

60TH SESSION OF THE STSC OF THE UN-COPUOS

Health-related Applications of Remote Sensing and GIS in the Philippines

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Philippine Space Agency



PhilSA

Outline

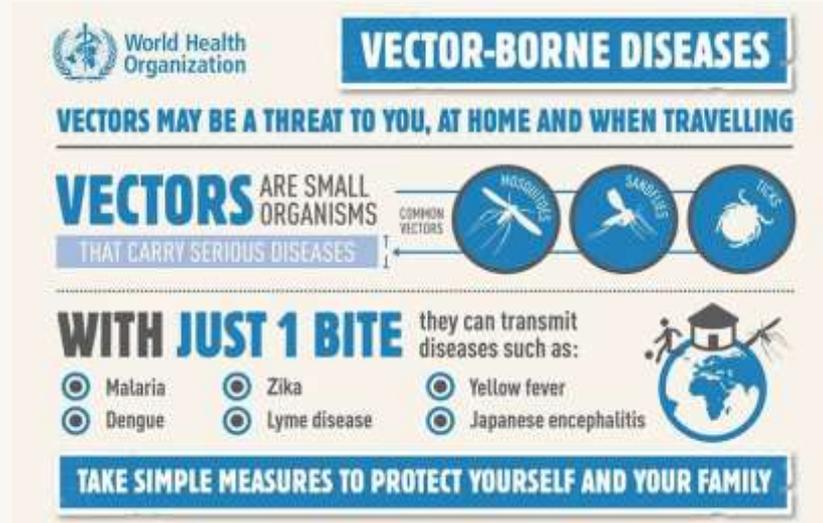
- Introduction
 - Health and epidemiological problems in the Philippines
 - PhilSA and activities related to GeoHealth
- GeoHealth Applications
 - Urban heat islands
 - Dengue incidence analysis, modelling, and prediction
- Challenges and Opportunities
 - Data gaps
 - Computational resources
 - Citizen science



Introduction

THE LEADING CAUSES OF MORTALITY IN THE PHILIPPINES

- Diseases of the heart
- Diseases of the vascular system
- Pneumonias
- Malignant neoplasms/cancers
- All forms of tuberculosis, accidents, COPD and allied conditions, diabetes mellitus, nephritis/nephritic syndrome and other diseases of respiratory system



Data from the Department of Health (DOH)'s Disease Surveillance Report showed there were 220,705 dengue cases recorded from Jan. 1 to Dec. 17, 2022. The figure is 182 percent higher than the 78,223 cases reported during the same period in 2021.

