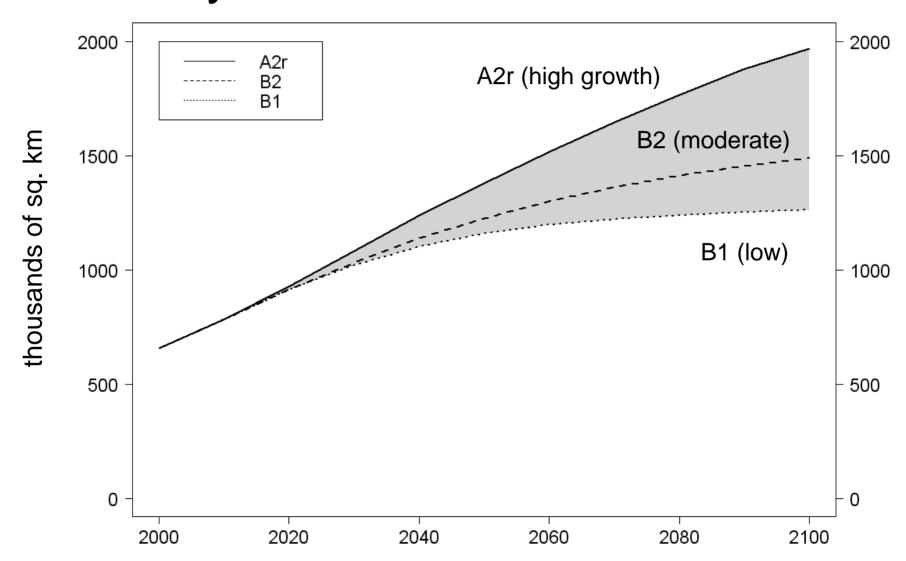




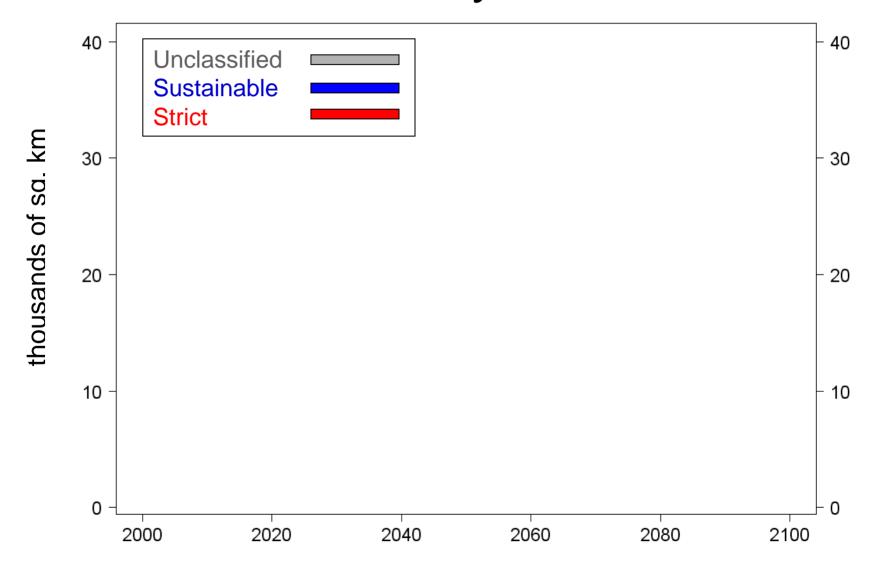
## Urban area 2000-2100, three storylines



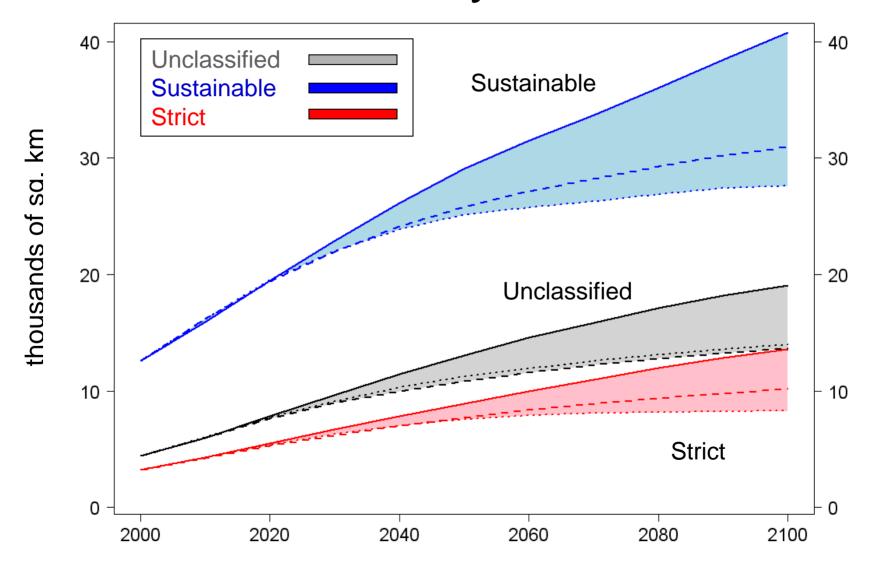
## Urban area 2000-2100, three storylines



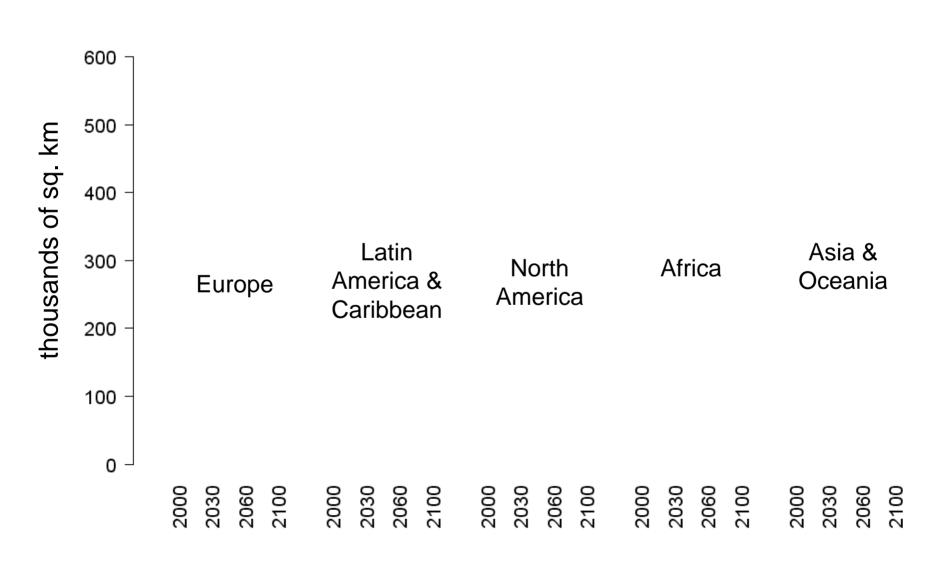
# Cumulative protected area 'losses' 2000-2100, three storylines



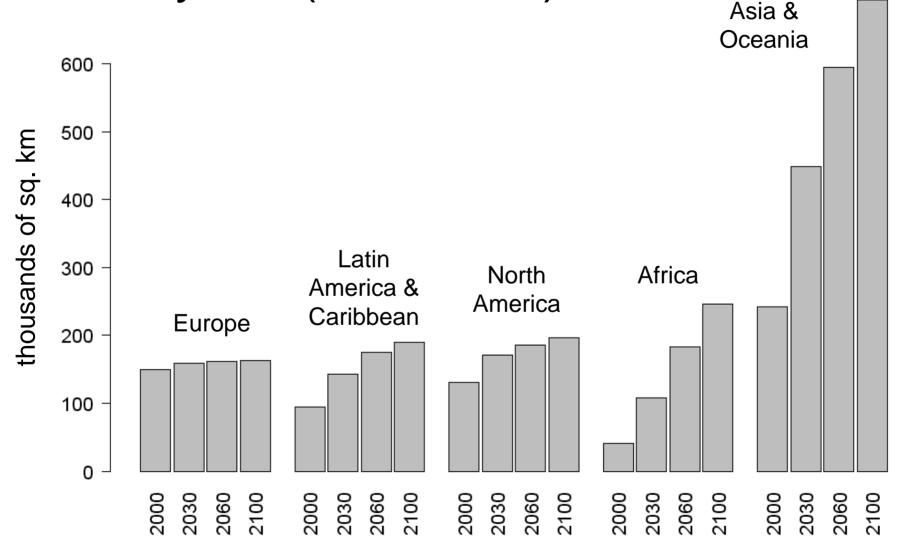
# Cumulative protected area 'losses' 2000-2100, three storylines



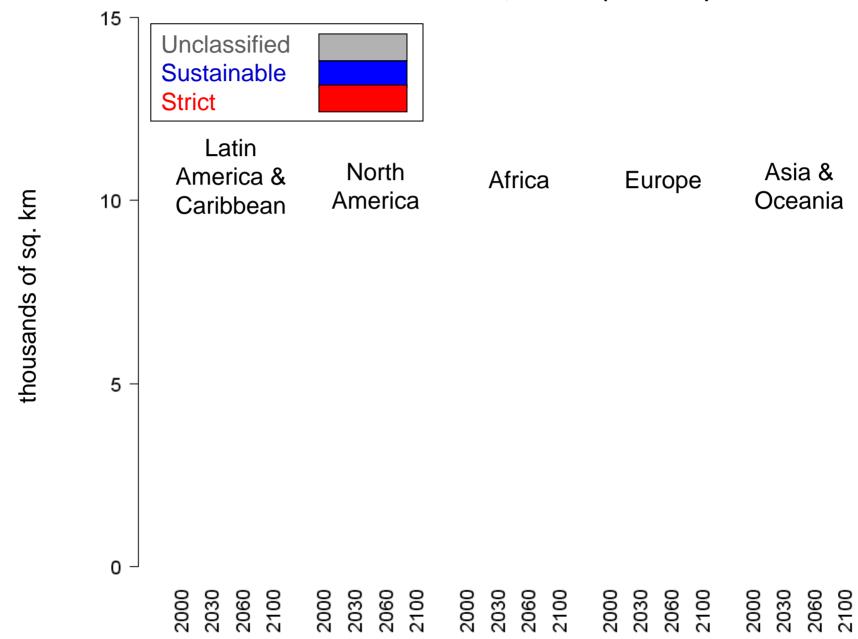
## Urban area 2000-2100, B2 storyline (moderate)

