

Monitoring Development from Space

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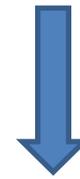
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2. Data: Ground VS Space

3. Some Remote Sensing Data

- Nighttime Light (DMSP-OLS)
- Land Cover (MODIS)
- Population (LandScan)

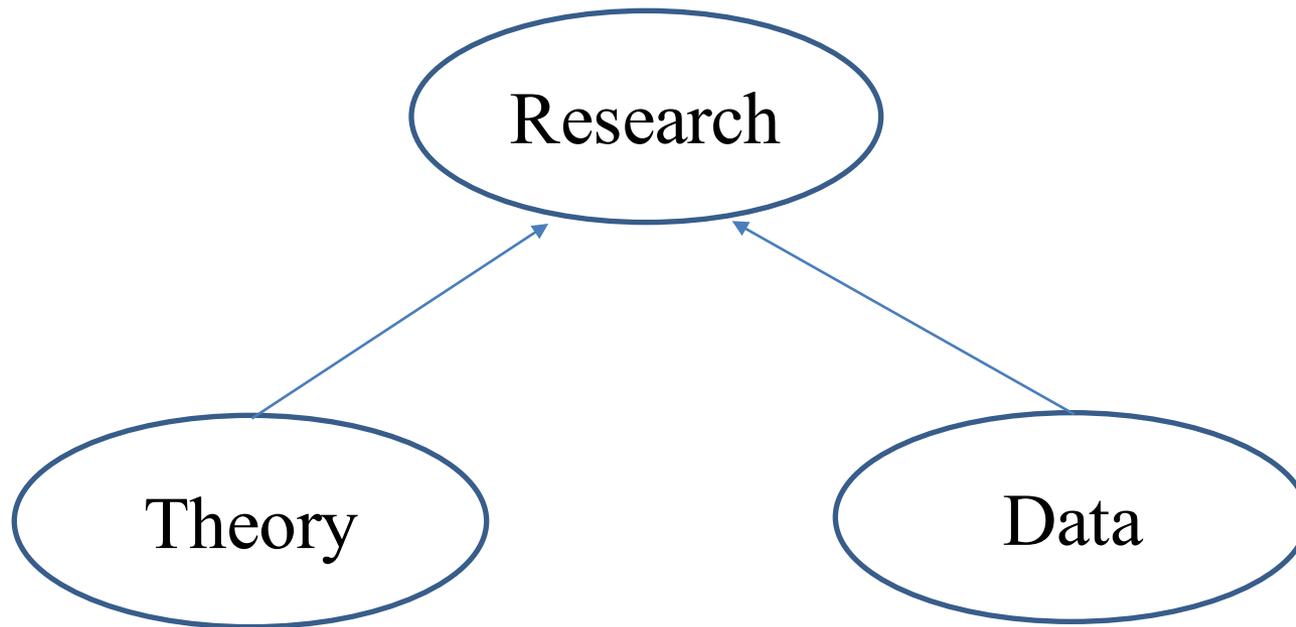


less preprocessing

more preprocessing

4. Some Applications of Remote Sensing Data in Economics

5. Concluding Remarks



too much emphasis on theory (in economics)

→ better theory, better data, better research

(better) data {
 (more precise presentation of) value
 (better presentation of) place
 (better presentation of) time
 (better) coverage

Data

Ground

Pros

- In-depth information
- User oriented (open-ended)

Cons

- High marginal cost
- Low spatial resolution
- Low temporal frequency
- Narrower coverage
- (Mostly) subjective

Space

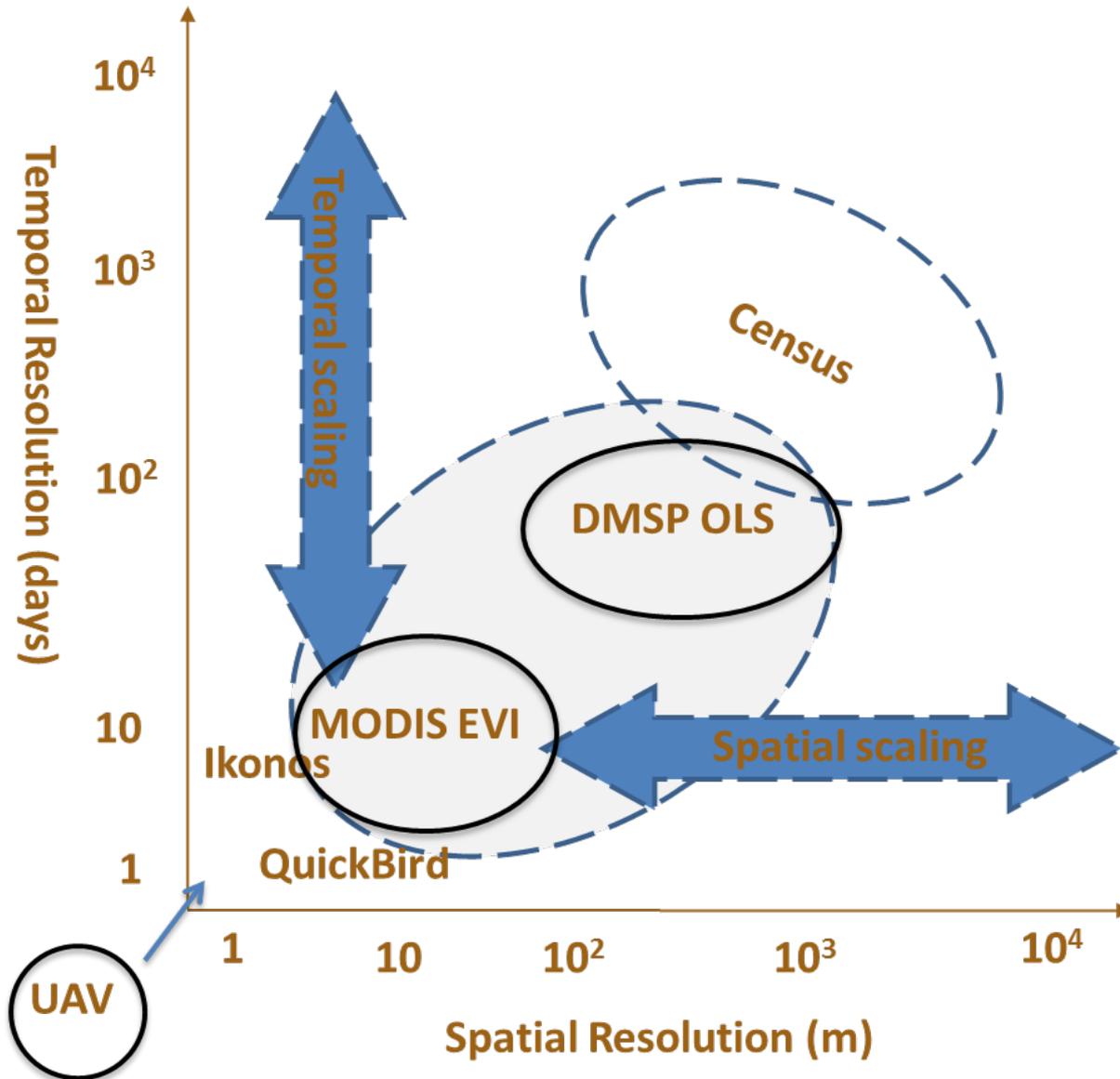
Pros

- Low marginal cost
- High spatial resolution
- High temporal frequency
- Wider coverage
- Objective

Cons

- Pre-defined information
- Heavy preprocessing
- Unfriendly format (to human)

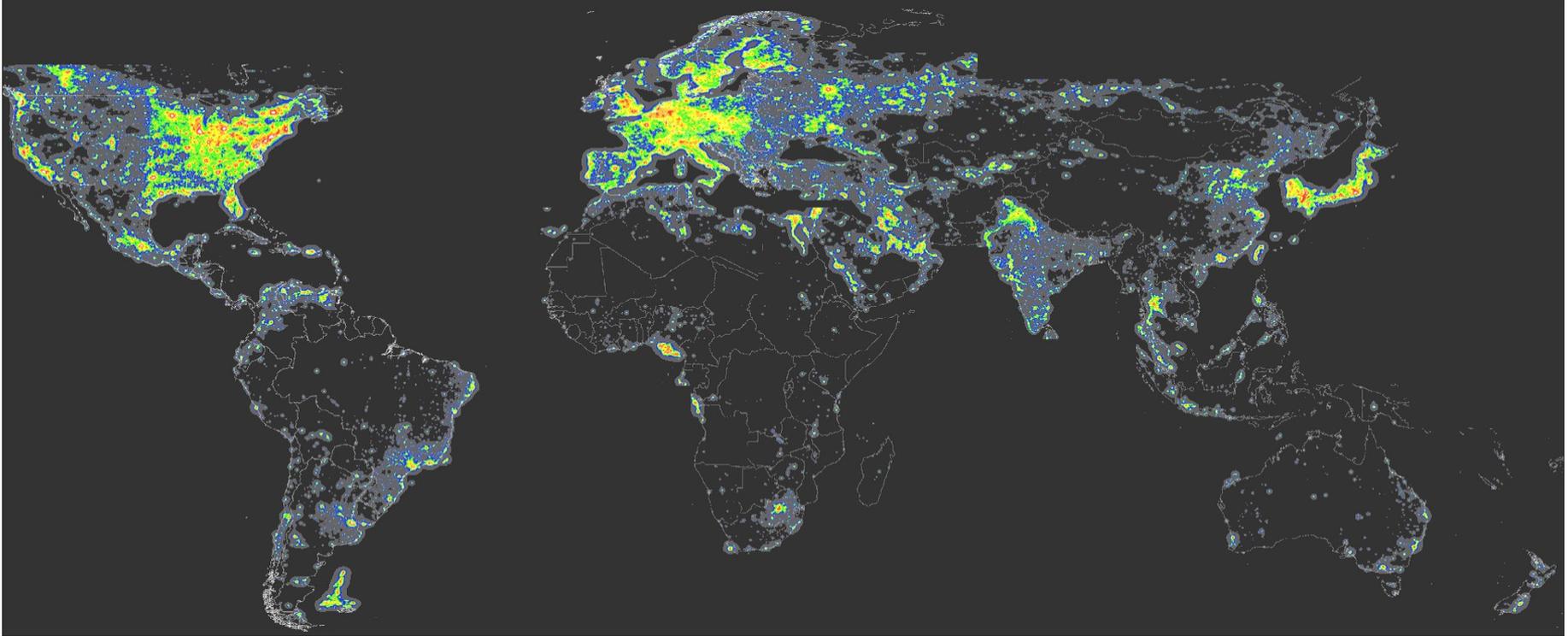
Spatial and Temporal Resolution of Data



Some Remote Sensing Data

Nighttime Light Data

The Richer the Region, The Brighter It seems from Space



Nighttime Light (index)

Spatial Resolution : approximately 1 km X 1km

Frequency: twice daily (raw data)