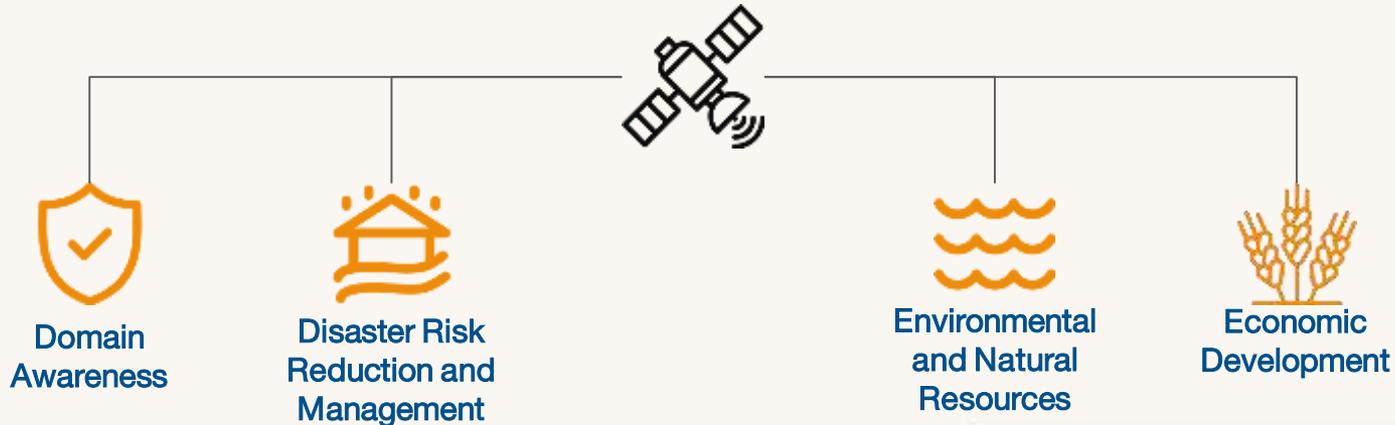


Introduction

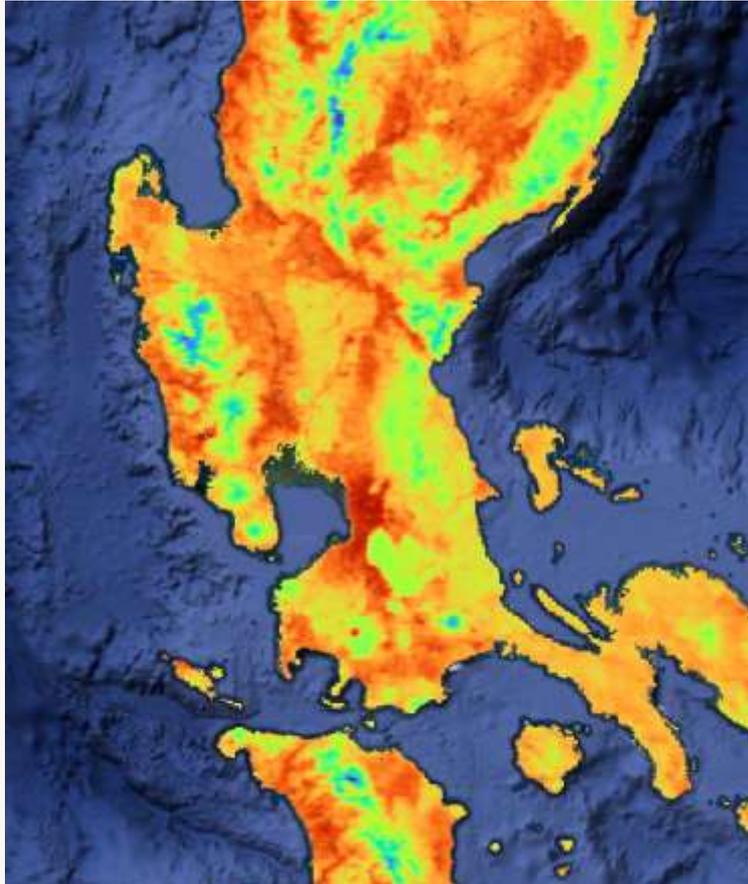
Mobilizing Space Data

For Economic Development, Disaster Risk Reduction, & Maritime Domain Awareness

The PhilSA aims to further the **development and application of remote sensing (RS), artificial intelligence (AI), machine learning (ML), data science and other methodologies** in producing space-enabled information to support the operations of various government agencies and other end users.



GeoHealth Applications: Urban Heat Islands



UHI Health Implications

Exacerbation of minor existing conditions

Increased risk of hospitalization and death

Heat stroke

Heat is often a contributory factor to deaths and morbidity from other causes, such as respiratory illness

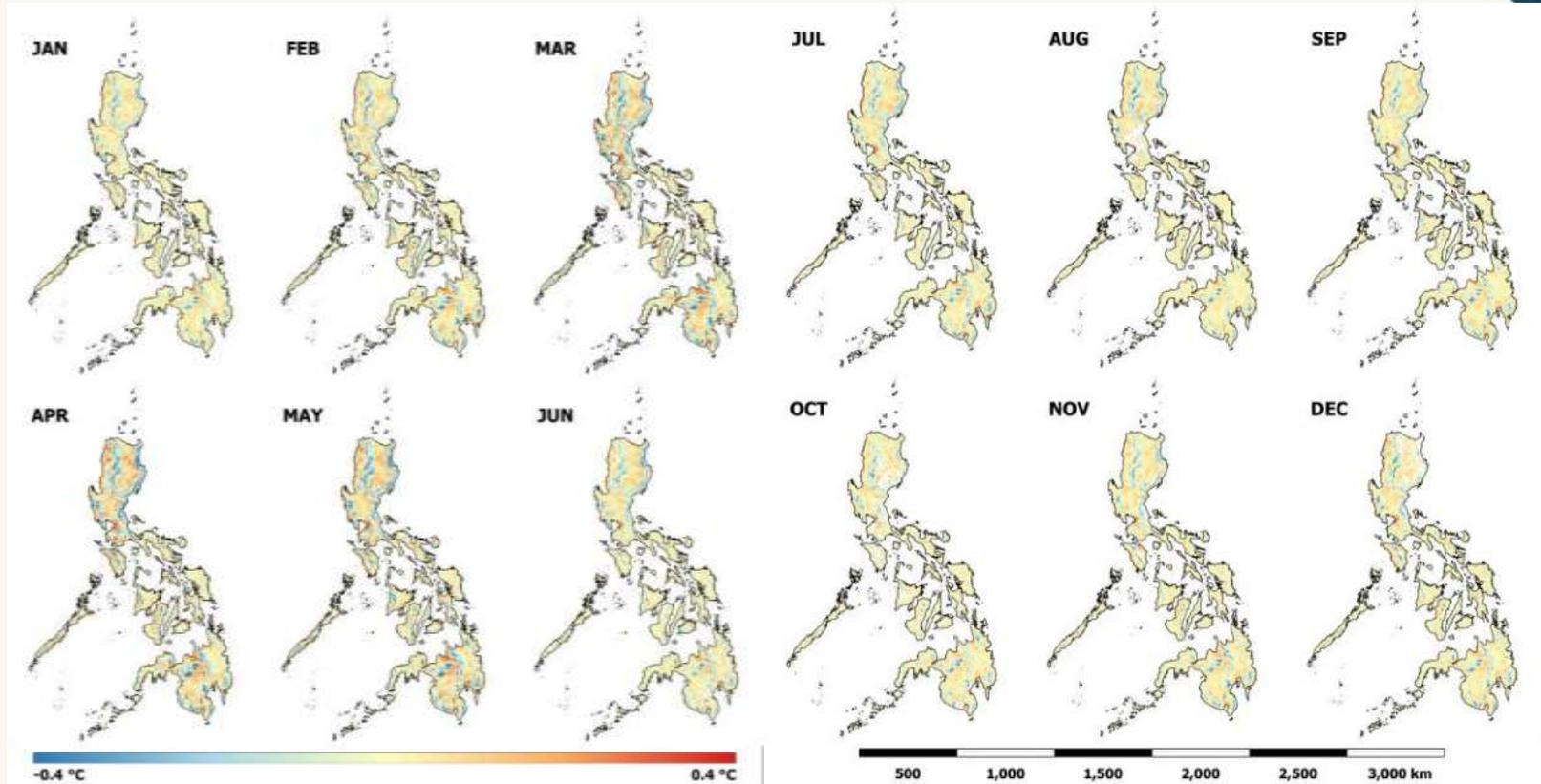
The enhancement of temperatures due to the UHI effect therefore increases heat-related mortality risk in urban areas, and this is likely to further increase in future, due to climate change