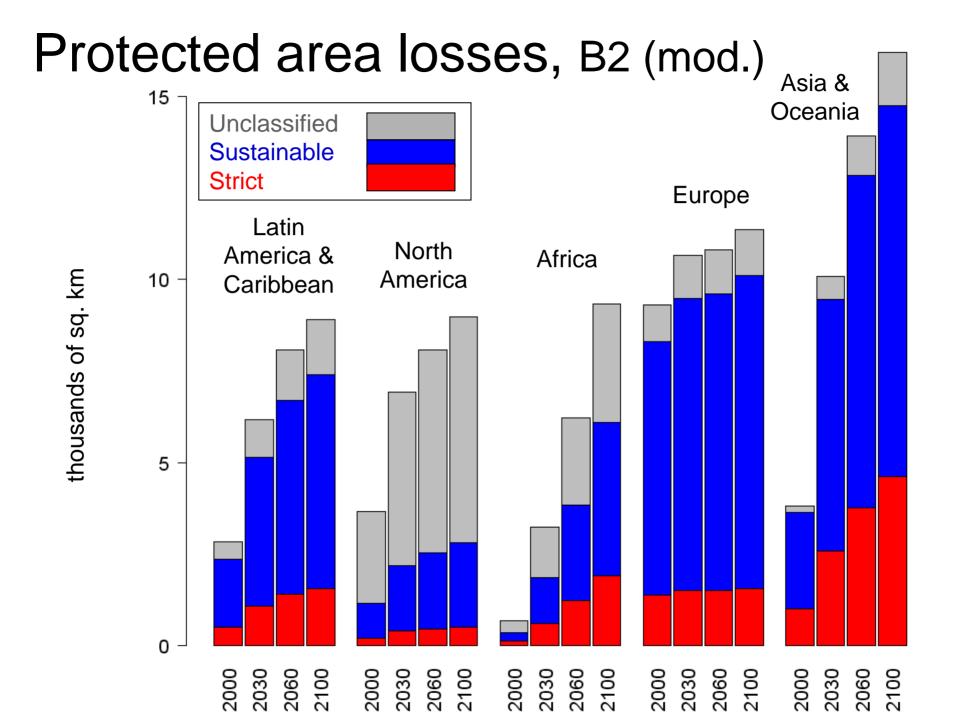


## Urban area 2000-2100, B2 storyline (moderate)



# Protected area losses, B2 (mod.)





# Main Findings

- MODIS 500m is the most appropriate map for conservation applications.
- 20,000+ sq. km of inholdings or incursions in protected areas globally as of 2000, mostly in Europe.
- Urban area may triple by 2100 to nearly 2 million sq km, with the bulk of that increase in Africa & Asia.
- 50,000+ additional sq. km of urban land may encroach on protected areas through 2100, most in Africa & Asia.

## **Future Directions**

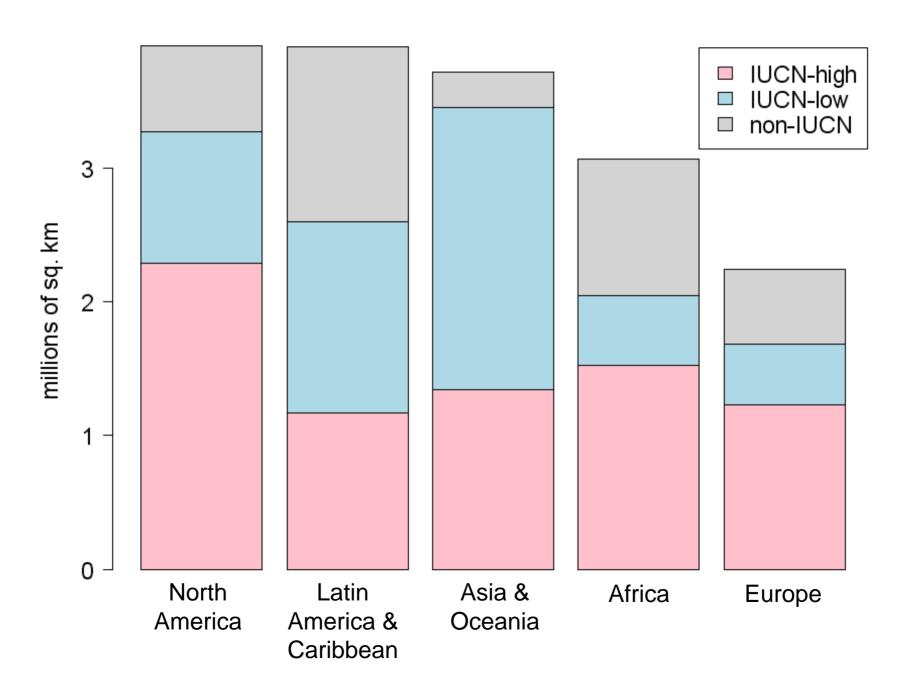
Map fusion vs. map selection

## **Future Directions**

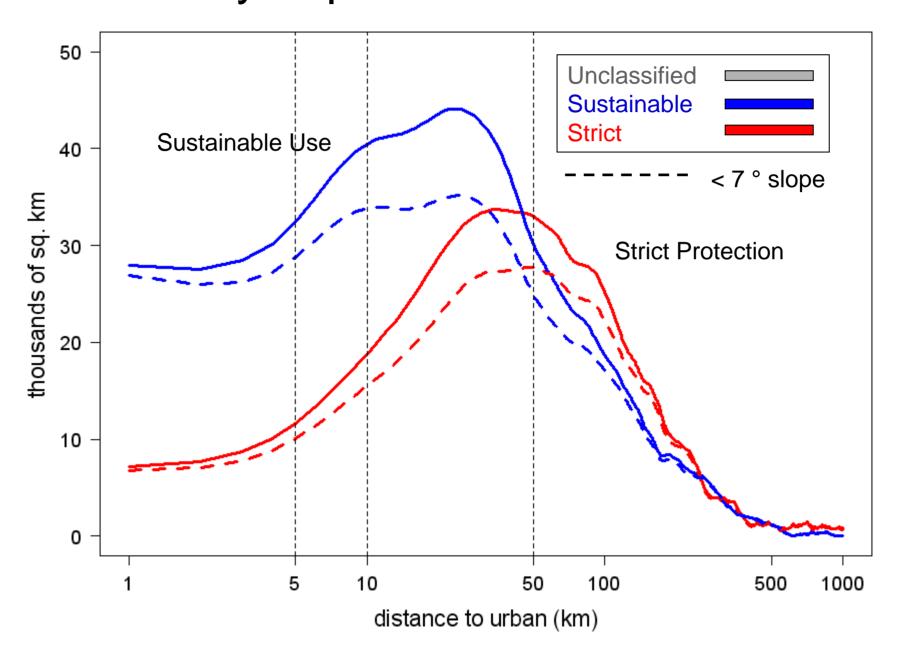
- Map fusion vs. map selection
- Assess the urban inholdings and incursions

## **Future Directions**

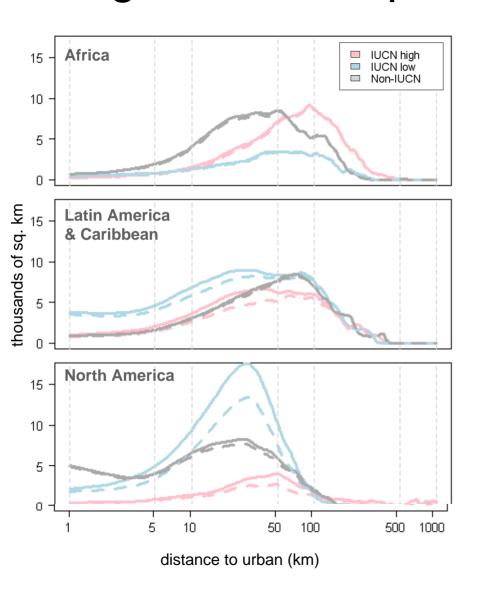
- Map fusion vs. map selection
- Assess the urban inholdings and incursions
- Improve the urban expansion model
  - Model urban density with GDP
  - Improve spatial allocation algorithm
  - Assess model output using Landsat maps
  - Allow protected areas to 'resist' incursion

