

# Population change in Latin American and the Caribbean, 1990-2000, a spatial time series

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# Acknowledgements

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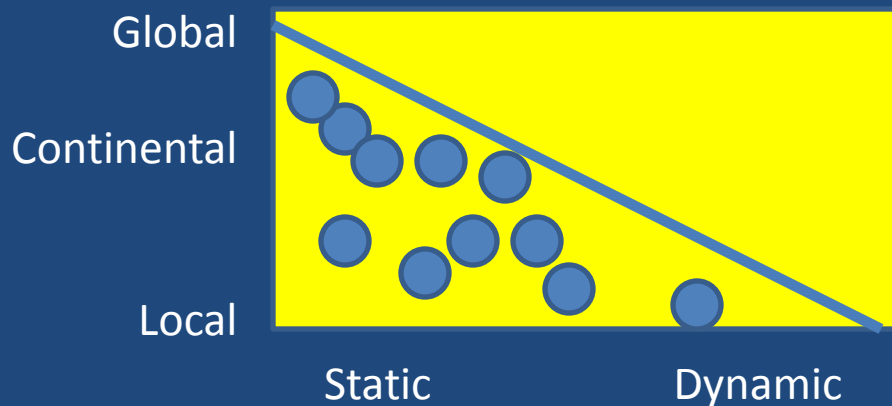
# Characterizing spatial distribution of population dynamically is important

- Driver of global change processes
  - Land use
  - Climate change
  - Hydrology
  - Emerging infectious diseases
- Element of vulnerability to
  - Global change
  - Natural disasters
  - Epidemics
  - Political conflict

**Fundamental building  
block of sustainability  
science**

# But it is hard to do on a large scale

- Georeferencing of census data is not standardized across countries
  - Process is ad hoc
  - Each country does it differently
- Boundaries change over time
  - Complicates dynamic analysis of spatial data
- As a result, spatial studies of population dynamics tend to be small-scale, local and regional
- Gap: continental-scale spatial analysis of population dynamics



# Our goals

- Characterize changing distribution of population in Latin America and Caribbean 1990-2000
  - Replicable methods
  - Spatial consistency
  - Comparable units
  - Spatial resolution suitable to global change analysis
- Integrate with comparable measures of land cover change (produced by collaborators) to explain interactions

### A. Contiguously Split Administrative Units

1990

2000

C=?

In this example, a new municipio was formed in 2000 by splitting B into two separate units... B and C.



1990 population  
A= 100  
B= 100

2000 population  
A= 125  
B= 85  
C=50

**Problem: You don't have an official 1990 population estimate for municipio C.**

## Dealing with changes in administrative boundaries

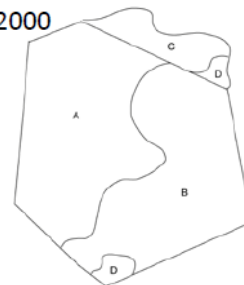
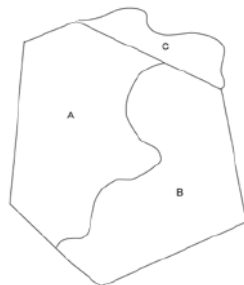
### B. Non-Contiguously Split Administrative Units

1990

2000

In this example, a new municipio D was formed in 2000 by taking parts of B and C.

D=?



1990 population  
A=100  
B=100  
C=75

2000 population  
A=125 C\*= 100  
B\*= 100 D=80

**Problem: You don't have an official 1990 population estimate for municipio D, B\* or C\*.**

Changes due to subdivision of census enumeration units, but also to administrative changes

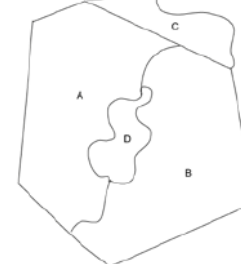
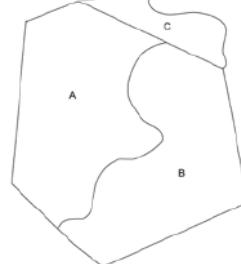
### C. Newly Formed Units

1990

2000

In this example, a new municipio D was formed in 2000 by taking parts of A and B.

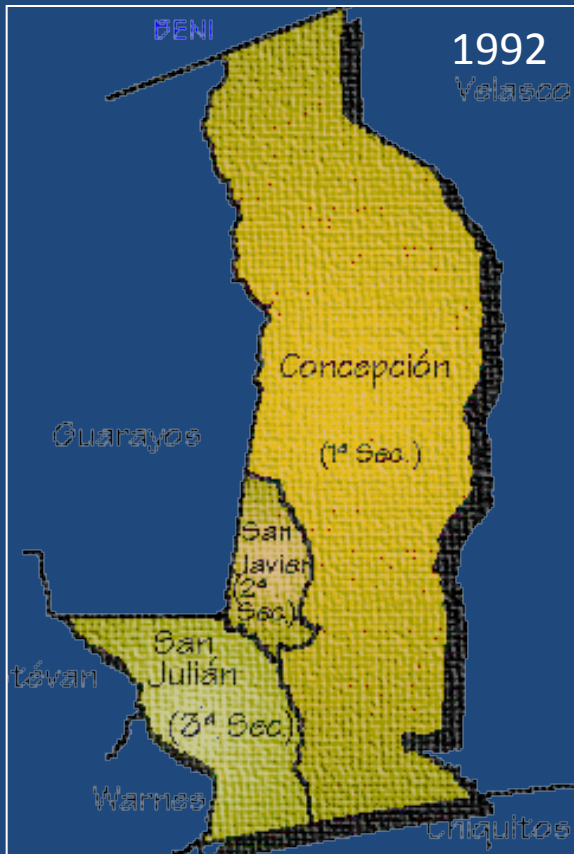
D=?



1990 population  
A=100  
B=100  
C=75

2000 population  
\*A=125 C= 100  
\*B= 100 D=80

**Problem: You don't have an official 1990 population estimate for municipio D, A\* or B\*.**



3 sections: Concepcion, San Javier, San Julian

5 sections: Concepcion, San Javier, San Julian, San Ramon, San Antonio de Lomerío



6 sections: Concepcion, San Javier, San Julian, San Ramon, San Antonio de Lomerío, Cuatro Cañadas