Source: Heaviside et al., 2017



GeoHealth Applications: Urban Heat Islands

UHI as Hazard Layer

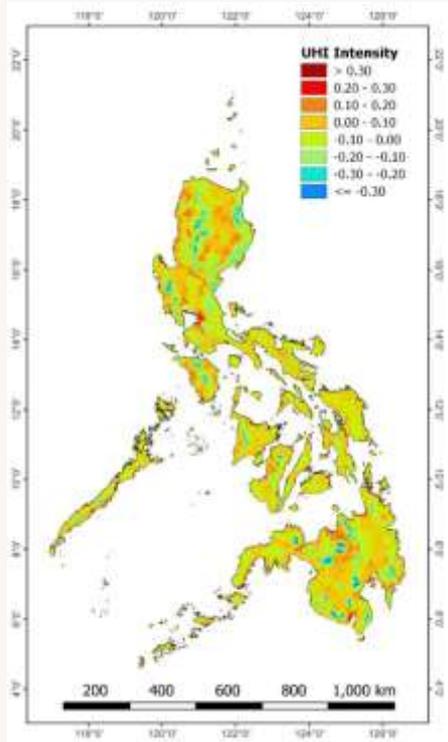


Spatio-temporal distribution of UHI in the Philippines in 2020



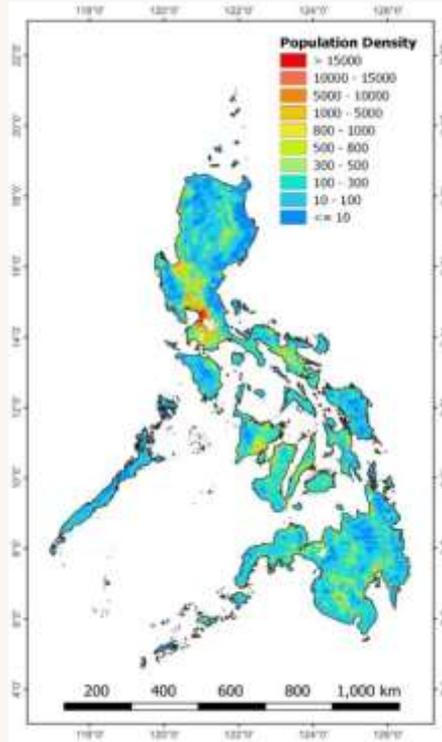
GeoHealth Applications: Urban Heat Islands