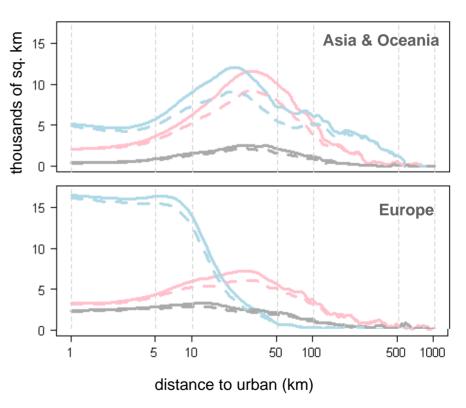


## Proximity of protected areas to MOD500



# Regional urban proximities







Sao Paolo, Brazil

San Salvador, El Salvador



Kampala, Uganda

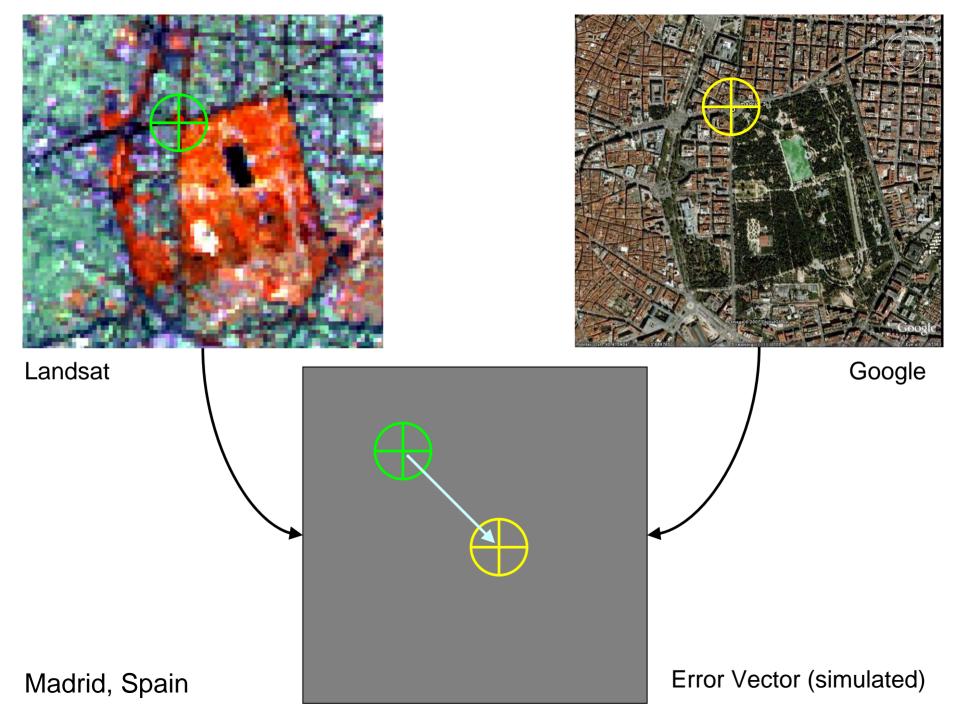


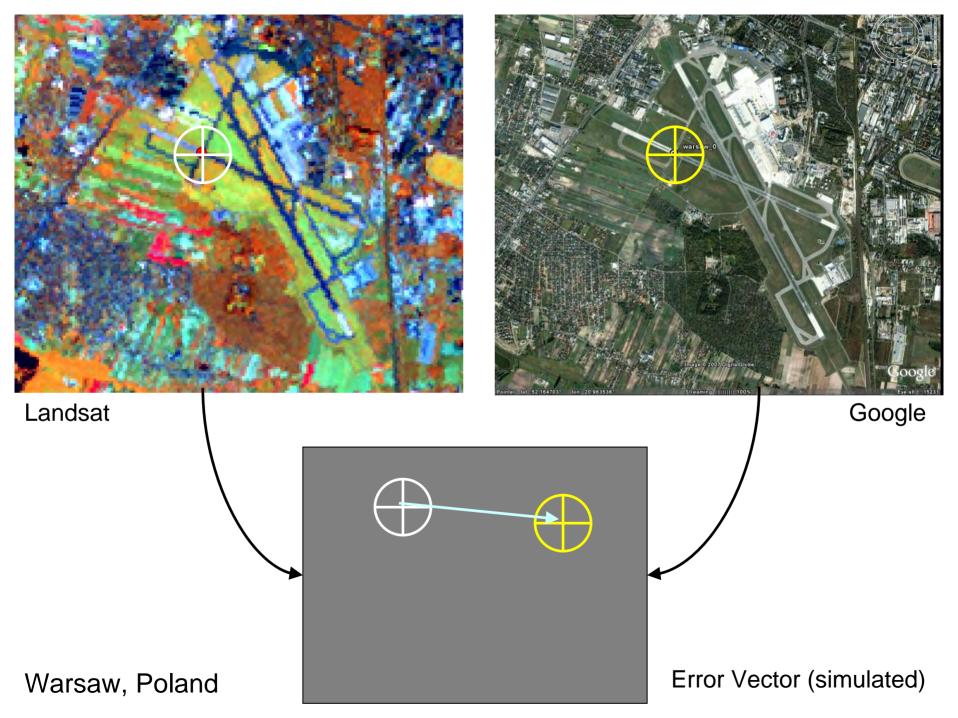
Sao Paolo, Brazil

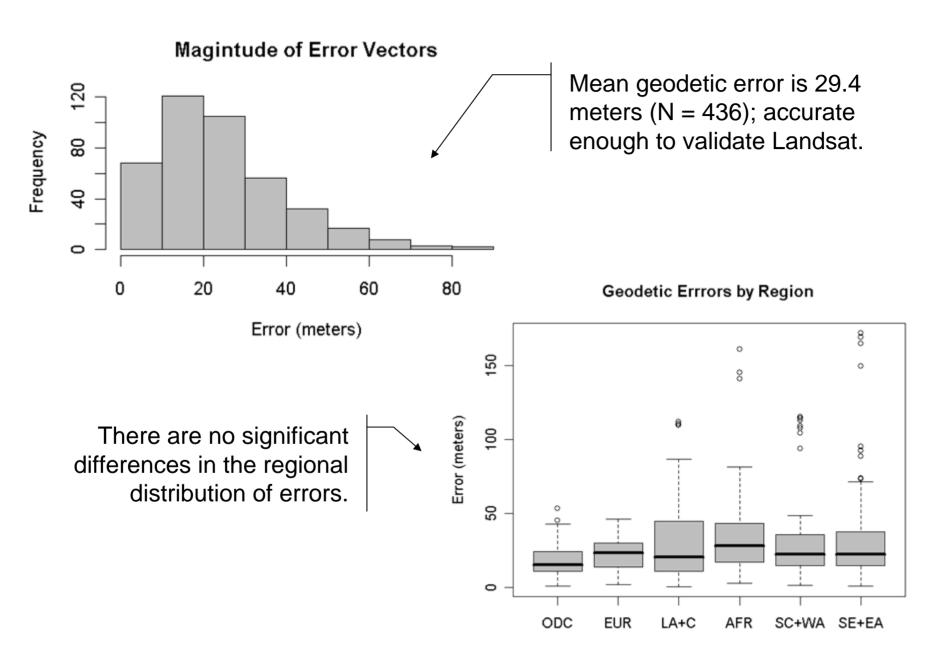
San Salvador, El Salvador

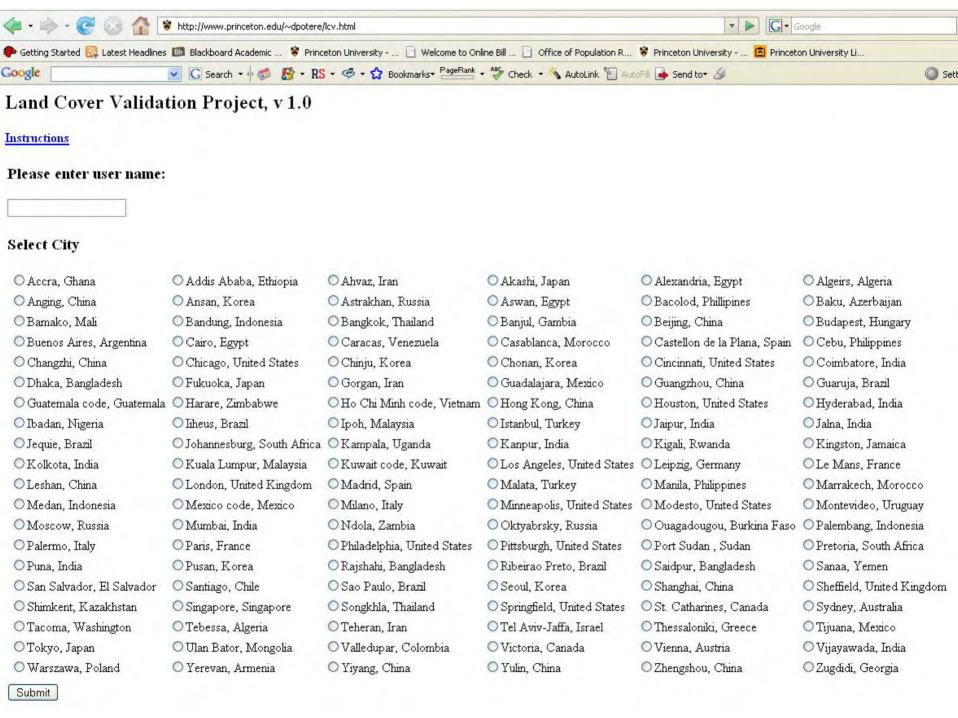


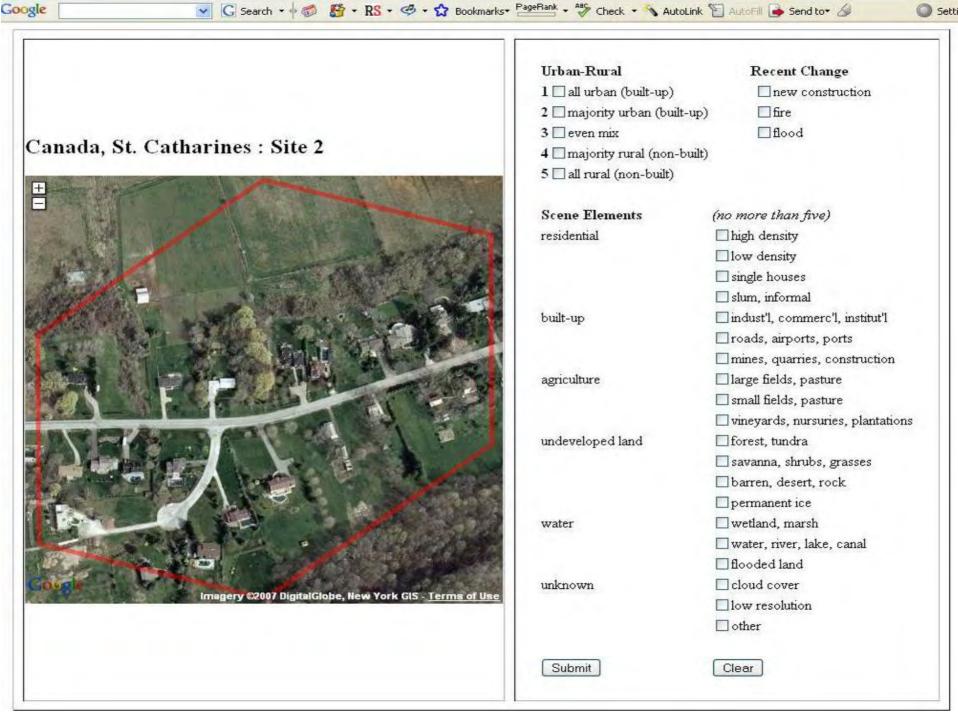
Kampala, Uganda

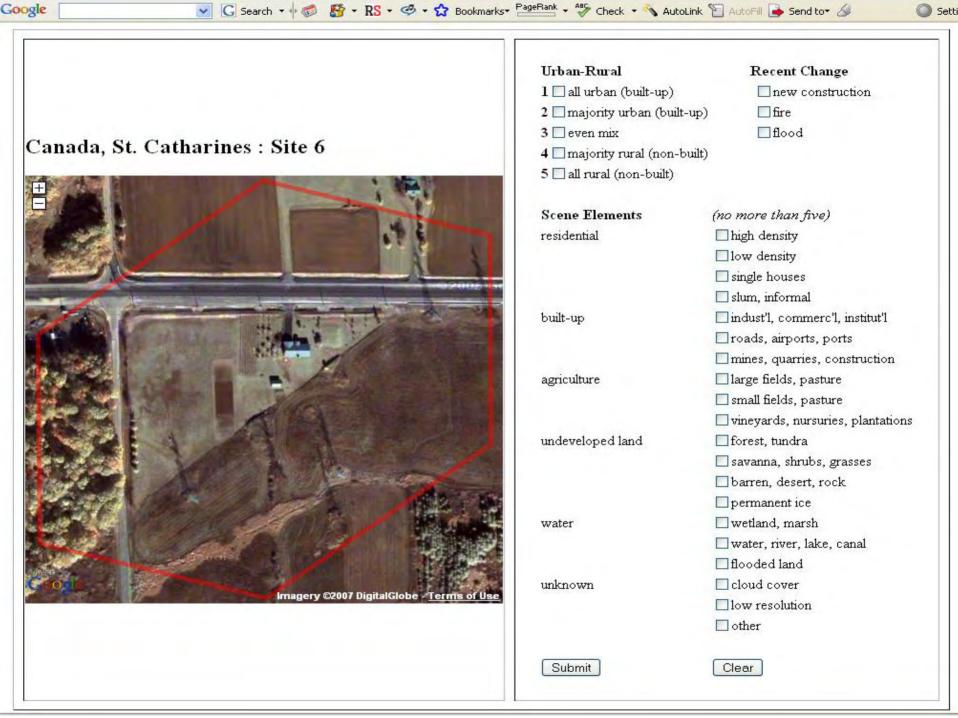


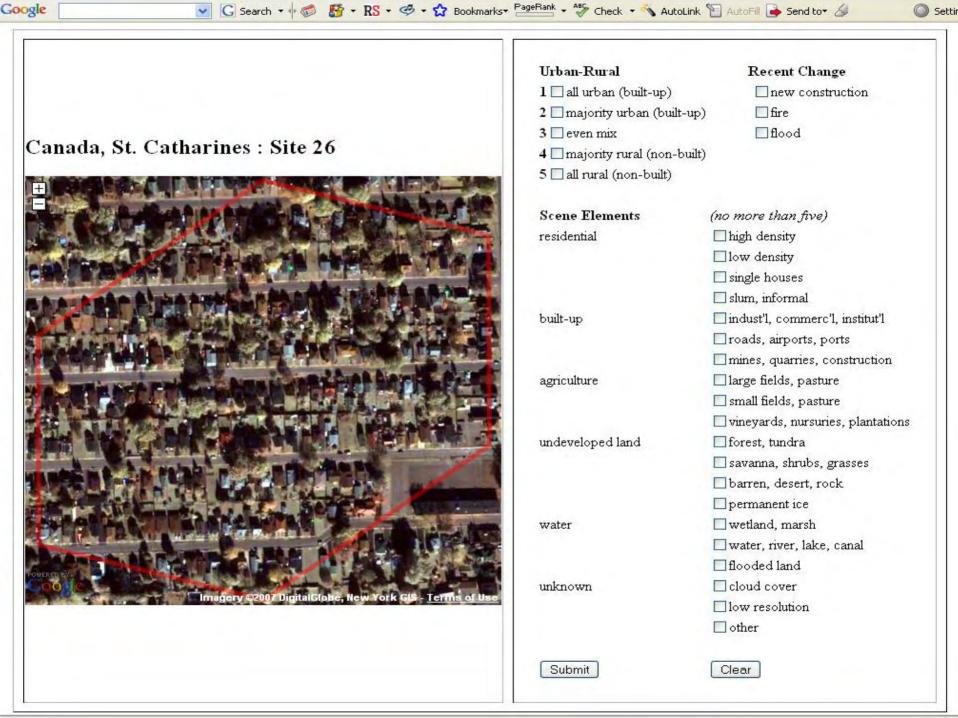










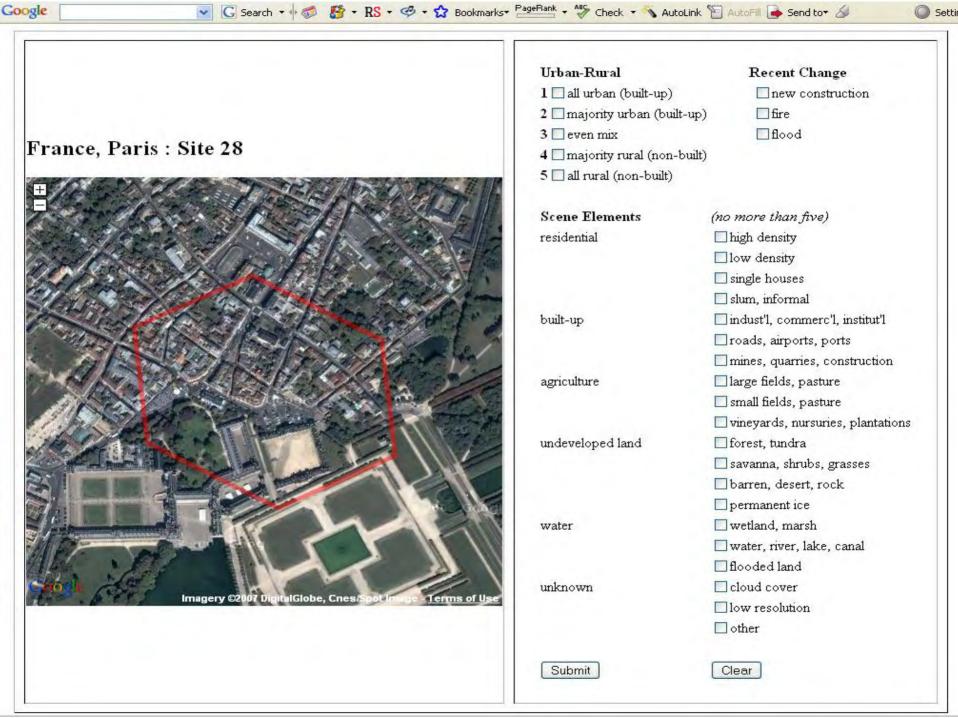


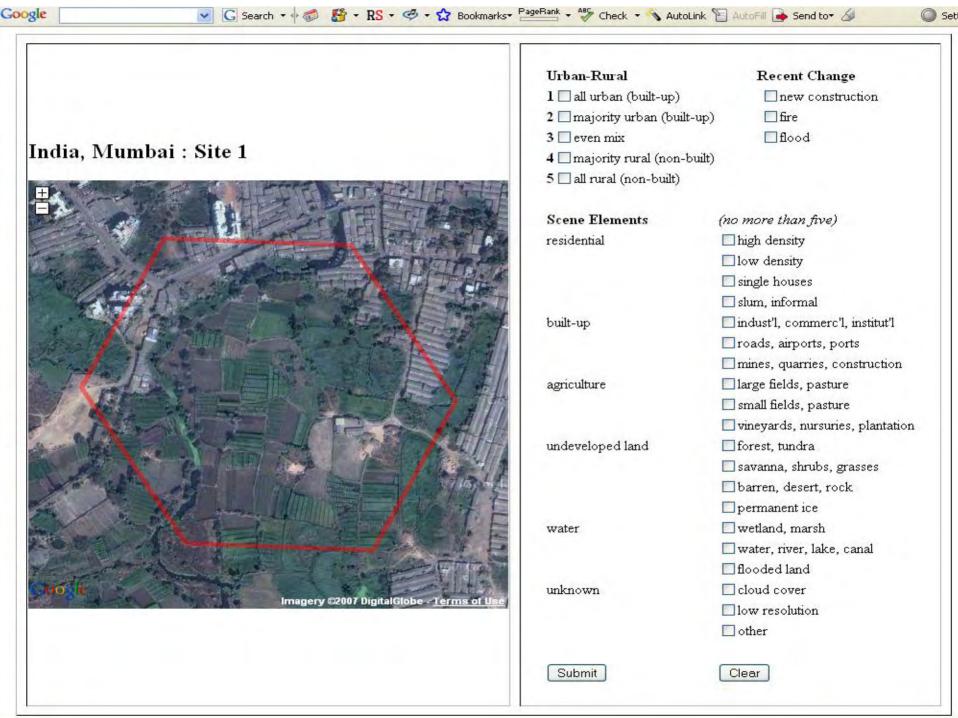


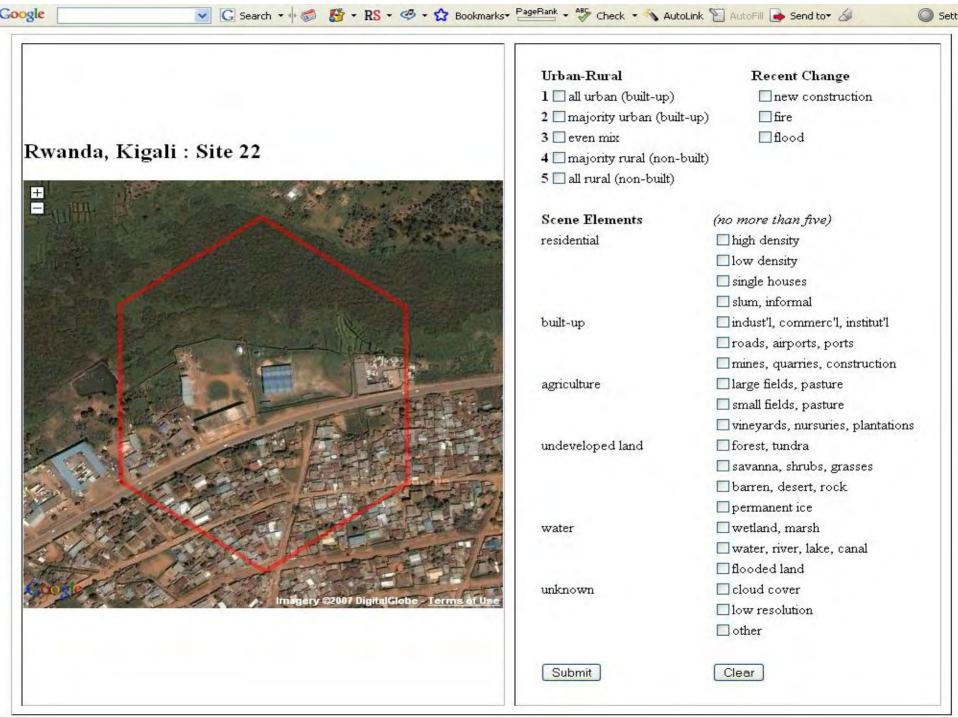
#### Canada, St. Catharines : Site 1

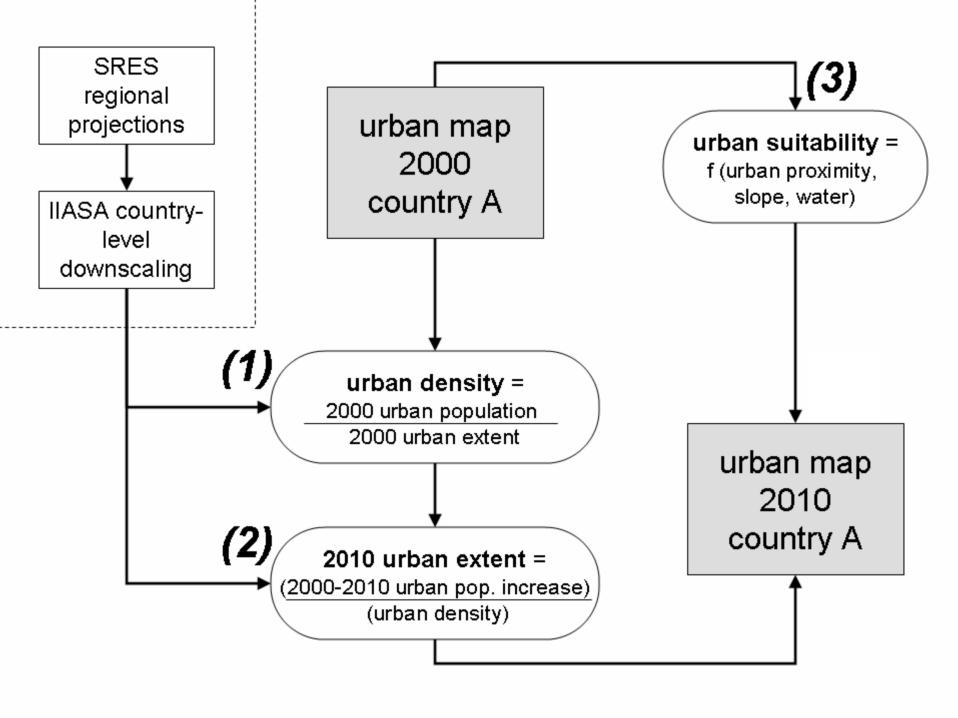


