

# **Projecting Future Amazonian Landscapes: An Econometric Approach**

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**NASA: “A Basin Scale Model for Projecting Amazonian Landscapes”**

## ***LBA questions....***

**How does the Amazon function  
.....as an ecological-hydrological system?**

**What does the future hold for the Amazon?**

Question 1:

**SCIENCE**

Question 2:

**crystal ball**

**tarot cards**

**GIS**

**CA models**

**econometrics**

## ***Earlier Answers to Question 2***

Laurance et al.

**28% by 2020**

Deforested or heavily degraded  
**OPTIMISTIC SCENARIO**

**42% by 2020**

Deforested or heavily degraded  
**NON-OPTIMISTIC SCENARIO**

Soares-Filho et al.

**28% by 2050**

Deforested  
**GOVERNANCE SCENARIO**

**47% by 2050**

Deforested  
**BUSINESS AS USUAL SCENARIO**

Andersen et al.

**441,550 Km<sup>2</sup> in 10 years**

Accumulated cleared land  
**NO ROAD INVESTMENTS**

**425,970 Km<sup>2</sup> in 10 years**

Accumulated cleared land  
**ROAD INVESTMENTS (AB)**

**-3.6%**

## ***Our Approach***

### **1) Econometric model (Reis, Pfaff, Andersen et. al)**

NOT A BUFFERING FUNCTION.....NOT A “CA” approach

### **2) Data rich**

# observations.....Data used

3 time steps for deforestation, 3 “lags” in roads

### **3) Focused just on Closed Forest area**

versus “urbanized” or heavily *cerrado* tracts

### **4) Treatment of demographics in projections**

use of 2000 micro-data from the census

➔ **The Model**

➔ **The Data**  
deforestation, roads

➔ **The Scenarios**  
roads, demography, governance

➔ **The Projections**

# *The Data*

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## **DEFORESTATION**

**1976-1987 – Antropismo map, Diagnóstico Ambiental (IBGE), 1:2,500,000 scale**

**1986-1992 – TRFIC-MSU Land Cover (pixel size reduced to 200m)**

**1992-2000 – TRFIC-MSU and PRODES-INPE (2000) Land Cover digital maps  
(pixel size reduced to 200m)**

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## **ROADS**

**IBGE Instituto Brasileiro de Geografia e Estatística. 2004. Mapas interativos de Transportes**

**1968-75**

**1975-83**

**1987-93**

**DNER Department Nacional de Estradas de Rodagem (DNER). Mapa Rodoviario. Republica Federativa do Brazil, Ministerio dos Transportes**