UHI Health Risk



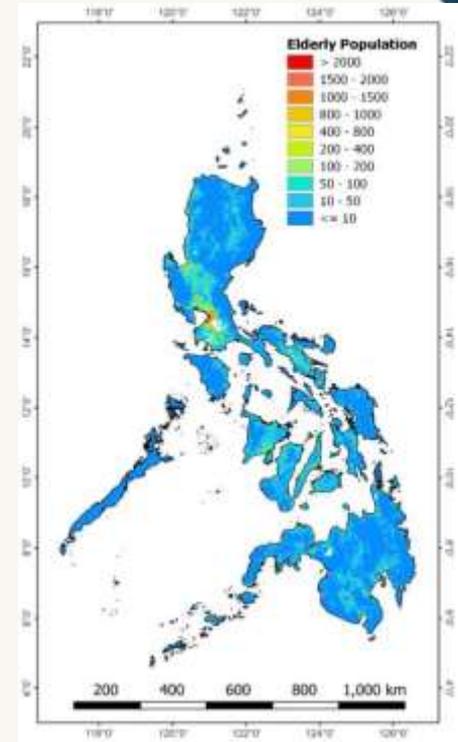
Hazard

×



Exposure
2020 Population density data

×

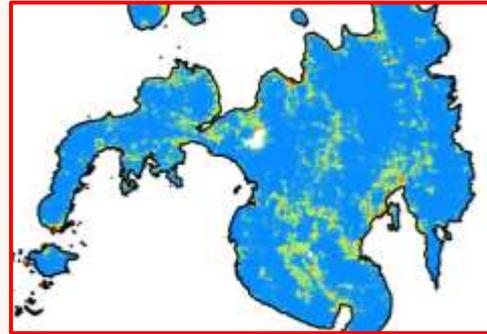
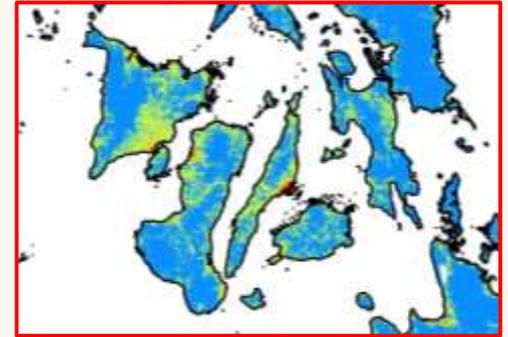
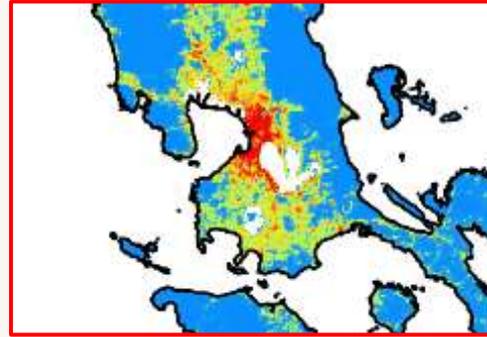
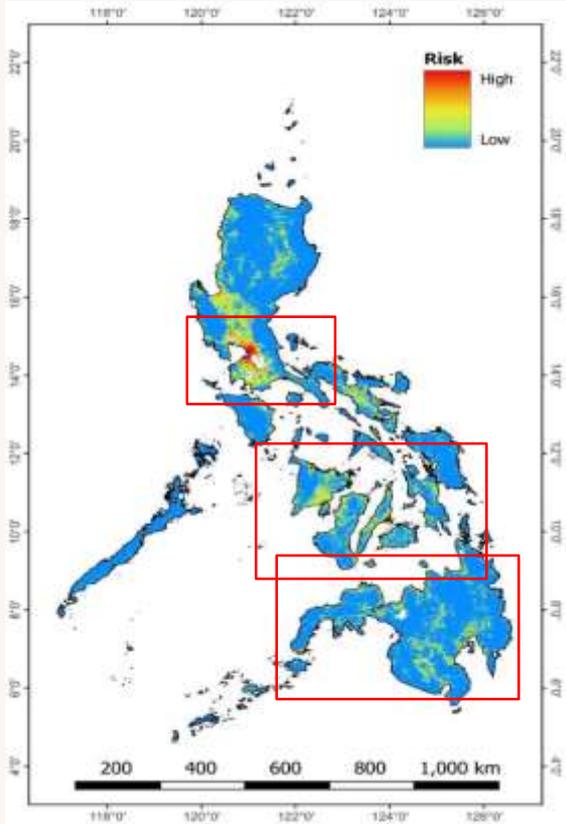