Value: 0-63

Cost: Free



Ground surveys

Spatial Resolution: country, city, region

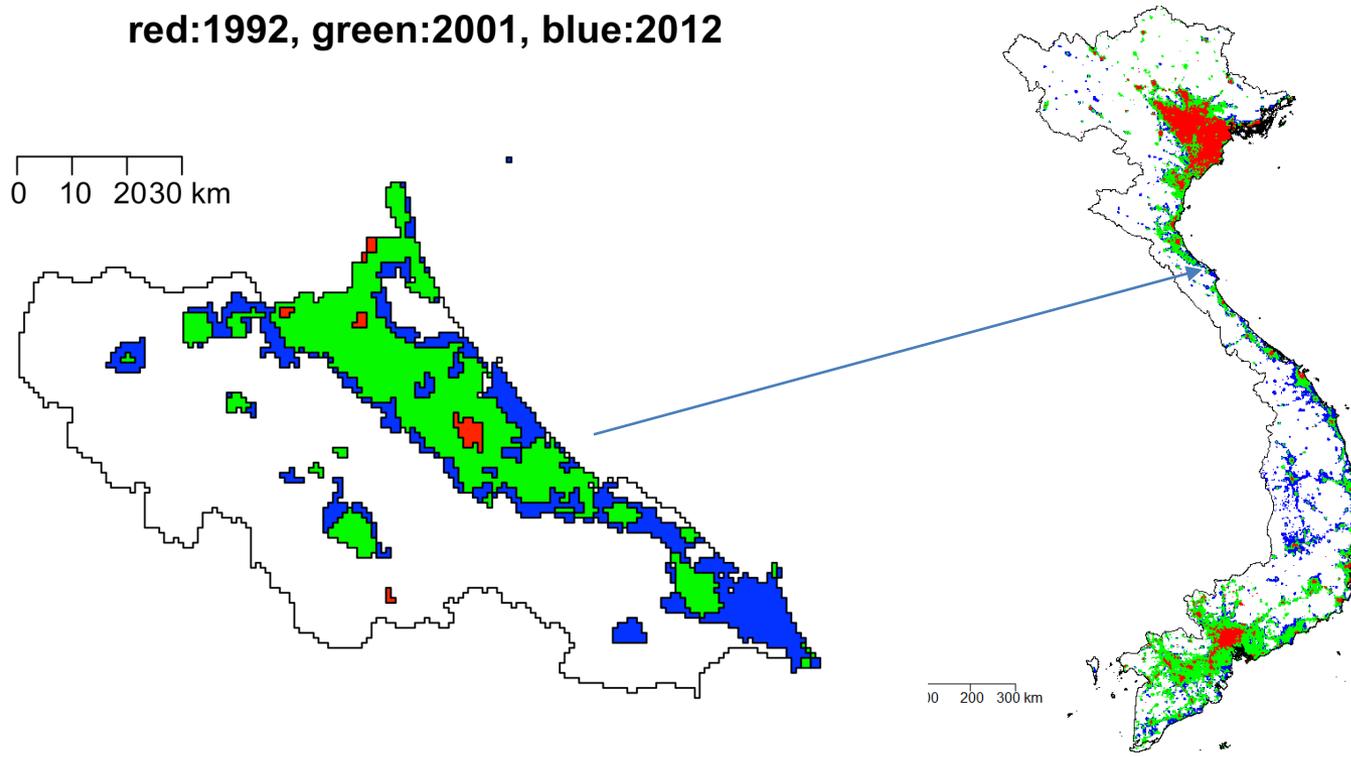
Frequency: often yearly

Value: variable

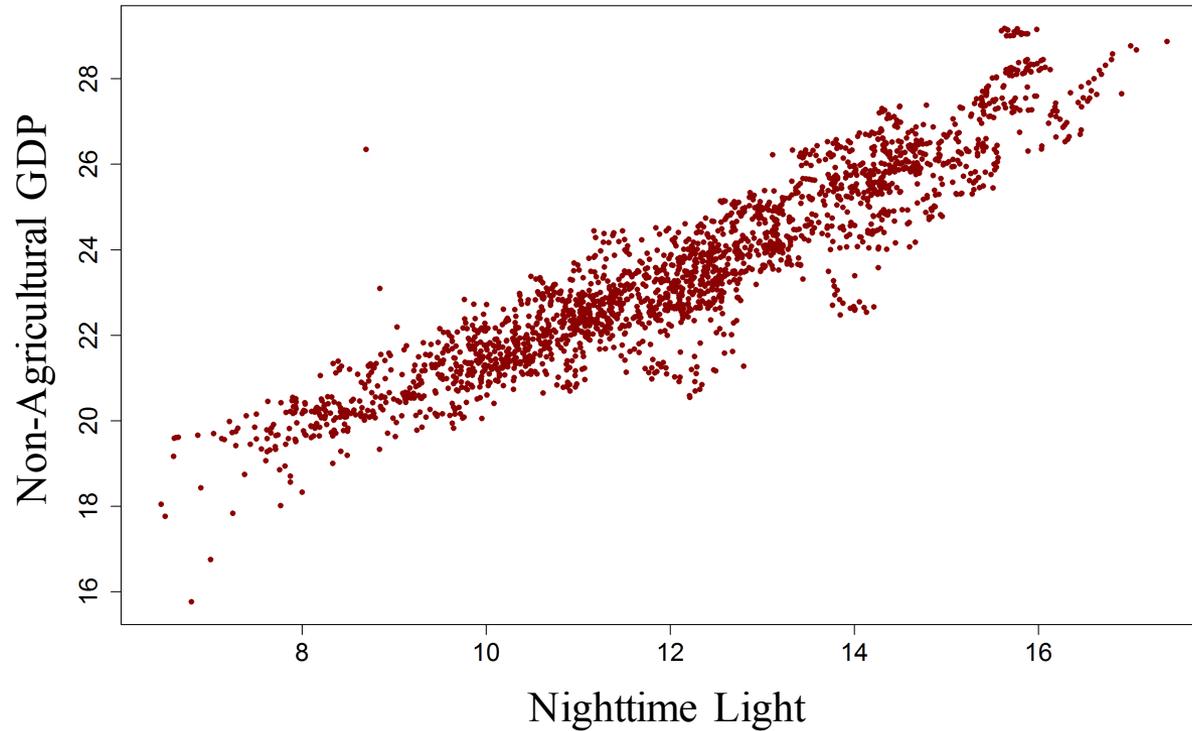
Cost: expensive and time consuming

Urban Area Expansion Measured by Lighted Area

Lit Area Expansion
Viet Nam/Ha Tinh
red:1992, green:2001, blue:2012



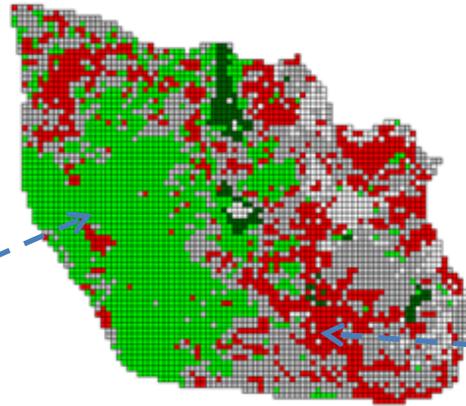
Nighttime Light and Non-Agricultural GDP



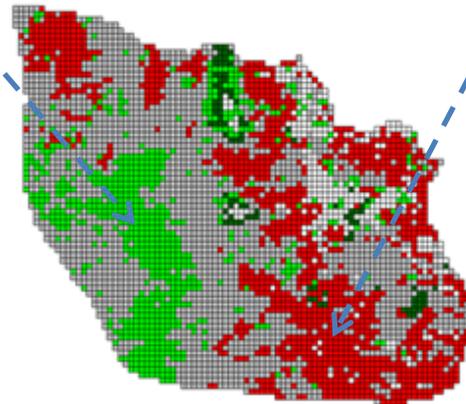
Land Cover (MODIS)