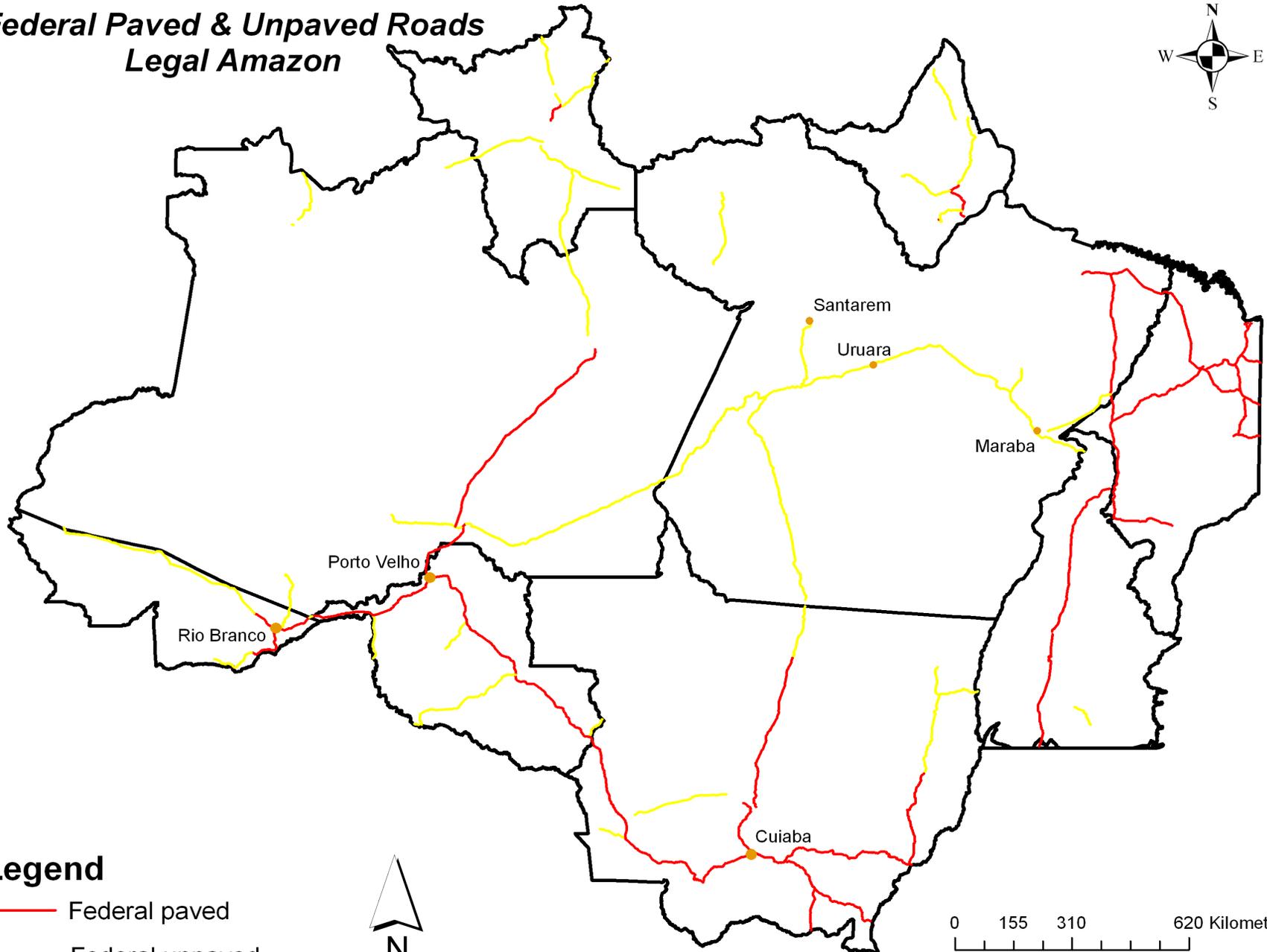
## ***The Model***

- 1) First, fit the regression model,  $Y_t = f(X, X_t, X_{t-1}, \dots)$ , where  $Y$  in the estimation is % yearly deforestation.
- 2) Project to 2010, using scenario data.
- 3) Update forest and scenario data, as necessary.
- 4) Project to 2020.

## ***Scenarios, to date.....***

- 1) AB - Expected Pop growth - No Governance
- 2) AB - Expected Pop growth - Partial Governance
- 3) No AB – Expected Pop growth - Partial Governance
- 4) No AB - Increased Out-migration - Hi Governance