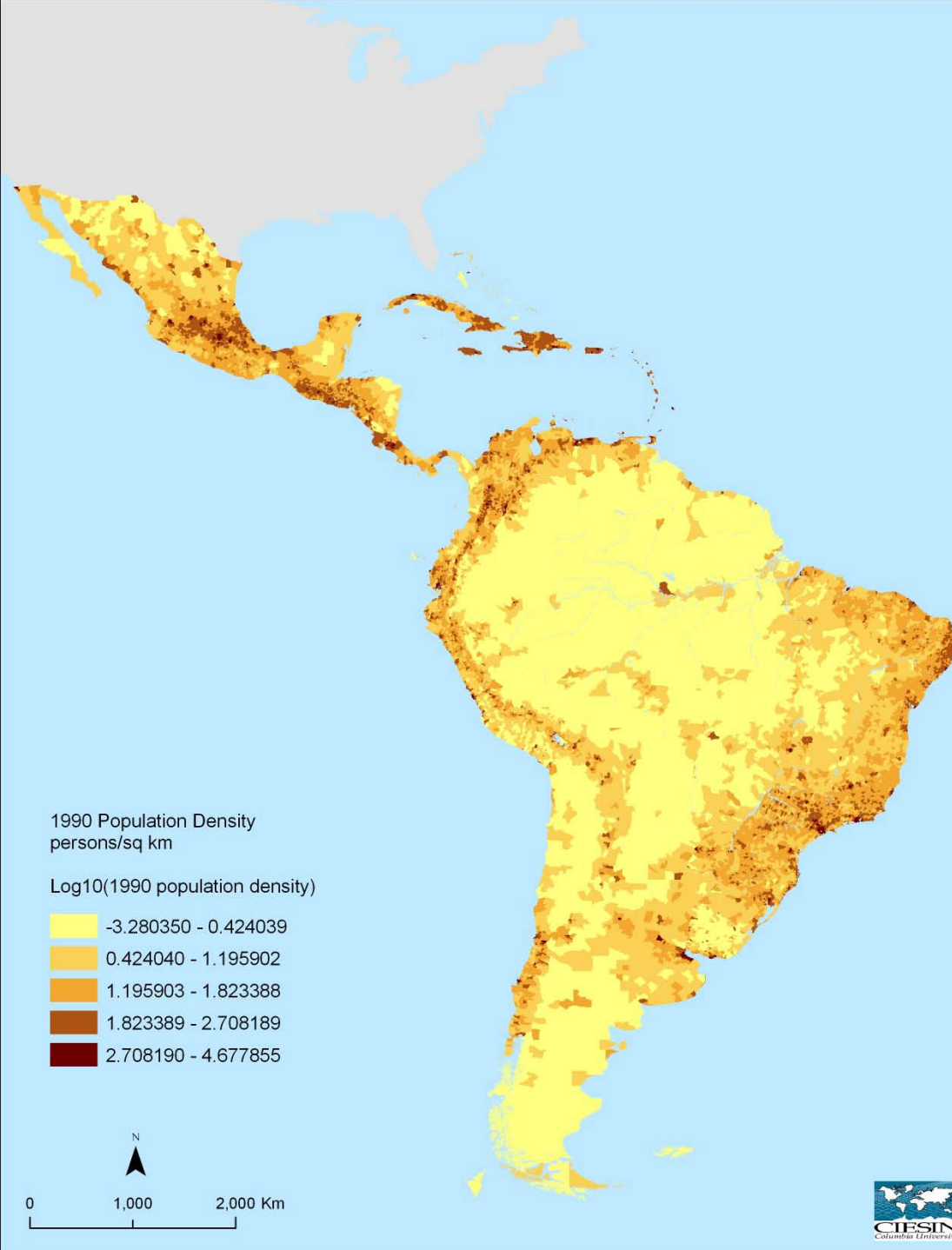
# Ñuflo de Flores, Santa Cruz, Bolivia



- 45 Countries
- 16,080 administrative units
- Primarily municipio



# Population Density, 1990



# Matching reference years

- Start with data from multiple census years
- Calculate annual growth rates

$$r = \frac{LN[(P_2/P_1)]}{(t_2 - t_1)}$$

where, LN = the natural log,  $P_1$  and  $P_2$  = population counts for the first and second reference years,  $t_1$  and  $t_2$  = time periods 1 and 2.

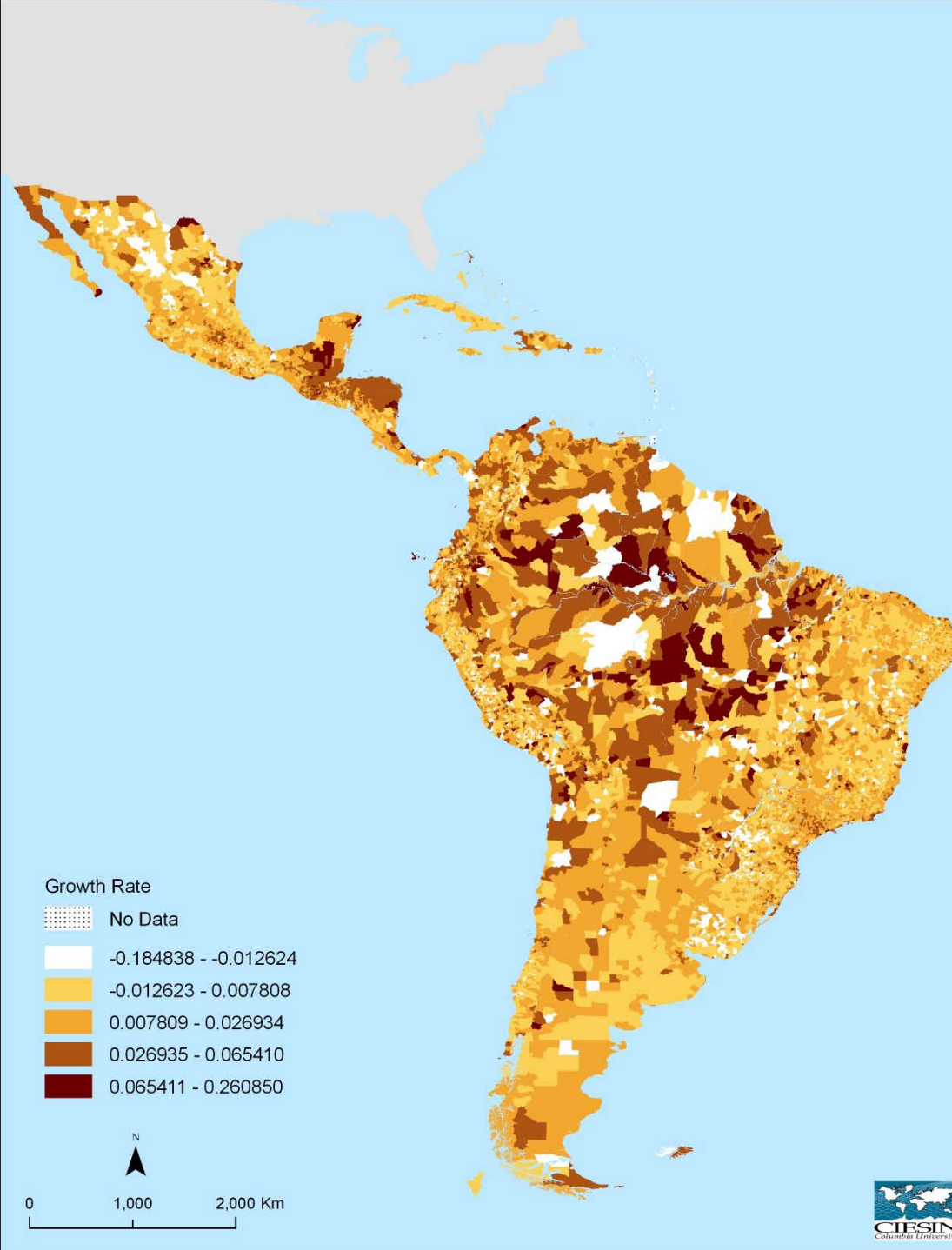
- Extrapolate and interpolate to generate estimates for 1990 and 2000

