

Developing a Forest Loss Model for Roraima, Brazil

GEOG 260 Final Presentation

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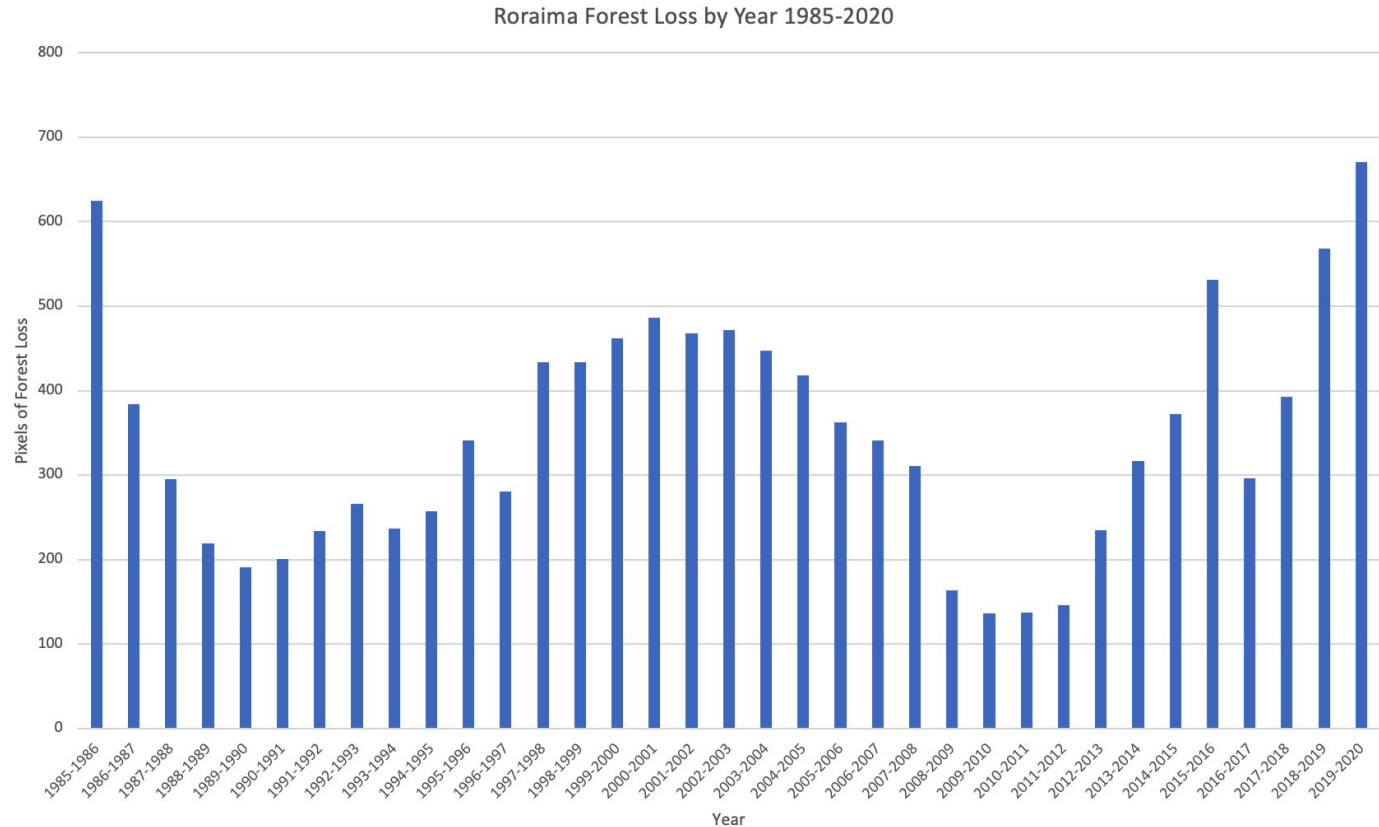


MAPBIOMAS
[BRASIL]

Introduction

In this project we observed differences in GEOMOD outputs as changes were implemented in validation period length and driver variables. This analysis displayed an increase in Figure of Merit as validation period length increased and number of driver variables increased.

Forest Loss by Year 1985-2020 in Roraima



Overview of GEOMOD Run Collections

| | |
|-----------------------|----------------------|
| Validation Interval 4 | 2000-2002 - 2 years |
| Validation Interval 3 | 2000-2005 - 5 years |
| Validation Interval 2 | 2000-2010 - 10 years |
| Validation Interval 1 | 2000-2015 - 15 years |

| | |
|--------------|--|
| Collection A | Elevation Driver Only |
| Collection B | Elevation and Slope Drivers |
| Collection C | Slope, Elevation, Indigenous Land, Protection Status, Land Cover, Rivers, and Population Density Drivers |

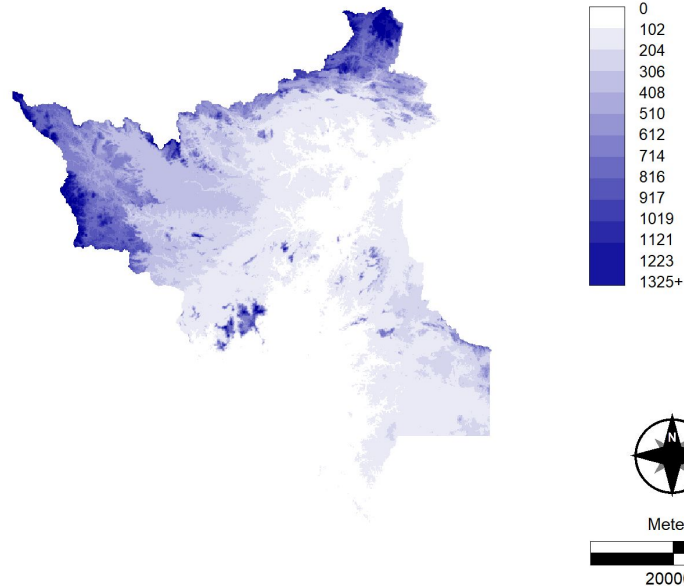
Remember: The number of driver variables used in GEOMOD increases with each collection after the control group

GEOMOD Run Collection A: Elevation

Interval Length 2, 5, 10, 15 years

This run collection serves as a control group to the larger study of the effect of validation length on GEOMOD results

Elevation in Roraima, Brazil

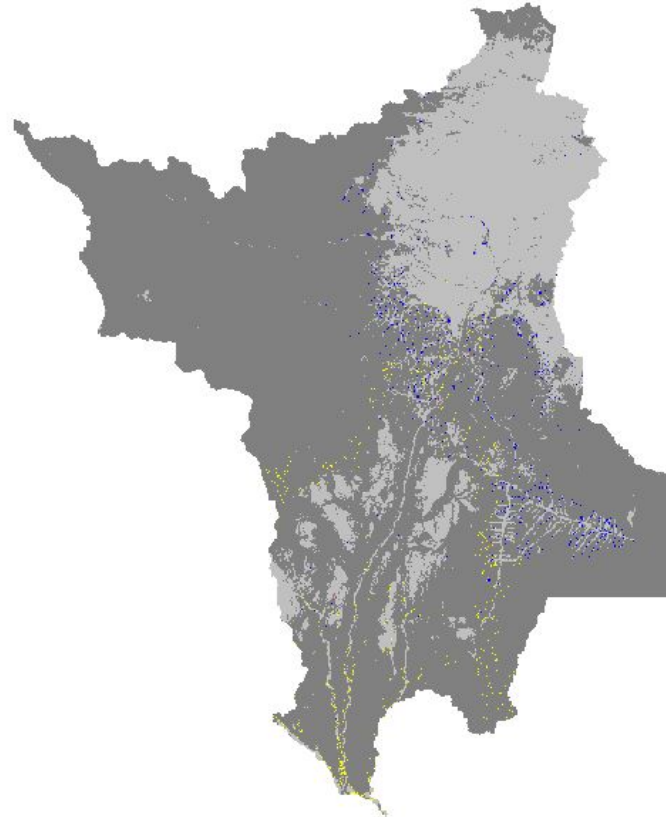


Run 4A - 2 Year Validation - Elevation

| | |
|--------------|-------|
| Hits | 9 |
| Misses | 945 |
| False Alarms | 945 |
| FOM | 0.474 |