**Federal Paved & Unpaved Roads  
Legal Amazon**



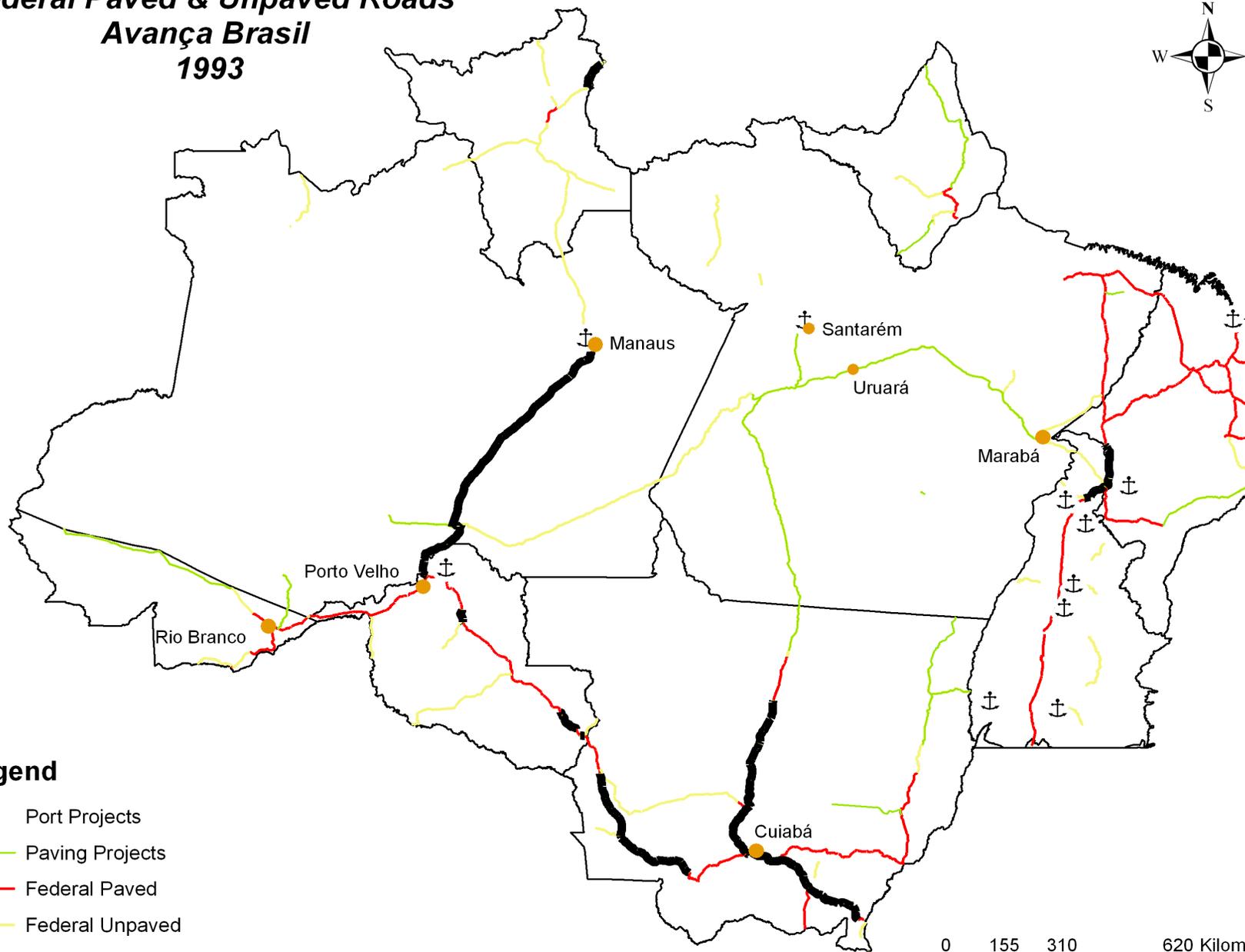
**Legend**

-  Federal paved
-  Federal unpaved



0 155 310 620 Kilometers

# Federal Paved & Unpaved Roads Avança Brasil 1993



## Legend

- ⚓ Port Projects
- Paving Projects
- Federal Paved
- Federal Unpaved
- Recuperation Projects

0 155 310 620 Kilometers

# ***Demographic Scenarios***

Microdata files of Brazil's 2000 demographic census

- .
  - Age structures for males and females
  - In- and out-migration 1995-2000 (yielding net migration)
  - Fertility rates and child survival figures for life expectancies

Population projections, from 2000 to 2020

(with moderate fertility declines and slight increases in life expectancy)

Two demographic scenarios:

“Expected population growth”

“Increased out-migration”

Two “city” population scenarios for every Amazon municipality

# ***The Aggregate Story***

population in 2000: **21,073,967** 68% urban, leaving ~**6,700,000** in rural areas

