

## Release Statement

### Gridded population estimates for 40 countries in Latin America and the Caribbean using official population estimates, Version 1.0

9 January 2023

The data were produced by WorldPop at the University of Southampton. These data include gridded population estimates, at approximately 100m resolution, for 40 countries in Latin America and the Caribbean (Appendix A). These results were created using official population estimates at the finest-available resolution provided by National Statistic Offices (NSOs) throughout the region, and built-up area, height and volume covariates produced from World Settlement Footprint 3D (WSF3D) datasets<sup>1</sup>.

We acknowledge the contribution of WorldPop's partners, notably the United Nations Population Fund (UNFPA) Latin America and Caribbean Regional Office in supporting the collection of population and administrative boundary data, and to the German Aerospace Center (DLR) for preparing and providing built settlement data from the WSF3D framework.

Modelling work and geospatial data processing was carried out by McKeen T., Bondarenko M., Kerr D. and Sorichetta A. Esch T., Marconcini M., Zeidler J. and Palacios-Lopez D. prepared and provided the WSF3D datasets. Juran S. and Valle C. aided with population and administrative boundary data collection. Oversight was provided by Andrew J. Tatem.

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*The authors followed rigorous procedures designed to ensure that the used data, the applied method and thus the results are appropriate and of reasonable quality. If users encounter apparent errors or misstatements, they should contact WorldPop at [release@worldpop.org](mailto:release@worldpop.org). WorldPop, University of Southampton, and their sponsors offer these data on a "where is, as is" basis; do not offer an express or implied warranty of any kind; do not guarantee the quality, applicability, accuracy, reliability or completeness of any data provided; and shall not be liable for incidental, consequential, or special damages arising out of the use of any data that they offer.*

## CITATION

McKeen T., Bondarenko M., Kerr D., Esch T., Marconcini M., Palacios-Lopez D., Zeidler J., Juran S., Tatem A.J. and Sorichetta A. 2023. *Gridded population estimates for 40 countries in Latin America and the Caribbean using official population estimates, Version 1.0*. Worldpop, University of Southampton. doi:10.5258/SOTON/WP00755.

## SOURCE DATA

- *Population*: Official population statistics at the finest level of administrative units available were provided by NSOs from the region (Appendix 1).
- *Geospatial covariate layers*: A set of ancillary geospatial layers known to be related to human population distribution were constructed (Appendix 2).
- *Settlement layers*: Notably amongst these geospatial covariate layers, high-resolution settlement data via the WSF3D project were used (Appendix 2).

## RELEASE CONTENT

1. **ppp\_\*XXX\_RF1\_v1.tif**
2. **ppp\_\*XXX\_RF2\_v1.tif**
3. **ppp\_\*XXX\_RF3\_v1.tif**
4. **ppp\_\*XXX\_RF4\_v1.tif**
5. **ppp\_\*XXX\_RF5\_v1.tif**

\*Spatially referenced gridded rasters are provided for 40 countries, identifiable using the ISO-3 country codes in the filenames in place of XXX above. For example, ABW refers to Aruba. See appendix 1 for the full list of countries. For each country, these data can be downloaded as a WinRAR Zip archive.

## **FILE DESCRIPTIONS**

The spatially referenced GeoTiff grid layers introduced in this description all have a resolution of 3 arc seconds (~100m at the equator) and have a geographic spatial reference (WGS1984). All GeoTiffs have a NoData value of -99999 (pixels that do not contain any people).

### **ppp\_\*XXX\_RF1\_v1.tif**

Each grid cell of this dataset represents the estimated population count for a specified country as calculated by RF modelling scenario 1, i.e. RF model fitted with just '*base*' covariate set, no WSF3D-derived data (Appendix 2).

### **ppp\_\*XXX\_RF2\_v1.tif**

Each grid cell of this dataset represents the estimated population count for a specified country as calculated by RF modelling scenario 2, i.e. RF model fitted with '*base*' covariate set and WSF3D built area layer (Appendix 2).

### **ppp\_\*XXX\_RF3\_v1.tif**

Each grid cell of this dataset represents the estimated population count for a specified country as calculated by RF modelling scenario 3, i.e. RF model fitted with '*base*' covariate set and WSF3D built height layer (Appendix 2).

### **ppp\_\*XXX\_RF4\_v1.tif**

Each grid cell of this dataset represents the estimated population count for a specified country as calculated by RF modelling scenario 4, i.e. RF model fitted with '*base*' covariate set and WSF3D built area and built height layers (Appendix 2).

### **ppp\_\*XXX\_RF5\_v1.tif**

Each grid cell of this dataset represents the estimated population count for a specified country as calculated by RF modelling scenario 5, i.e. RF model fitted with '*base*' covariate set and WSF3D built area, built height and volume layer (Appendix 2).

## **METHODS OVERVIEW**

### **Pre-processing**

Population counts and administrative boundaries were manually checked and harmonised to ensure matching records. Covariate layers were resampled to 3 arc-second resolution and nibbled (i.e. cells with no data are replaced with the values of the nearest neighbours) to match the provided administrative boundaries.