The following formula is then applied to the official population estimates, to extrapolate the data:

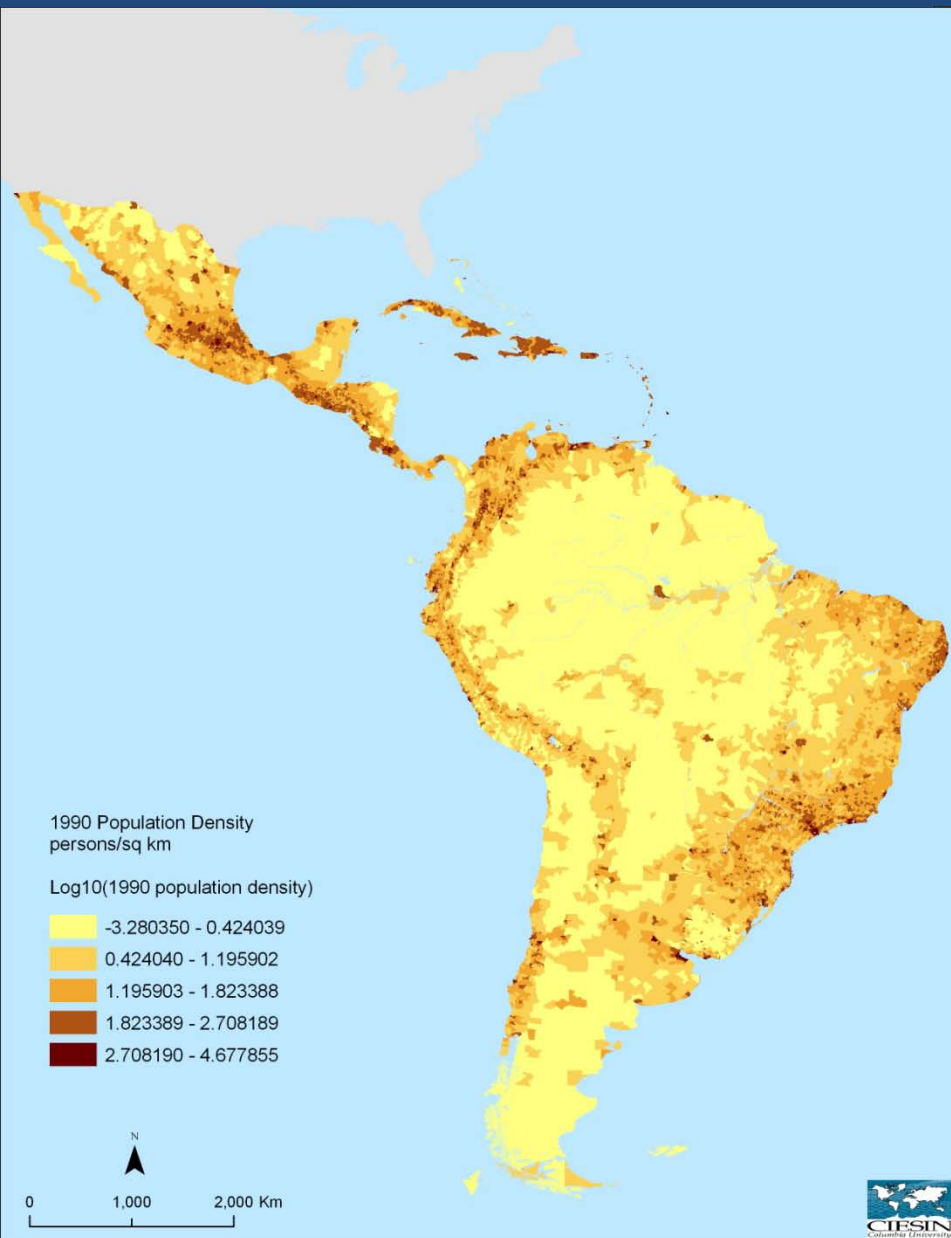
$$e^{rt} \times P_1$$

where,  $r$  = the geometric growth rate (as defined above),  $t$  = the number of years the initial estimate will be projected forward/backward,  $P_1$  = population counts for the first reference year