Fertility: **5.26**

Life expectancy: **70** for men, **71** for women

High birth rate, low death rate

Out-migration, but low: **-2595** per year between 1995 and 2000

## PROJECTED AMAZONIAN POPULATION

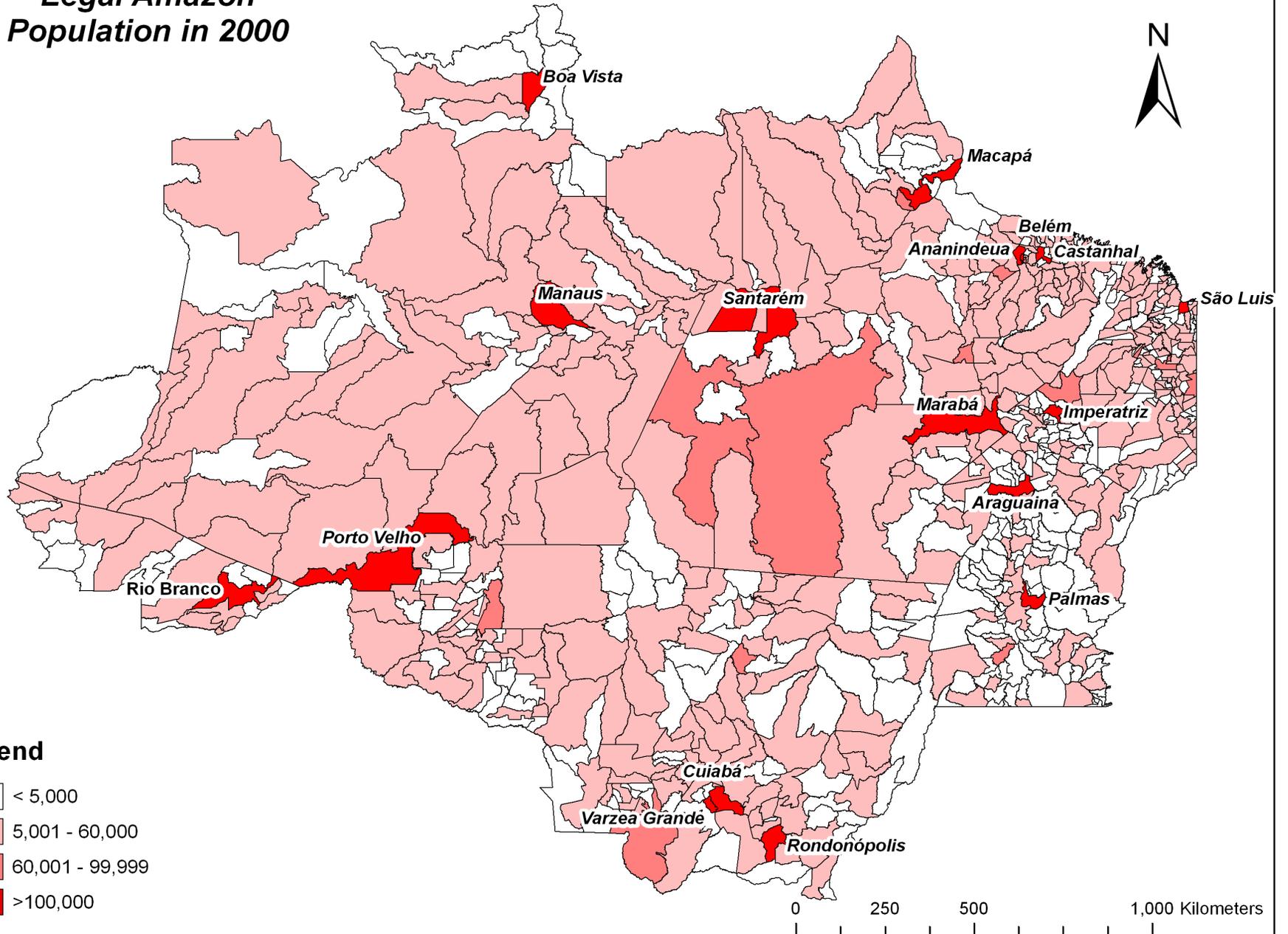
Expected Population growth: **35,409,282**

