



TERRA POPULUS

Integrated Data on Population and Environment



TerraPop Goals

Lower barriers to conducting **interdisciplinary human-environment** interactions research by making data with **different formats** from **different scientific domains** easily interoperable

Provide an **organizational** and **technical** framework to **preserve, integrate, disseminate, and analyze** global-scale spatiotemporal data describing population and the environment.



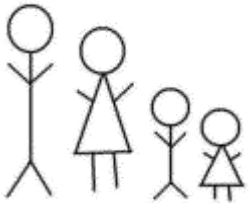
Source Data



- **DOMAINS & FORMATS**
- **POPULATION MICRODATA**
- **AREA-LEVEL DATA**

Terra Populus Data Domains

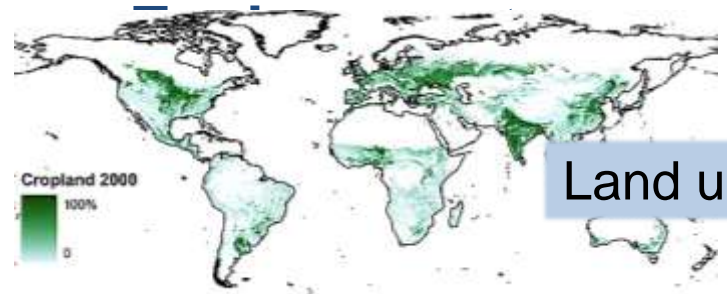
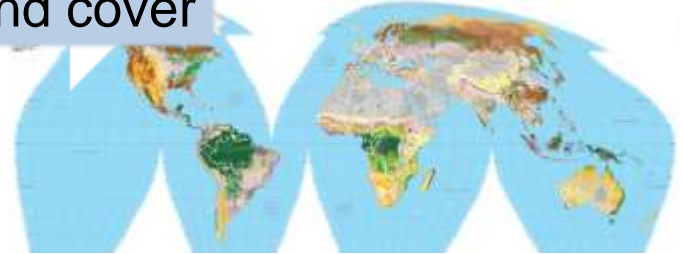
Microdata



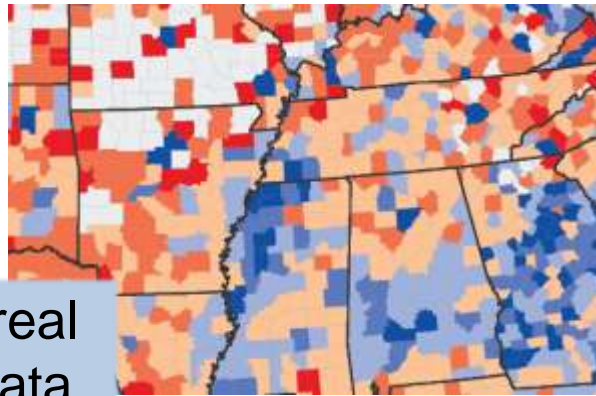
Individuals
and
households

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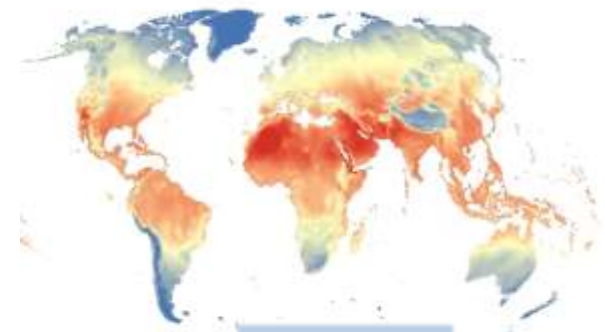
Land cover