GEOMOD Run 4A Validation

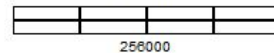
Cross-Classification : 2000Forest_mask_Roraima64 | 2002Forest_mask_Roraima64 | controltest1_2year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |



Meters

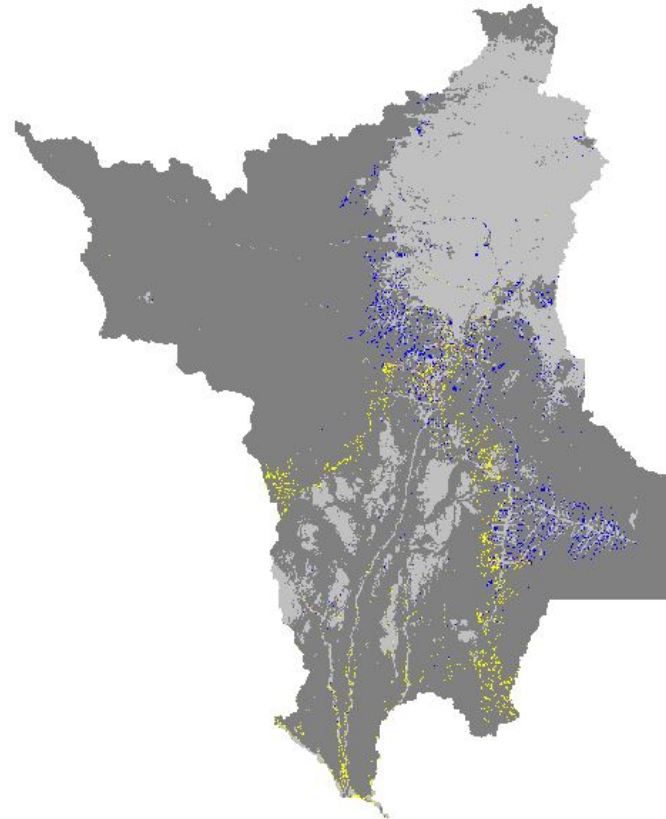


Run 3A - 5 Year Validation - Elevation

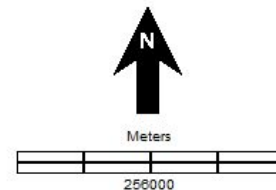
| | |
|--------------|-------|
| Hits | 59 |
| Misses | 2232 |
| False Alarms | 2232 |
| FOM | 1.304 |

GEOMOD Run 3A Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2005Forest_mask_Roraima64 | controltest1_5year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |

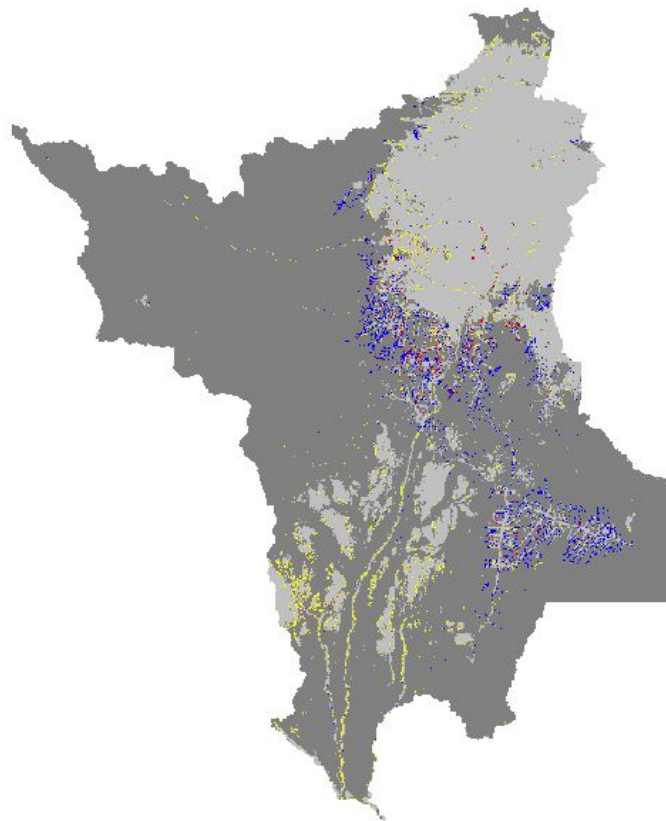


Run 2A - 10 Year Validation - Elevation

| | |
|--------------|-------|
| Hits | 232 |
| Misses | 3373 |
| False Alarms | 3373 |
| FOM | 3.325 |

GEOMOD Run 2A Validation

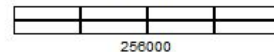
Cross-Classification : 2000Forest_mask_Roraima64 | 2010Forest_mask_Roraima64 | controltest3_10year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |



Meters

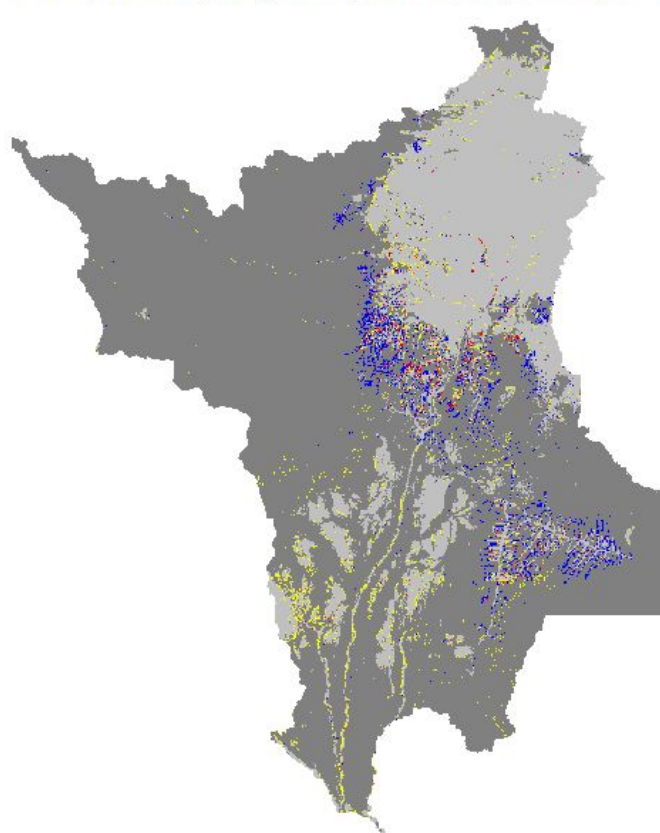


Run 1A - 15 Year Validation - Elevation

| | |
|--------------|-------|
| Hits | 431 |
| Misses | 4381 |
| False Alarms | 4381 |
| FOM | 4.688 |

GEOMOD Run 1A Validation

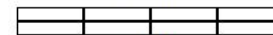
Cross-Classification : 2000Forest_mask_Roraima64 | 2015Forest_mask_Roraima64 | controltest3_15year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |