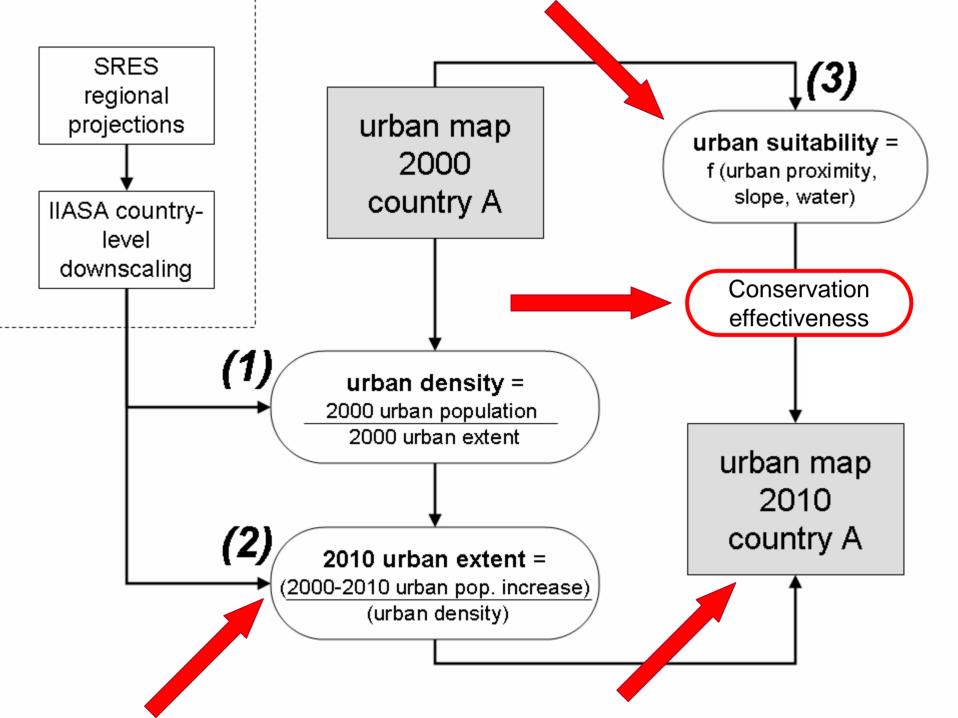
Urban-Rural	Recent Change
1 🗌 all urban (built-up)	new construction
2 majority urban (built-up)	☐ fire
3 □ even mix	□ flood
4 majority rural (non-built)	
5 🗌 all rural (non-built)	
Scene Elements	(no more than five)
residential	☐ high density
	low density
	single houses
	slum, informal
built-up	indust'l, commerc'l, institut'l
	🗌 roads, airports, ports
	mines, quarries, construction
agriculture	🔲 large fields, pasture
	small fields, pasture
	vineyards, nursuries, plantation
undeveloped land	forest, tundra
	🗌 savanna, shrubs, grasses
	🔲 barren, desert, rock
	permanent ice
water	wetland, marsh
	water, river, lake, canal
	🗌 flooded land
unknown	cloud cover
	low resolution
	other
Submit	Clear