Land use



Areal
Data



Climate



Age Birthplace
 Sex Mother's birthplace
 Relationship Race Occupation

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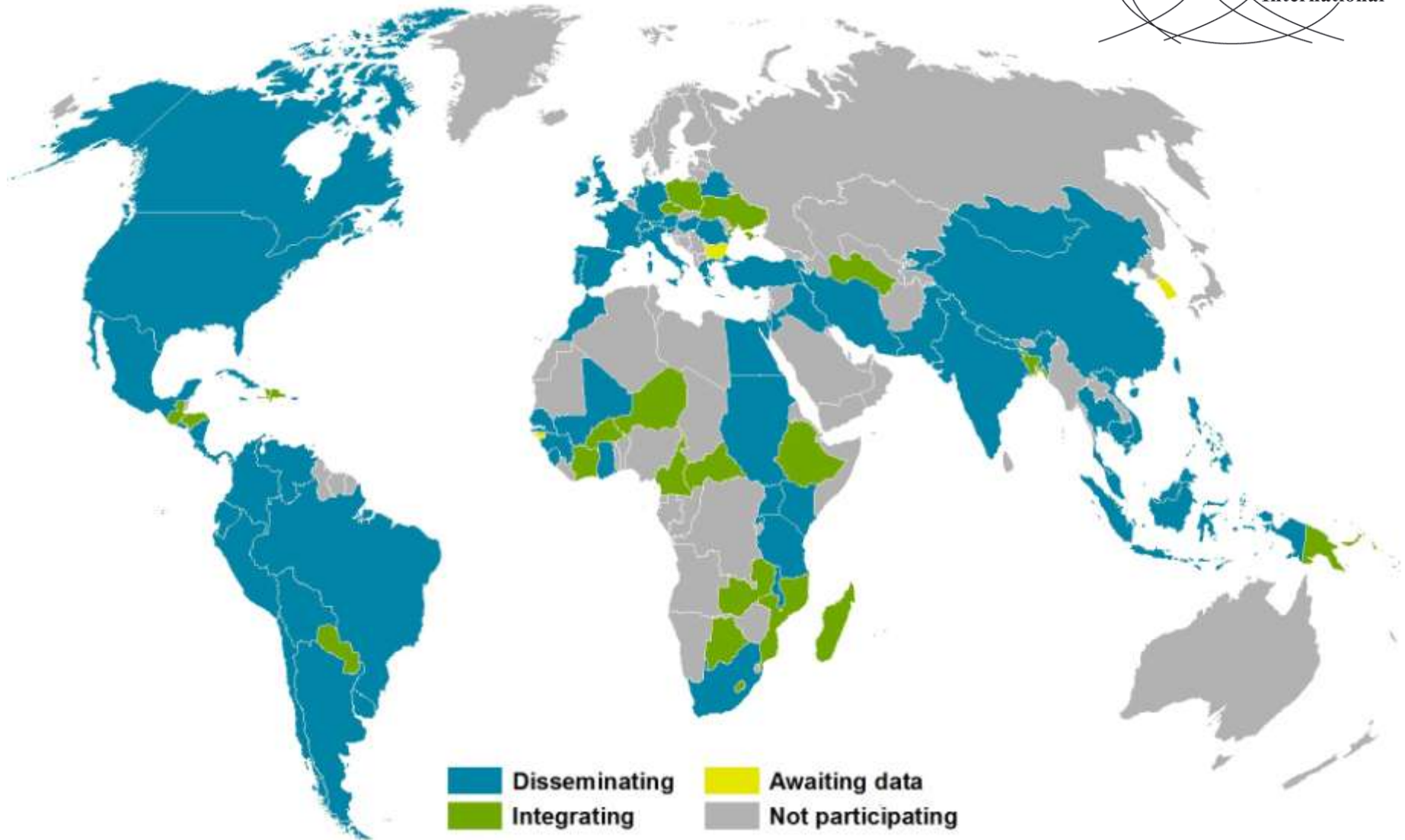
Population Microdata Structure

Geographic and housing characteristics

- Rows
 - Household records
 - Person records within households
- Columns
 - Variables



Microdata Availability



- | | | | |
|---|---------------|--|-------------------|
|  | Disseminating |  | Awaiting data |
|  | Integrating |  | Not participating |



Area-level Data Sources

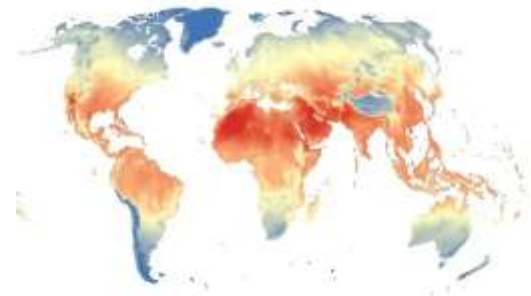
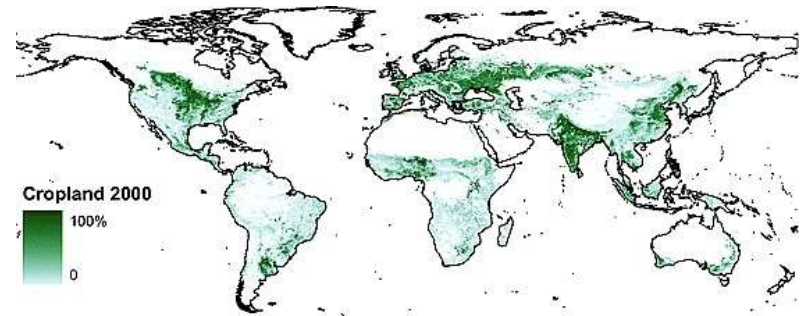
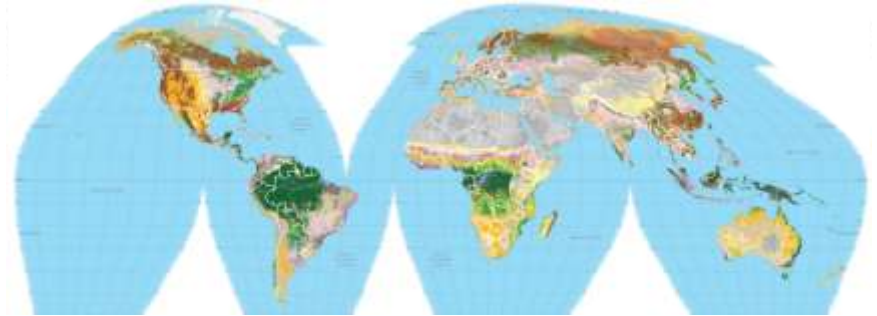
- Census tables, especially where microdata is unavailable
- Other types of surveys, data
 - Agricultural surveys
 - Economic surveys, data
 - Election data
- Legal information