Meters



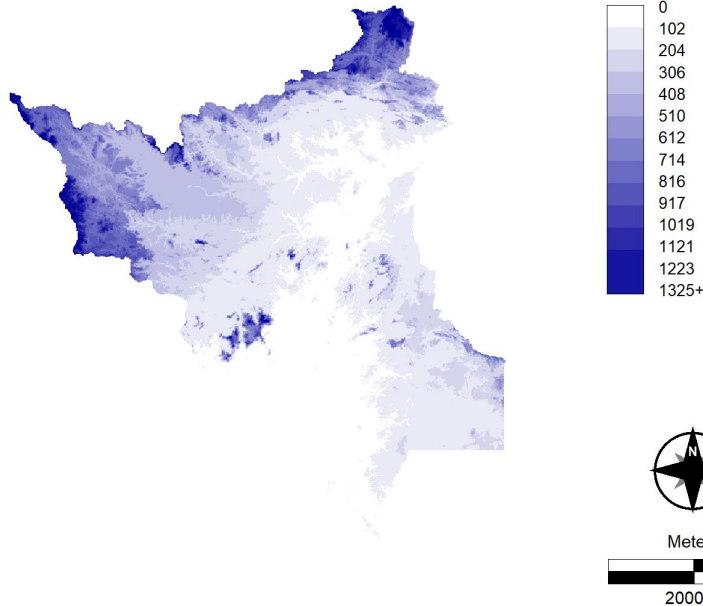
25000

GEOMOD Run Collection B: Elevation and Slope

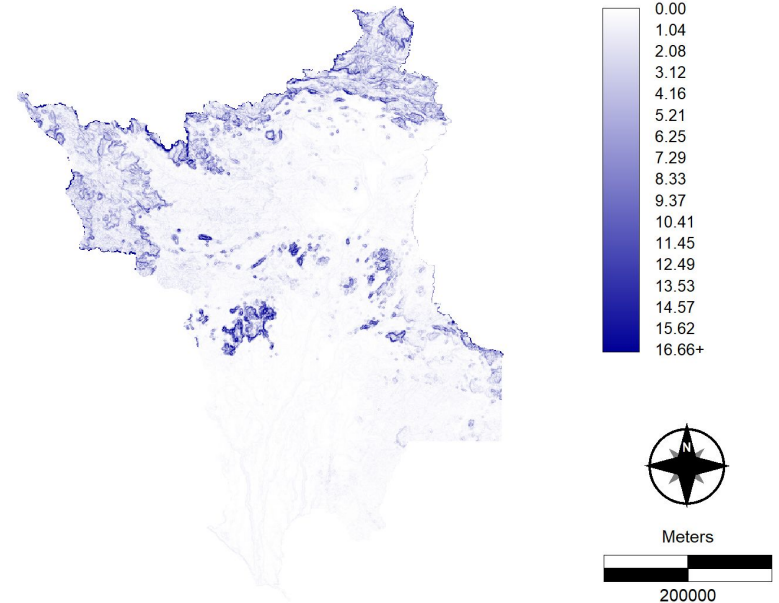
Interval Length: 2,5,10,15 years

Drivers are weighted equally

Elevation in Roraima, Brazil



Slope in Roraima, Brazil

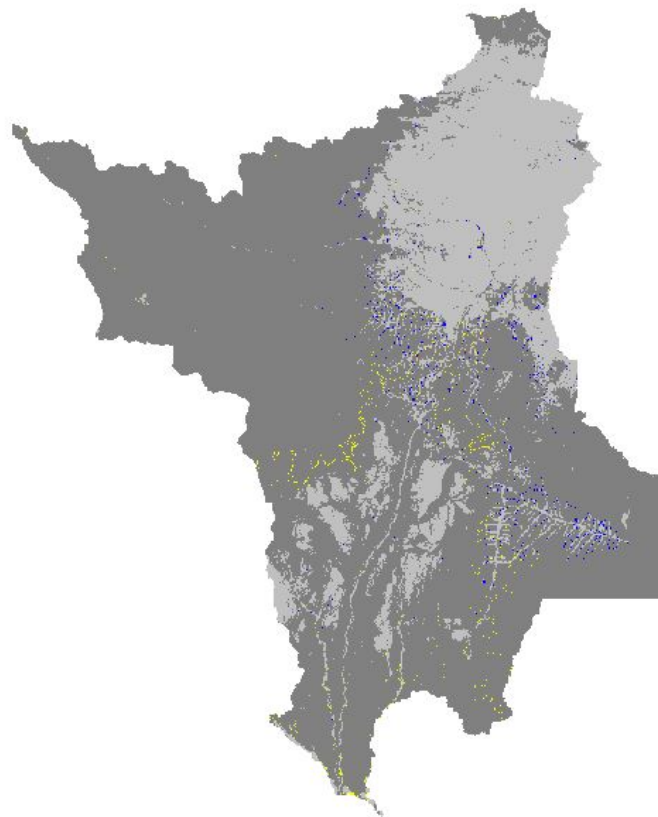


Run 4B - 2 Year Validation - Elevation and Slope

| | |
|--------------|-------|
| Hits | 12 |
| Misses | 942 |
| False Alarms | 942 |
| FOM | 0.633 |

GEOMOD Run 4B Validation

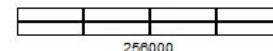
Cross-Classification : 2000Forest_mask_Roraima64 | 2002Forest_mask_Roraima64 | controltest2_2year_1



| | | |
|---|---|----------------------|
| 1 | 1 | 1 Forest Persistence |
| 1 | 2 | 1 Miss |
| 1 | 1 | 2 False Alarm |
| 1 | 2 | 2 Hits |
| 2 | 2 | 2 Non-Forest |



Meters

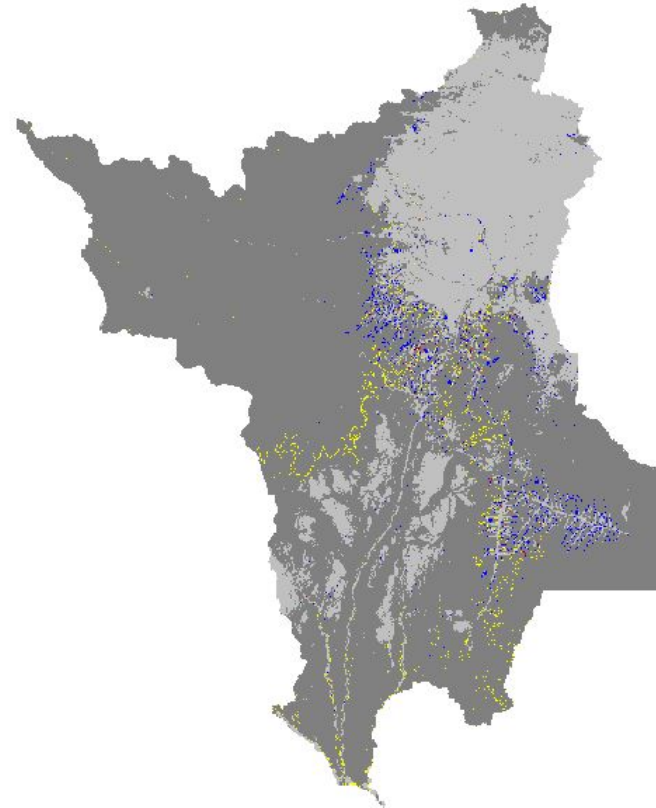


Run 3B - 5 Year Validation - Elevation and Slope Drivers

| | |
|--------------|-------|
| Hits | 118 |
| Misses | 2173 |
| False Alarms | 2173 |
| FOM | 2.643 |