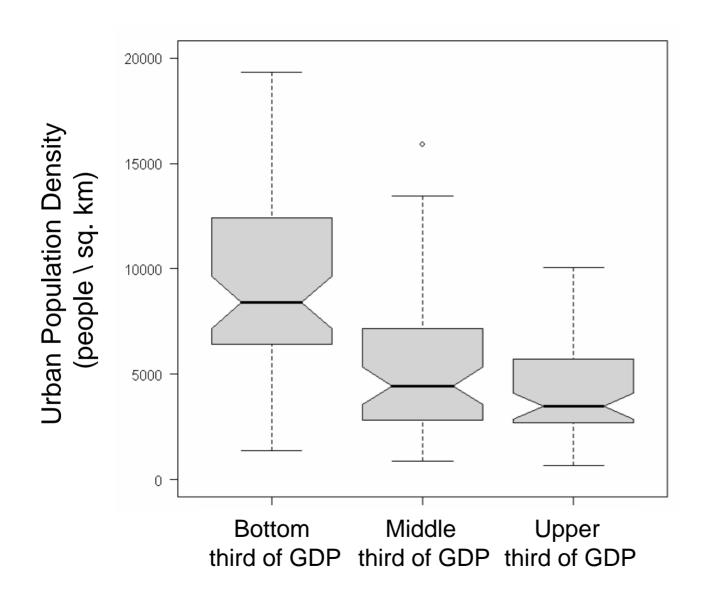






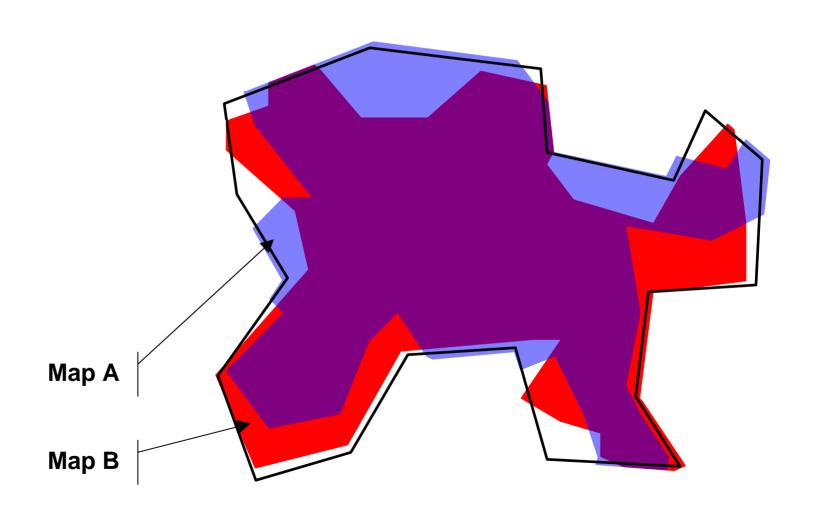


## GDP versus urban density (n=120)

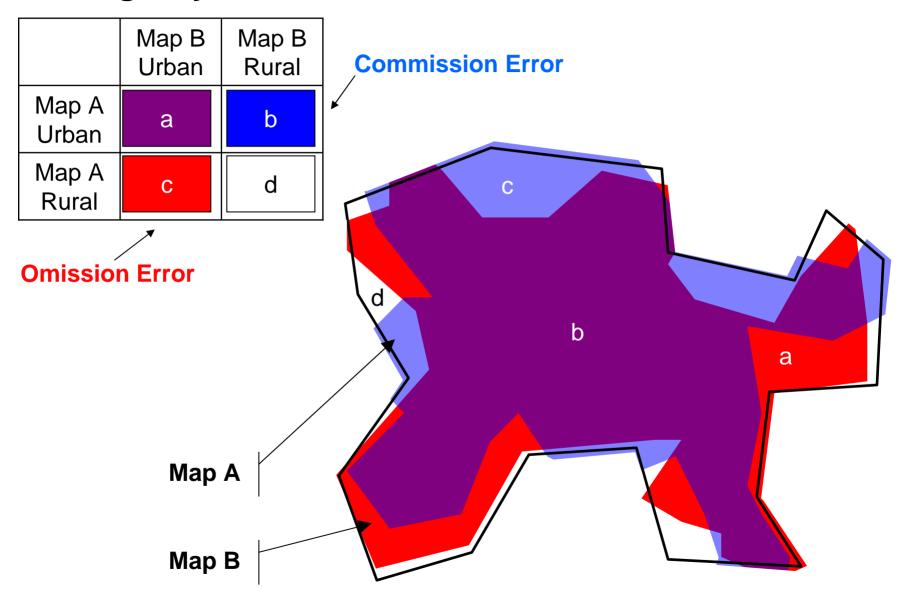


# **Assessment Results**

	Omissions	Shape	Size
VMAP0	3	2	3
GLC00	3	2	2
HYDE	2	2	2
IMPSA	1	1	2
MOD500	1	1	1
MOD1K	2	2	2
GRUMP	2	2	3



#### **Contingency Matrix**



#### Map Agreement Statistics

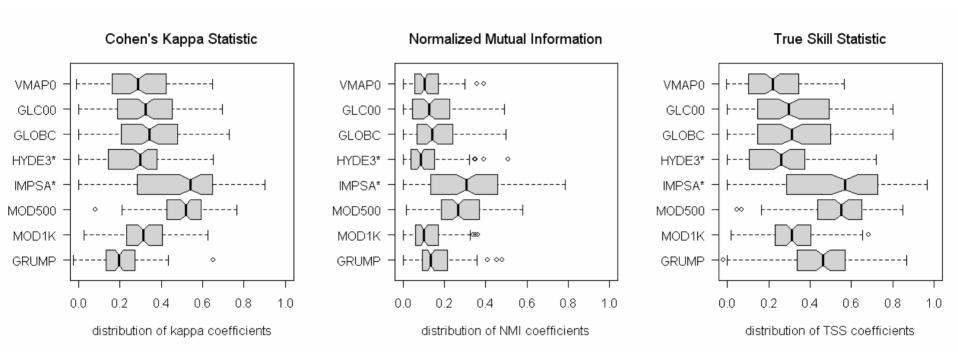
#### **Contingency Table**

n = a + b + c + d		Validation Data		
	_	Presence	Absence	
Review Data	Presence	а	b	
	Absence	С	d	

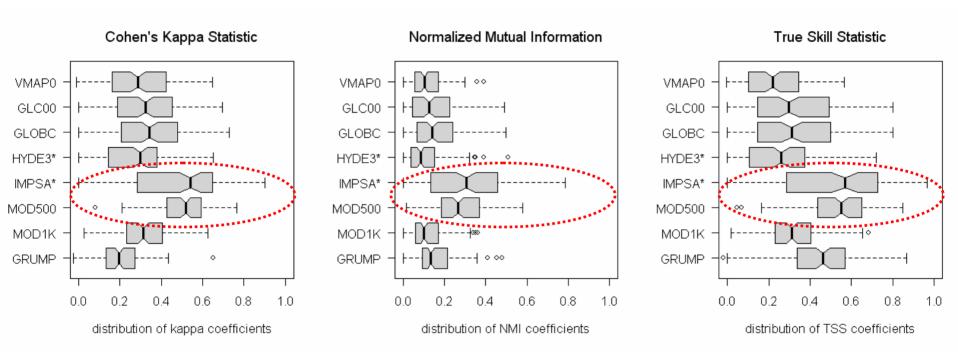
Overall map accuracy (OMA)	$\frac{a+d}{n}$
Specificity (1-Commission)	$\frac{d}{b+d}$
Sensitivity (1-Omission)	$\frac{\alpha}{\alpha + c}$

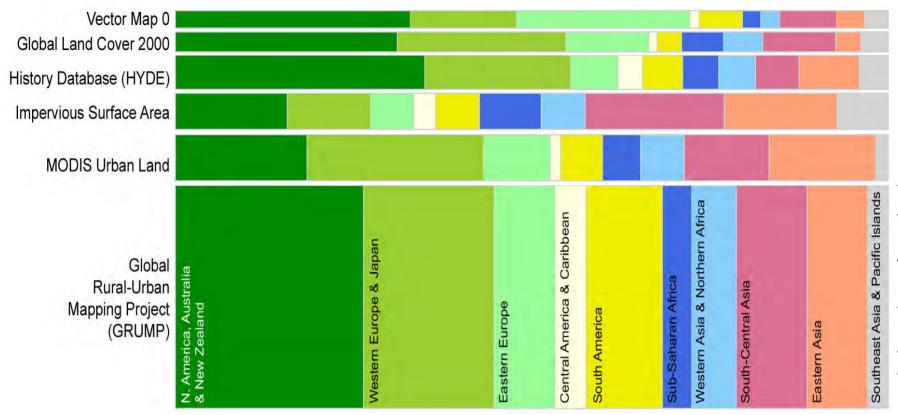
Cohen's Kappa	$\frac{\left(\frac{a+d}{n}\right) - \frac{(a+b)(a+c) + (c+d)(d+b)}{n^2}}{1 - \frac{(a+b)(a+c) + (c+d)(d+b)}{n^2}}$
Normalized Mutual Information	$1 - \frac{-a \ln(a) - b \ln(b) - c \ln(c) - d \ln(d) + (a+b) \ln(a+b) + (c+d) \ln(c+d)}{n \ln(n) - ((a+c) \ln(a+c) + (b+d) \ln(b+d))}$
True Skill Statistic	$\frac{ad - bc}{(a+c)(b+d)}$ or, sensitivity + specificity - 1