Land Cover Change of a District in Lao PDR

2002



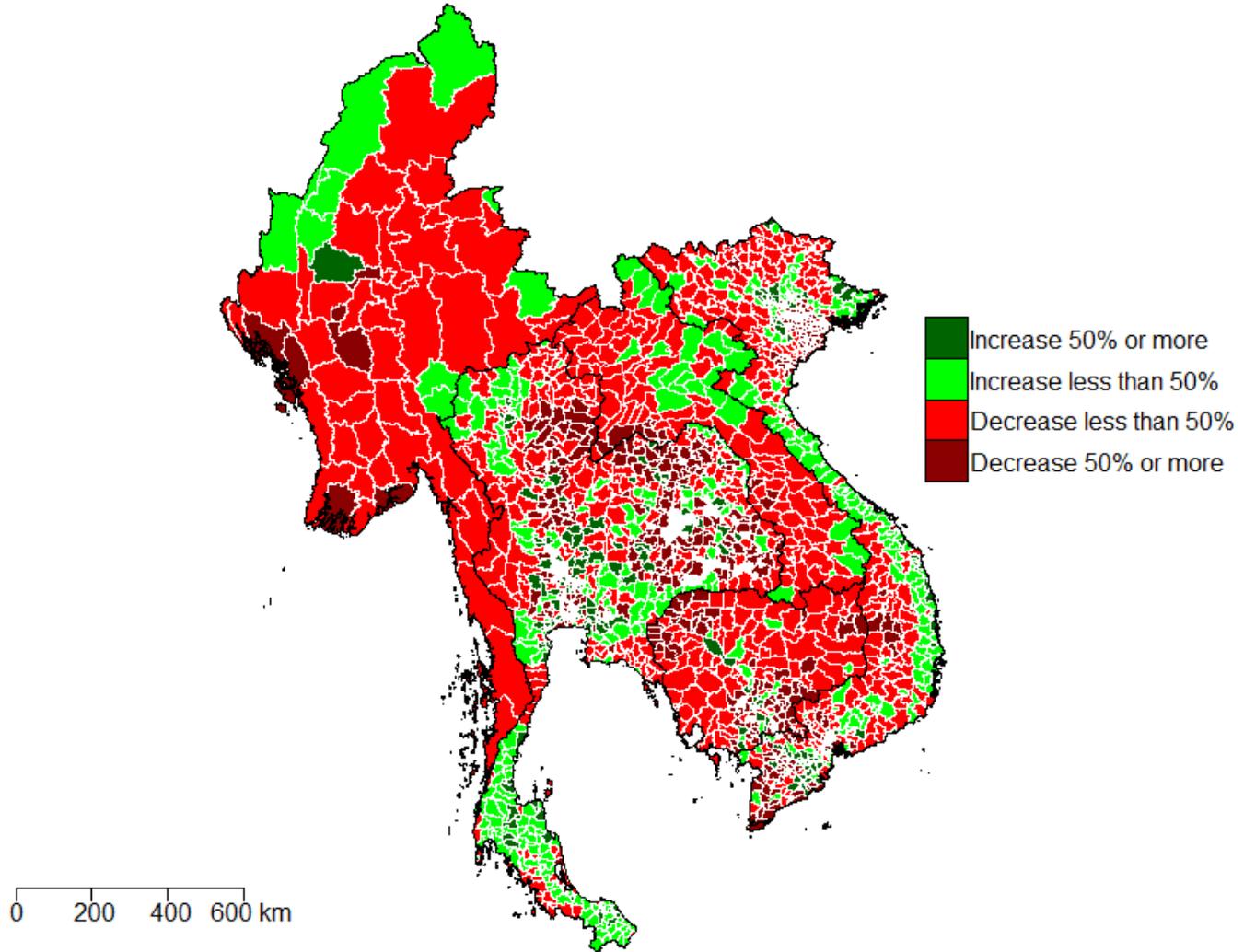
2009



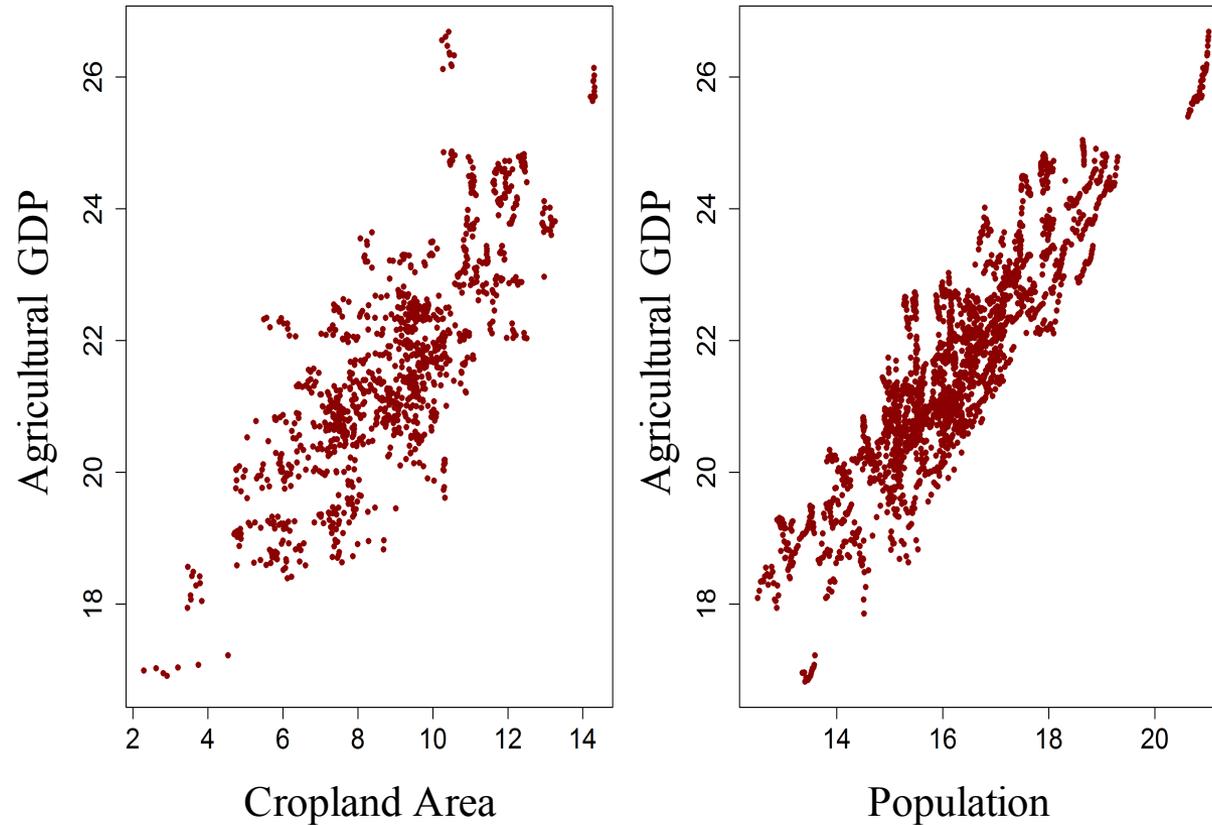
Forest area decreased

Larger Human Habitat

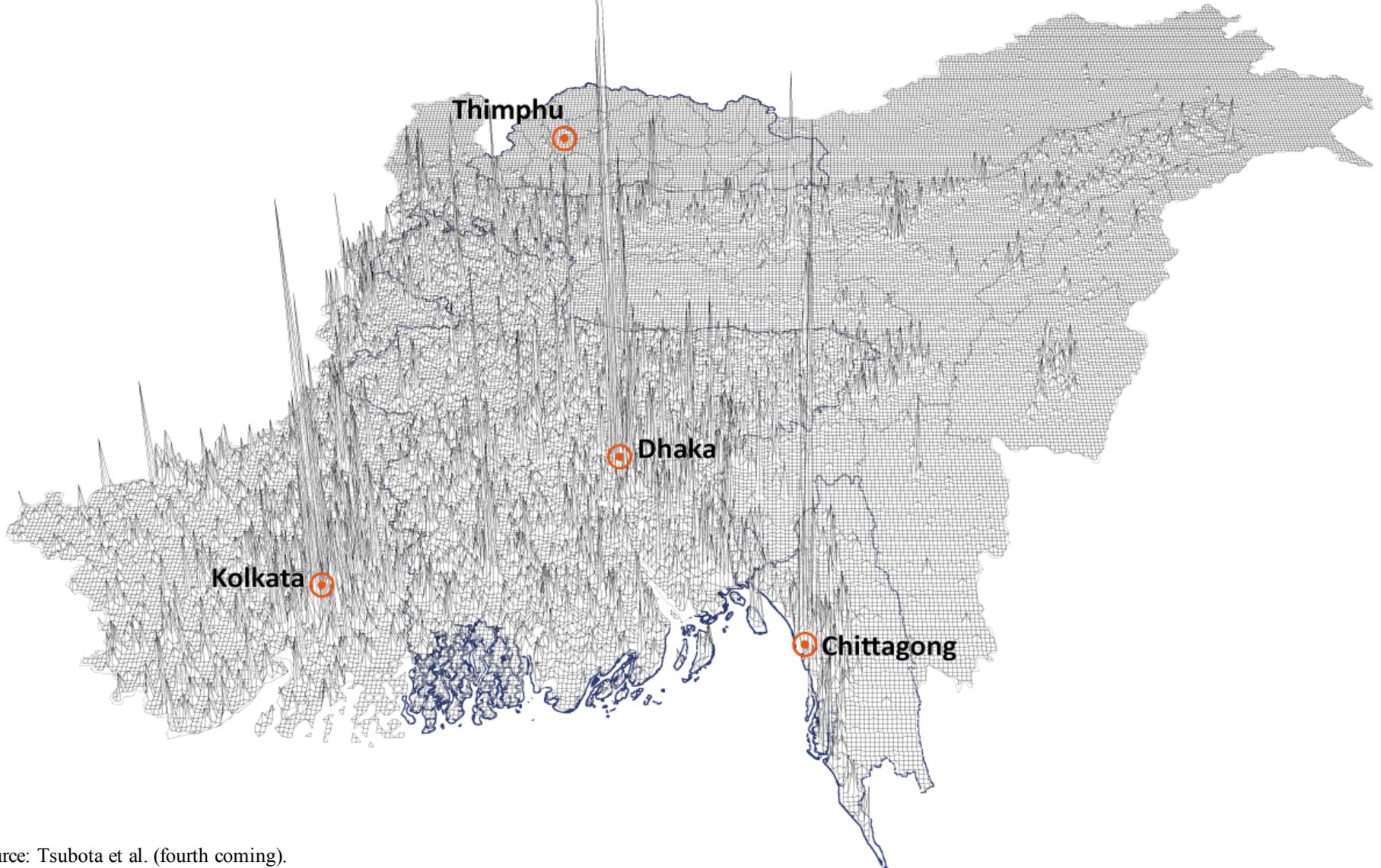
Forest Area Change 2001-2009



Cropland, Population and Agriculture GDP

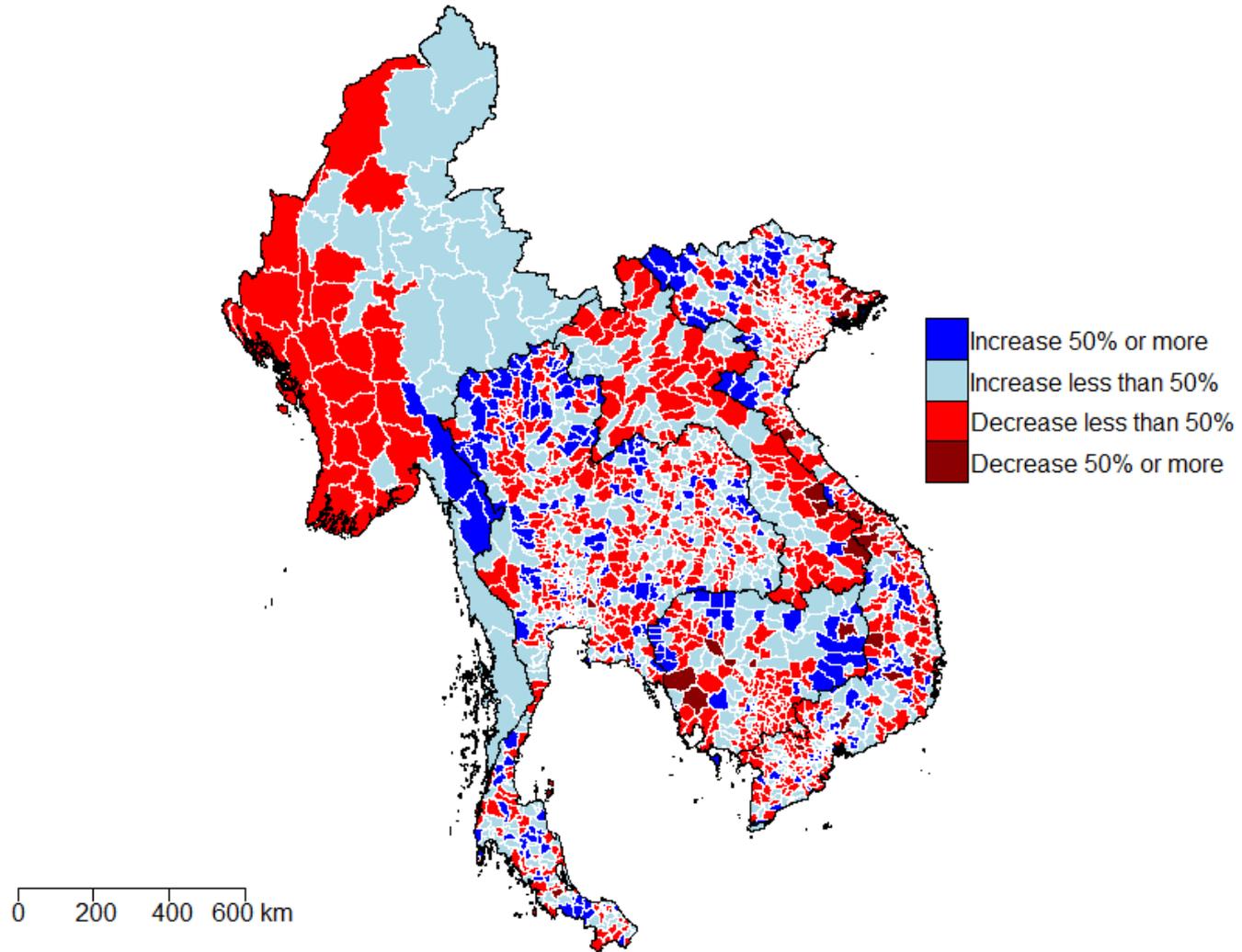


LandScan (Population) in Bangladesh and Surrounding Areas (2010)

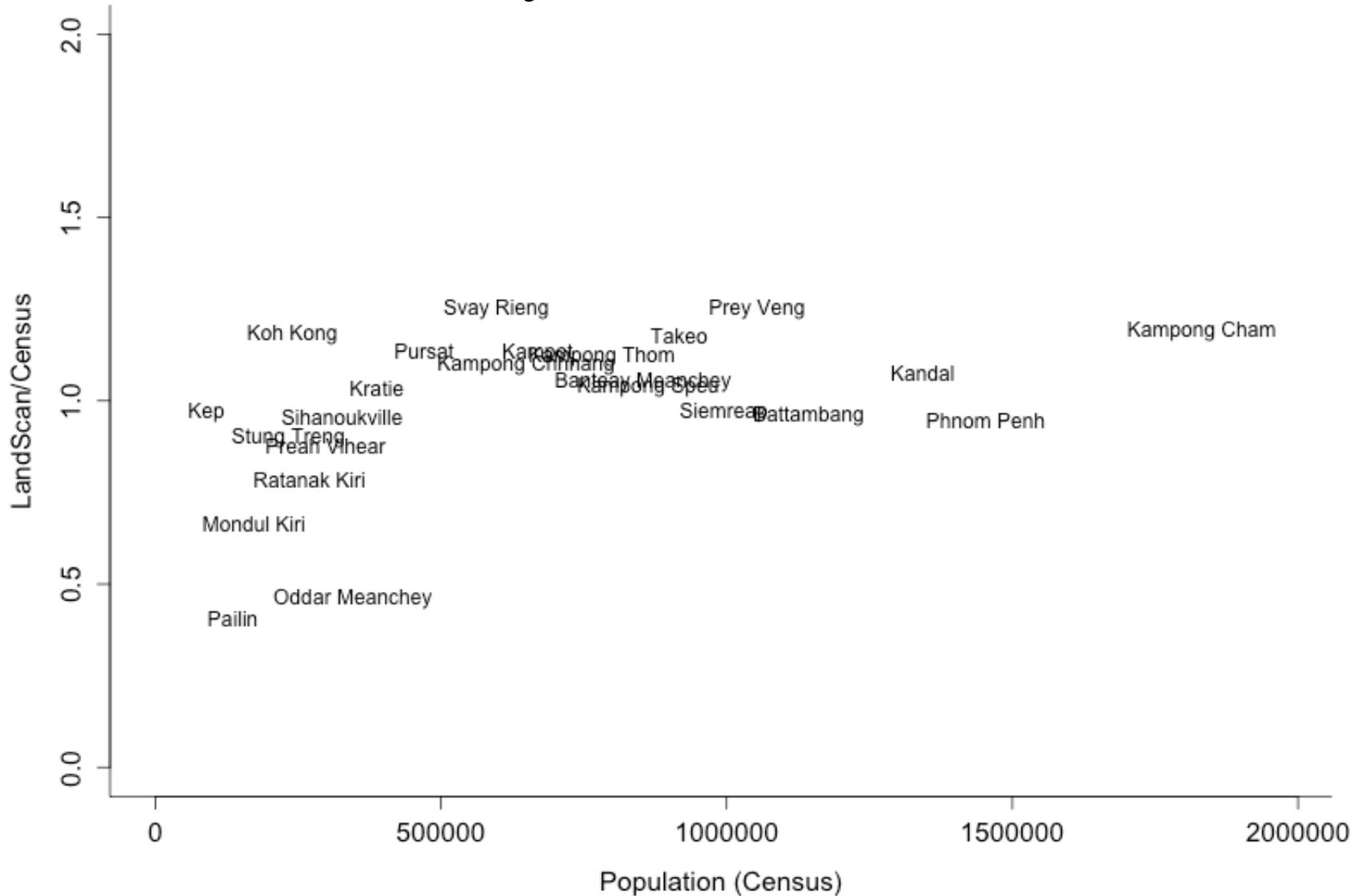


LandScan (Population)