GEOMOD Run 3B Validation

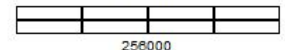
Cross-Classification : 2000Forest_mask_Roraima64 | 2005Forest_mask_Roraima64 | controltest2_5year_1



| | | | |
|---|---|---|--------------------|
| 1 | 1 | 1 | Forest Persistence |
| 1 | 2 | 1 | Miss |
| 1 | 1 | 2 | False Alarm |
| 1 | 2 | 2 | Hits |
| 2 | 2 | 2 | Non-Forest |



Meters



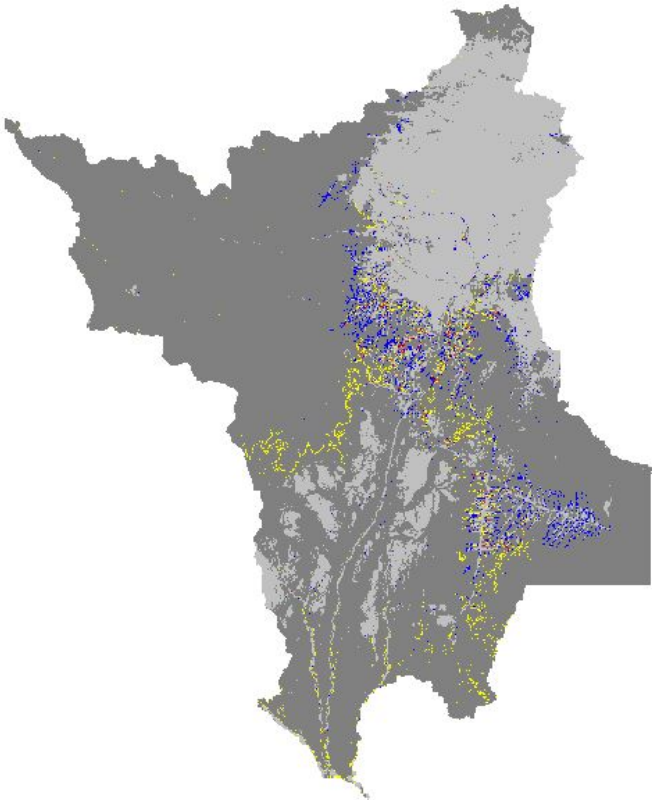
25000

Run 2B - 10 Year Validation - Elevation and Slope Drivers

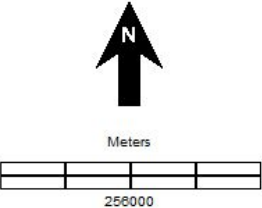
| | |
|--------------|-------|
| Hits | 324 |
| Misses | 3281 |
| False Alarms | 3281 |
| FOM | 4.705 |

GEOMOD Run 2B Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2010Forest_mask_Roraima64 | controltest2_10year_1



- 1 | 1 | 1 Forest Persistence
- 1 | 2 | 1 Miss
- 1 | 1 | 2 False Alarm
- 1 | 2 | 2 Hits
- 2 | 2 | 2 Non-Forest

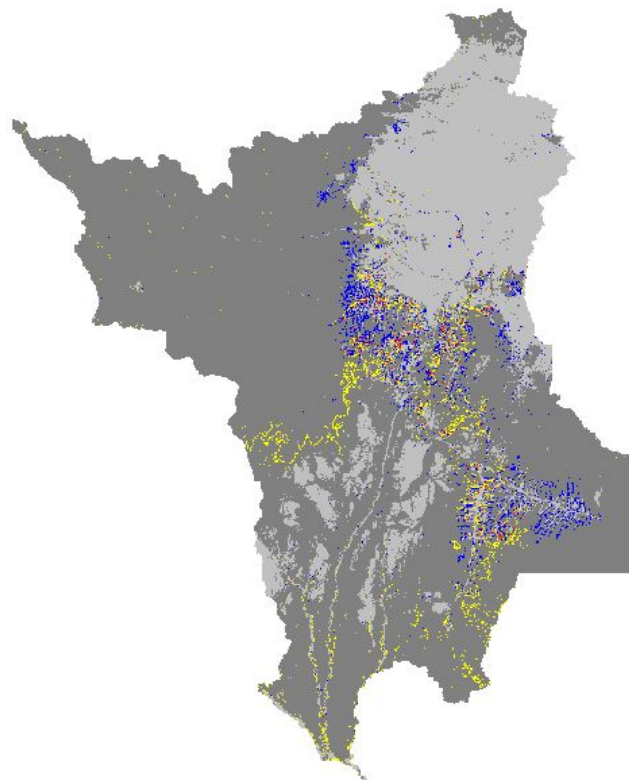


Run 1B - 15 Year Validation - Elevation and Slope Drivers

| | |
|--------------|-------|
| Hits | 552 |
| Misses | 4260 |
| False Alarms | 4260 |
| FOM | 6.085 |

GEOMOD Run 1B Validation

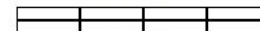
Cross-Classification : 2000Forest_mask_Roraima64 | 2015Forest_mask_Roraima64 | controtest2_15year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |



Meters



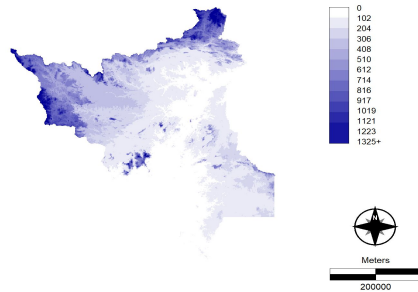
256000

GEOMOD Run Collection C: Slope, Elevation, Indigenous Land, Protection Status, Land Cover, Rivers, Population Density

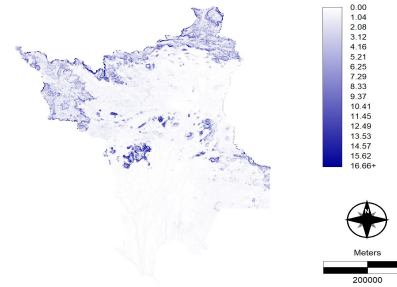
Interval Length: 2,5,10,15 years

Drivers are weighted equally

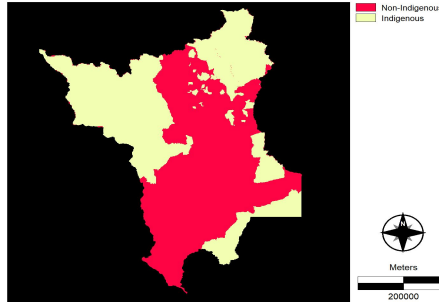
Elevation in Roraima, Brazil



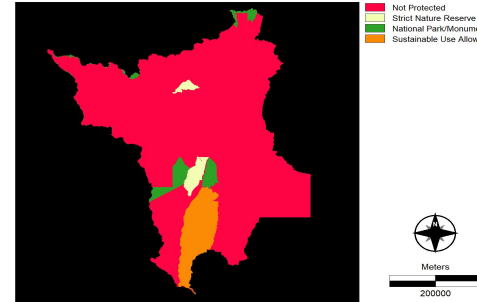
Slope in Roraima, Brazil



Indigenous Land in Roraima, Brazil



Protection Status in Roraima, Brazil

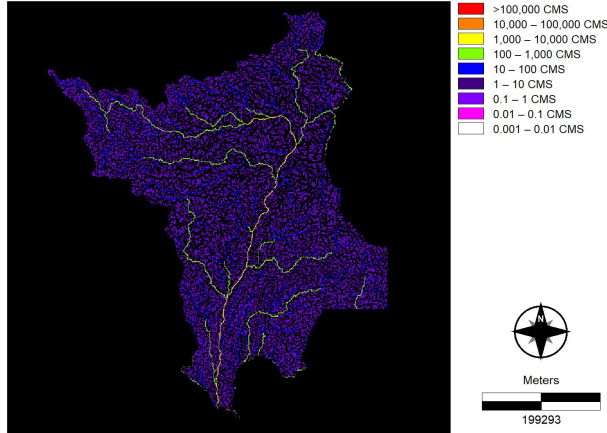


GEOMOD Run Collection C: Slope, Elevation, Indigenous Land, Protection Status, Land Cover, Rivers, Population Density