#### Map agreement distributions (n=120)



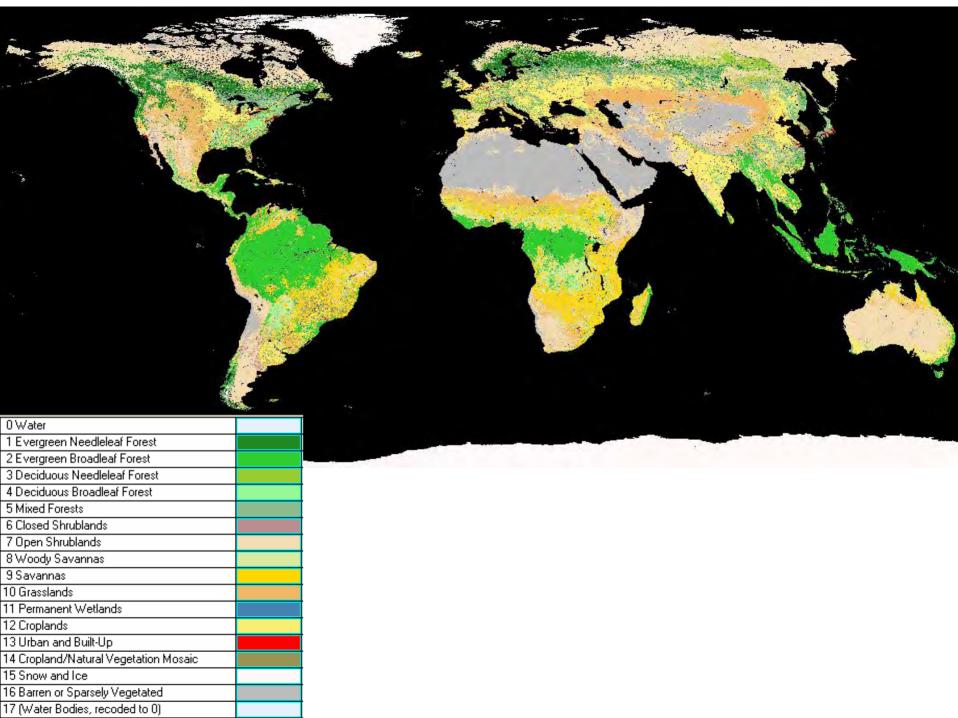
#### Map agreement distributions (n=120)

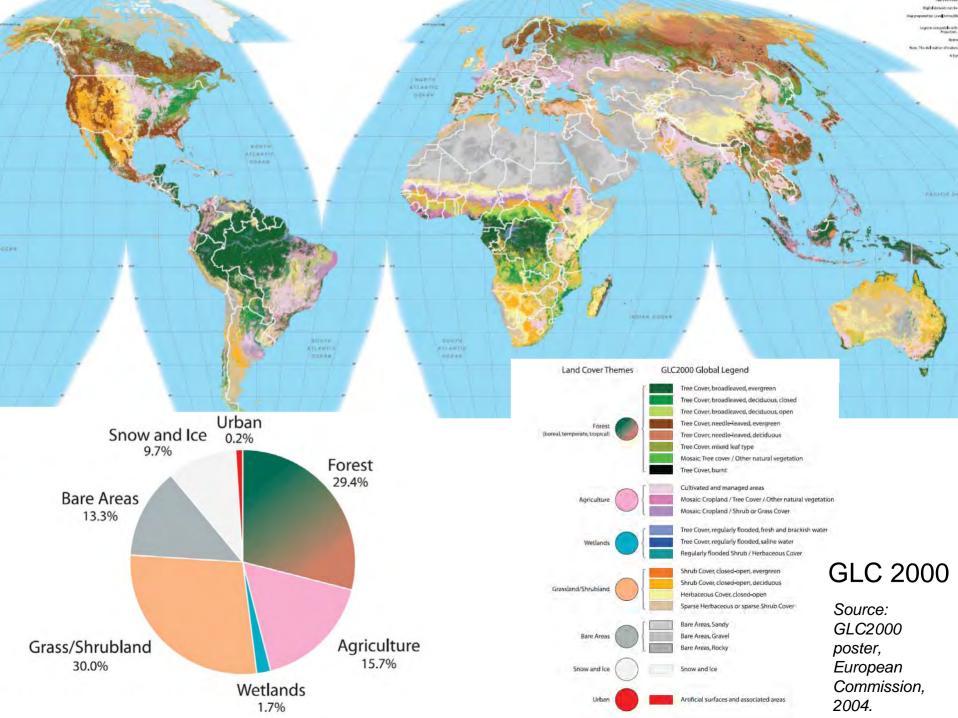




Cartogram of total urban area, by world-region







### Methods

	Primarily image-based			Combination				Map-based	
Imagery	MOD500	MOD1K	GLOBC	GLC00	IMPSA	LSCAN	HYDE3	GRUMP	VMAP0
High Res.						Various <sup>a</sup>			
Medium Res.	Landsat	Landsat		Landsat	Landsat <sup>b</sup>	GeoCover <sup>c</sup>			
Coarse Res.	MODIS 500m, '01	MODIS 1km, '01	MERIS 300m, '05	SPOT4- VGT 2001					
Night Lights		1996-97		1994-95	2000-01 <sup>d</sup>			1994-95	
Census & Maps									
Census						US <sup>e</sup>	UN <sup>f</sup>	UN <sup>f</sup>	
Maps / Charts	X	Χ	X			X		Χ	X
City Gazetters						X		Χ	X
Road Vectors			Х			X			
Global Maps									
VMAP				level 0		level 1 g	level 0	level 0	
MODIS						2001			
GLC-2000			2001				2001		
LandScan					2004		2005		