Vulnerability
2020 Elderly Population data

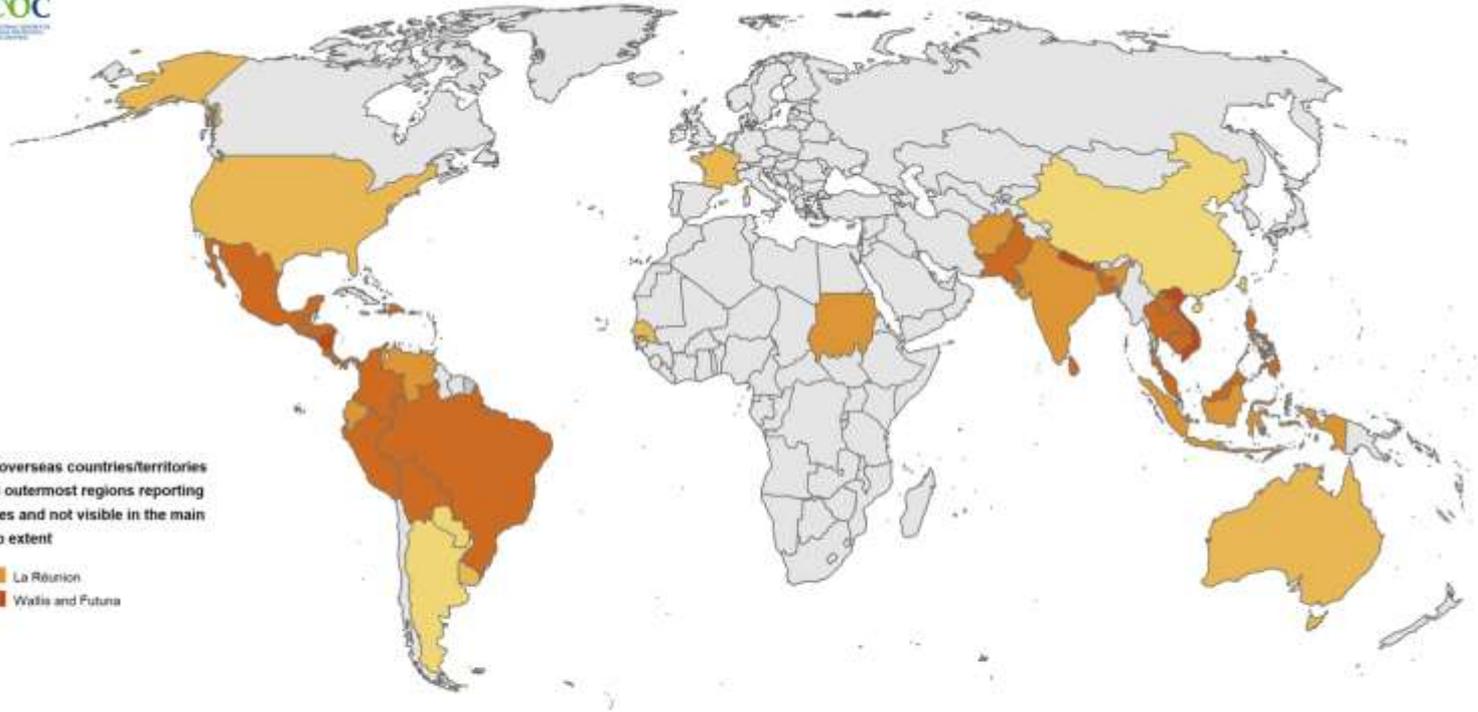


GeoHealth Applications: Urban Heat Islands

UHI Health Risk



GeoHealth Applications: Dengue



EU overseas countries/territories and outermost regions reporting cases and not visible in the main map extent

- La Reunion
- Wallis and Futuna

Notification rate per 100 000 persons



Note: Data refer to cases reported in the last 3 months. Administrative boundaries: © Eurographics
The boundaries and names shown on this map do not imply official endorsement or acceptance by the European Union. ECDC. Map produced on 19 January 2023