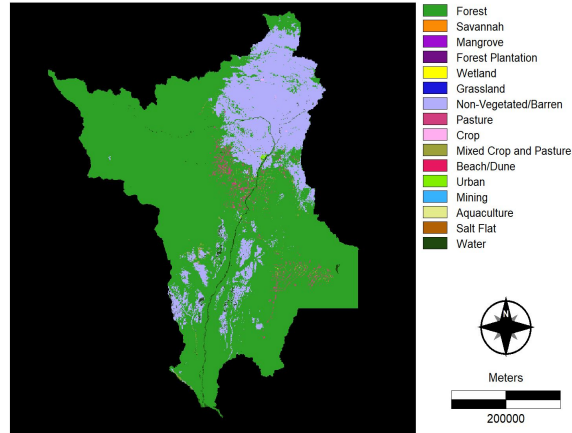
Interval Length: 2,5,10,15 years

Drivers are weighted equally

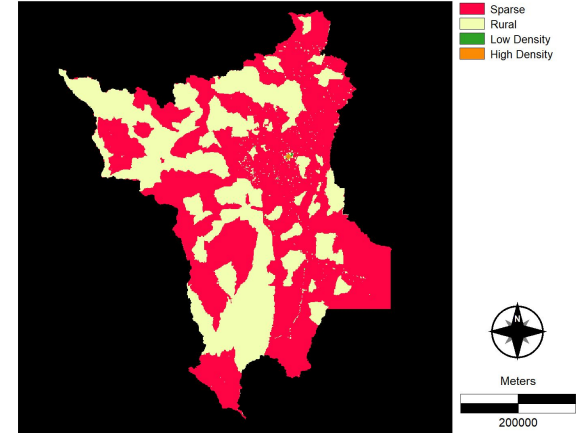
Rivers in Roraima, Brazil



Land Cover in Roraima, Brazil



Population Density in Roraima, Brazil

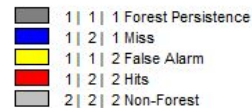
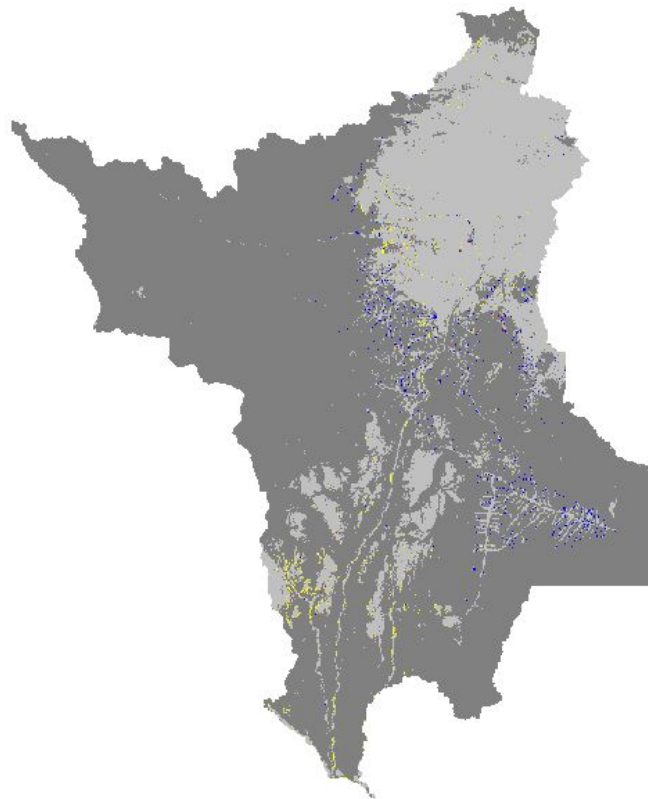


Run 4C - 2 Year Validation - Multiple Drivers

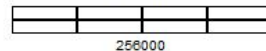
| | |
|--------------|-------|
| Hits | 34 |
| Misses | 920 |
| False Alarms | 920 |
| FOM | 1.814 |

GEOMOD Run 4C Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2002Forest_mask_Roraima64 | controltest3_2year_1



Meters

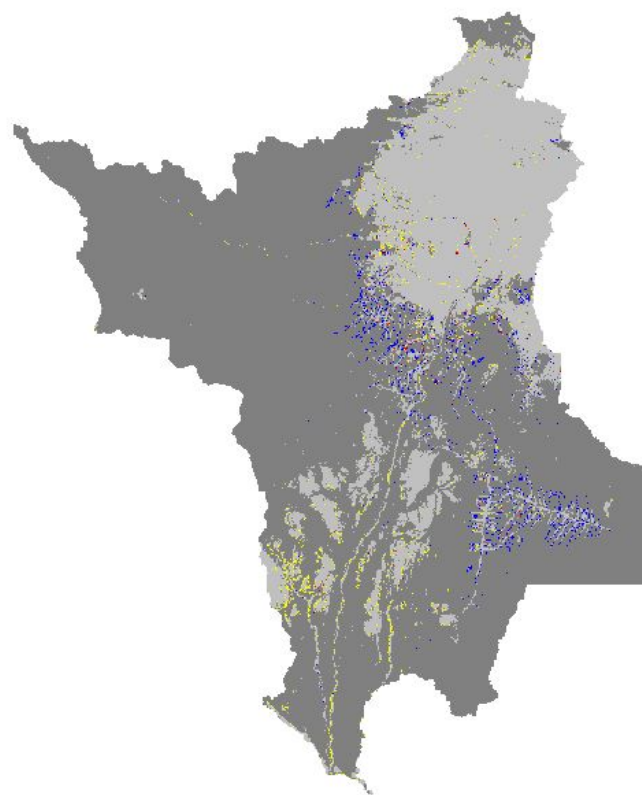


Run 3C - 5 Year Validation - Multiple Drivers

| | |
|--------------|-------|
| Hits | 206 |
| Misses | 2085 |
| False Alarms | 2085 |
| FOM | 4.707 |

GEOMOD Run 3C Validation

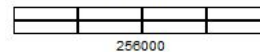
Cross-Classification : 2000Forest_mask_Roraima64 | 2005Forest_mask_Roraima64 | controltest3_5year_1



| | |
|-----------|--------------------|
| 1 1 1 | Forest Persistence |
| 1 2 1 | Miss |
| 1 1 2 | False Alarm |
| 1 2 2 | Hits |
| 2 2 2 | Non-Forest |