Environmental Data (Rasters)

TerraPop Prototype

- Land cover data from satellite images (*Global Land Cover 2000*)
- Agricultural land use data from satellites and government records (*Global Landscapes Initiative*)
- Climate data from weather stations (*WorldClim*)

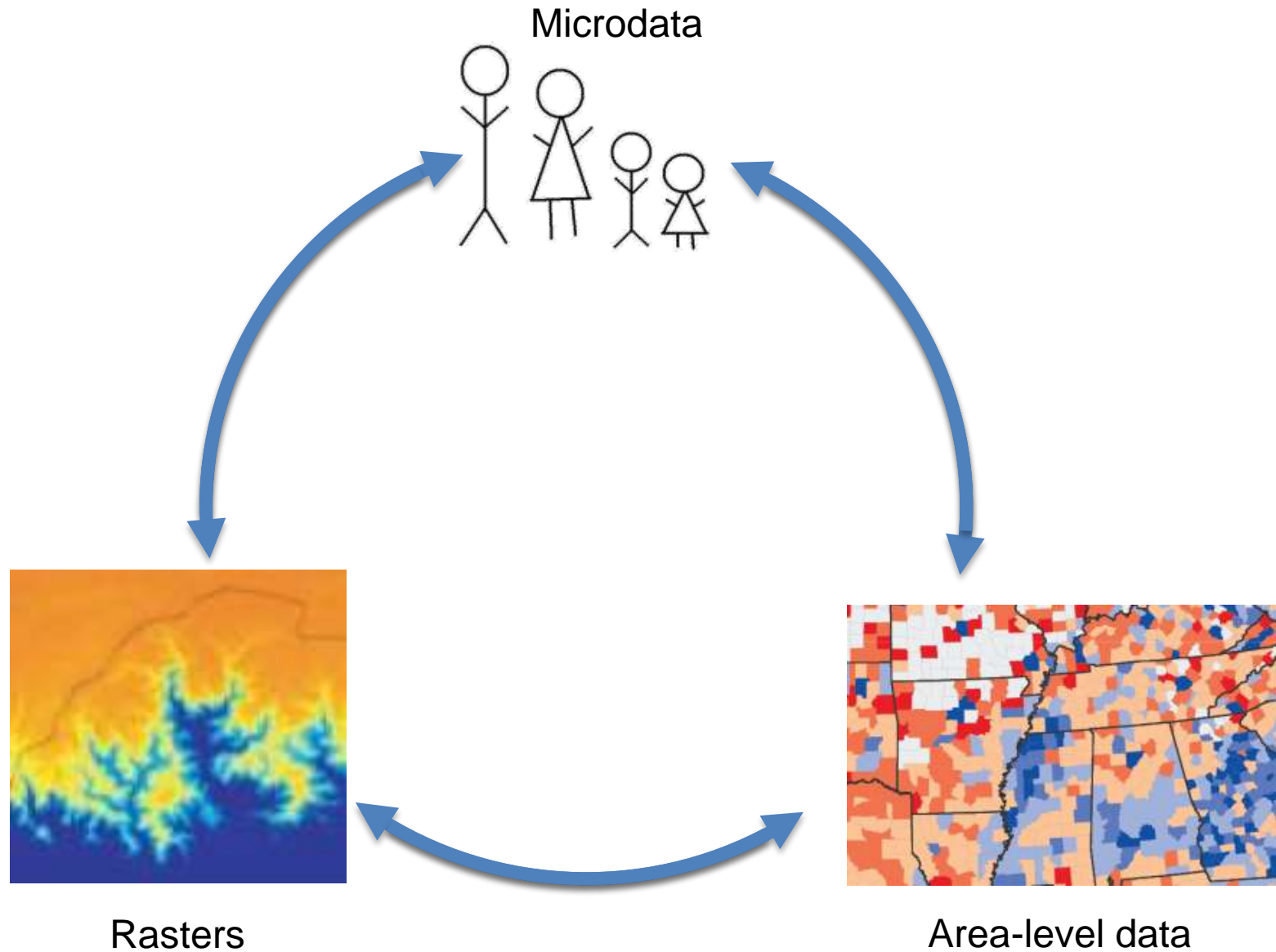


Location-Based Integration



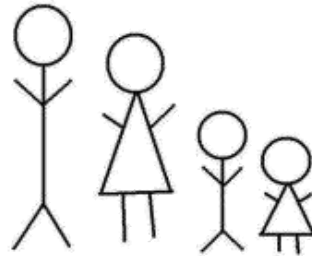
MICRODATA ⇔ AREA-LEVEL ⇔ RASTER

Location-Based Integration



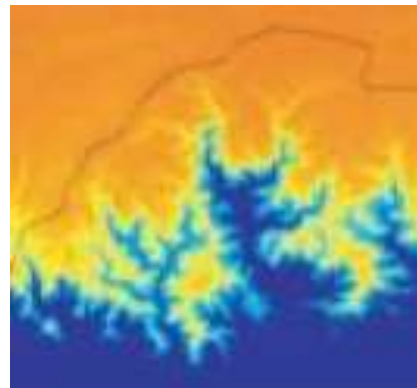
Location-Based Integration

Microdata

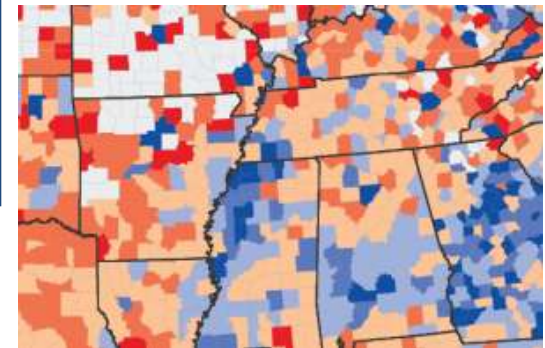


Individuals and households
with their environmental
and social context

AGE	SEX	LANDCOV	AVGTEMP
10	Male	Forest	21.20
27	Female	Forest	24.30
54	Female	Pasture	24.10
37	Male	Cropped	25.60
37	Female	Cropped	28.10