Increased Out-migration: **32,678,238**

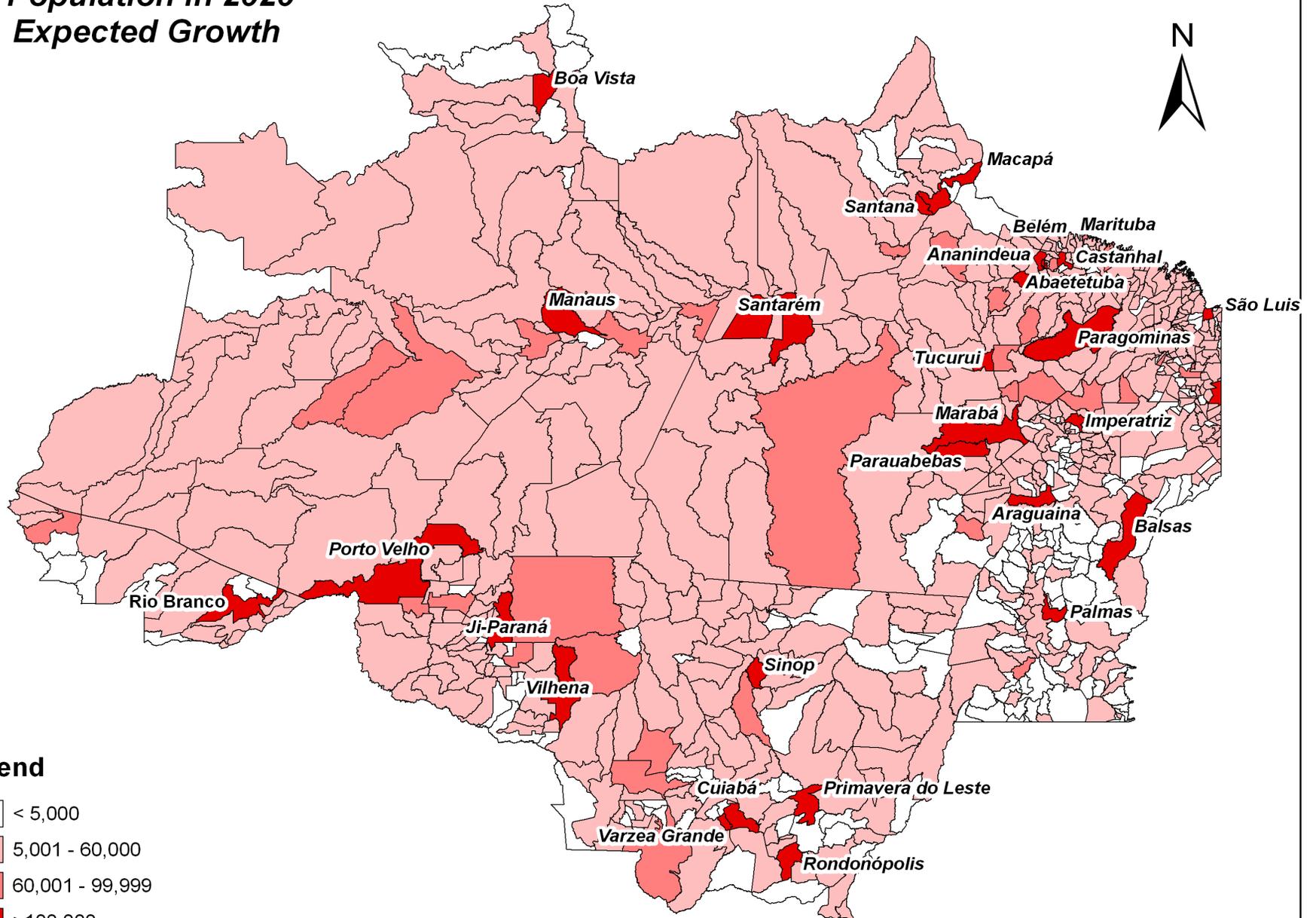
The Amazon has NOT gone through a demographic transition