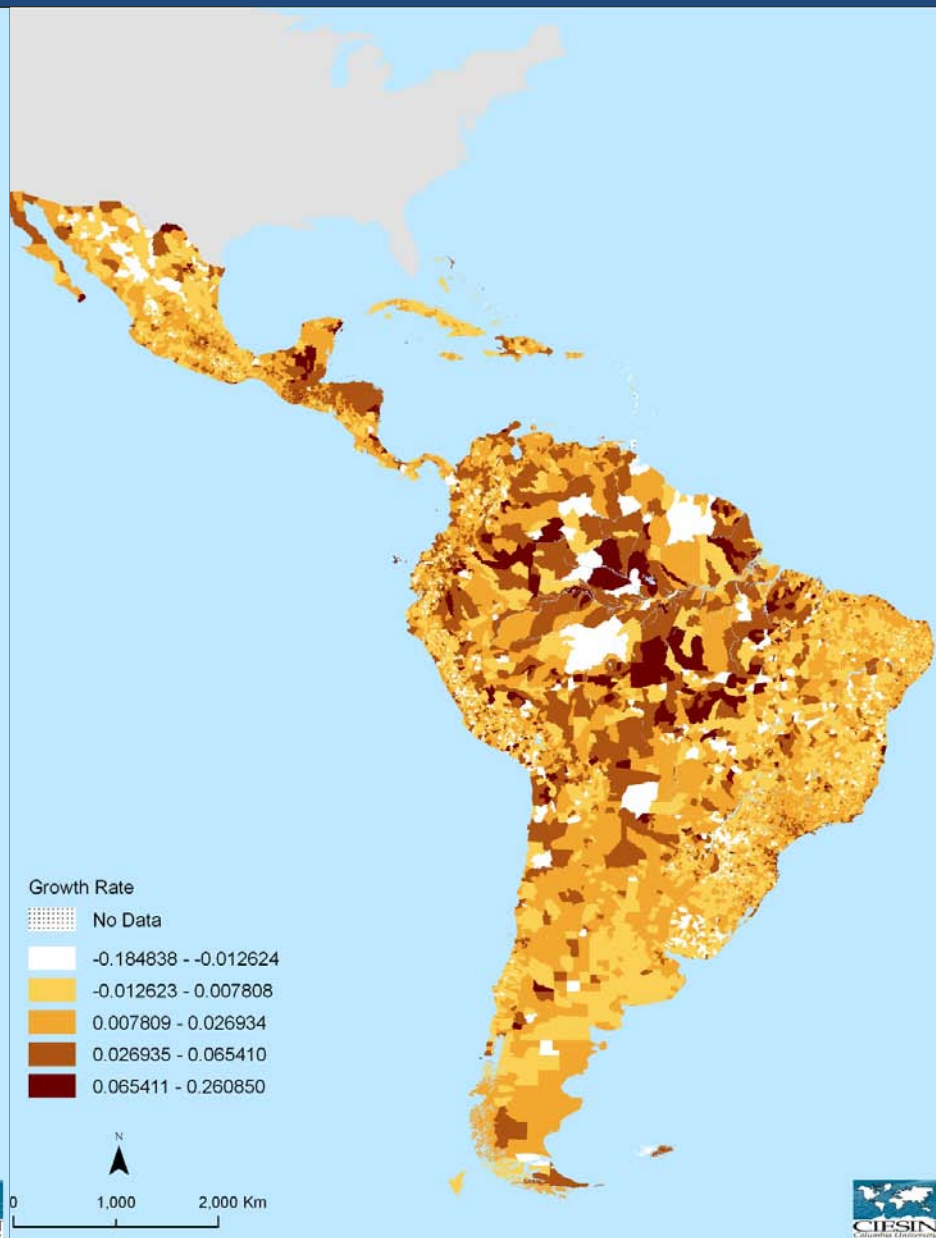
# Growth Rate, 1990-2000



# Density



# Growth Rate



# Descriptives

1990 Density (people/sq km)

Mean 228

Min 0

Max 47,627

Std. Dev. 1450

1990-2000 Growth Rate (%)

Mean 15.8

Min -84.3

Max 1,262

Std. Dev. 36.1

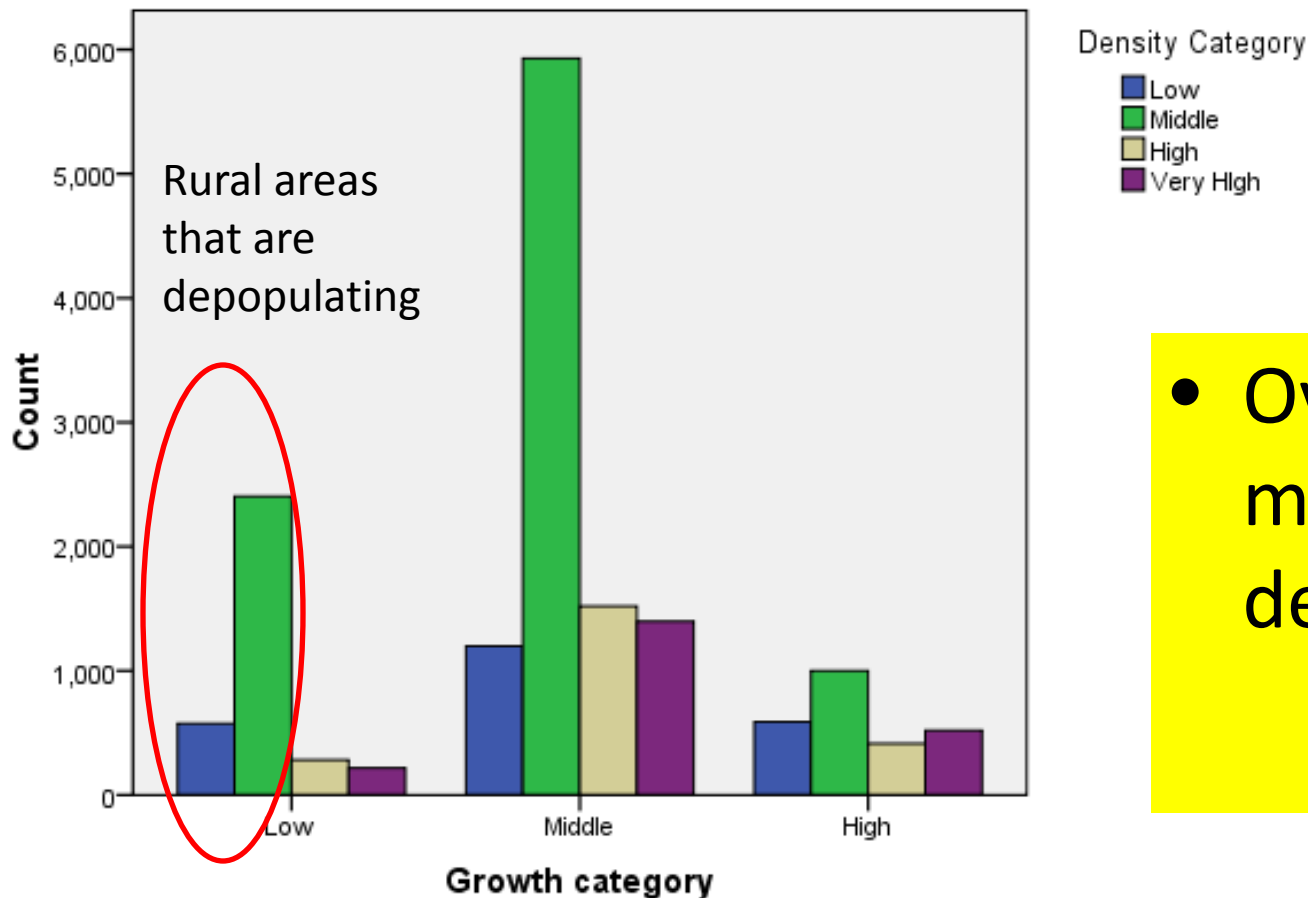
# Grouping the municipios

- Density (persons/sq km)
  - Low 0 - 5.7 (n=2397)
  - Middle 5.7 - 72 (n=9333)
  - High 72 - 162 (n=2215)
  - Very high 162 - 47,627 (n=2135)
- Growth Rate (%)
  - Low -84 - -2.2 (n=3477)
  - Middle -2.2 - 34 (n=10,048)
  - High 34 - 1,262 (n=2521)