42	Female	Urban	26.70
20	Female	Forest	24.30
39	Male	Urban	26.80
77	Female	Cropped	27.70
11	Female	Cropped	22.30
31	Female	Pasture	25.10
23	Male	Forest	24.40
24	Female	Urban	21.50
40	Female	Urban	23.40



Rasters

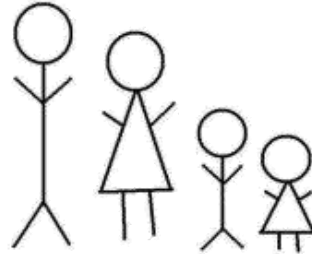


Area-level data



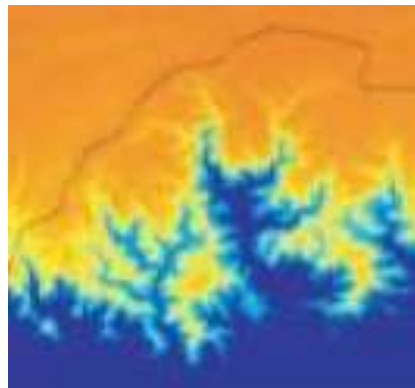
Location-Based Integration

Microdata

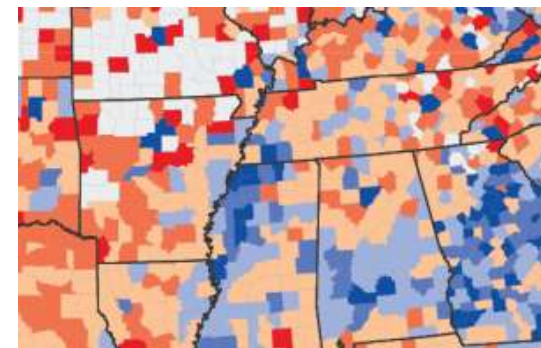


County ID	Mean Ann. Temp.	Max. Ann. Precip.	Rent, Rural	Rent, Urban	Own, Rural	Own, Urban
G17003100001	21.2	768	3129	1063	637	365
G17003100002	23.4	589	2949	1075	1469	717
G17003100003	24.3	867	3418	1589	1108	617
G17003100004	21.5	943	1882	425	202	142
G17003100005	24.1	867	2416	572	426	197
G17003100006	24.4	697	2560	934	950	563
G17003100007	25.6	701	2126	653	321	215

