

# Estimating bias and precision of biomass estimates in miombo woodlands with global and local maps

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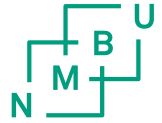
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# IPCC compliance – useful guidelines for map assessment



- IPCC guidelines – how should they be interpreted?
    1. *“neither over- nor underestimates so far as can be judged”*

Methodology:

      - a) Either use a «benchmark» value to assess estimates, or
      - b) use statistical estimators that are known to be unbiased, e.g. design-based estimators
    2. *“uncertainties are reduced as far as is practicable”*

Use the map either

      - a) as the primary source of information, or
      - b) as auxiliary information to improve precision of the estimates.
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# Biomass map assessment

Do you have a probability ground sample?

Yes

Design-based inference  
*map=auxiliary data only*

1<sup>st</sup> guideline:  
accuracy

2<sup>nd</sup> guideline:  
uncertainty

Satisfied via use  
of unbiased  
design-based  
estimator

Design-based  
variance  
estimators  
are rigorous

Use of map reduces uncertainty

No

Model-based inference  
*map=primary data source*

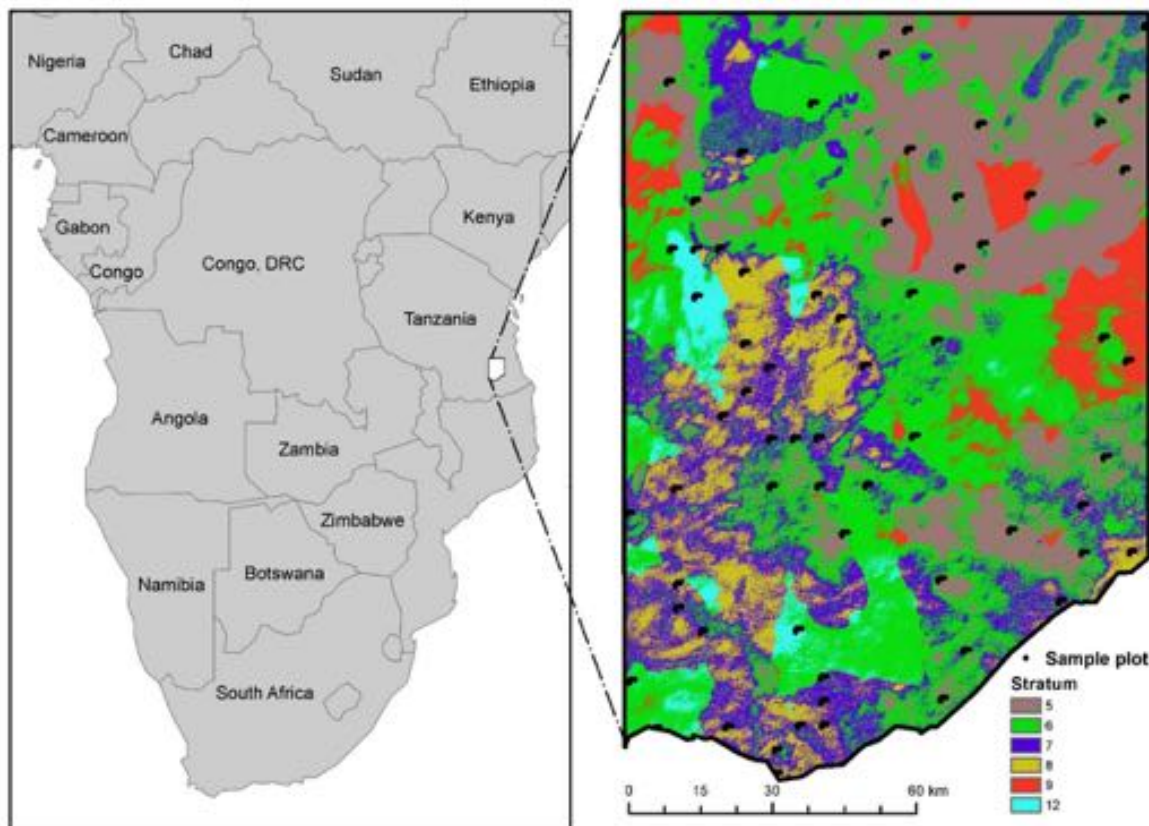
1<sup>st</sup> guideline:  
accuracy

2<sup>nd</sup> guideline:  
uncertainty

Requires  
independent,  
greater quality  
data to assess  
accuracy

Use model-based  
variance  
estimator  
with data provided  
by the map author

# Study area and design



Sampling design:

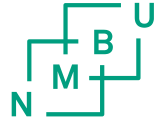
Systematic stratified cluster sample with unequal cluster sizes

Allows design-based analysis and inference

# Reference data – field survey

National forest inventory sample plots

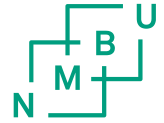




# Map products

Map products:

1. Global maps (Saatchi, Yu et al.)
    - a. A global height map (Lorey's height)
    - b. A global biomass map
  
  2. A local height map (Trier et al.)
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# Biomass map assessment

Estimation strategies:

## 1. Global and local height maps

- a. Use the maps to fit local biomass models:  $AGB = \alpha + \beta H + \varepsilon$
- b. Produce a biomass prediction map
- c. Use the map as auxiliary data in a model-assisted estimation