Meters

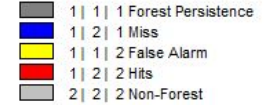
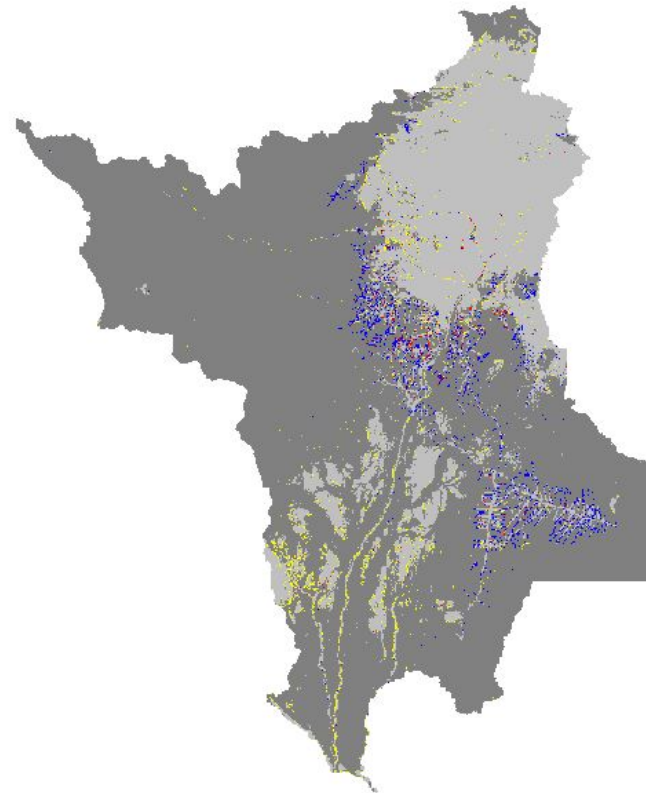


Run 2C - 10 Year Validation - Multiple Drivers

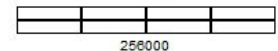
| | |
|--------------|-------|
| Hits | 583 |
| Misses | 3022 |
| False Alarms | 3022 |
| FOM | 8.797 |

GEOMOD Run 2C Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2010Forest_mask_Roraima64 | controltest3_10year_1



Meters

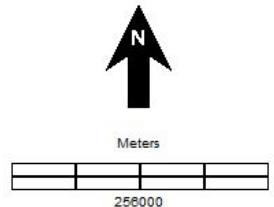
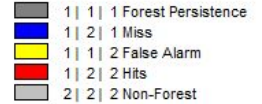
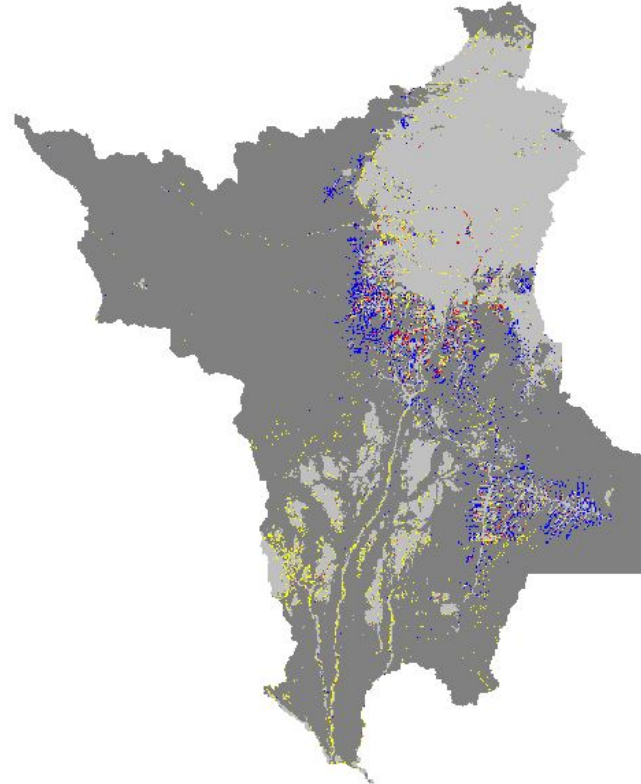


Run 1C - 15 Year Validation - Multiple Drivers

| | |
|--------------|-------|
| Hits | 868 |
| Misses | 3944 |
| False Alarms | 3944 |
| FOM | 9.913 |

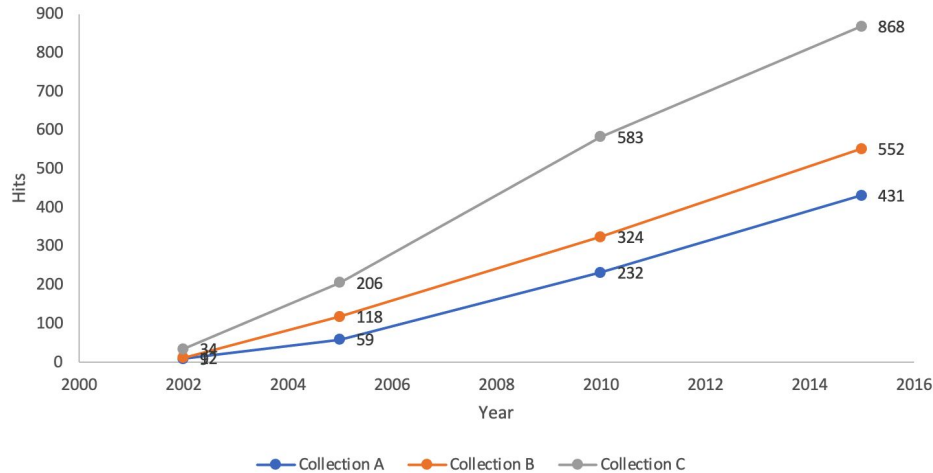
GEOMOD Run 1C Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2015Forest_mask_Roraima64 | controltest3_15year_1