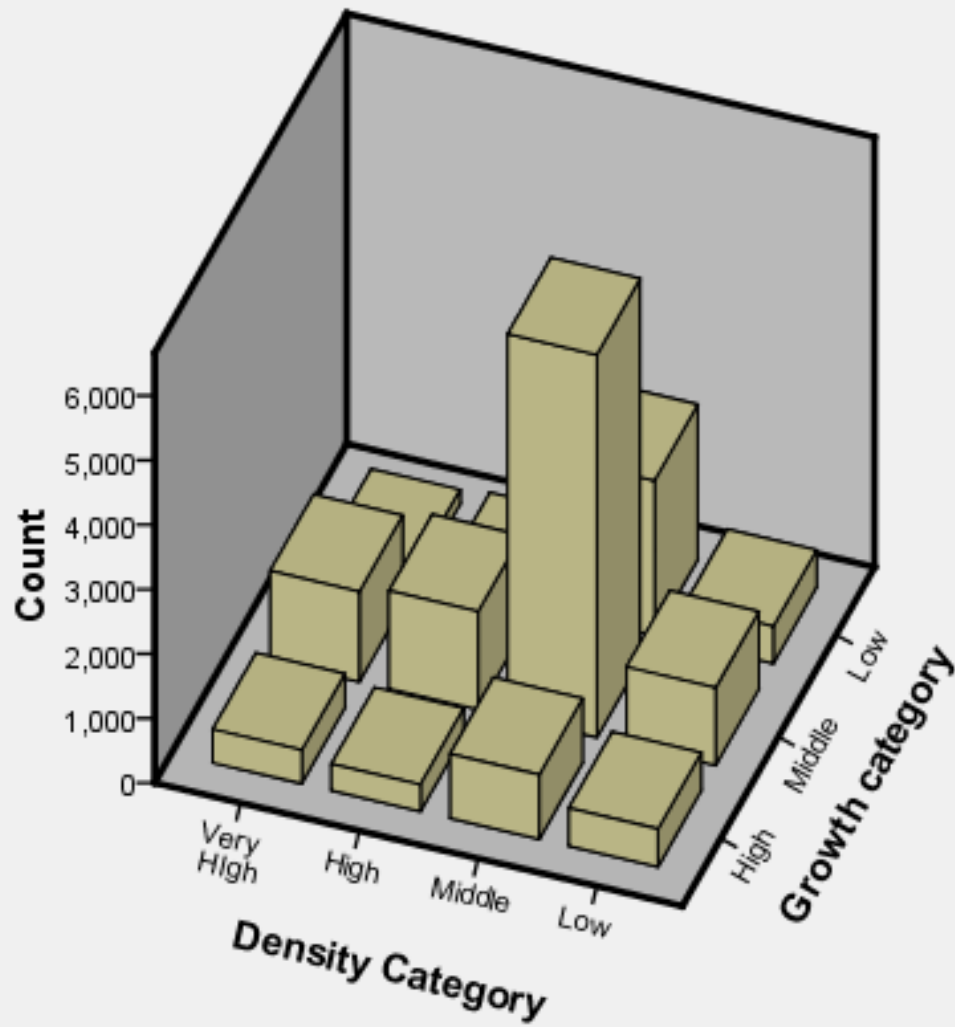
## Growth category \* Density Category Crosstabulation

Count

		Density Category				Total
		Low	Middle	High	Very Hlgh	
Growth category	Low	575	2403	281	218	3477
	Middle	1199	5931	1520	1398	10048
	High	589	999	414	519	2521
Total		2363	9333	2215	2135	16046