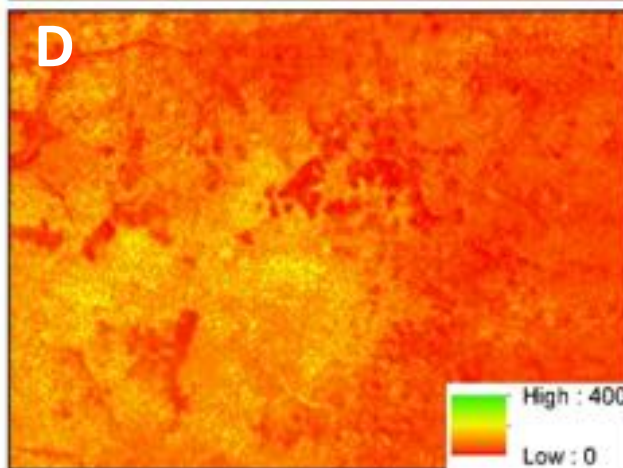
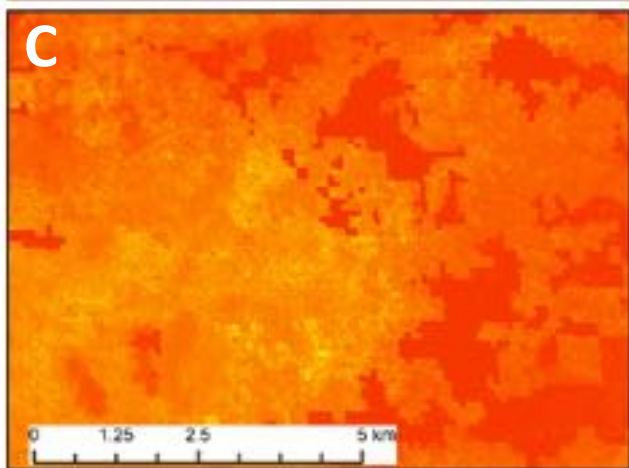
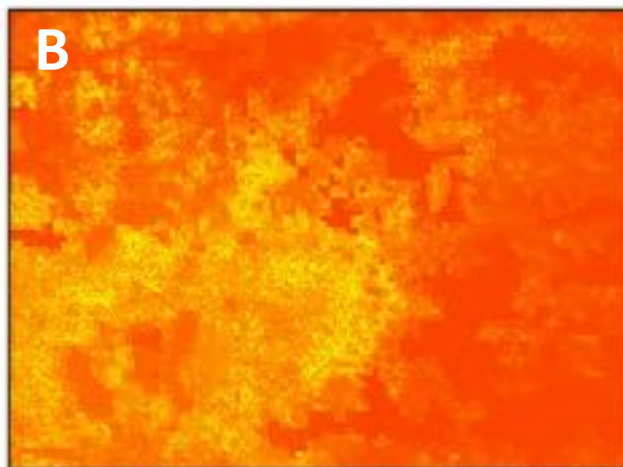
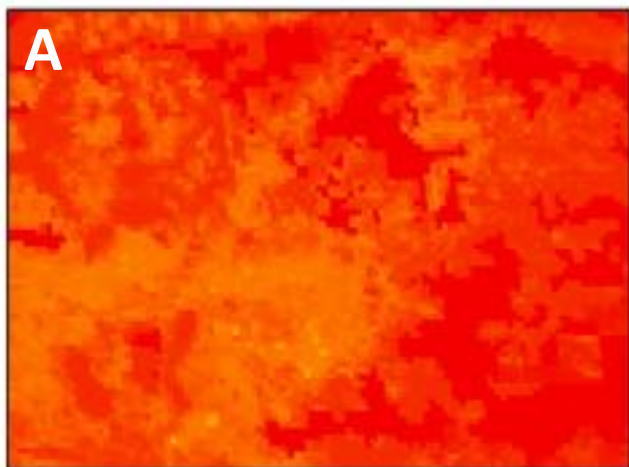
## 2. Global biomass map, uncalibrated

Use the map as is in a model-assisted estimation

## 3. Global biomass map, locally calibrated

- a. Use the map to fit local biomass model:  $AGB_L = \alpha + \beta AGB_G + \varepsilon$
  - b. Produce a locally calibrated biomass prediction map
  - c. Use the map as auxiliary data in a model-assisted estimation
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# Biomass map assessment



A: Global biomass map uncalibrated

Calibrated maps:

B: Locally calibrated global biomass map

C: Biomass prediction map from global height map

D: Biomass prediction map from local height map

0 1.25 2.5 5 km

High : 400  
Low : 0



# Biomass map assessment

Evaluation criteria:

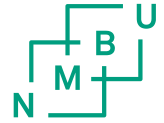
1. Precision of biomass estimates (standard error) when maps are used to support the estimation relative to precision of other estimates (relative efficiency; RE\*)
2. Bias estimate for stratum  $h$

$$\hat{B}_h = \frac{1}{N_h} \sum_{k \in U_h} \hat{b}_k + \frac{1}{\sum_{U_i \in S_h} N_i} \sum_{k \in S_h} (b_k - \hat{b}_k)$$

Synthetic estimator

HT-like bias estimator

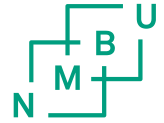
\*Calculated with variances rather than standard errors



# Biomass map assessment

## Main findings:

1. Uncalibrated global biomass map:
    - a. Statistically significantly biased: 44-76%
    - b. Precision much poorer than using only the field sample (RE=0.4)
  
  2. Locally calibrated global biomass map
    - a. Greater precision than using only the field sample (RE=1.7)
  
  3. Local biomass maps from global and local height maps
    - a. Equally precise, no additional benefit of local height map (RE=1.9)
    - b. More precise than locally calibrated biomass map
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# Biomass map assessment

## Conclusions:

1. Global biomass map has no value without local calibration
  2. When calibrated locally, global biomass map can still help improving precision of estimates – potentially representing great savings in monetary terms
  3. No benefits found for local maps versus global maps, given available local calibration data
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