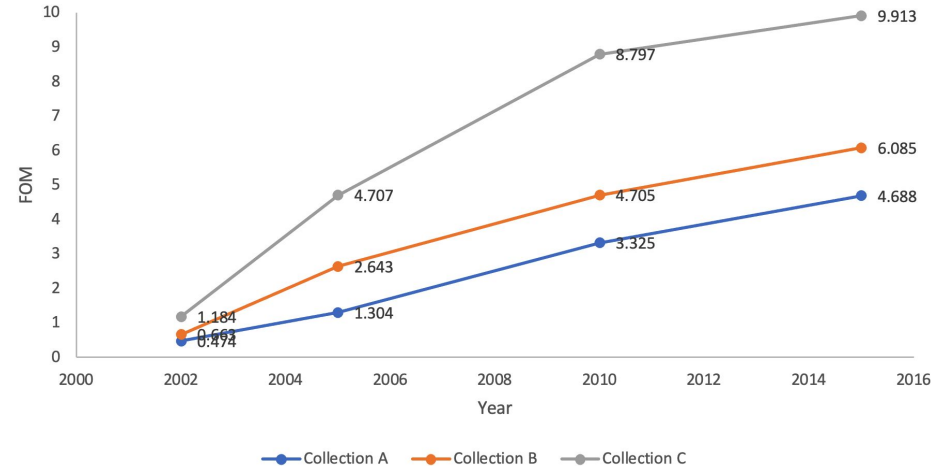


Comparison of all GEOMOD Run Collections

Hits Across All GEOMOD Run Collections



FOM Across All GEOMOD Run Collections

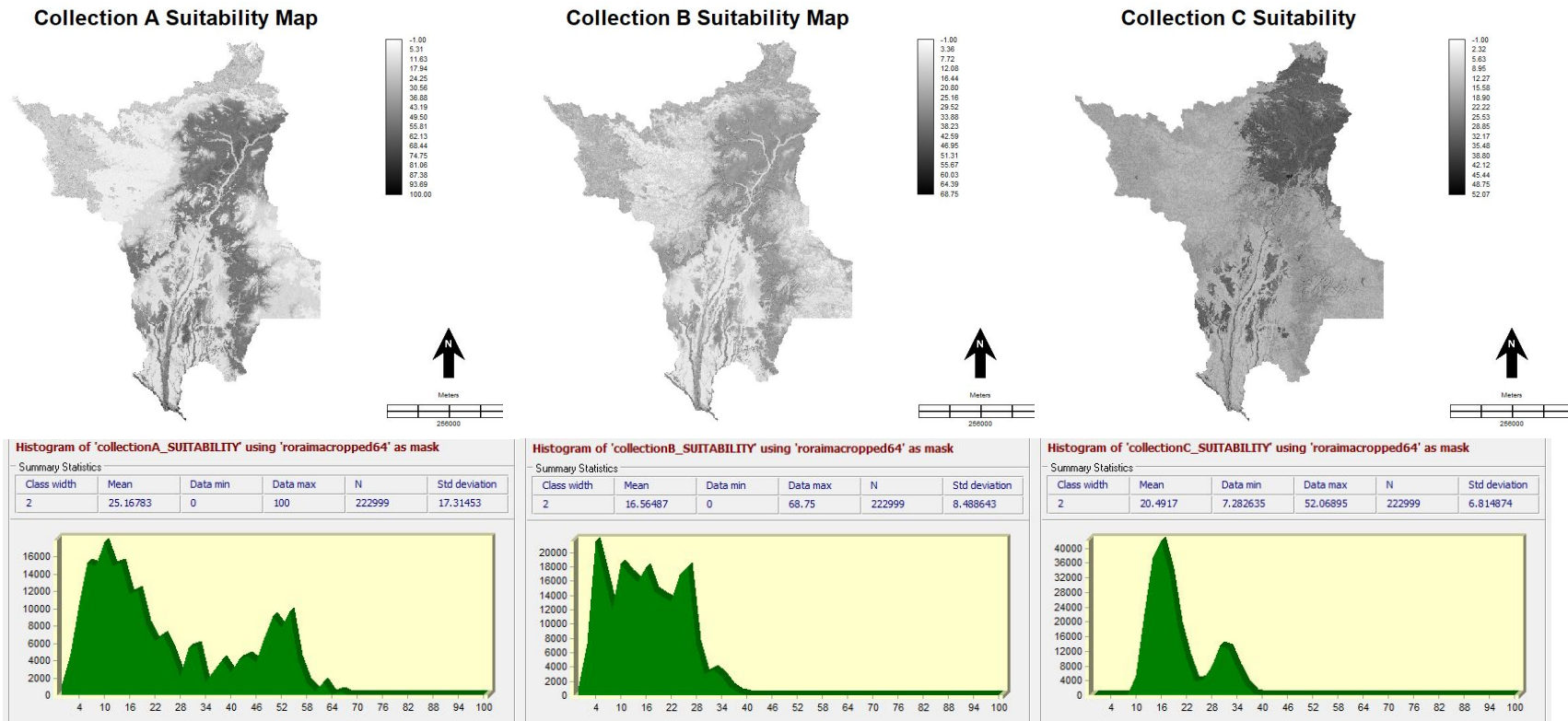


| | |
|--------------|--|
| Collection A | Elevation Driver Only |
| Collection B | Elevation and Slope Drivers |
| Collection C | Slope, Elevation, Indigenous Land, Protection Status, Land Cover, Rivers, and Population Density Drivers |

Comparing Suitability Across Collections A, B, C

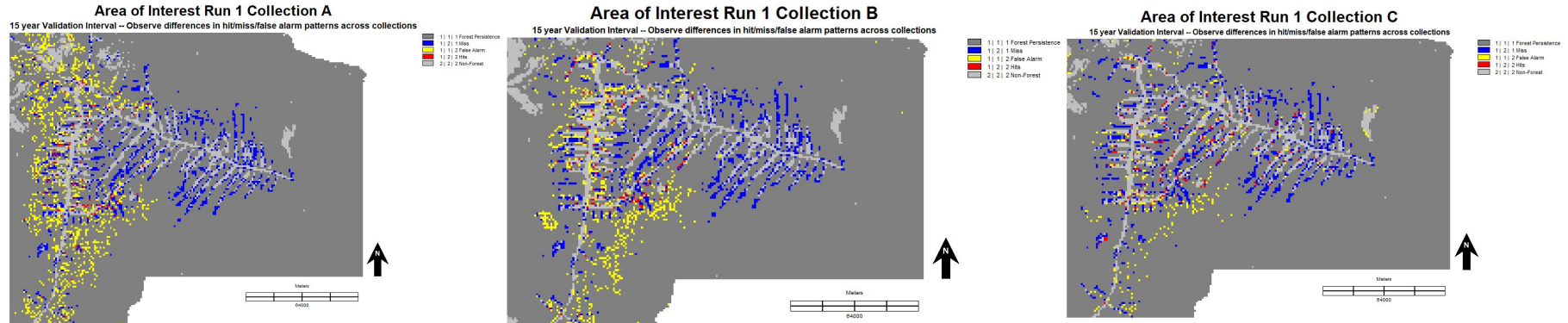
The GEOMOD parameters used ensure the same suitability maps were used within each collection

Notice the decreasing standard deviation and maximum value as more driver variables are included



From left to right: Collection A, B, C

Viewer should notice an increase in misses and hits and a decrease in false alarms as number of Driver Variables increases. A decrease in False Alarms with an increase in Hits suggests a improvement in allocation as number of Driver Variables increases.

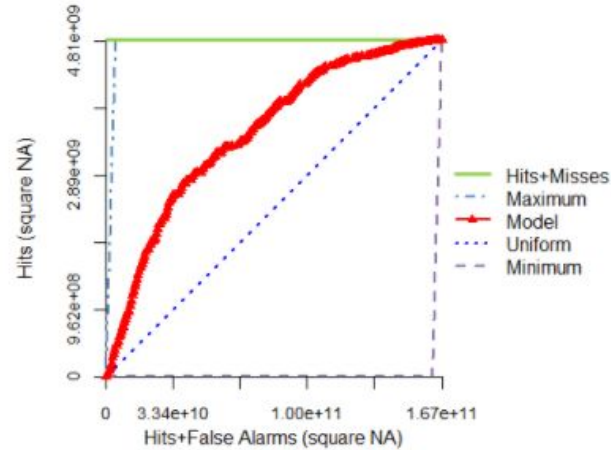


The three images displayed should lead the viewer to see GEOMOD's capability to simulate forest loss to increase as the Driver Variables used increases from Elevation to Elevation and Slope to Elevation, Slope, Indigenous Land, Protection Status, Land Cover, Rivers, Population Density. In addition to the increase in hits, notice the decrease in False Alarms in the southernmost section of the fishbone pattern, suggesting the variables added in Collections B and C demonstrate a connection to forest loss patterns in Roraima.

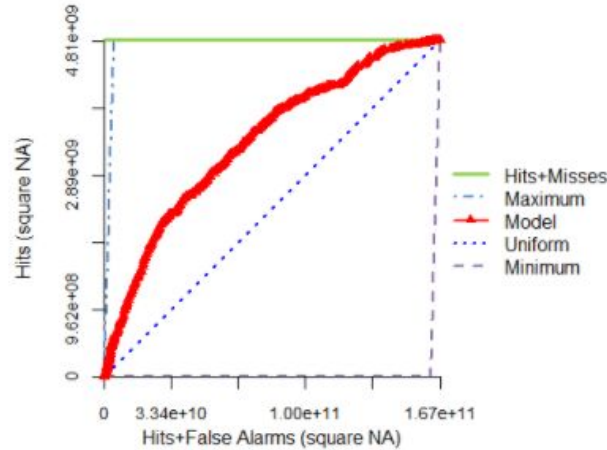
Total Operating Characteristic (TOC)

These figures display how many pixels with forest loss fall exist under each possible suitability value threshold- i.e. displaying the distribution of suitability values within pixels of forest loss from 2000-2015 in each GEOMOD Collection