### **Random forest modelling**

The population modelling approach used the Random Forest (RF)-based dasymetric mapping approach<sup>2</sup> implemented in the popRF 'R' package<sup>3</sup> based on Breiman's<sup>4</sup> algorithm.

For several countries, the available population count data do not have sufficient administrative units (>25 administrative units) to implement the RF methodology effectively. Therefore, in these cases the RF model was applied by grouping together countries or using another country to 'train' the RF-model (Appendix 1).

## REFERENCES

1. Esch, T. *et al.* World Settlement Footprint 3D-A first three-dimensional survey of the global building stock. *Remote Sens. Environ.* **270**, 112877, <https://doi.org/10.1016/j.rse.2021.112877> (2022).
2. Stevens, F. R., Gaughan, A. E., Linard, C. & Tatem, A. J. Disaggregating Census Data for Population Mapping Using Random Forests with Remotely-Sensed and Ancillary Data. *PLoS ONE* **10**, e0107042, <https://doi.org/10.1371/journal.pone.0107042> (2007).
3. Bondarenko, M., Nieves, J.J., Forrest, R.S., Andrea, E.G., Jochem, C., Kerr, D. & Sorichetta, A. popRF: Random Forest-informed Population Disaggregation R package, \_Comprehensive R Archive Network (CRAN)\_ , <https://cran.rproject.org/package=popRF> (2021).
4. Breiman, L. Random forests. *Mach. Learn.* **45**, 5-32, <https://doi.org/10.1023/A:1010933404324> (2001).

## APPENDIX 1

Table of sourced population data used for random forest modelling.

| ISO-3 country code | Country name          | Total population | No. of units | Unit level | Modelled with   | Dataset Year |
|--------------------|-----------------------|------------------|--------------|------------|-----------------|--------------|
| ABW                | Aruba                 | 112,683          | 55           | 2          |                 | 2020         |
| AIA                | Anguilla              | 13,572           | 9            | 0          | Grouped Islands | 2011         |
| ARG                | Argentina             | 45,808,456       | 525          | 2          |                 | 2021         |
| ATG                | Antigua and Barbuda   | 84,816           | 8            | 1          | Grouped Islands | 2019         |
| BHS                | Bahamas               | 391,476          | 32           | 1          | Grouped Islands | 2019         |
| BLZ                | Belize                | 322,454          | 6            | 1          | GTM             | 2020         |
| BMU                | Bermuda               | 63,779           | 11           | 2          | Grouped Islands | 2020         |
| BOL                | Bolivia               | 11,841,955       | 9            | 1          | PER, PRY        | 2021         |
| BRA                | Brazil                | 211,755,692      | 5,570        | 2          |                 | 2020         |
| BRB                | Barbados              | 226,193          | 11           | 1          | Grouped Islands | 2010         |
| CHL                | Chile                 | 19,678,363       | 346          | 3          |                 | 2021         |
| COL                | Colombia              | 50,372,424       | 1,122        | 2          |                 | 2020         |
| CRI                | Costa Rica            | 5,163,021        | 478          | 3          |                 | 2021         |
| CUB                | Cuba                  | 11,193,470       | 168          | 2          |                 | 2015         |
| CUW                | Curaçao               | 165,983          | 65           | 1          | Grouped Islands | 2020         |
| CYM                | Cayman Islands        | 69,914           | 6            | 1          | Grouped Islands | 2019         |
| DMA                | Dominica              | 69,325           | 10           | 1          | Grouped Islands | 2011         |
| DOM                | Dominican Republic    | 10,448,499       | 155          | 3          |                 | 2020         |
| ECU                | Ecuador               | 17,510,643       | 25           | 1          | COL             | 2020         |
| GRD                | Grenada               | 114,000          | 7            | 1          | Grouped Islands | 2020         |
| GTM                | Guatemala             | 17,109,746       | 340          | 2          |                 | 2021         |
| GUY                | Guyana                | 756,237          | 10           | 1          | SUR             | 2021         |
| HND                | Honduras              | 9,302,282        | 298          | 2          |                 | 2020         |
| JAM                | Jamaica               | 2,697,983        | 14           | 1          | DOM             | 2019         |
| KNA                | Saint Kitts and Nevis | 46,325           | 14           | 1          | Grouped Islands | 2020         |
| LCA                | Saint Lucia           | 178,696          | 10           | 1          | Grouped Islands | 2018         |
| MEX                | Mexico                | 128,972,439      | 2,457        | 2          |                 | 2021         |
| MSR                | Montserrat            | 4,566            | 39           | EA         | Grouped Islands | 2021         |
| NIC                | Nicaragua             | 6,595,672        | 153          | 2          |                 | 2020         |
| PAN                | Panama                | 4,337,406        | 13           | 1          | HND, SLV        | 2021         |
| PER                | Peru                  | 29,381,884       | 1,873        | 3          |                 | 2021         |
| PRY                | Paraguay              | 7,252,669        | 250          | 2          |                 | 2020         |