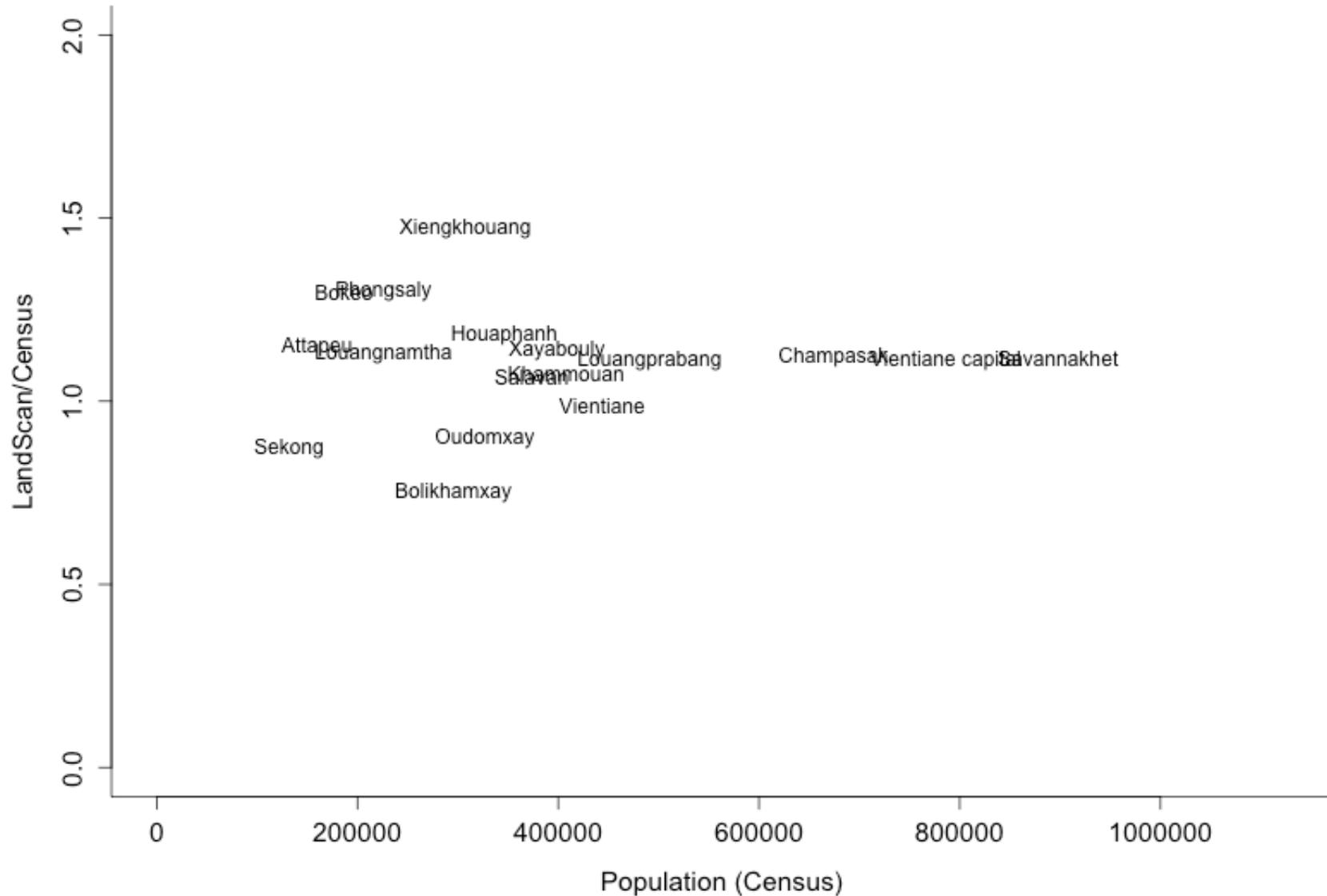
2001-2011



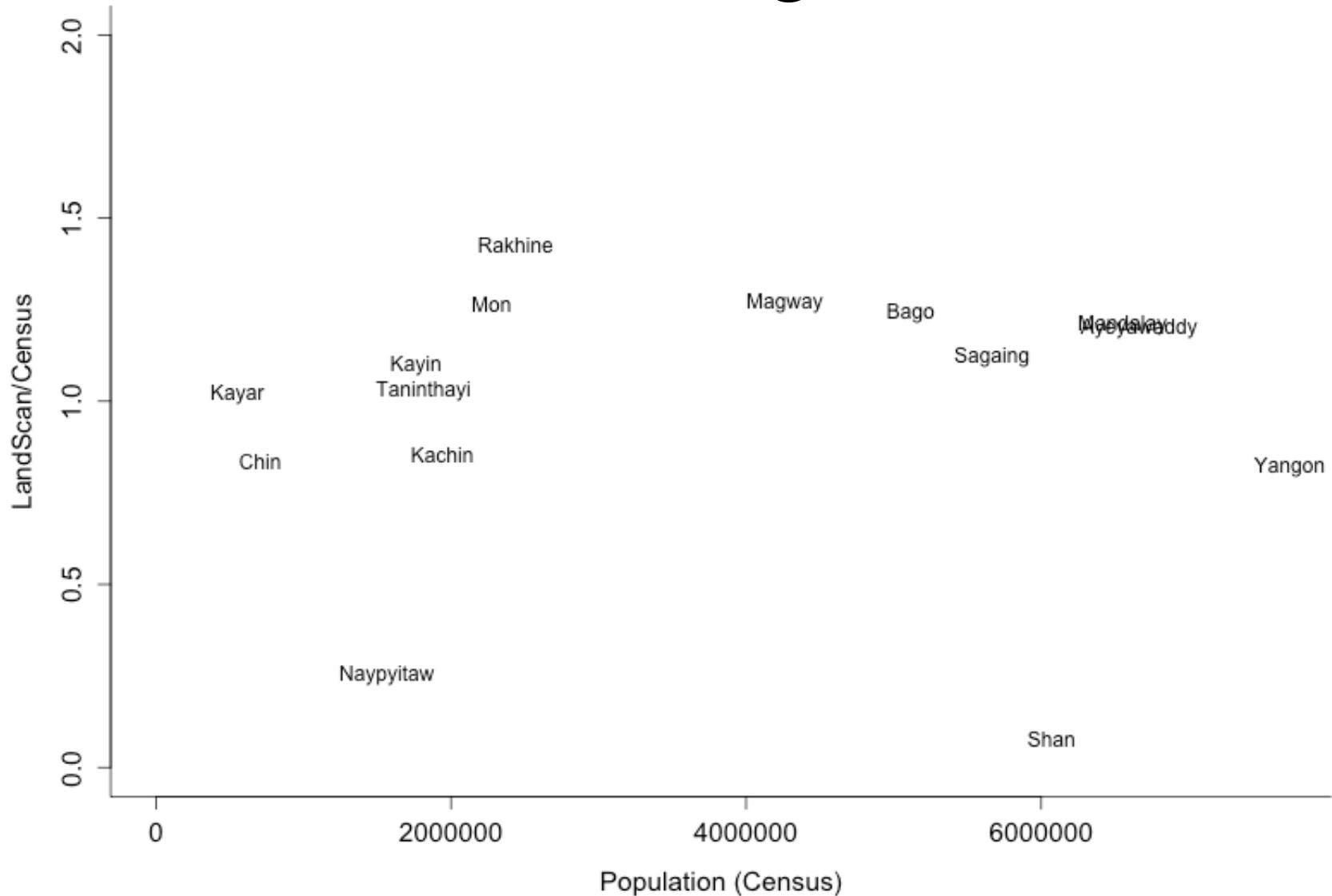
LandScan (Population) in Cambodia by Provinces



LandScan (Population) in Lao PDR by Provinces

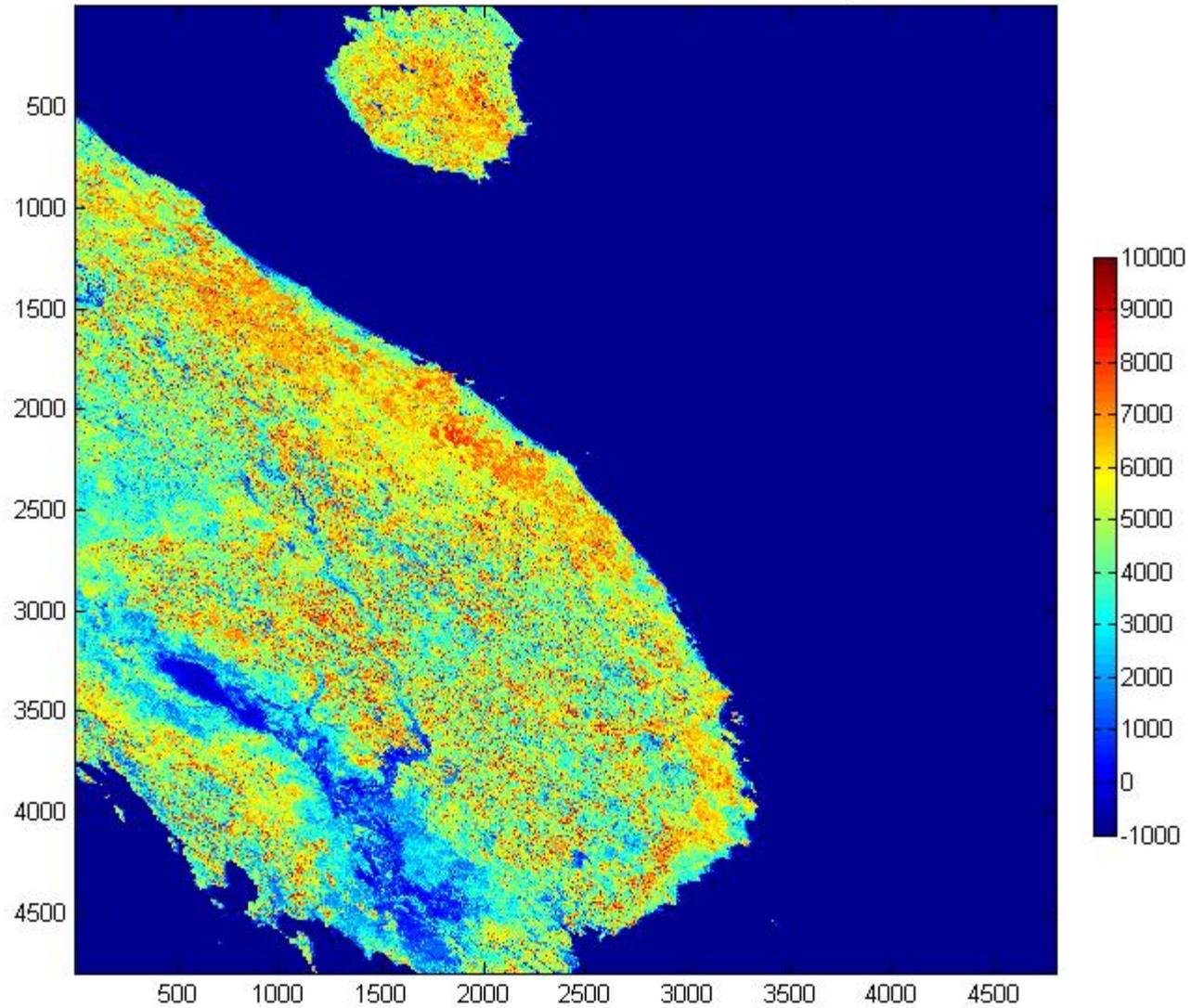


LandScan (Population) in Myanmar by States/Regions

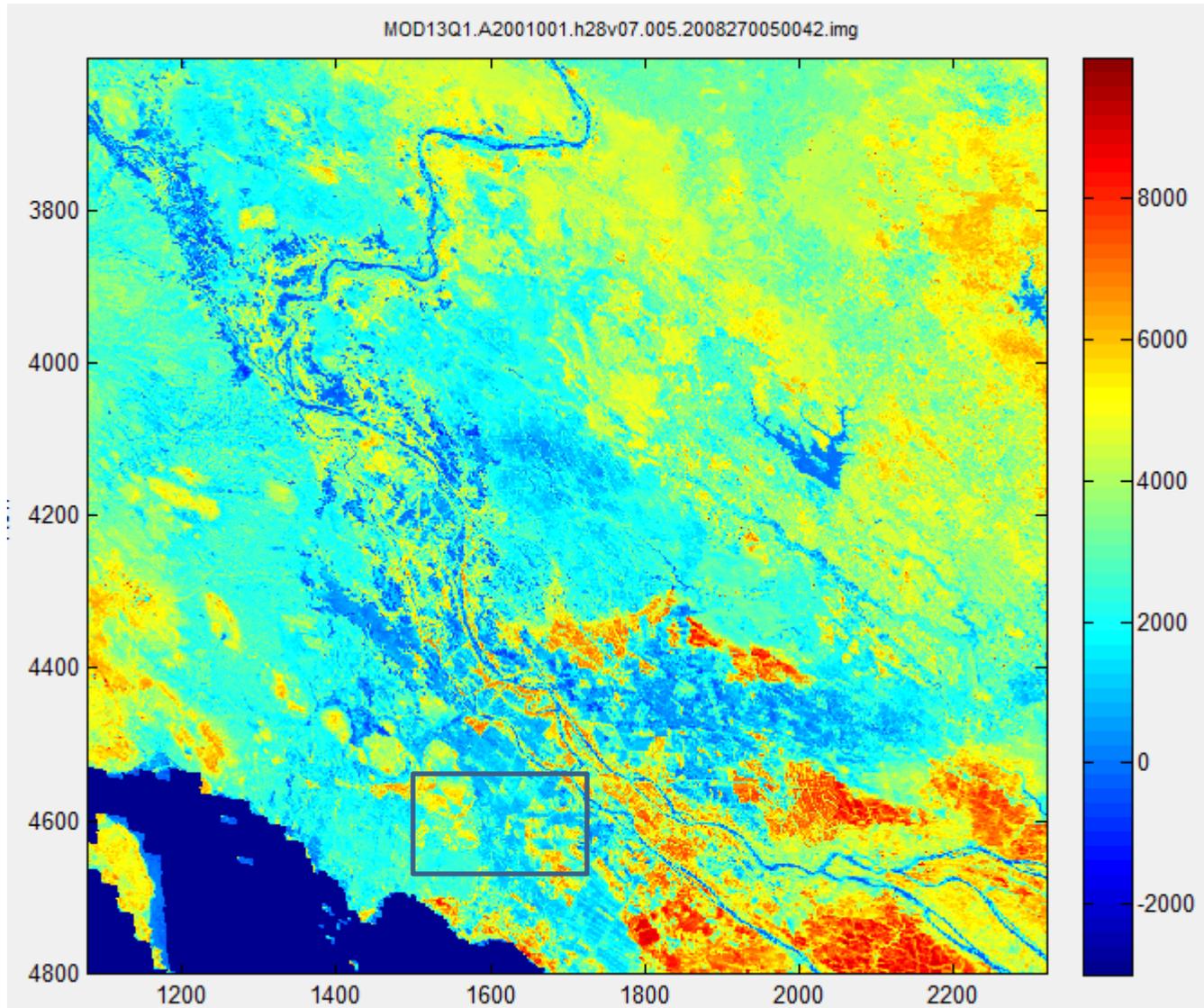


Southern Vietnam

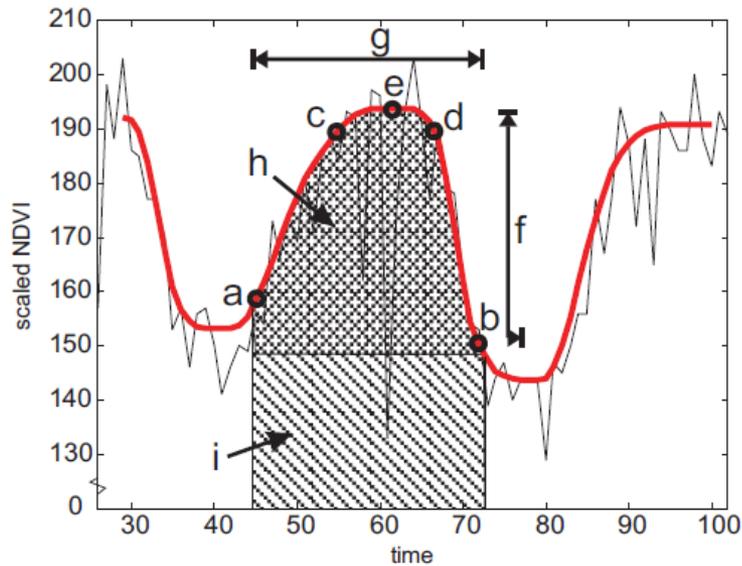
MOD13Q1.A2001225.h28w07.005.2007050115033.img