Summarized environmental and population characteristics for administrative districts



Rasters

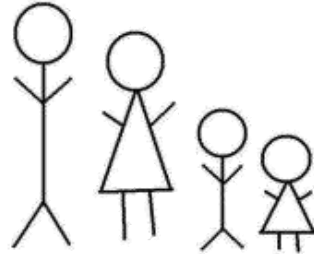


Area-level data

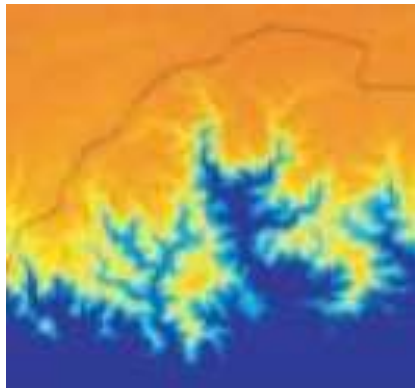


Location-Based Integration

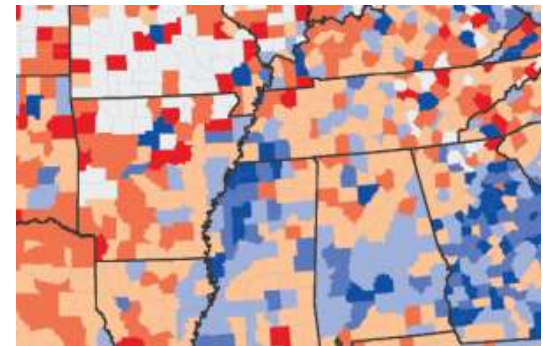
Microdata



Rasters of
population and
environment
data



Rasters

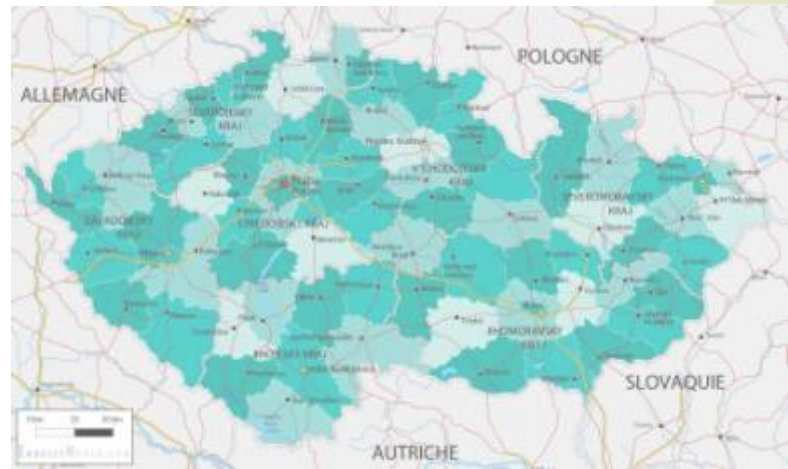


Area-level data



Boundaries are Key

- Linkages across data formats rely on administrative unit boundaries
- Particular needs
 - Lower level boundaries
 - Historical boundaries



Administrative Unit Boundary Processing



- **OBTAINING**
- **LINKING TO MICRODATA**
- **TEMPORAL HARMONIZATION**
- **REGIONALIZATION**

Obtaining Boundary Data

- **Potential sources of digital data**
 - National Statistical Offices
 - Global Administrative Areas data (e.g. SALB, GAUL)
 - Digitizing from images or paper maps
- **Challenges**
 - Lower level and historical data
 - Date mismatches with census data
 - Code matching to microdata