|     |                                  |            |     |   |                 |      |
|-----|----------------------------------|------------|-----|---|-----------------|------|
| SLV | El Salvador                      | 6,825,935  | 262 | 2 |                 | 2021 |
| SUR | Suriname                         | 590,100    | 62  | 2 |                 | 2018 |
| TCA | Turks and Caicos Islands         | 31,458     | 6   | 1 | Grouped Islands | 2021 |
| TTO | Trinidad and Tobago              | 1,328,022  | 15  | 1 | Grouped Islands | 2020 |
| URY | Uruguay                          | 3,530,912  | 19  | 1 | COL, PRY        | 2020 |
| VCT | Saint Vincent and the Grenadines | 110,696    | 13  | 2 | Grouped Islands | 2018 |
| VEN | Venezuela                        | 32,605,423 | 25  | 1 | PRY             | 2020 |
| VGB | Virgin Islands (British)         | 32,670     | 25  | 0 | Grouped Islands | 2017 |

## APPENDIX 2

List of covariates.

| Covariate name                    | Description   |
|-----------------------------------|---|
| *XXX_cls_11_dst.tif               | Distance to ESA-CCI-LC cultivated terrestrial areas and managed lands 2018                |
| *XXX_cls_40_dst.tif               | Distance to ESA-CCI-LC natural and semi-natural terrestrial vegetation – Woody/Trees 2018 |
| *XXX_cls_130_dst.tif              | Distance to ESA-CCI-LC natural and semi-natural terrestrial vegetation – Shrubs 2018      |
| *XXX_cls_140_dst.tif              | Distance to ESA-CCI-LC natural and semi-natural terrestrial vegetation – Herbaceous 2018  |
| *XXX_cls_150_dst.tif              | Distance to ESA-CCI-LC natural and semi-natural sparse terrestrial vegetation 2018        |
| *XXX_cls_160_dst.tif              | Distance to ESA-CCI-LC natural and semi-natural aquatic vegetation 2018                   |
| *XXX_cls_190_dst.tif              | Distance to ESA-CCI-LC artificial surfaces 2018   |
| *XXX_cls_200_dst.tif              | Distance to ESA-CCI-LC bare areas 2018  |
| *XXX_InlandWater_dst.tif          | Distance to ESA-CCI-LC inland waterbodies 2000-2012                                       |
| *XXX_Coastline_WPGP.tif           | Coastline 2000-2012   |
| *XXX_elevation.tif                | HydroSHEDS elevation 2006   |
| *XXX_slope.tif                    | HydroSHEDS-based slope 2006   |
| *XXX_UrbanArea_dst.tif            | Distance to built footprint 2021  |
| *XXX_pedestrian_distance.tif      | Distance to OSM pedestrian road intersections 2021  |
| *XXX_residential_distance.tif     | Distance to OSM residential road intersections 2021                                       |
| *XXX_vehicle_distance.tif         | Distance to OSM vehicle road intersections 2021   |
| *XXX_pedestrian_roads_dst.tif     | Distance to OSM pedestrian roads 2021   |
| *XXX_residential_roads_dst.tif    | Distance to OSM residential roads 2021  |
| *XXX_vehicle_roads_dst.tif        | Distance to OSM vehicle roads 2021  |
| *XXX_OSM_Waterways_WPGP.tif       | Distance to OSM major waterways 2017  |
| *XXX_Precipitation_WPGP.tif       | Average annual total precipitation 1970-2000  |
| *XXX_Temperature_WPGP.tif         | Average annual temperature 1970-2000  |
| *XXX_VIIRS.tif                    | VIIRS night-time lights 2020 (Visible Infrared Imaging Radiometer Suite)                  |
| *XXX_WDPA_WPGP.tif                | Distance to IUCN strict nature reserve and wilderness area edges 2017                     |
| *XXX_road_length.tif              | Road length 2021  |
| *XXX_road_density.tif             | Road density 2021   |
| *XXX_road_int_0_5_km.tif          | Road intensity (0.5km bandwidth) 2021   |
| *XXX_road_int_1_km.tif            | Road intensity (1km bandwidth) 2021   |
| *XXX_road_int_2_km.tif            | Road intensity (2km bandwidth) 2021   |
| *XXX_road_int_5_km.tif            | Road intensity (5km bandwidth) 2021   |
| *XXX_WSF3D_BuildingArea_uncnd.tif | WSF3D built area 2021   |
| *XXX_WSF3D_Height_uncnd.tif       | WSF3D built height 2021   |
| *XXX_Volume.tif                   | Built volume 2021   |

\*Spatially referenced gridded covariate layers were constructed for 40 countries, identifiable using the ISO-3 country codes in the filenames in place of XXX above. For example, ABW refers to Aruba. See appendix 1 for the full list of countries in this dataset.

Note: covariates in grey not included in 'base' set of covariates for random forest modelling.