An Giang Province



Extraction of Seasonal Parameters



Eklundh & Jönsson

1. Rice production provinces:

The Coordinates of An Giang Province:

10° 30' 0" N, 105° 10' 0" E

The Coordinates of Dong Thap Province:

10° 40' 0" N, 105° 40' 0" E

2. Coffee production provinces:

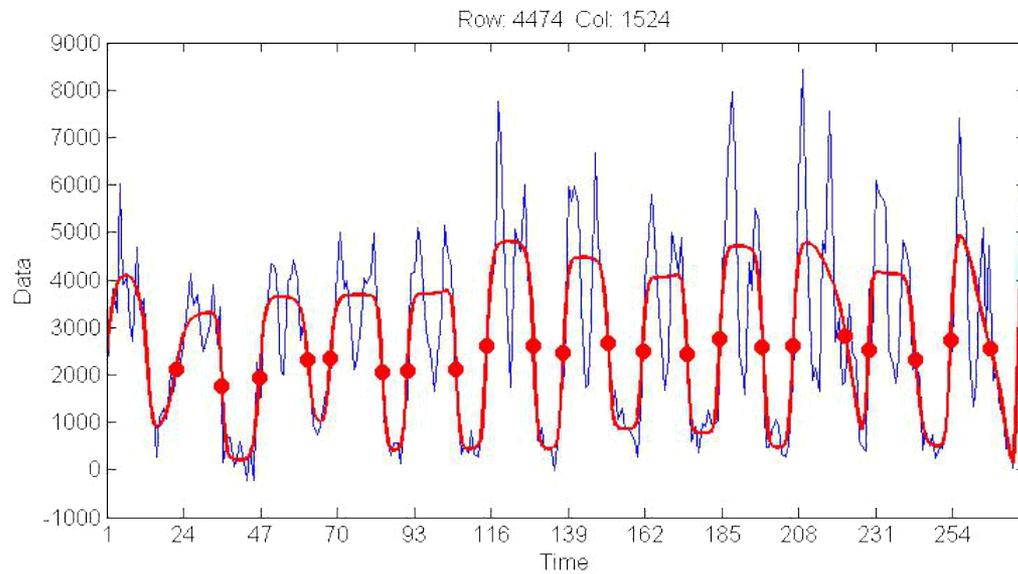
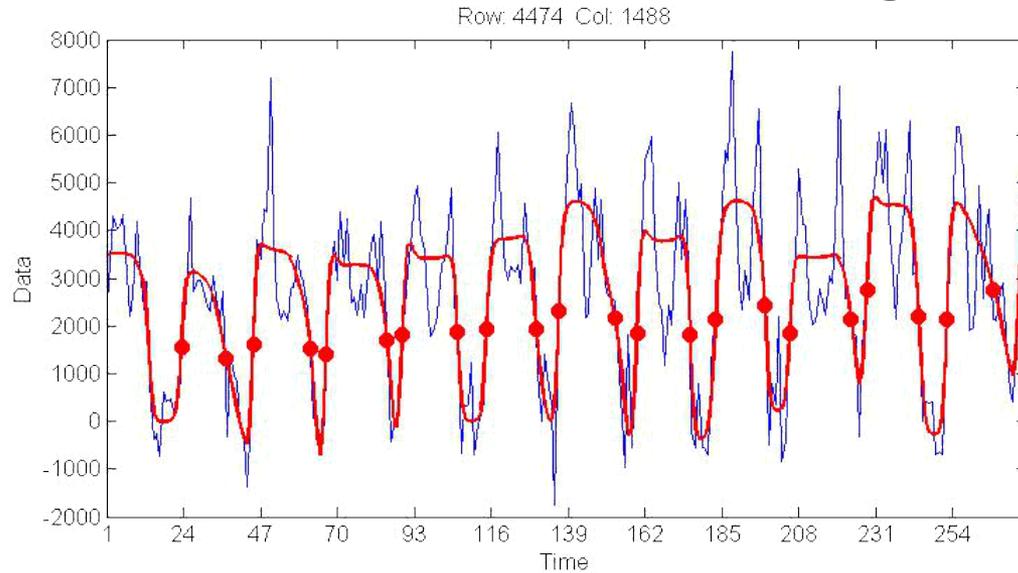
The Coordinates of Dak Lak Province:

12° 40' 0" N, 108° 3' 0" E

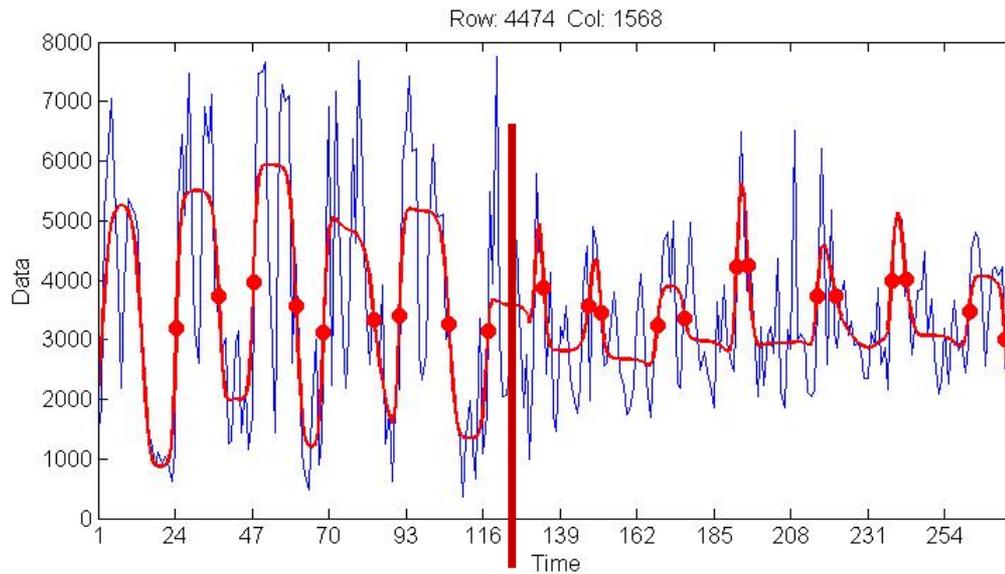
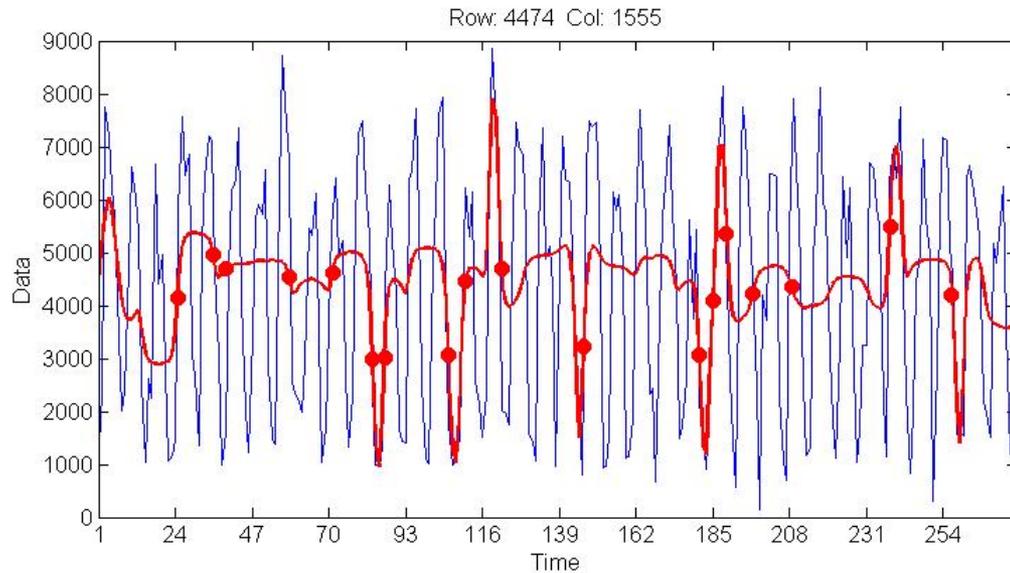
The Coordinates of Lam Dong Province:

11° 57' 0" N, 108° 26' 0" E

Rice Cultivation Signatures



Rice Cultivation Signatures



Some Applications of Remote Sensing Data

Estimating Non-Agricultural Growth with Nighttime Light Data (National Level)

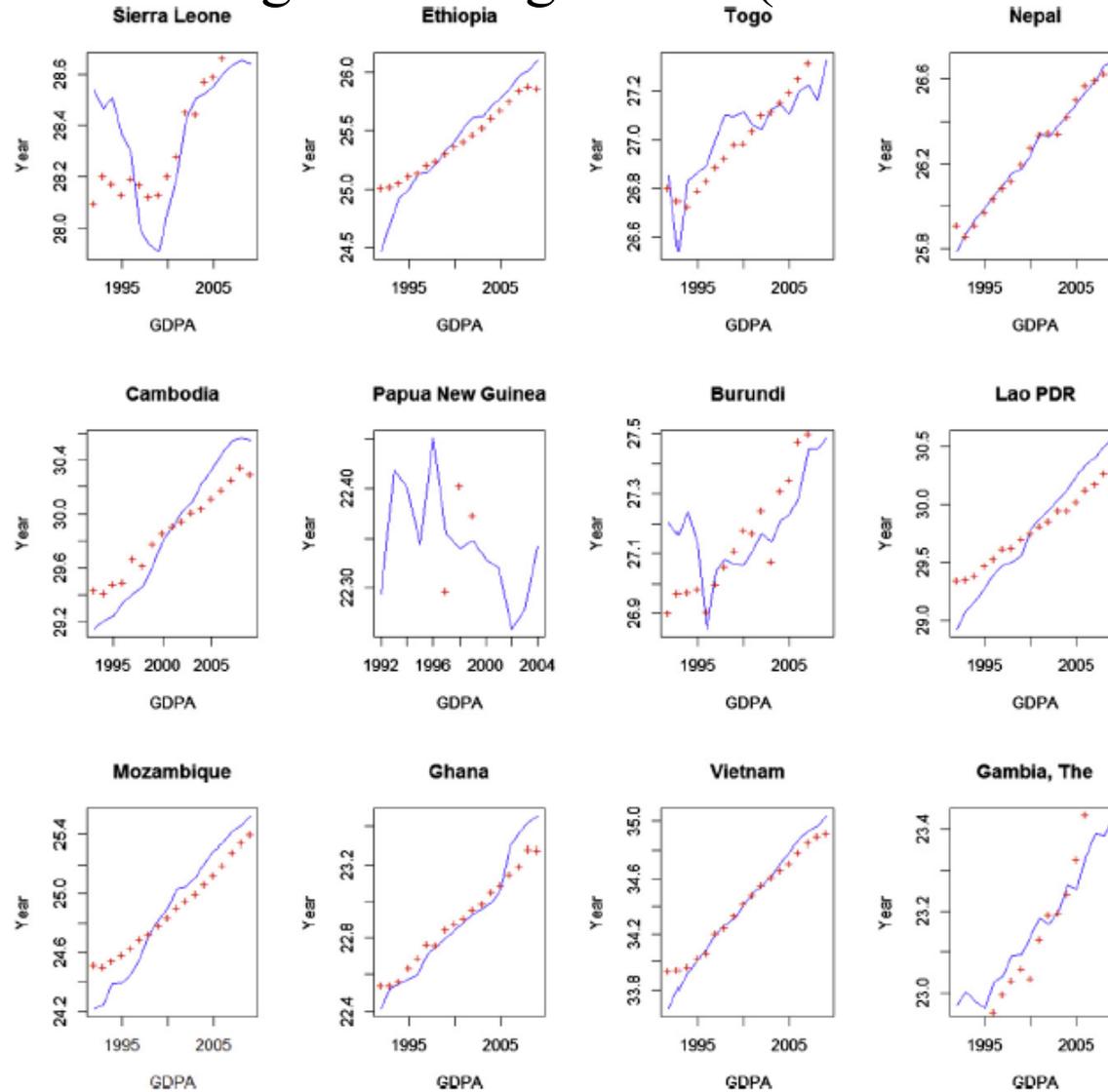


Figure 5. Fit of non-agriculture's GDP for selected countries with large agricultural sector. Source: World Development Indicators and Estimated by Authors.
Note: Natural log of real GDP in local currency. Real line represents official figures, crossed line is authors' estimations.