Out-migration is not compensating natural increase of the regional population

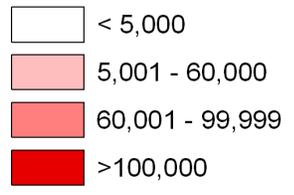
# Legal Amazon Population in 2000



# Population in 2020 Expected Growth



## Legend



# ***Governance Scenarios***

## Low governance

No protection in PA's, no control on private holdings

## Partial governance

Indigenous areas and Fed Protected: 100%

Fed Sustainable Use and State Protected: 75%

State Sustainable Use: 50%

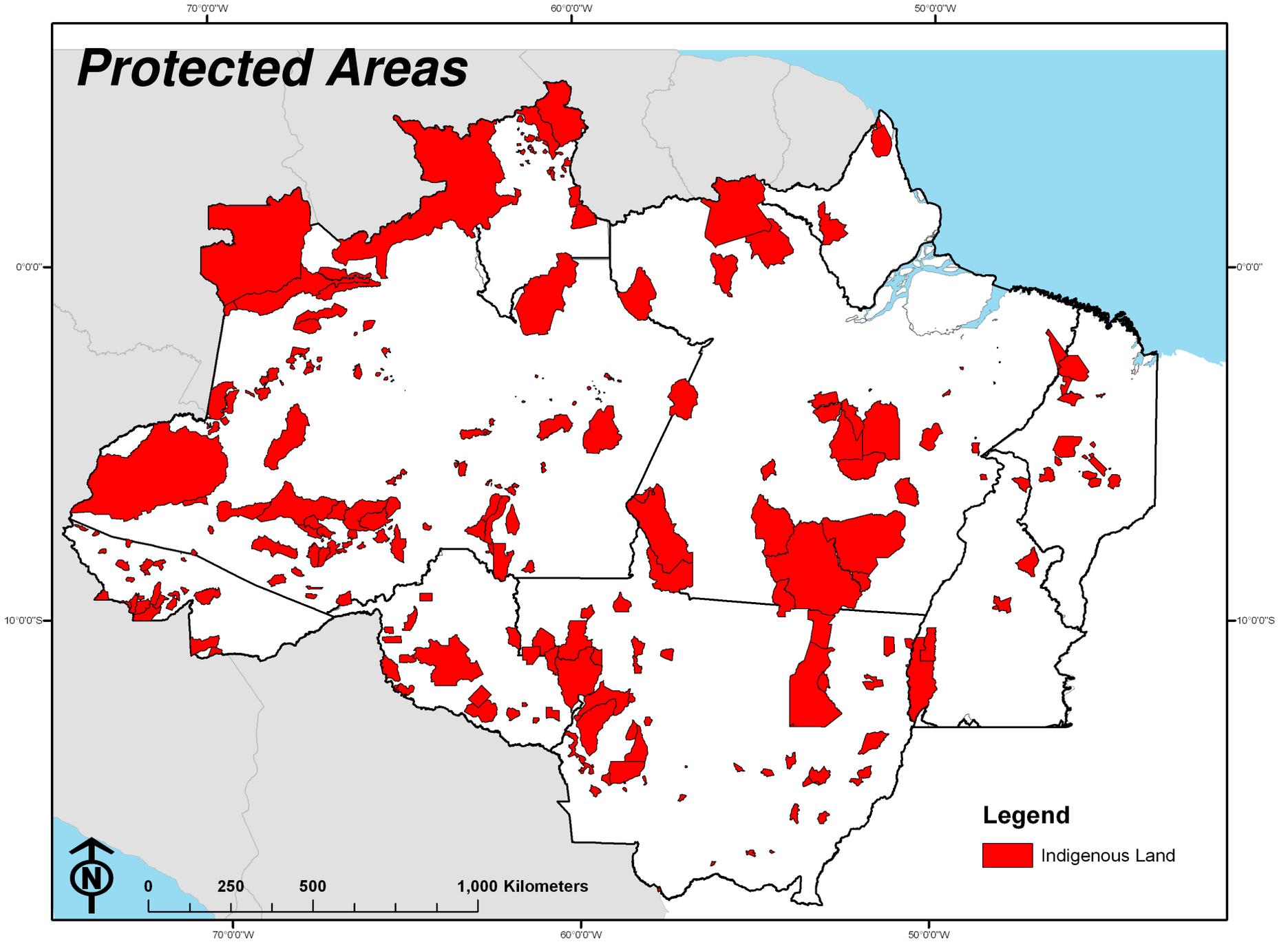
Private Holdings: 50% rule

## High Governance

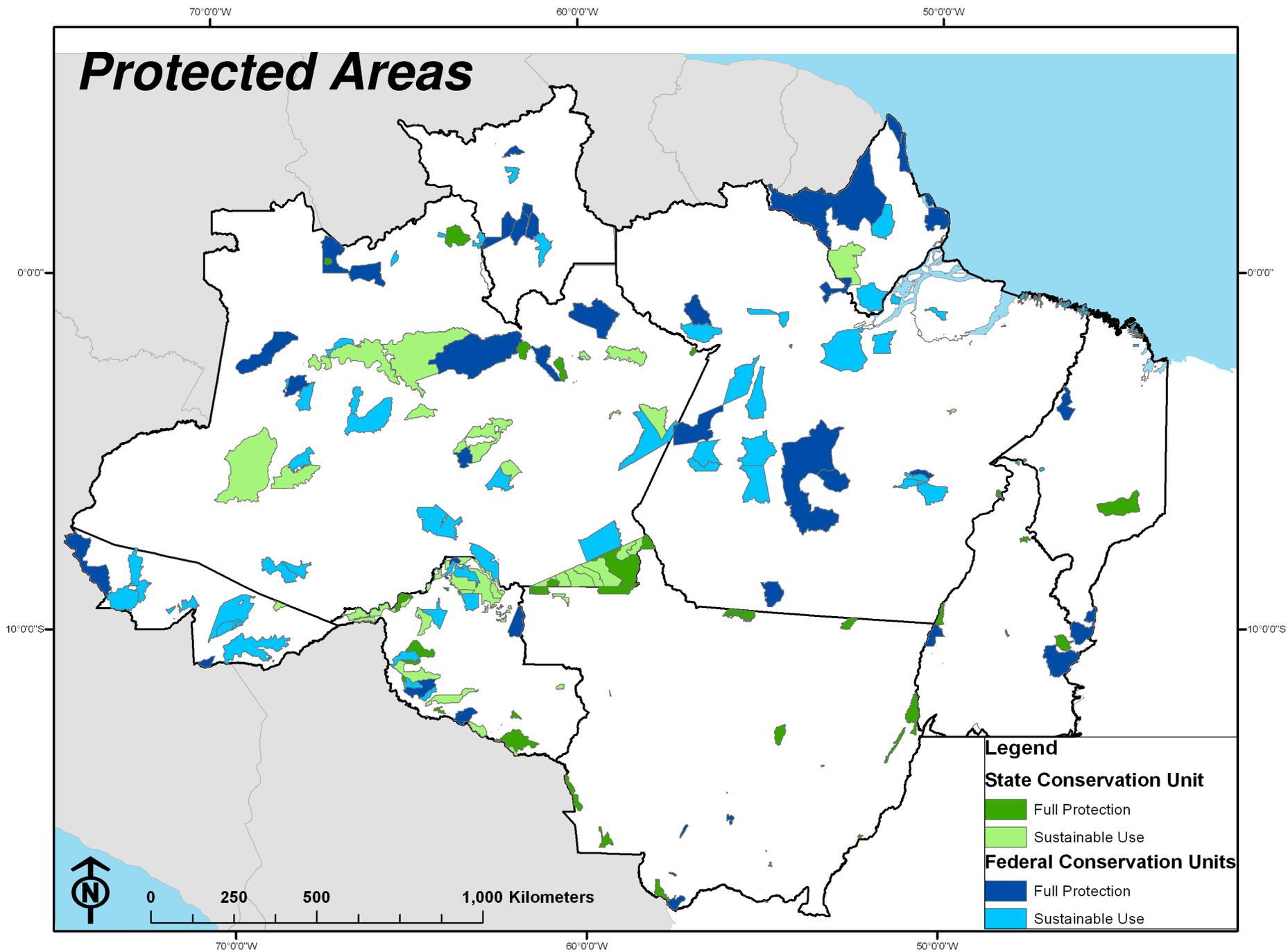
100% protection in all PA's

Private Holdings: 20% rule

# Protected Areas



# Protected Areas



## ***Scenarios enable us to consider.....***

Governance effects

*controlling for pop growth & investment (1 & 2)*

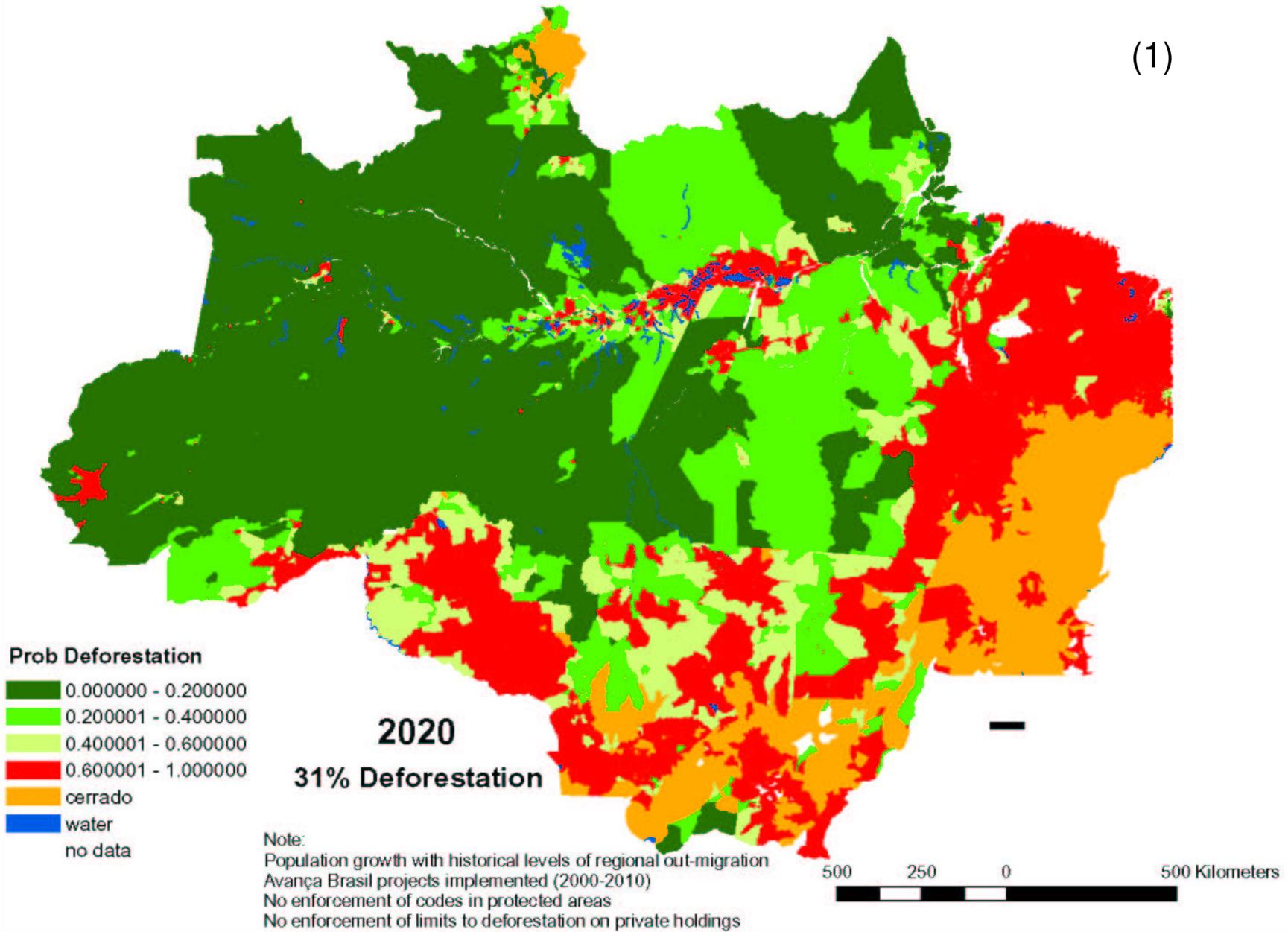
Road Investment effects

*controlling for pop growth & governance (2 & 3)*

Best and Worst conservation cases (1 & 4)

# Expected Population Growth, Road Investments, and Low Governance

(1)



## ***Preliminary Findings***

**Partial Governance effects      31% vs. 19%**

**Road Investment effects      19% vs. 19%**

**Worst vs Best      31% vs 16%**

## ***Where to from here?***

- Model improvements and refinements
- Further work on the demographics
- Infrastructure effects