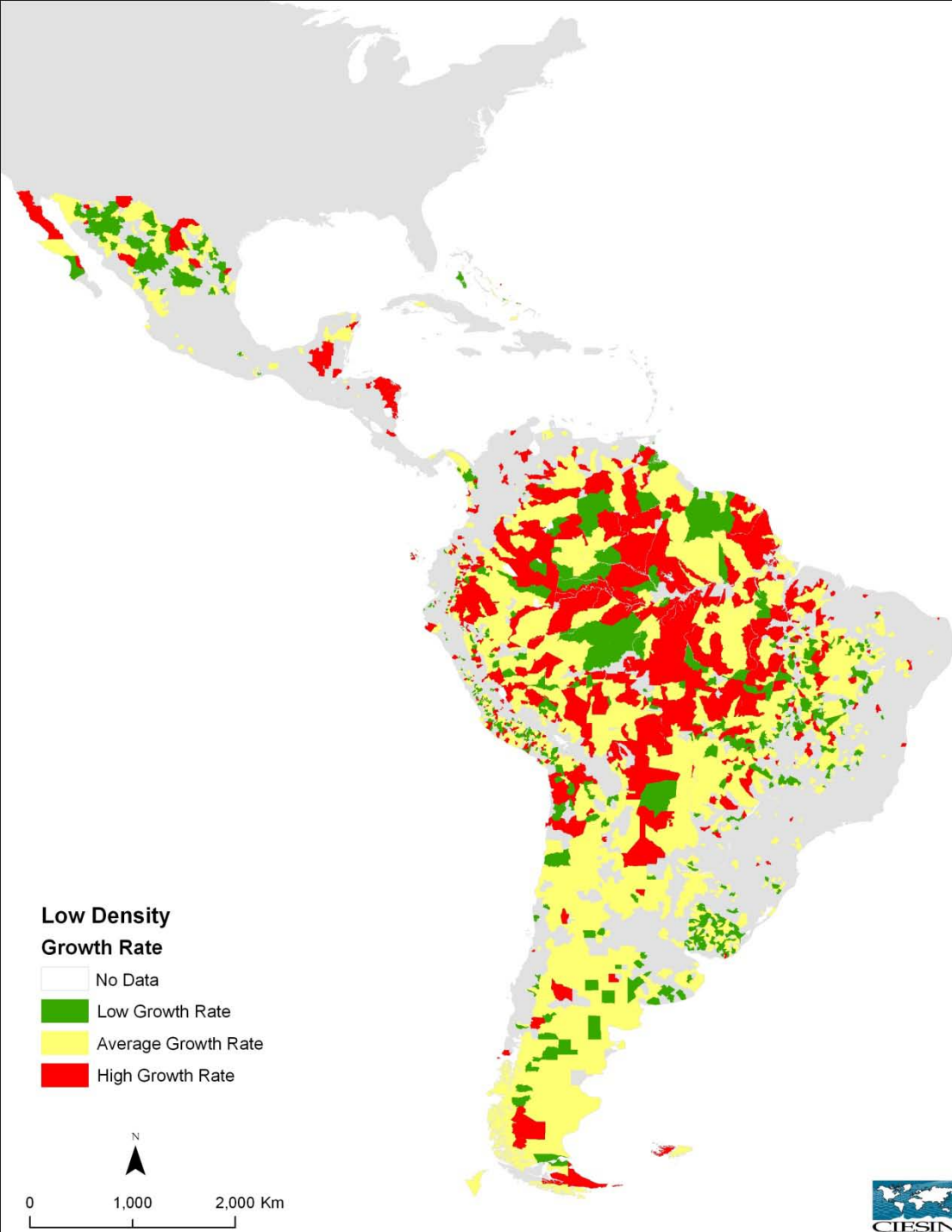


- Over 4,000 municipios are depopulating

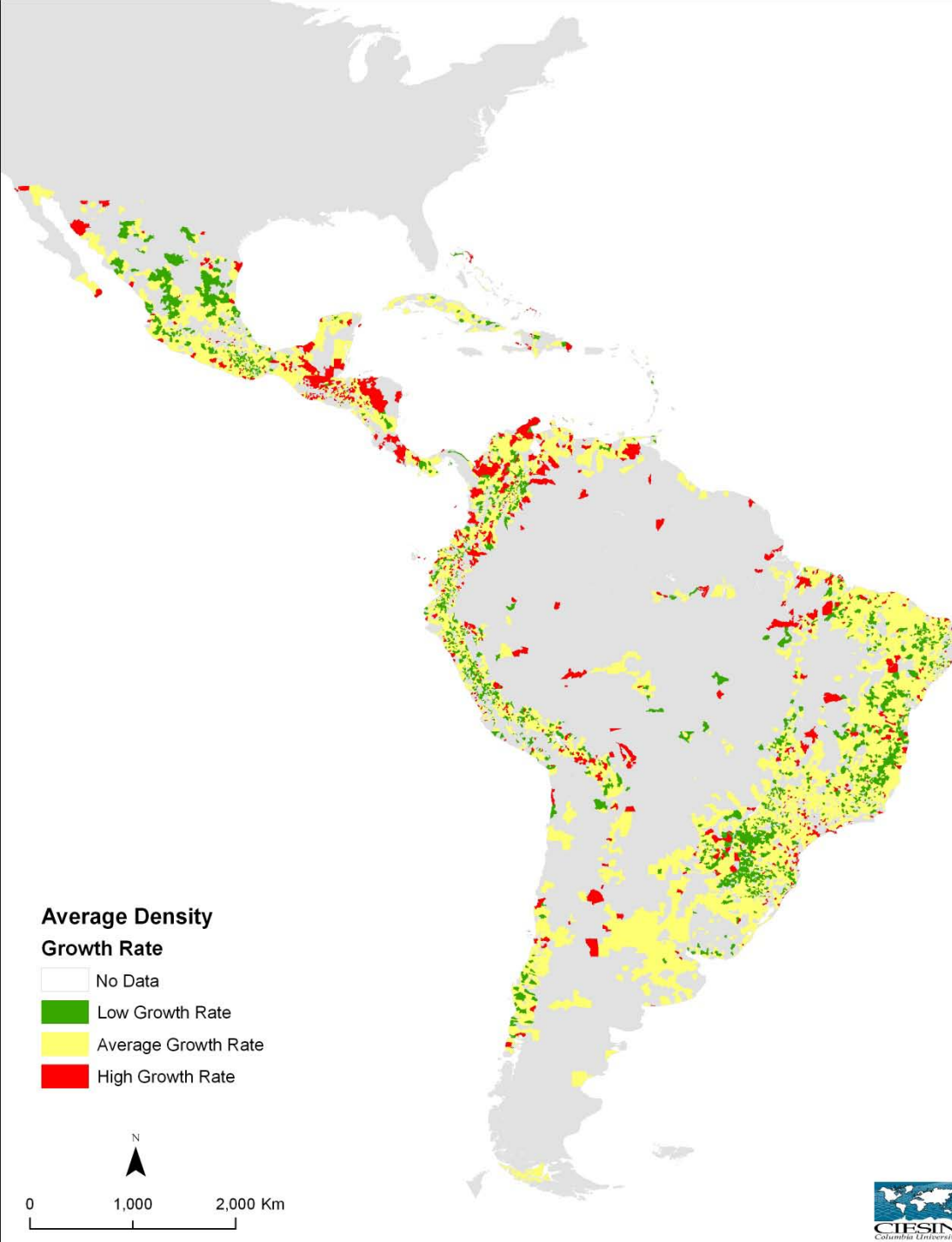




# Municipios with low 1990 population density



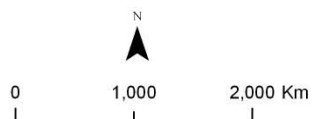
# Municipios with average 1990 population density



# Municipios with high 1990 population density

## High Density Growth Rate

- No Data
- Low Growth Rate
- Average Growth Rate
- High Growth Rate

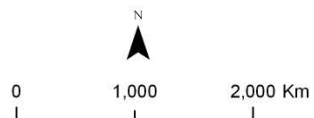


# Municipios with very high 1990 population density

## Very High Density

### Growth Rate

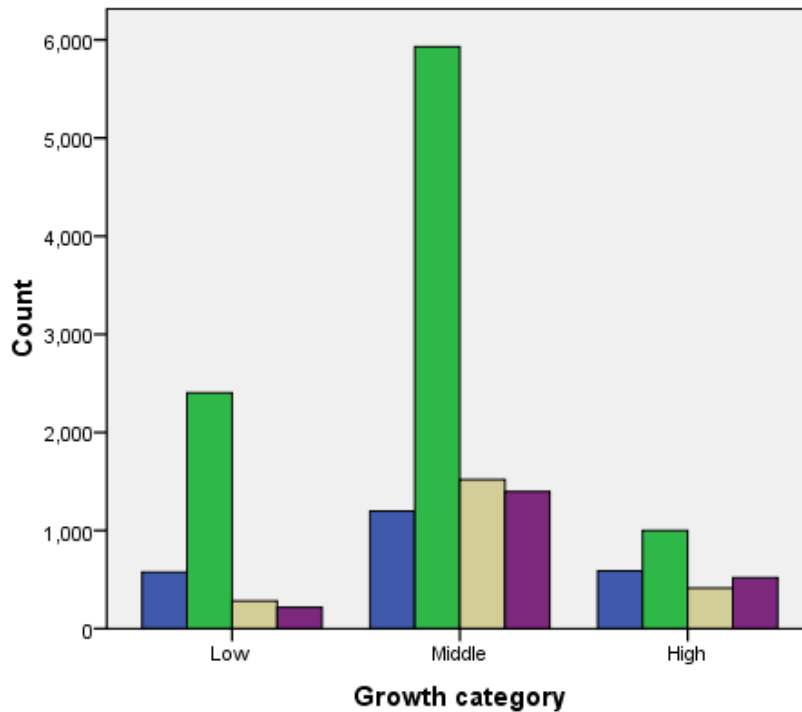
- No Data
- Low Growth Rate
- Average Growth Rate
- High Growth Rate