Estimating Agricultural Growth with Land Cover Data (National Level)

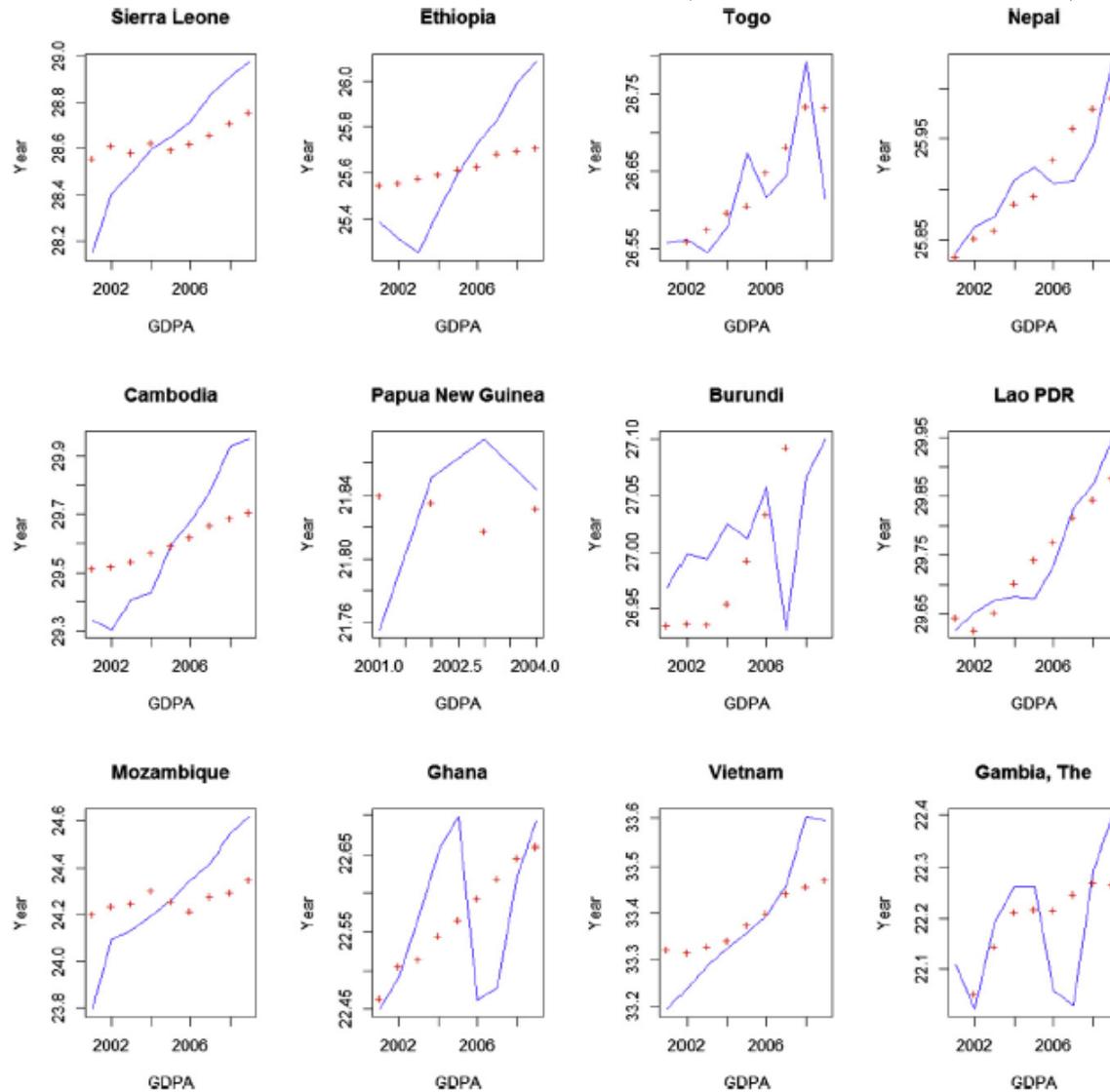
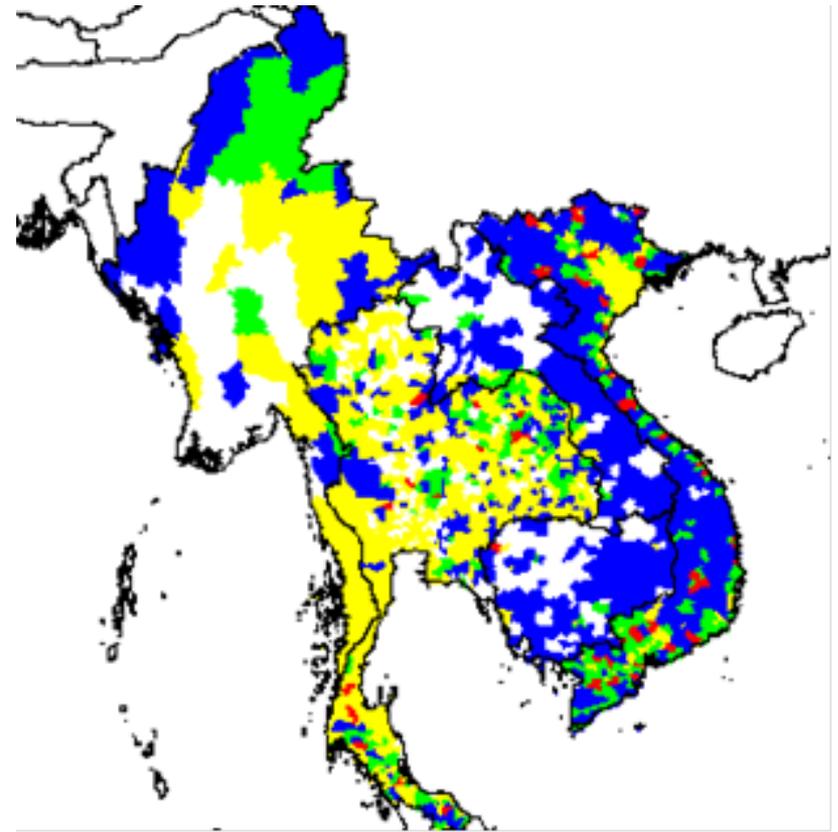
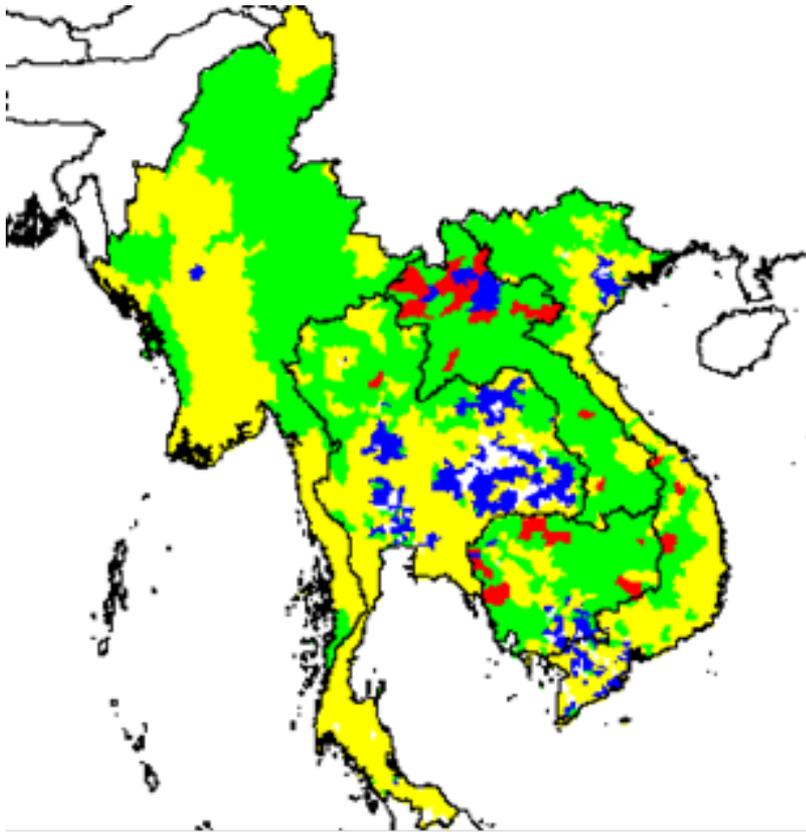


Figure 6. Fit of agriculture's GDP for selected countries with large agricultural sector. Source: World Development Indicators and Estimated by Authors. Note: Natural log of real GDP in local currency. Real line represents official figures, crossed line is authors' estimations.

Spatially Disaggregating Growth Figures with Remote Sensing Data

Agriculture
(annual average 2002-2009)

Non-Agriculture
(annual average 1992-2009)



Source: Estimated by Authors.

Figure 10 – Average Growth of Agriculture and Non-Agriculture in Indochinese Peninsula (Cambodia, Laos, Myanmar, Vietnam, Thailand).

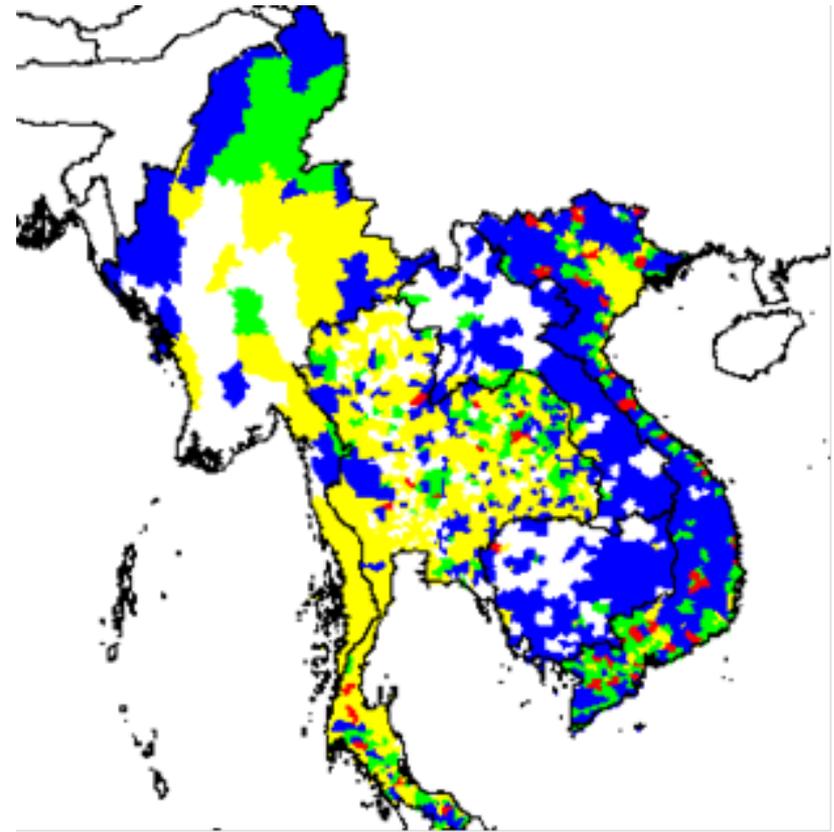
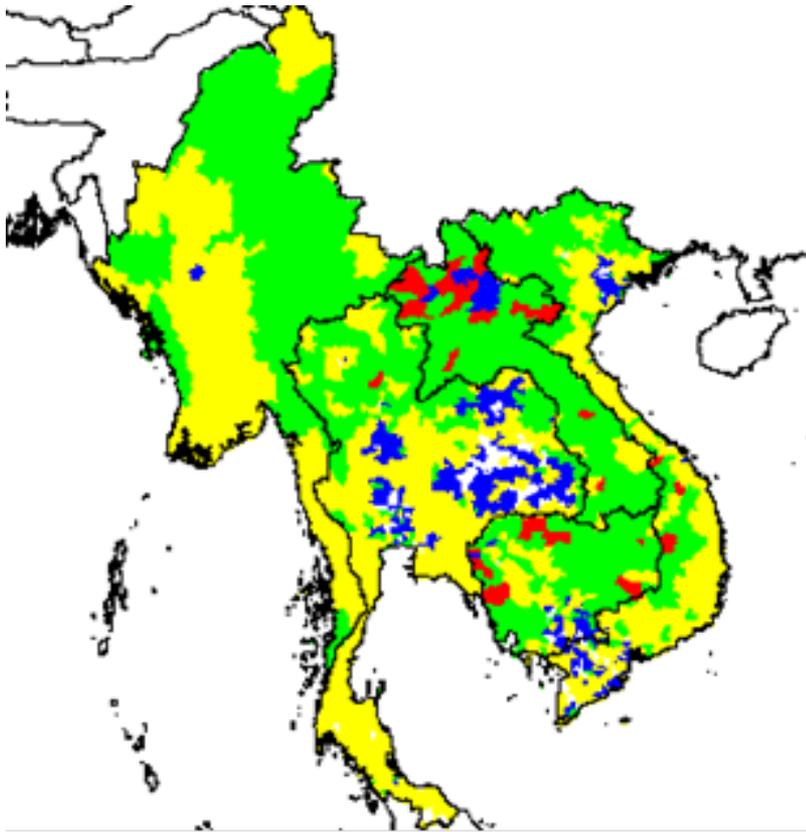
Note: White: -0, Yellow: 0-0.025, Green: 0.025-0.05, Red: 0.05-0.075, Blue: 0.075-

Source: Keola et al. (2015).