GeoHealth Applications: Dengue

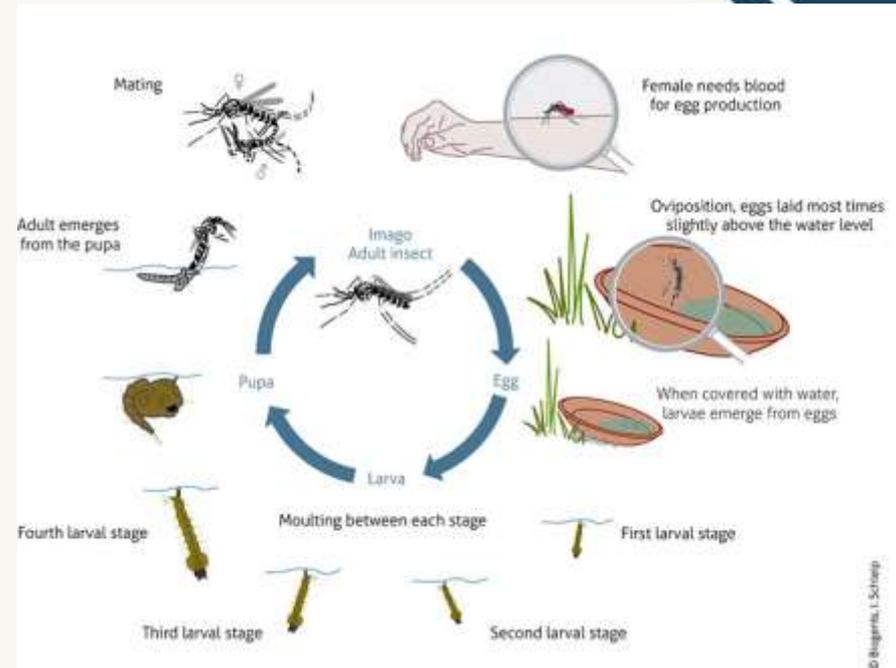


- The *Aedes aegypti* mosquito is the main vector that transmits the viruses that cause dengue.
 - The viruses are passed on to humans through the bites of an infective female *Aedes* mosquito, which mainly acquires the virus while feeding on the blood of an infected person.
- Flight range studies suggest that most female *Ae. aegypti* may **spend their lifetime in or around the houses** where they emerge as adults, and they usually fly an average of **400 meters**.
- This means that people, rather than mosquitoes, rapidly move the virus within and between communities and places.



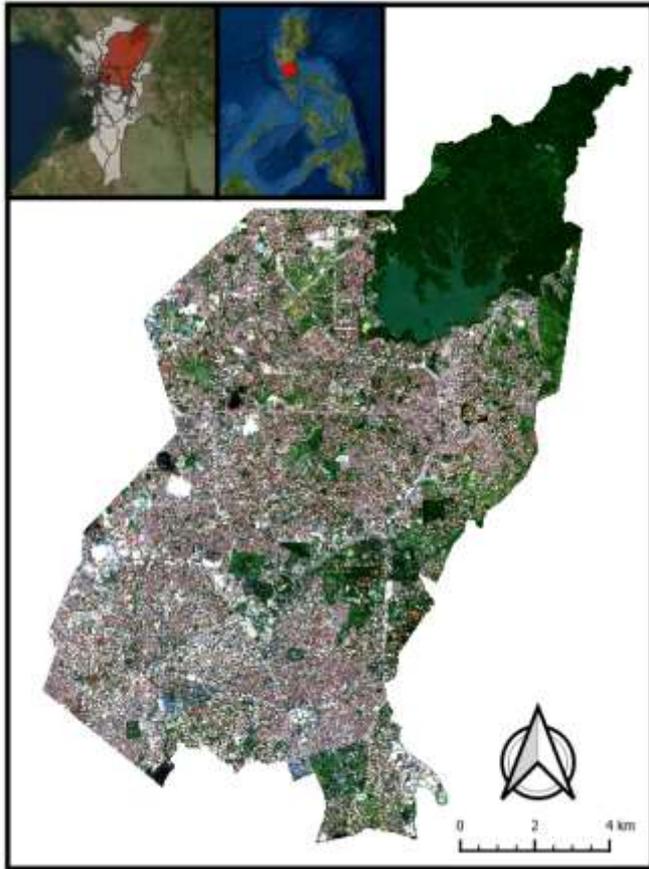
GeoHealth Applications: Dengue

- *Aedes aegypti* is abundant in neotropical regions, where environmental factors (e.g., rainfall, temperature, and relative humidity) favor its life cycle (Eisen et al. 2014).
- **Optimal temperatures** for development, longevity, and fecundity are between **22°C and 32°C** (Beserra et al. 2009).
- With higher temperatures in the favorable survival range of *Ae. aegypti*, **egg-laying time decreases, causing an increase in egg number** (Costa et al. 2010).
- Moreover, the **extrinsic incubation period of the dengue virus is reduced, resulting in higher rates of viral transmission** (Focks et al. 2000, Hopp and Foley 2001).



Four (4) life stages: egg, larva, pupa and adult. Mosquitoes can live and reproduce inside and outside the home. The entire life cycle, from an egg to an adult, takes approximately 8-10 days.