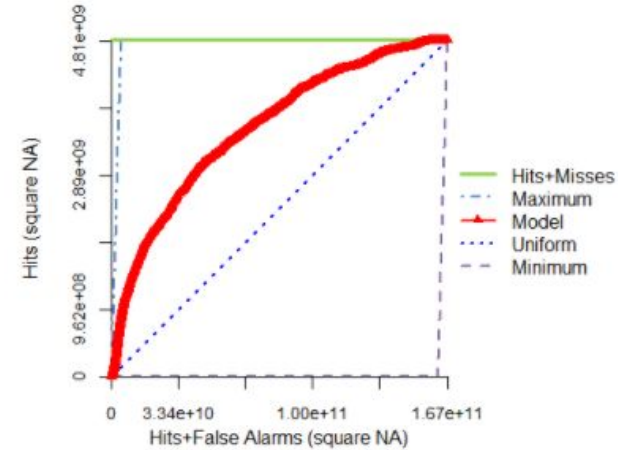
Collection A



Collection B



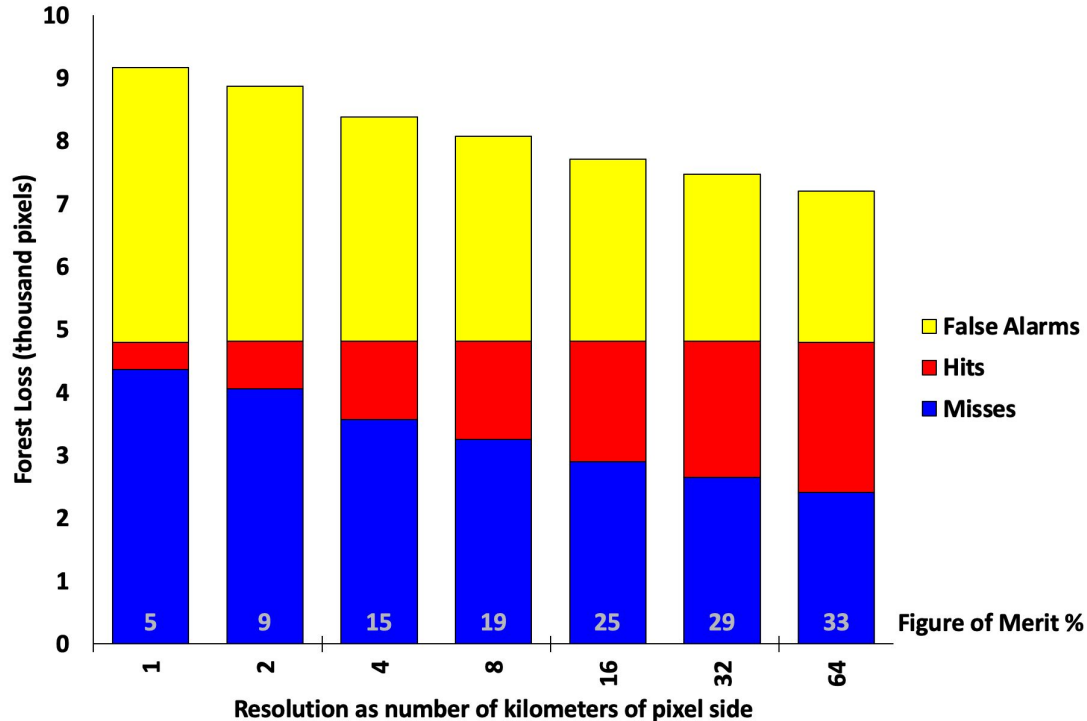
Collection C



While all three TOC Curves display an expected trend of higher suitability values corresponding to larger volumes of actual forest loss, they do not show any noticeable differences that connect to conclusions we can make about the role of Driver Variables in each Collection.

Multi Resolution Analysis of 15 year Elevation Driver GEOMOD Run Validation

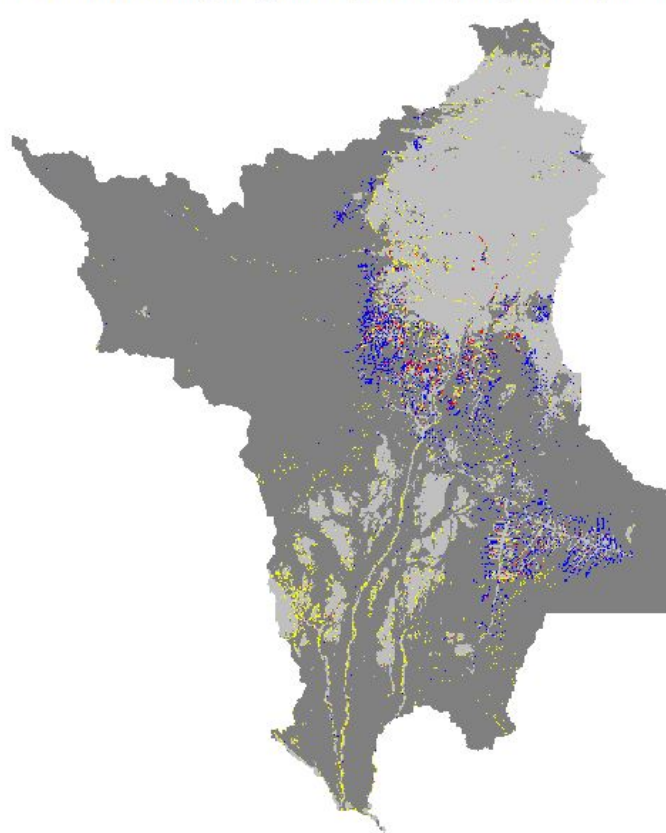
Figure of Merit increases as resolution becomes coarser.



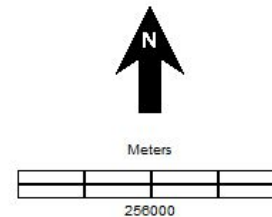
15 year Elevation Driver GEOMOD Run Validation

GEOMOD Run 1A Validation

Cross-Classification : 2000Forest_mask_Roraima64 | 2015Forest_mask_Roraima64 | controltest3_15year_1



| | | |
|---|---|----------------------|
| 1 | 1 | 1 Forest Persistence |
| 1 | 2 | 1 Miss |
| 1 | 1 | 2 False Alarm |
| 1 | 2 | 2 Hits |
| 2 | 2 | 2 Non-Forest |



Conclusion

In this project we observed differences in GEOMOD outputs as changes were implemented in validation period length and driver variables. This analysis displayed an increase in Figure of Merit as validation period length increased and number of driver variables increased.

As number of driver variables increased, we also noticed a more accurate allocation of forest loss in the agricultural “fishbone” formation.

References

- Aldrich, S. P., Walker, R. T., Arima, E. Y., Caldas, M. M., Browder, J. O., & Perz, S. (2006). Land-Cover and Land-Use Change in the Brazilian Amazon: Smallholders, Ranchers, and Frontier Stratification. *Economic Geography*, 82(3), 265–288.
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- Pontius, R. G. (2018). Criteria to Confirm Models that Simulate Deforestation and Carbon Disturbance. *Land*, 7(3), 105.
<https://doi.org/10.3390/land7030105>
- Souza, C. M., Z. Shimbo, J., Rosa, M. R., Parente, L. L., A. Alencar, A., Rudorff, B. F. T., Hasenack, H., Matsumoto, M., G. Ferreira, L., Souza-Filho, P. W. M., de Oliveira, S. W., Rocha, W. F., Fonseca, A. V., Marques, C. B., Diniz, C. G., Costa, D., Monteiro, D., Rosa, E. R., Vélez-Martin, E., ... Azevedo, T. (2020). Reconstructing Three Decades of Land Use and Land Cover Changes in Brazilian Biomes with Landsat Archive and Earth Engine. *Remote Sensing*, 12(17), 2735. <https://doi.org/10.3390/rs12172735>