Spatially Disaggregating Growth Figures with Remote Sensing Data

Agriculture
(annual average 2002-2009)

Non-Agriculture
(annual average 1992-2009)



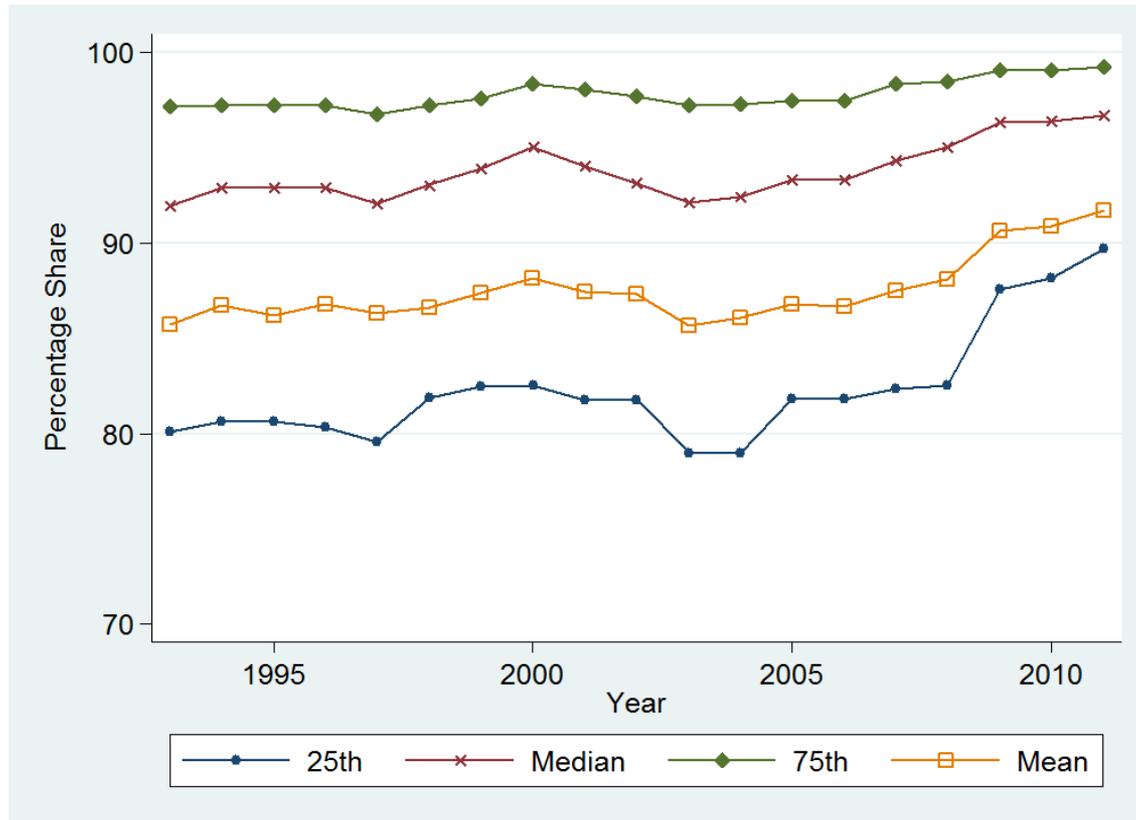
Source: Estimated by Authors.

Figure 10 – Average Growth of Agriculture and Non-Agriculture in Indochinese Peninsula (Cambodia, Laos, Myanmar, Vietnam, Thailand).

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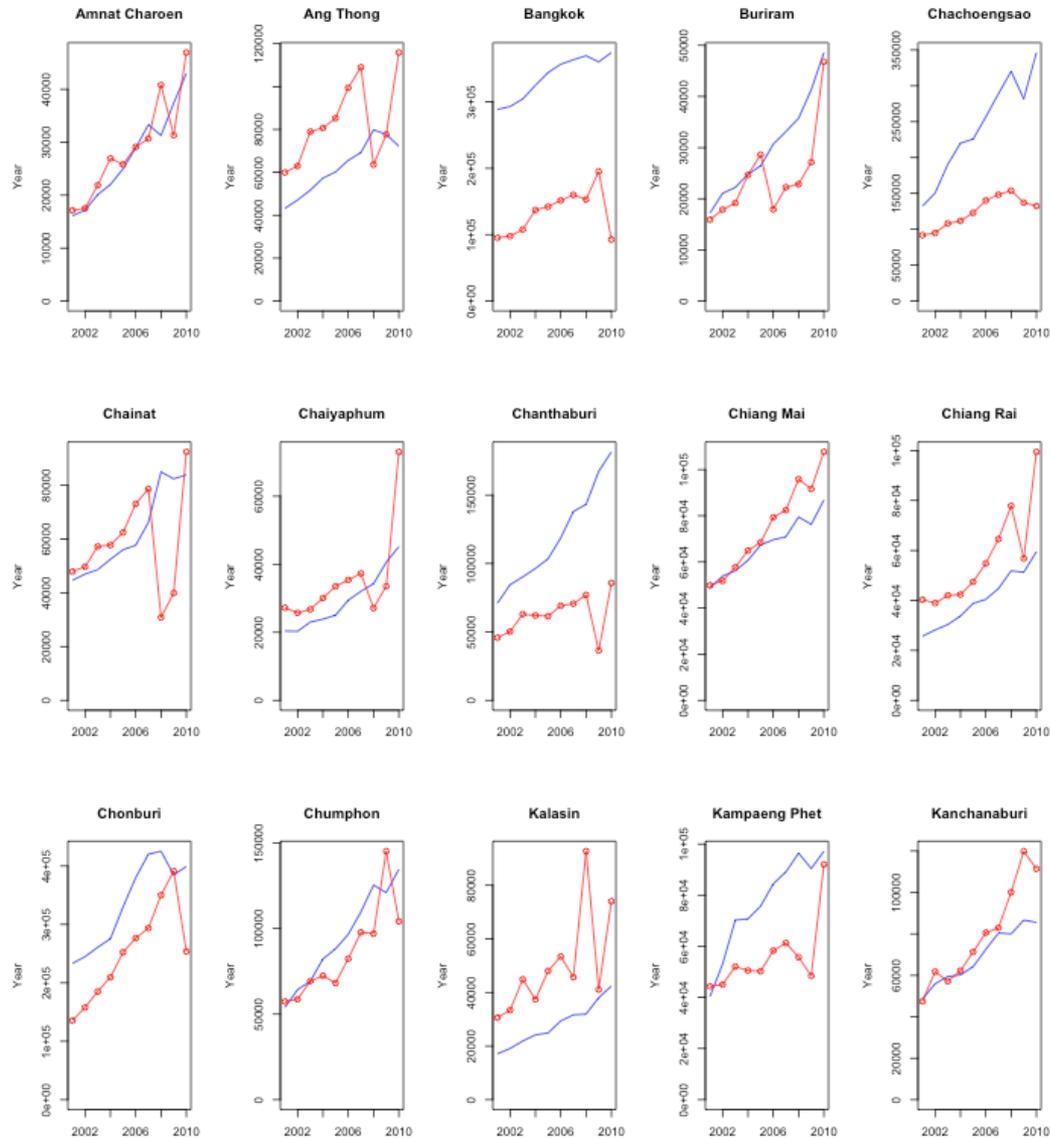
Source: Keola et al. (2015).

Trends in the Share of the Informal Sector's Sales at the District Level in Cambodia



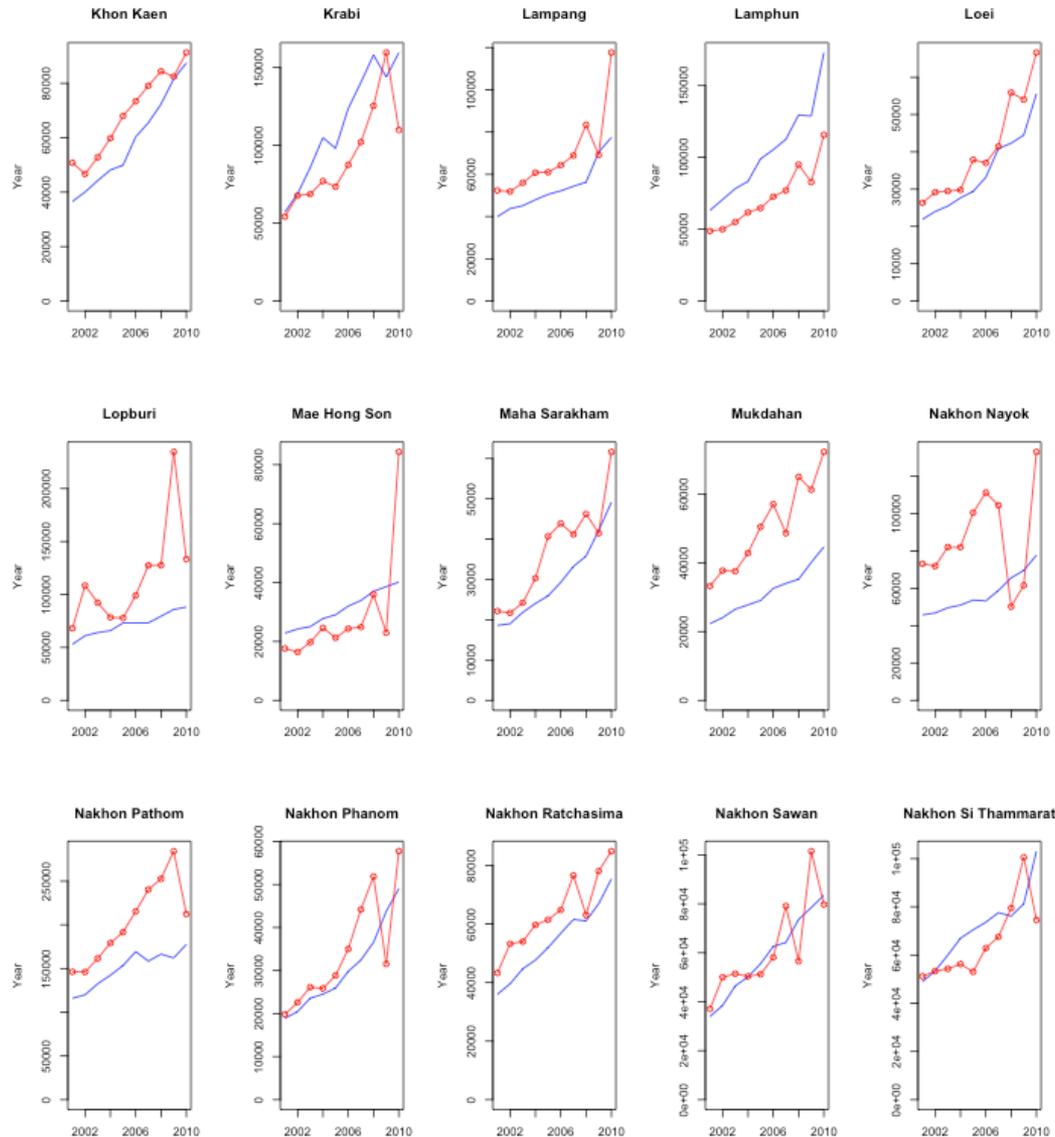
Note: 25th and 75th indicate the 25th and 75th percentiles of the share of the informal sector's sales at the district-level in each year.

Estimation of Gross Provincial Products in Thailand with Nighttime Light and LandScan



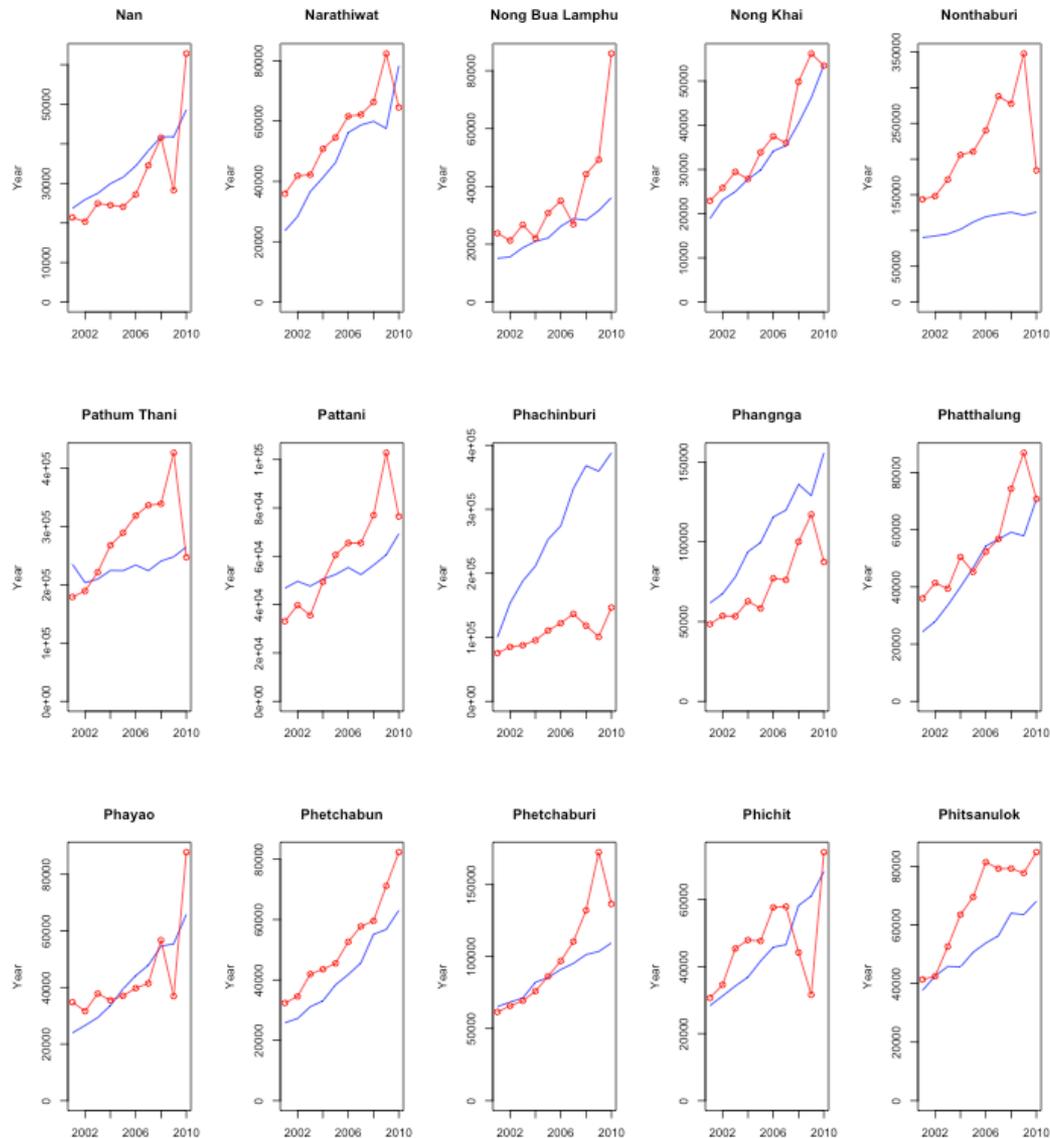
Source: Keola et al. (forthcoming).