Digitizing Boundaries

Leveraging available digital data

- Script input

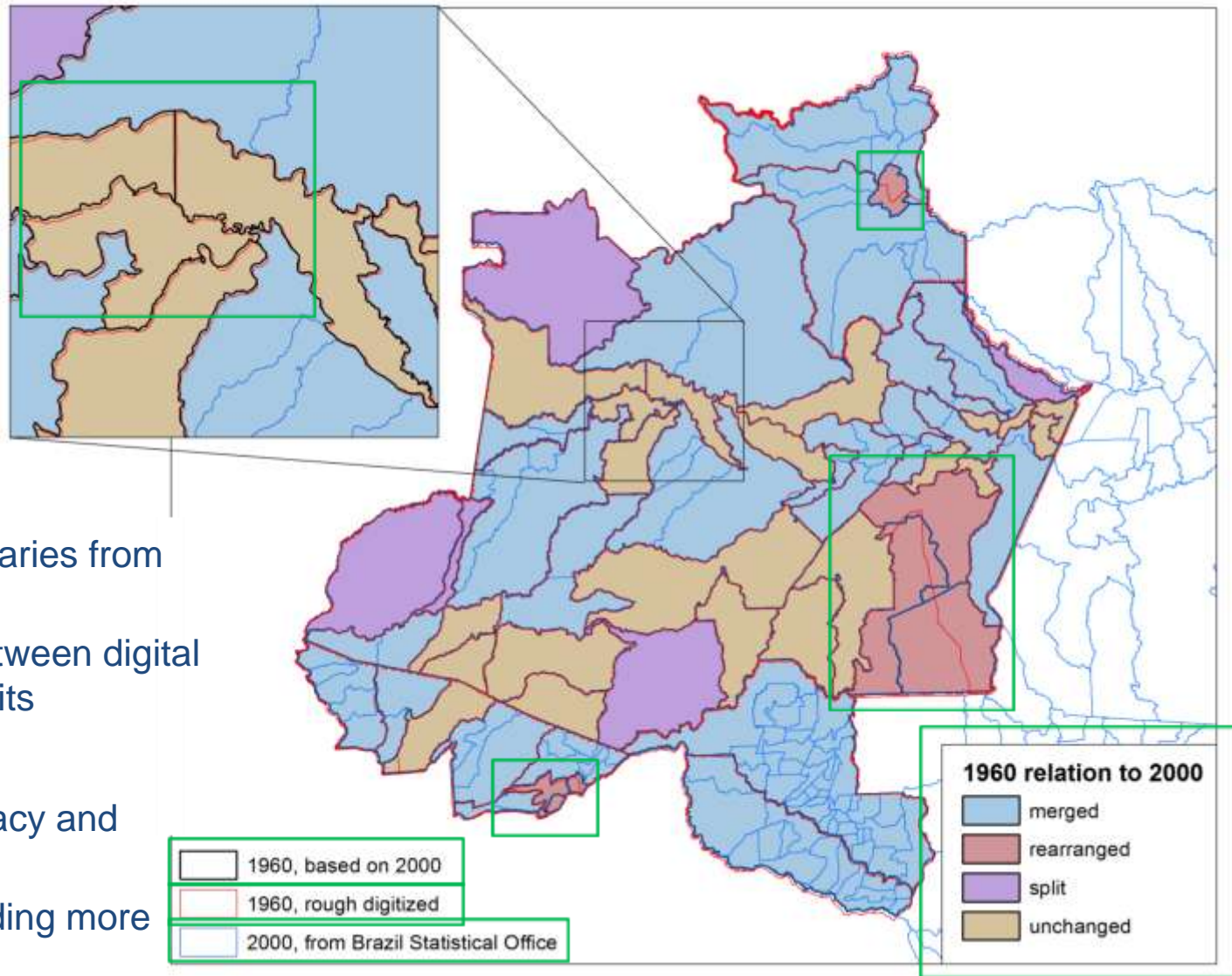
- Existing digital data
- Rough digitized boundaries

- Script output

- Relevant boundaries from digital data
- Relationship between digital and digitized units

- Advantages

- Preserve accuracy and detail
- Flag areas needing more work



Code Matching

- Codes link boundaries to microdata records, connect people to places

Boundary
shape
attributes

Shape *	GEODIGITO	NOME
Polygon	1100015	Alta Floresta D'Oeste
Polygon	1100023	Ariquemes
Polygon	1100031	Cabixi
Polygon	1100049	Cacoal
Polygon	1100056	Cerejeiras
Polygon	1100064	Colorado do Oeste
Polygon	1100072	Corumbiara
Polygon	1100080	Costa Marques

MUNIBR2	PERNUM	WTPER	AGE	SEX	MARST
1100049	2	18.40	96	2	4
1100023	5	18.53	95	2	4
1100023	3	24.12	94	1	2
1100023	6	9.70	90	1	2
1100049	3	26.57	88	2	4
1100049	2	19.85	87	2	4
1100049	2	21.59	86	1	3
1100049	1	19.49	86	1	4
1100023	7	9.70	85	2	2
1100015	3	25.56	85	1	2

IPUMS
microdata

- Boundary data may or may not include codes
- Approach
 - Name matching, when possible
 - Map observations – digitizing script captures codes
 - Research on boundary changes