**MOD500** 

**GLOBC** 

**HYDE3** 

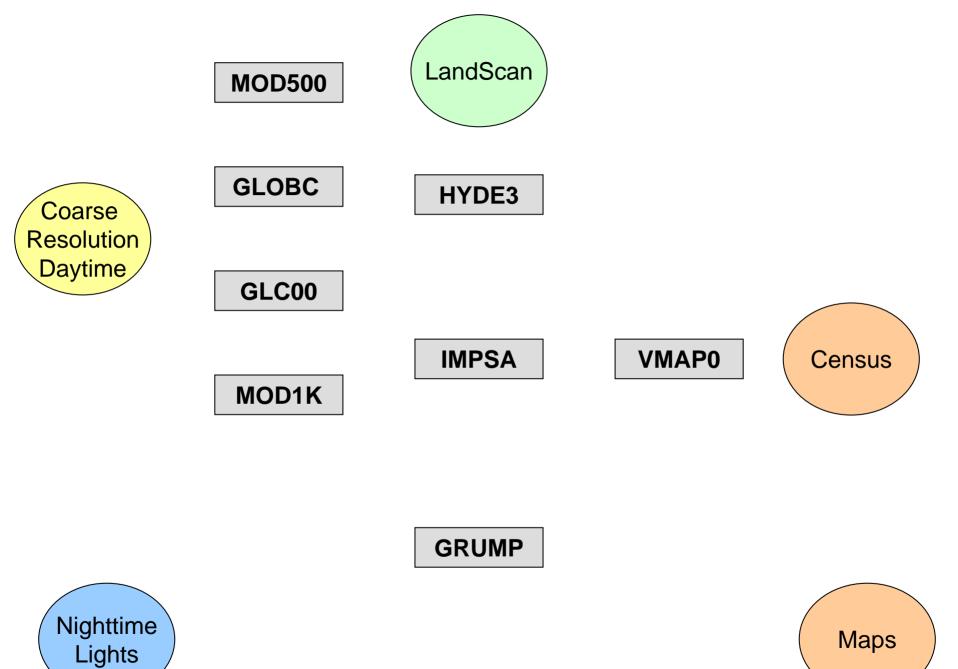
GLC00

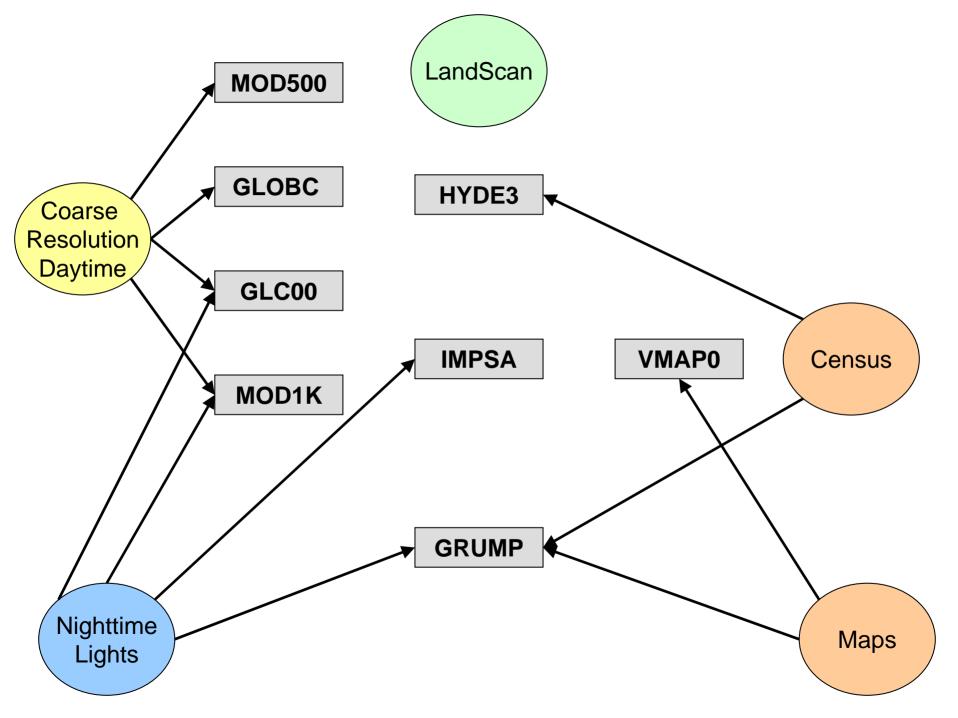
**IMPSA** 

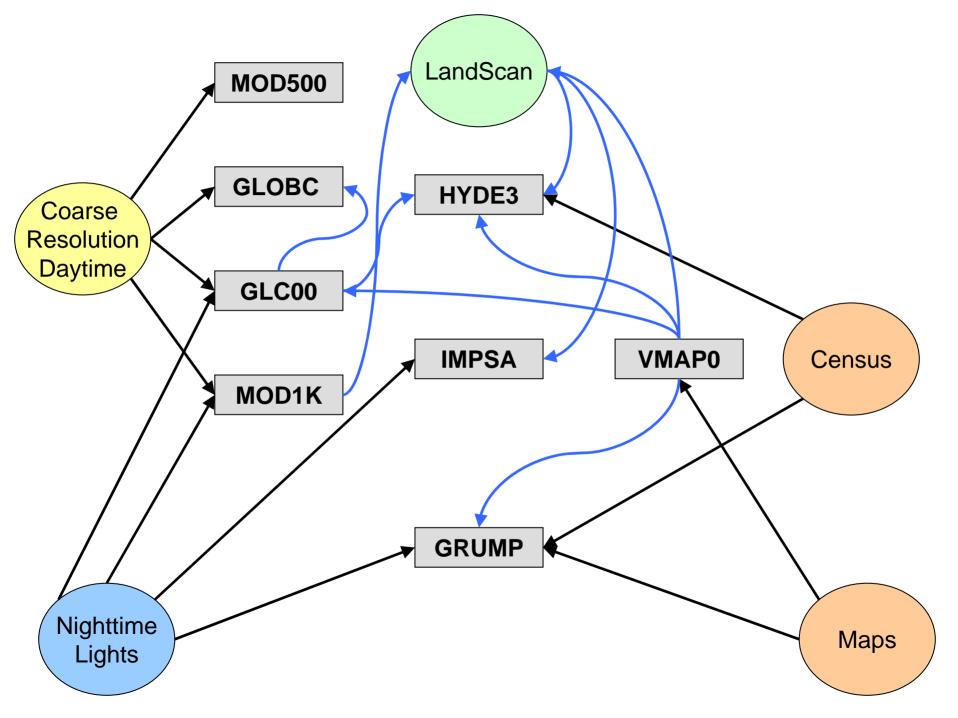
VMAP0

MOD1K

**GRUMP** 

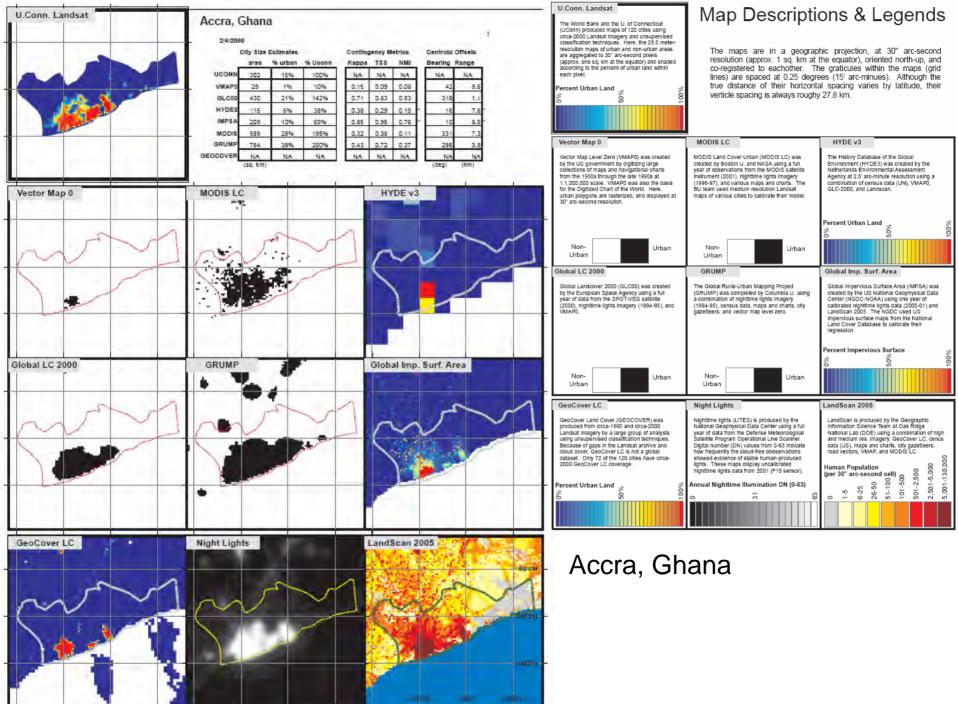


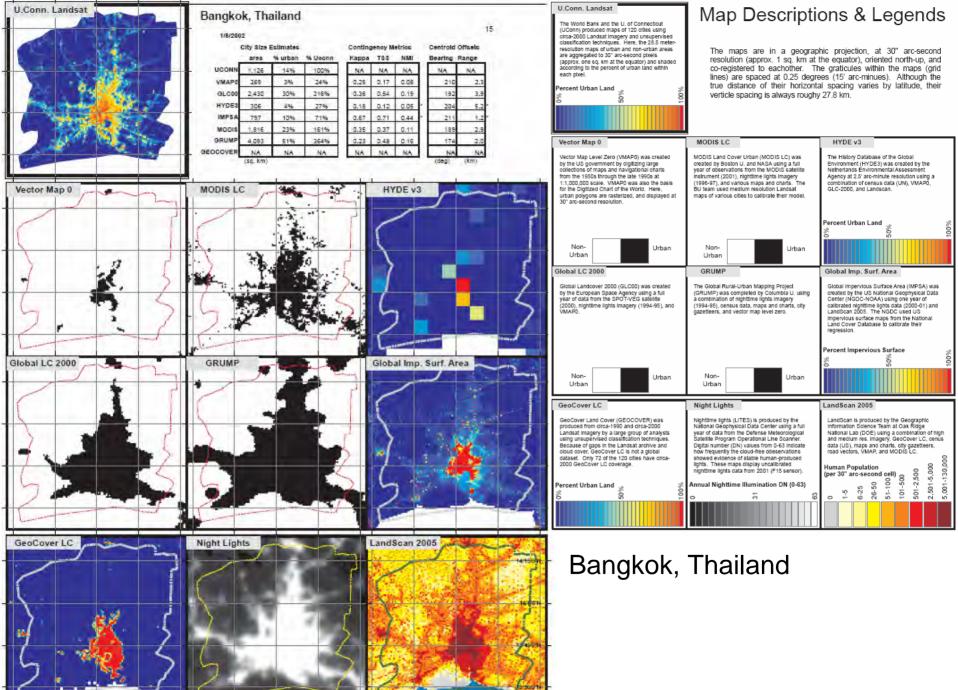


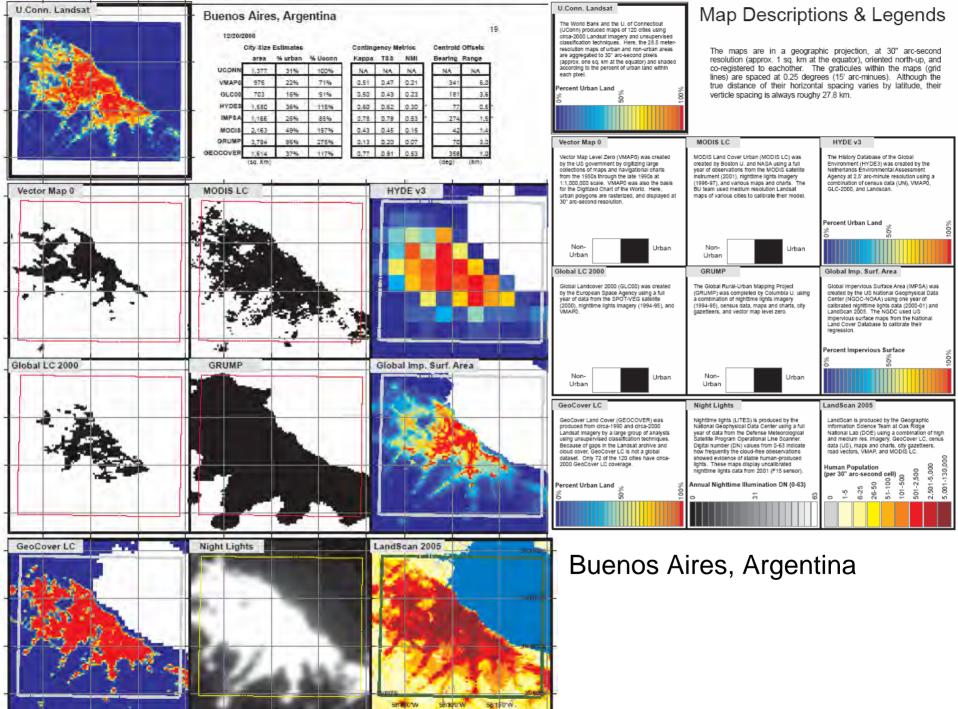


#### Methods for six Global Urban Maps

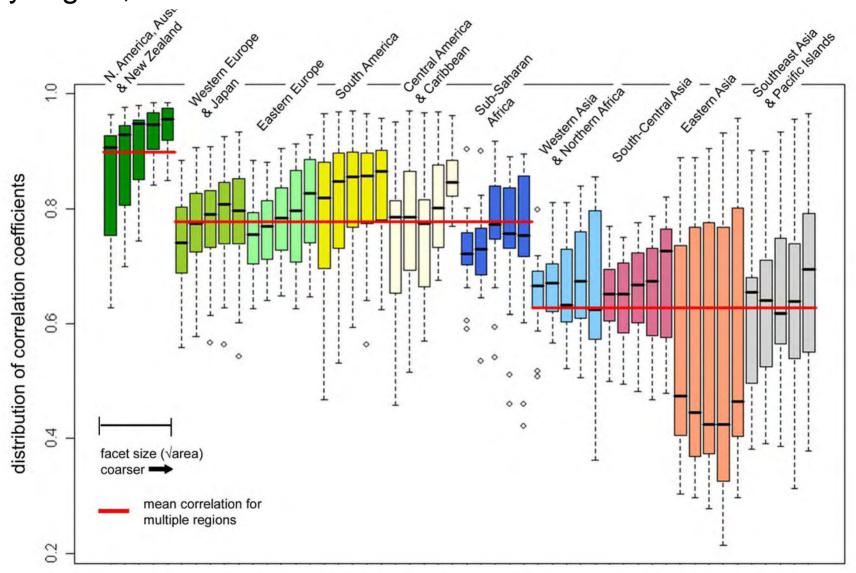
	Population	Primarily In	nage-Based		Map-Based		
	LSCAN	MODIS	GLC00	IMPSA	GRUMP	HYDE3	VMAP0
Imagery							
High Resolution	various <sup>1</sup>						
Medium Res.	GeoCover <sup>2</sup>	Landsat	Landsat	Landsat			
Coarse Res.		MODIS	SPOT-VGT				
Nighttime Lights		1994-95	1994-95	2000-01	1994-95		
Census & Maps							
Annual Census	US <sup>4</sup>				UN <sup>7</sup>	UN <sup>7</sup>	
Maps / Charts	Х	Χ	Χ		Χ		Х
City Gazetters	Х				Χ		Х
Road Vectors	Х						
Global Maps							
VMAP	lev. 0 & 1 <sup>6</sup>		lev. 0 <sup>5</sup>		lev. 0	lev. 0	
MODIS	2001						
GLC-2000						2001	
LandScan				2004		2005	