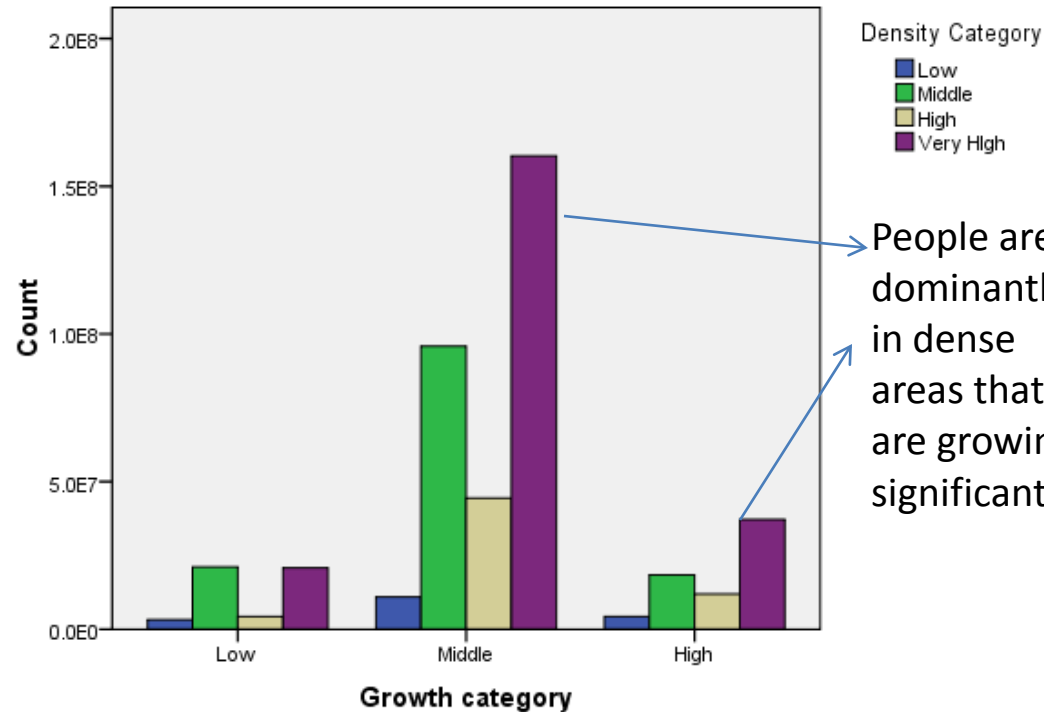
# Unweighted

# Pop-weighted

Bar Chart



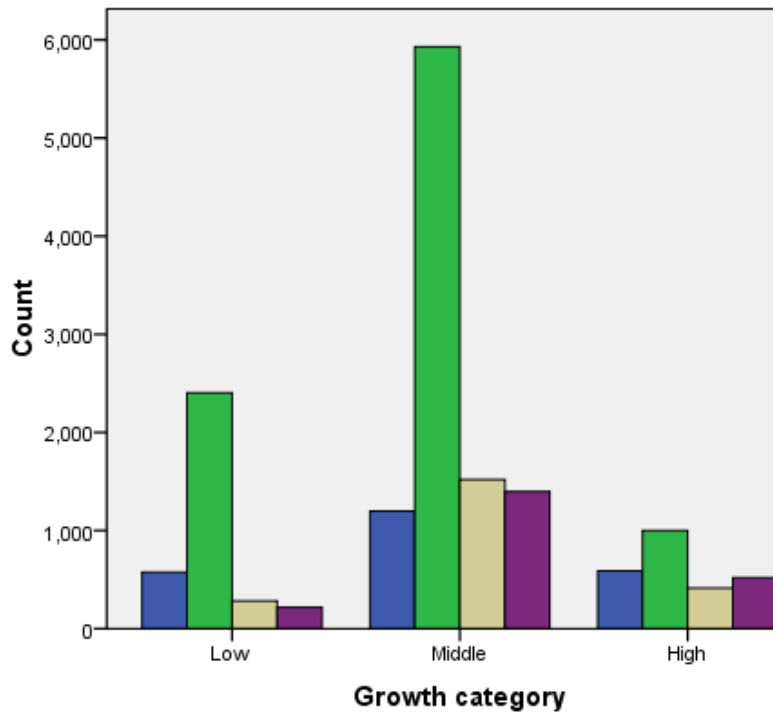
Bar Chart



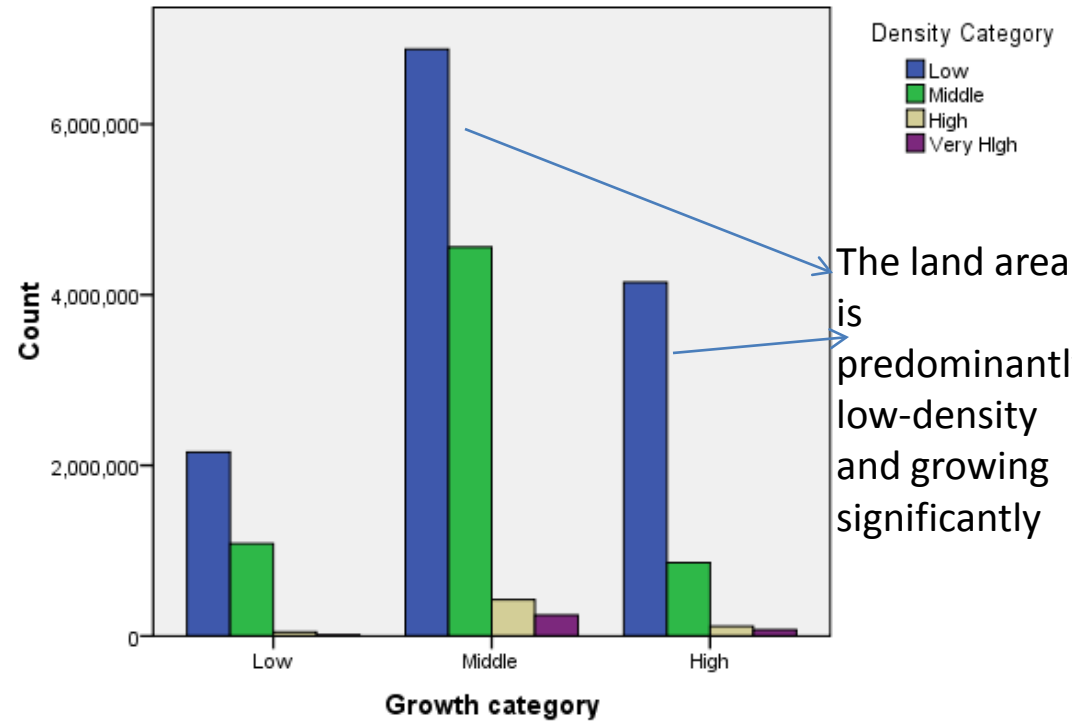
# Unweighted

# Area-weighted

Bar Chart



Bar Chart

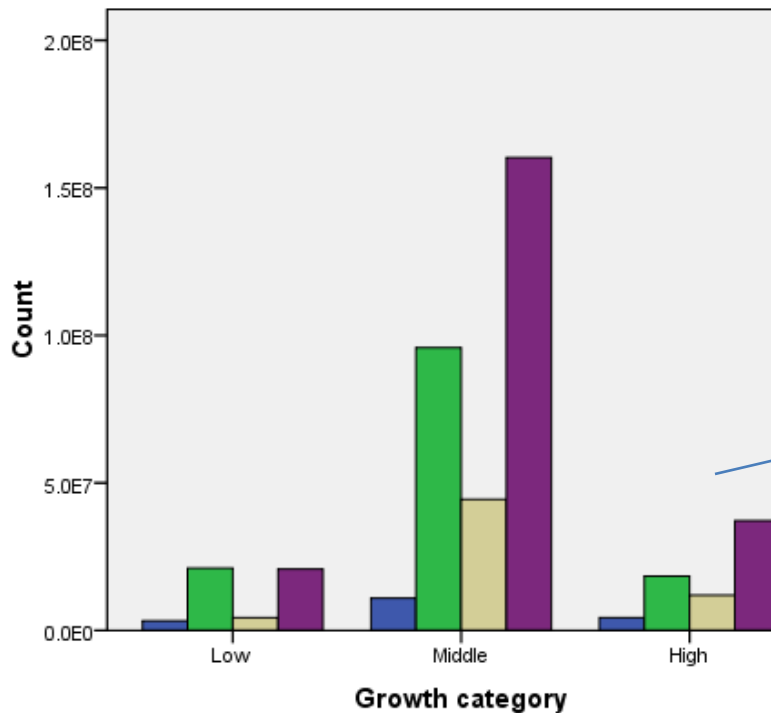


The land area is predominantly low-density and growing significantly