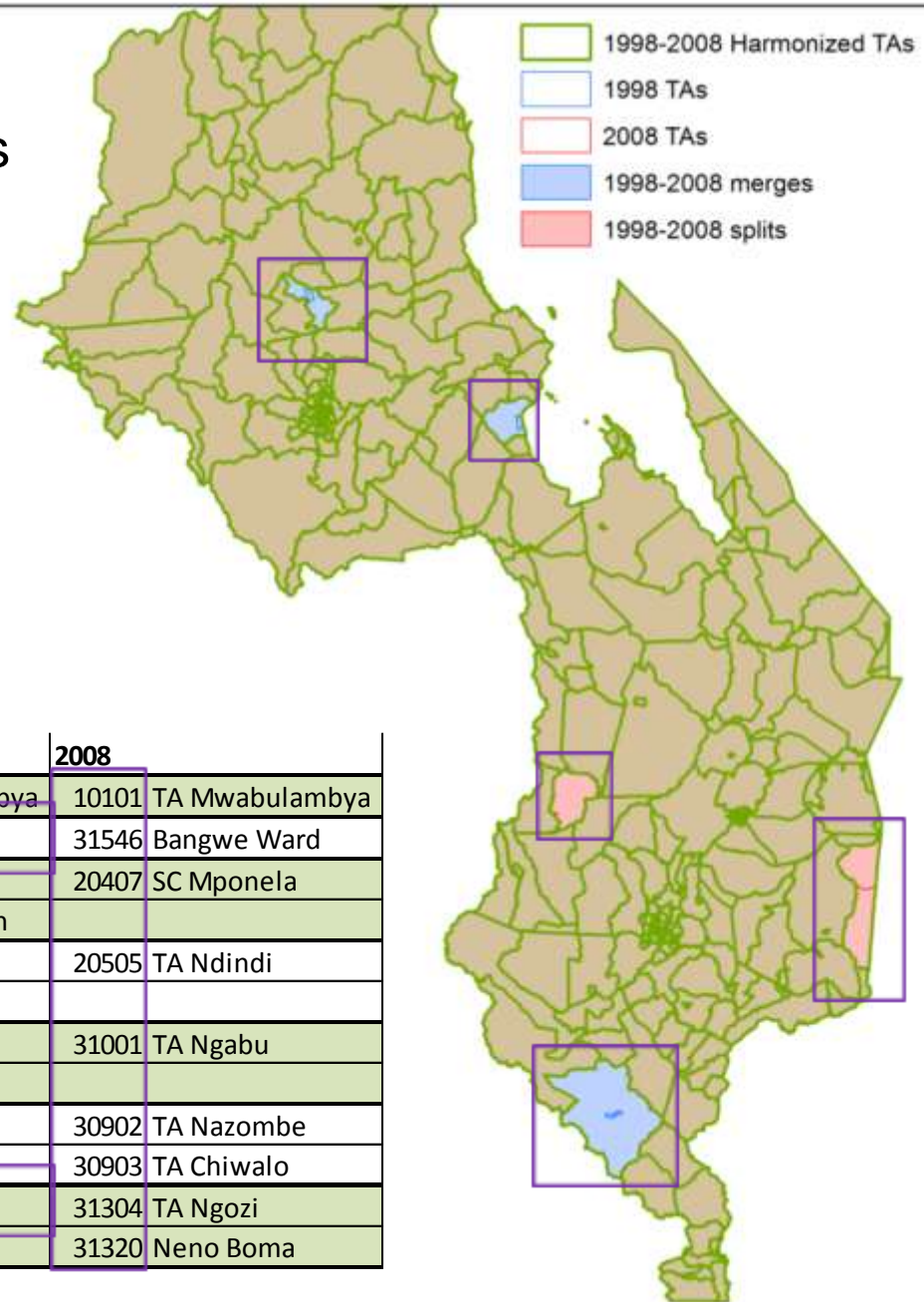


Temporal Harmonization

- Purpose
 - Create consistent units for time-series analysis
- Top-down strategy
 - Start with first administrative level units
 - Harmonize 2nd level units within 1st level “containers”
- Script to create “least common denominator” units
 - Applicable when maps from multiple years are available
 - Creates aggregate units encompassing areas with boundary changes
 - Constructs source-harmonized crosswalk



- “Erase” interior boundaries applicable to only one census
- Apply harmonized codes
- Also aids in code matching



Crosswalk

Harmonized	1998	2008
10101 TA Mwabulambya	10101 TA Mwabulambya	10101 TA Mwabulambya
31546 Bangwe Ward	30546 Bangwe Ward	31546 Bangwe Ward
20407 Mponela	20407 SC Mponela	20407 SC Mponela
	20421 Mponela Urban	
20505 Ndindi and Chipoka Urban	20505 TA Ndindi	20505 TA Ndindi
	20521 Chipoka Urban	
31001 Ngabu	31001 TA Ngabu	31001 TA Ngabu
	31021 Ngabu Urban	
30902 Nazombe and Chiwalo	30902 TA Nazombe	30902 TA Nazombe
		30903 TA Chiwalo
31304 Ngozi and Neno Boma	30606 TA Ngozi	31304 TA Ngozi
		31320 Neno Boma