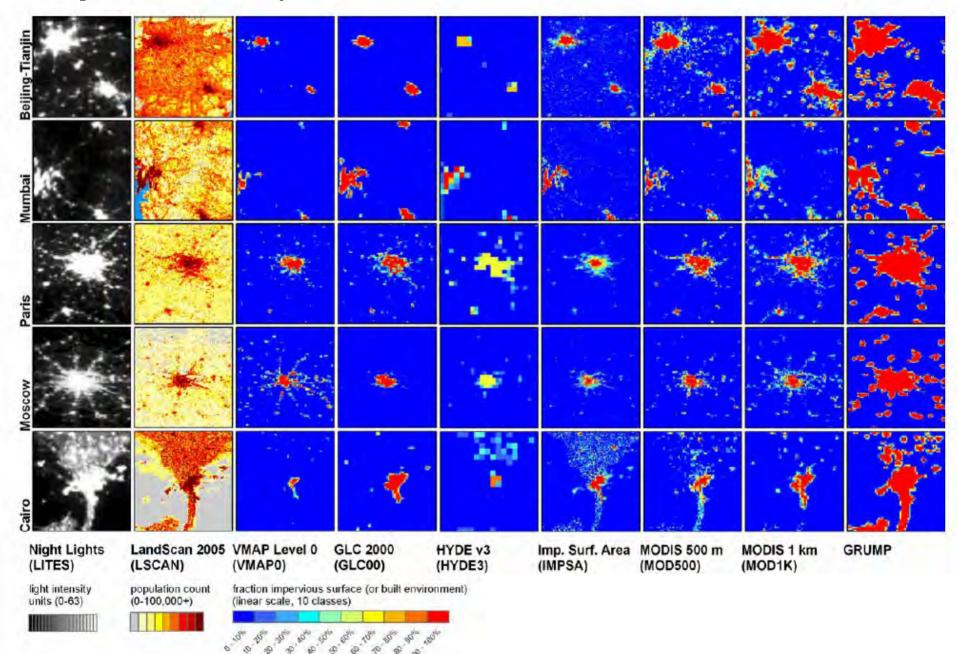


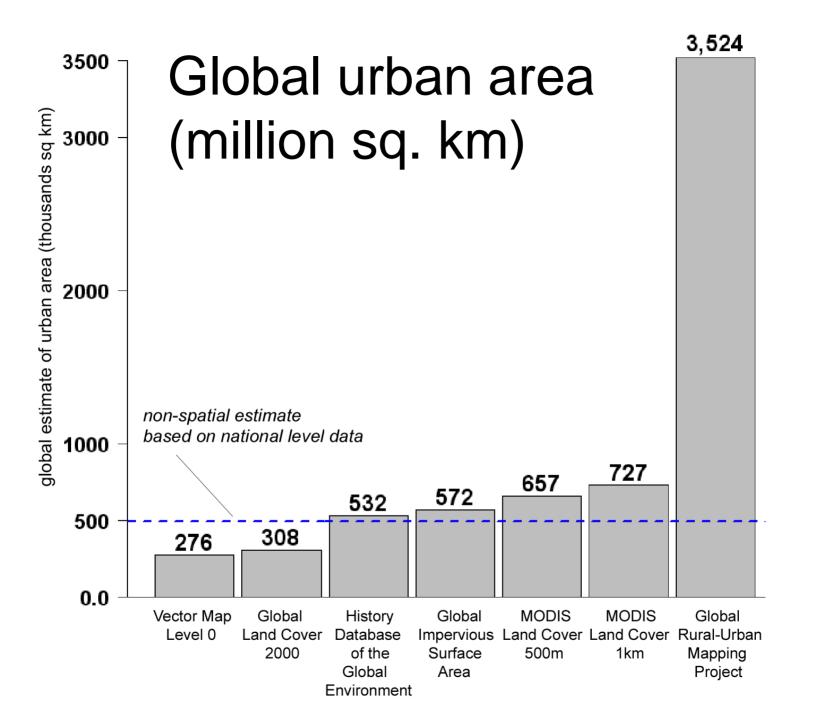


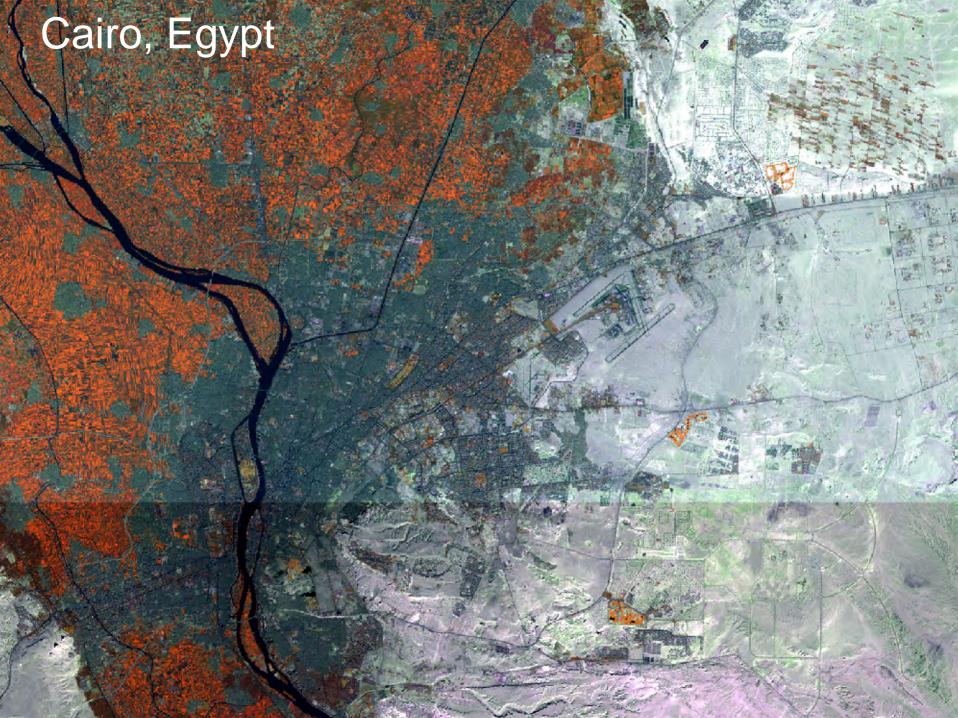
### Inter-map correlations across all 15 map pairs by region, five resolutions

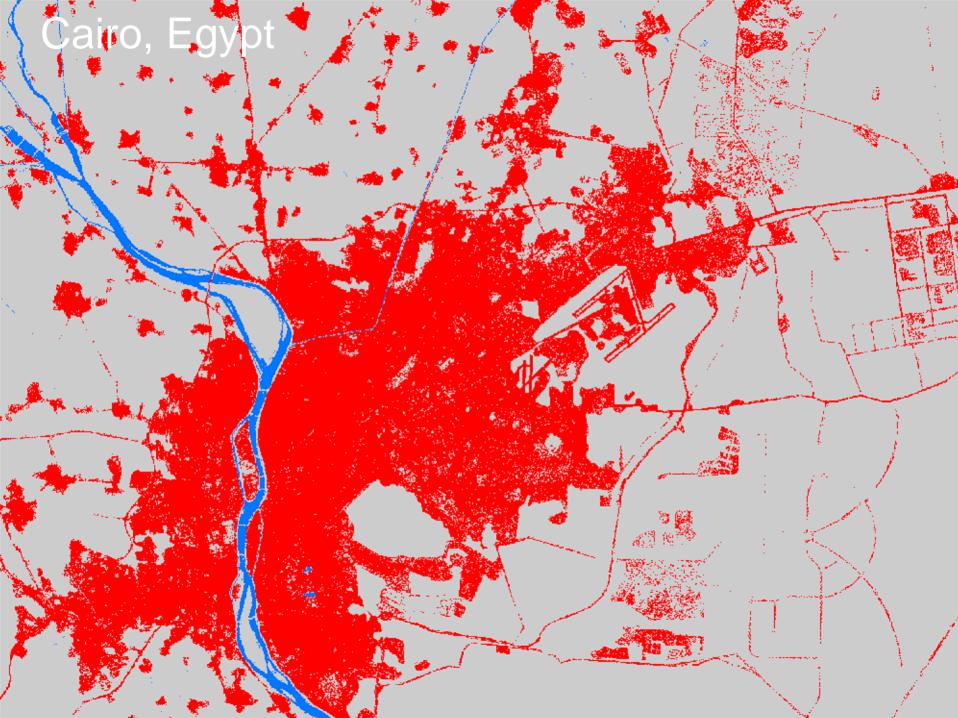


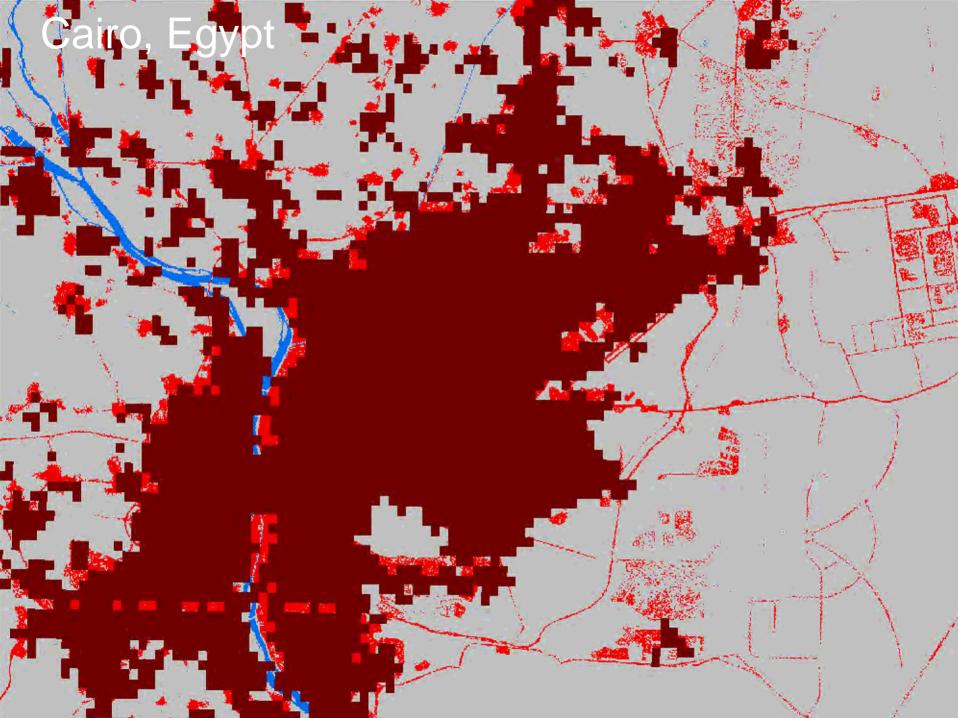
#### City-scale comparisons











City Name (Population 2000, x1	1000)	VMAP0	GLC00	HYDE3	IMPSA	MOD500	MOD1K	GRUMP	Regional Omission Rates
Zhengshou, China	(2,070)		0						East Asia (56%) (9/16)
Yulin, China	(1,558)	<5	0						
Leshan, China	(1,373)	<5							
Yiyang, China	(1,343)		0					<5	
Ulan Bator, Mongolia	(738)			<5					
Changzhi, China	(594)		0						
Anging, China	(566)		0						
Chinju, Korea	(287)		0						
Chonan, Korea	(114)		<5						
Baku, Azerbaijan	(1,936)		<5						W. Asia (63%) (5/8)
Sanaa, Yemen	(1,653)		<5						
Yerevan, Armenia	(1,407)		0						
Malata, Turkey	(437)		0						
Zugdidi, Georgia	(105)		<5						
Gorgan, Iran	(189)		0						SC Asia (6%) (1/16)
Cebu, Philippines	(719)						<5		SE Asia (8%) (1/12)
Vallendupar, Columbia	(274)		0						Latin Am. (19%) (3/16)
Ilheus, Brazil	(162)	0	_						
Jequie, Brazil	(130)	0	<5						00.46: (470/) (0/40)
Banjul, Gambia	(399)	<5	_						SS Africa (17%) (2/12)
Kigali, Rwanda	(351)	<5	0						
Port Sudan, Sudan	(384)	<5	0					<5	N. Africa (25%) (2/8)
Tebessa, Algeria	(163)	<5							000 - 5 (000) (4/00)
Fukuoka, Japan	(1,341)		<5						ODC + Europe (3%) (1/32)
Total (	Omissions	8	18	1	0	0	1	2	
Omission Rate (	120 cities)	7%	15%	1%	0%	0%	1%	2%	
		VMAPO	GLC00	HYDE3	IMPSA	MOD500	MOD1K	GRUMP	
				_		_	_	0	

# Why do protected areas matter?

- How do urban and protected areas interact?
- Why is urban expansion a concern?

- Prevent large, permanent biodiversity losses
- Provide ecosystem services
- Improve human health and well-being
- Direct urban incursions on protected areas
- Alterations in local-to-regional ecosystems (climate, biodiversity, pollution, etc.)
- Two billion new urbanites through 2030
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