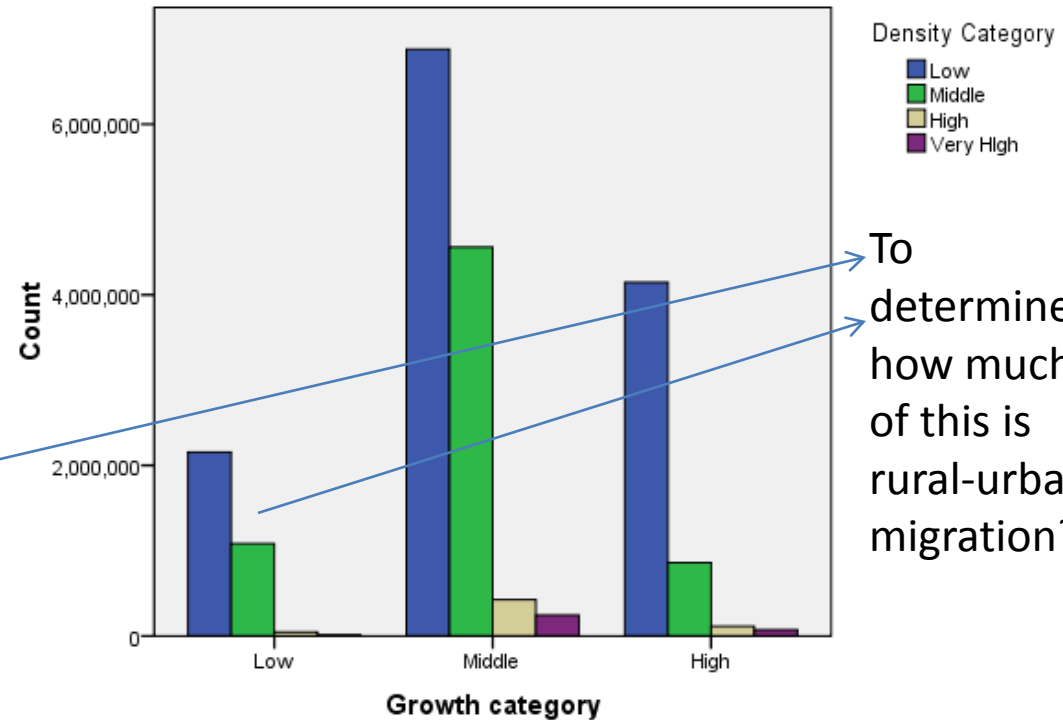
# Pop weighted

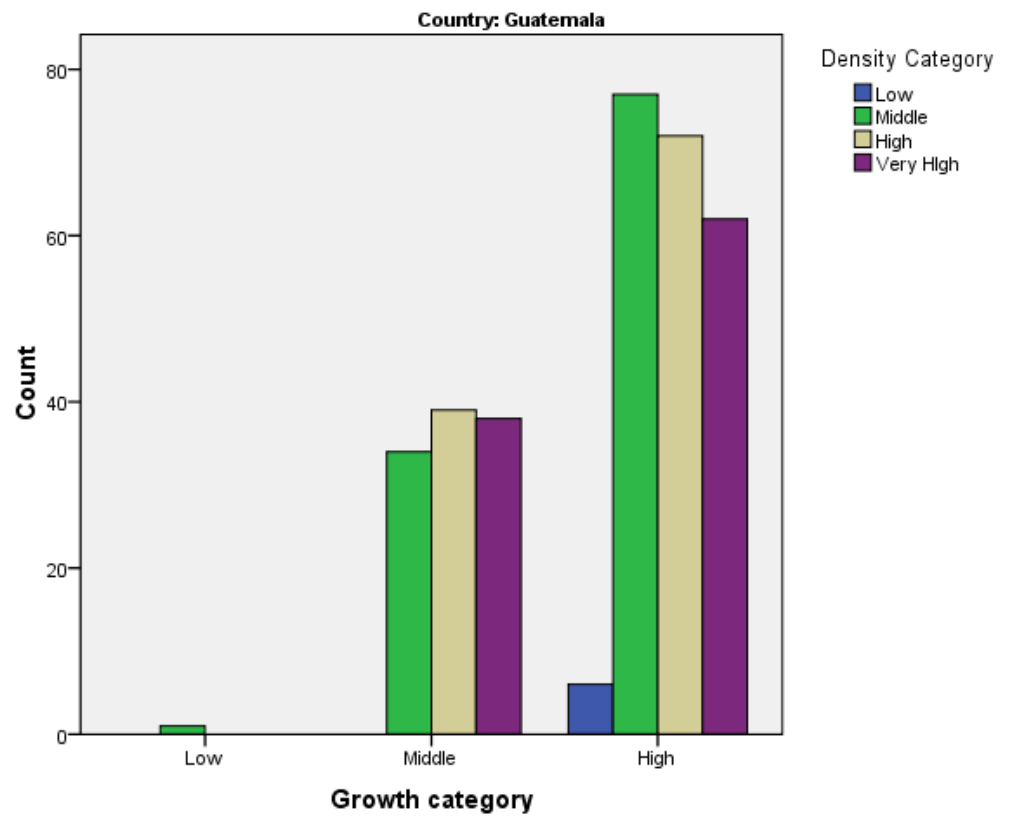
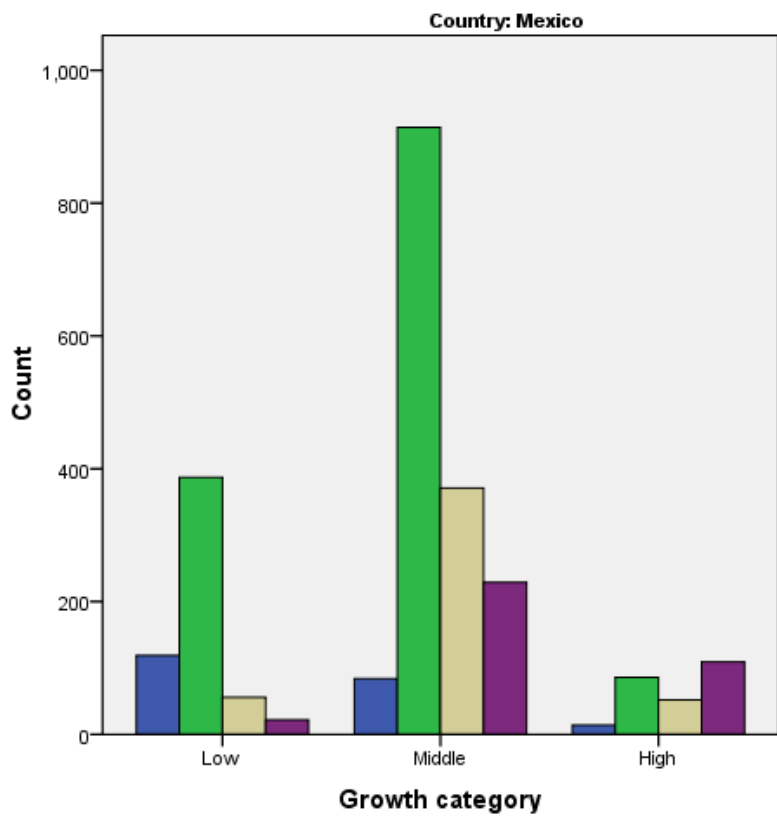
# Area weighted

Bar Chart



Bar Chart





Density Category

- Low
- Middle
- High
- Very High



# Next steps

- Integrated model to explain land cover, demographic change
- Describe shifting patterns of vulnerability to climate change