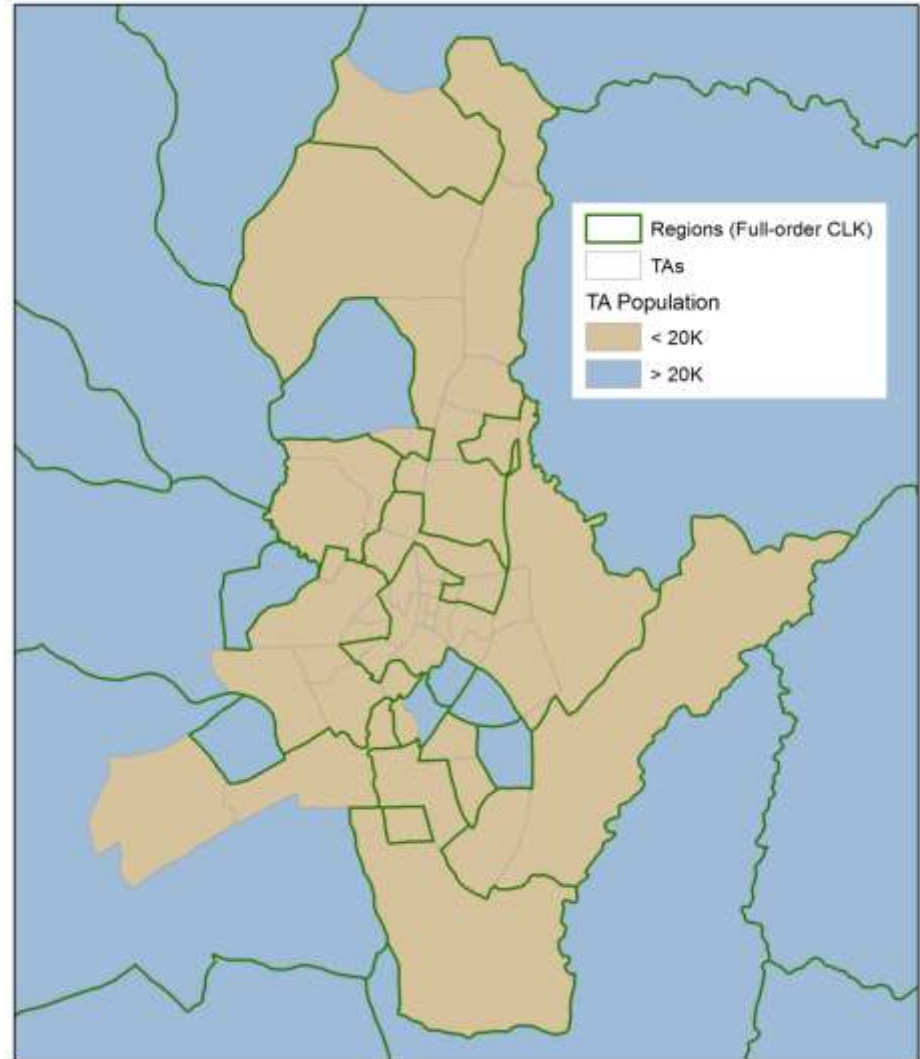
Regionalization

- Confidentiality concerns require minimum 20,000 population in each unit disseminated
- REDCAP tool
 - Constructs regions by combining units
 - Regions meet minimum population threshold
 - Contiguity constrained
 - Combines units that are similar in terms of a selected variable
- Currently in testing phase
 - REDCAP Algorithms and parameters
 - Optimization variables (e.g., pop. density, education, occupation)
 - Testing on Malawi TAs, Brazil 2000 municipios



Regionalization - Lilongwe, Malawi

- Units < 20K combined with neighbors to meet threshold
- Specific aggregation depends on
 - Optimization variable
 - Algorithm



Beyond Administrative Boundaries



- **ARBITRARY BOUNDARIES**
- **RASTERIZATION**

Arbitrary Boundaries

- Watersheds, buffers around features, etc.
- Near-term
 - Summarize rasters to user-supplied boundaries
 - Identify administrative units intersecting user-supplied boundaries
- Future
 - Reallocation based on uniform distribution assumption
 - Reallocation based on other assumptions



Rasterization

- Prototype - All cells in unit get the same value
 - Use lowest level units available
 - Rates only, not counts
- Future – Distribute based on ancillary data
 - Requires research on available methods
 - May provide as service – users select:
 - ✦ Ancillary data
 - ✦ Weights
 - ✦ Spatial distribution parameters