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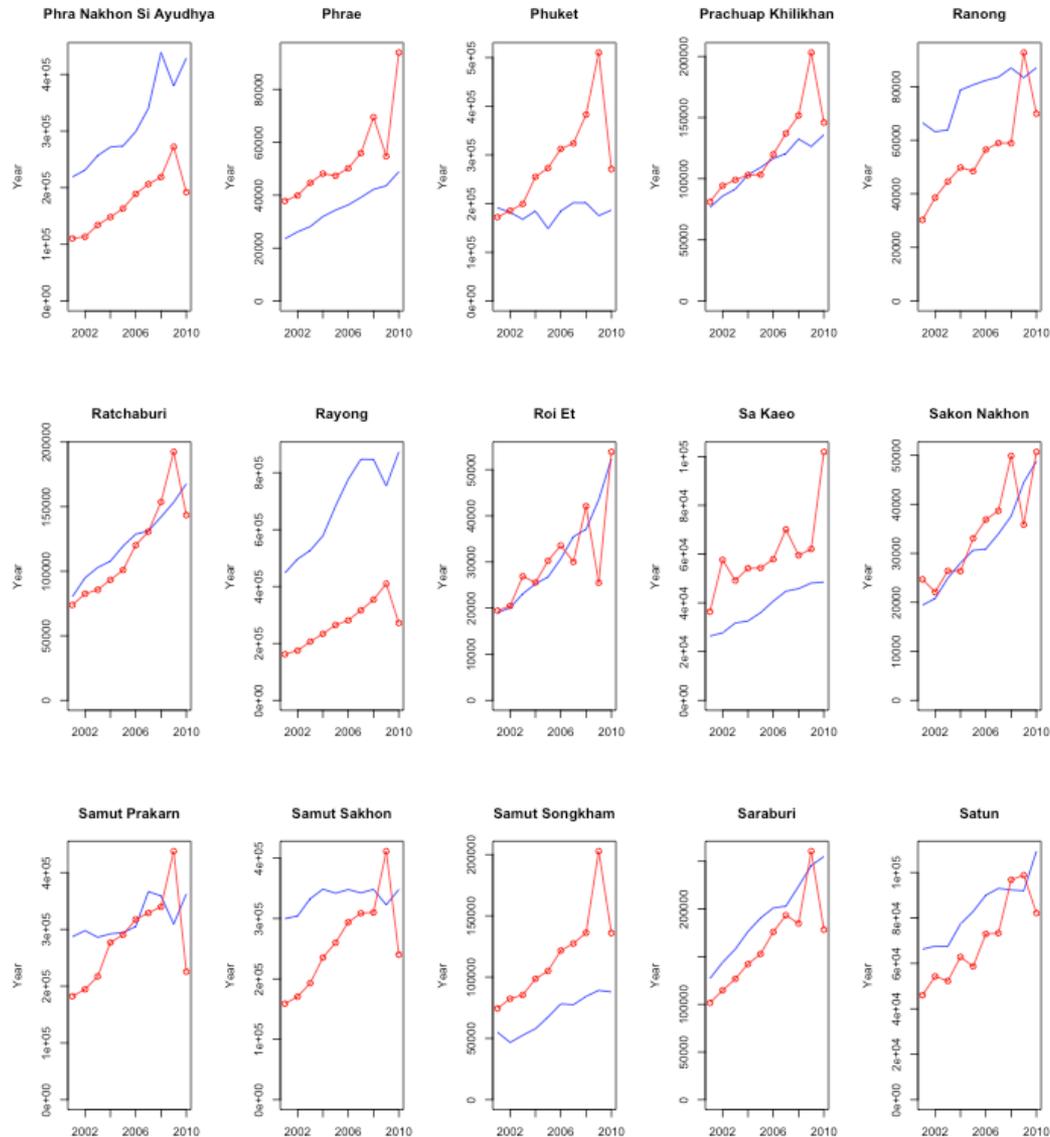


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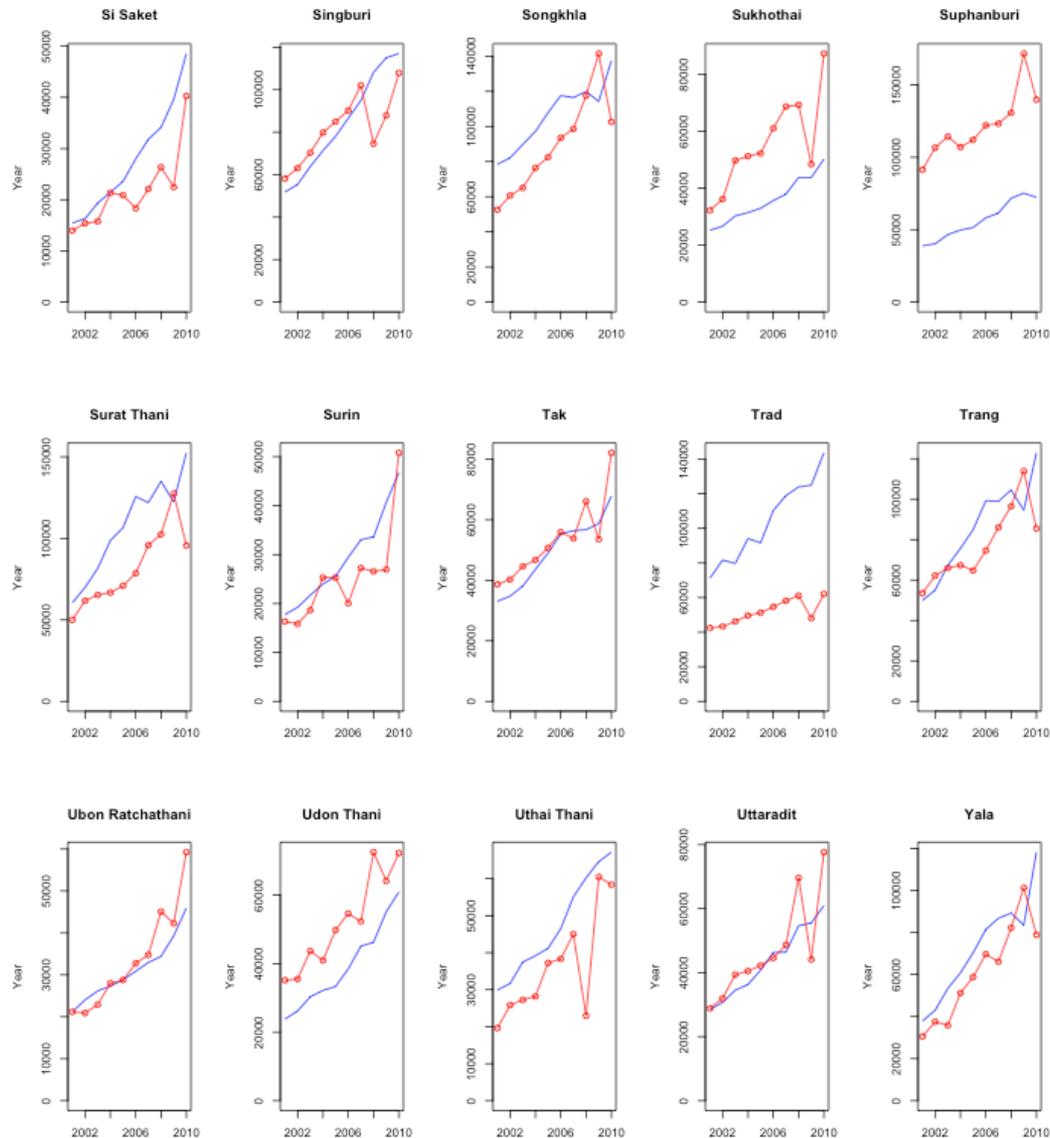
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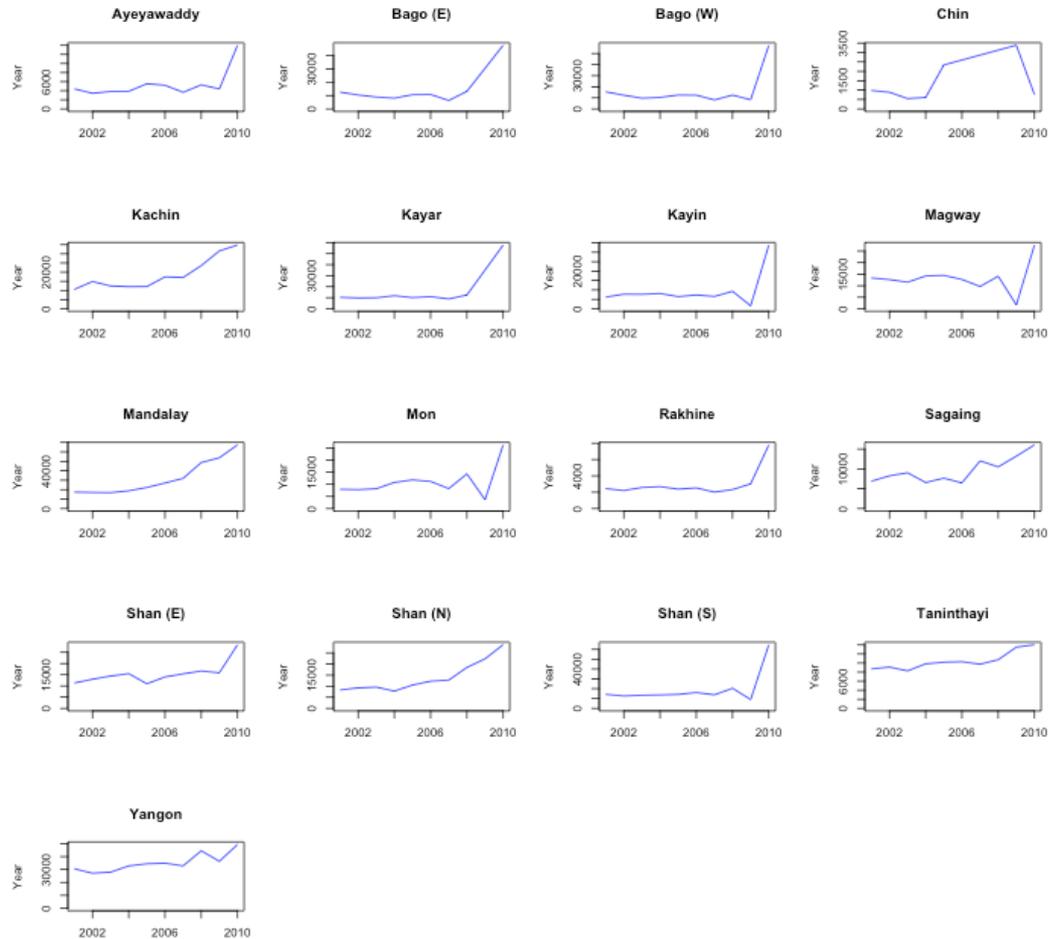
Estimation of Gross Provincial Products in Thailand with Nighttime Light and LandScan



Estimation of Gross Provincial Products in Thailand with Nighttime Light and LandScan



Estimation of Gross Provincial Products in Thailand with Nighttime Light and LandScan



Concluding Remarks

Data collected on the ground and from space are complimentary

- Conventional field survey is both expensive and time consuming → low spatio-temporal resolution
- High spatio-temporal resolution remote-sensing data can be used to interpolate/extrapolate spatially patchy and infrequent ground surveys
- Remote-sensing data is free, or very cheap, so is particularly suitable for study of developing countries with budget constrain
- Combination of field surveys and remote sensing would push (economics) research to the next level

References

- Andersson, M. (2013). Presentation Material at MDRI, Hanoi, Viet Nam, 18 June 2013.
- Andersson, M. (2016). Presentation Material at Second Workshop on Sub-National Regional Development in Lower Mekong Countries at Thammasat University, Bangkok, Thailand, 5 and 6 February 2016.
- Kenmei, T., Isono, I., Kumagai, S., Keola, S., (fourth coming). World Bank's Project Report.
- Keola, S., Andersson, M., & Hall, O. (2015). Monitoring economic development from space: using nighttime light and land cover data to measure economic growth. *World Development*, 66, 322-334.
- Keola, S., Andersson, M., Hall, O., Kirdruang, Phatta., Linn, S. N., Onphanhdala, P., Sophal, C., Thang, T.T. (fourth coming). Sub-National Regional Development in Lower Mekong Countries Since 1990s.
- Tanaka, K., & Keola, S. (2016). Shedding light on the shadow economy: a nighttime light approach. *The Journal of Development Studies*, 1-17.

Thank You for Your Attention

Questions and collaboration proposals are welcomed at
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