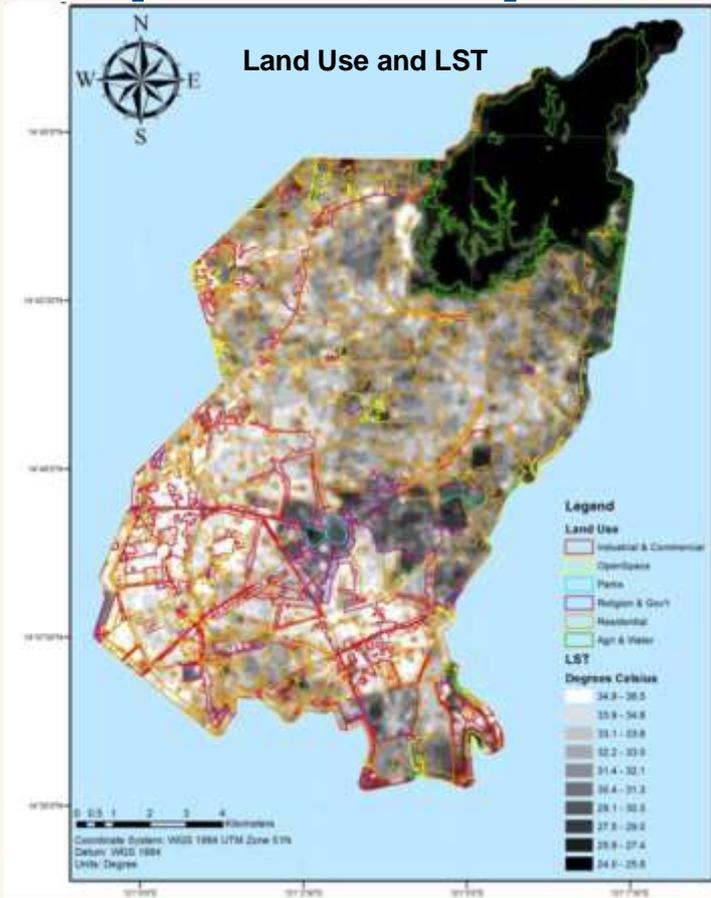
Geospatial Analysis of Dengue Incidences

- The main objective of the study is to identify factors (e.g., land use land cover, meteorological) influencing the spatio-temporal prevalence of dengue cases in Quezon City, Metro Manila.



GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences



Number of **dengue cases** in each barangay of Quezon City in 2015 (including monthly)

Barangay **population** in 2015 (including normalized)

Rainfall (Mean, Monthly)

Air Temperature (Mean, Monthly)

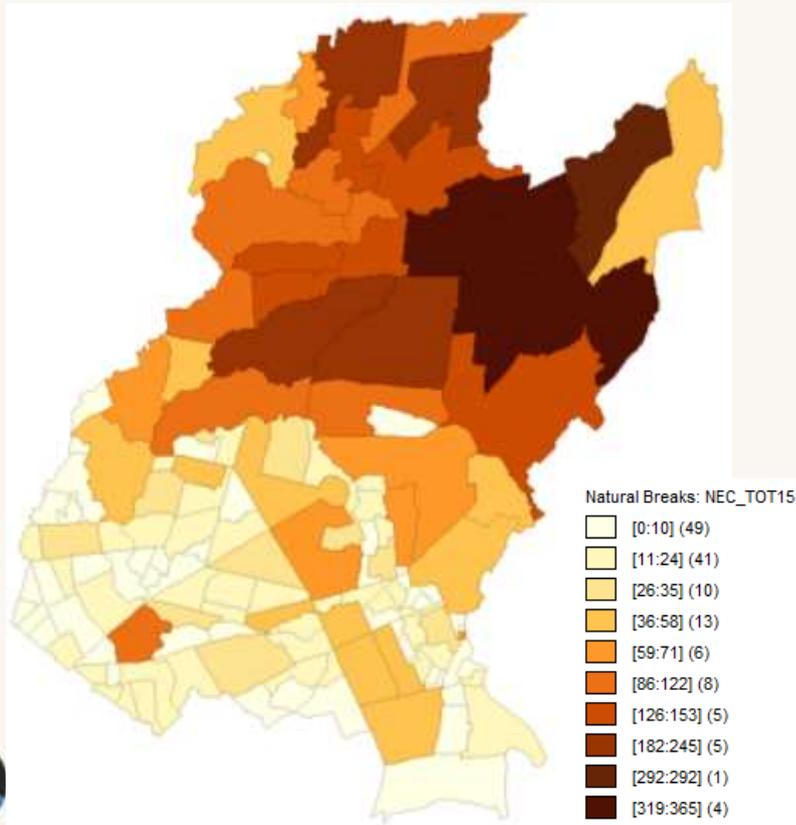
Land Use Classes:
Informal Settlements, Very Low Density Residential, Open Spaces, Medium Density Residential, Commercial Areas,

Land Surface Temperature (Mean, Max)



GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences



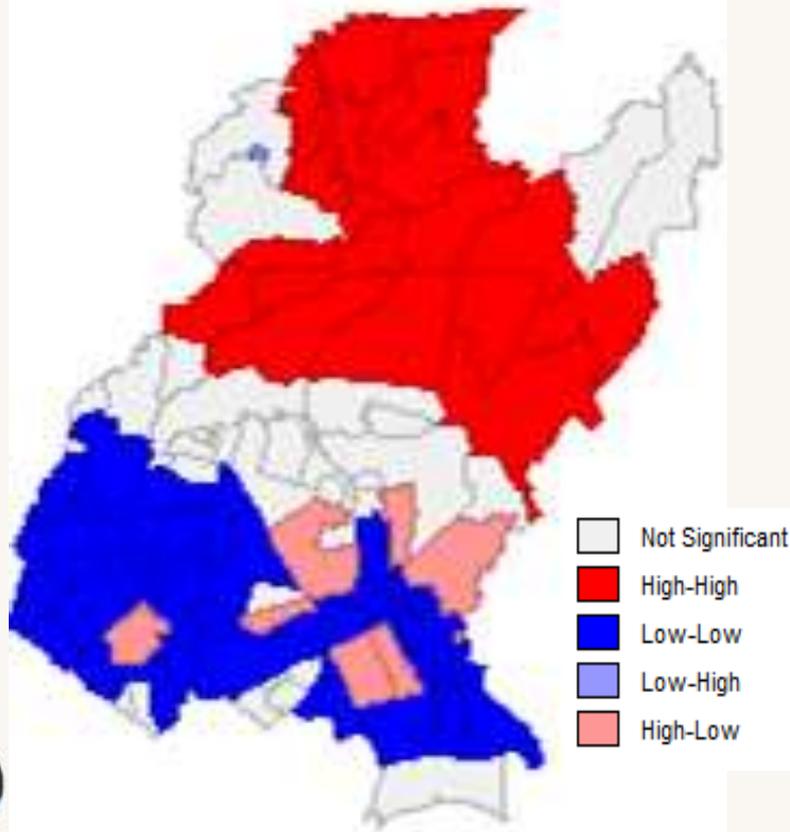
Dengue Cases in Quezon City (2015)

- The spatial distribution of dengue cases in 2015 indicate very high values in areas with large informal settlers.



GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences



2015 LISA Clusters

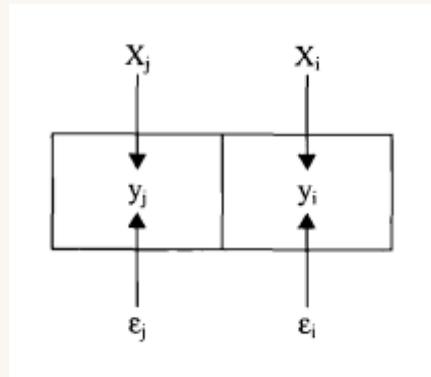
- Persistent clustering of high-high values in the northern part of Quezon City while low-low clusters are in the southern part of the city, whether yearly or monthly.



GeoHealth Applications: Dengue

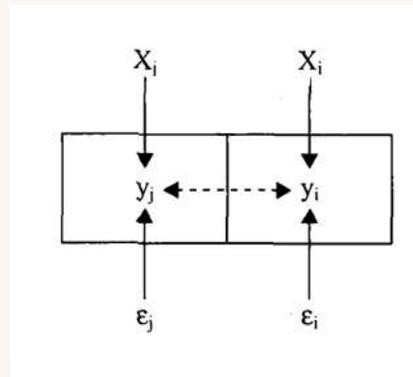
Geospatial Analysis of Dengue Incidences

OLS



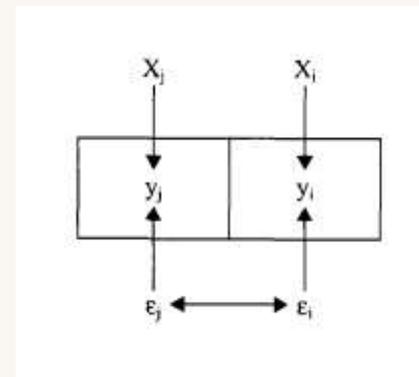
No influence from neighbors

SPATIAL LAG



Dependent variable influenced by neighbors

SPATIAL ERROR



Residuals influenced by neighbors

$$Y = \beta_0 + \lambda WY + X\beta + \varepsilon$$

$$Y = \beta_0 + X\beta + \rho W\varepsilon + \xi$$



Geospatial Analysis of Dengue Incidences

OLS Model for 2015 Using Land Use Variables Only

$$NEC2_TOT15 = 18.2545 + 3.40894*OPNSPCS + 5.52552*INF_SET + 3.28358*VL_RESD$$

- **Open Spaces, Informal Settlements, and Very Low-Density Residential Areas**, account for 65.9% (R-squared) of the variability of dengue cases in 2015. However, standard error (S.E.) is 41.8.
- Spatial dependence is significant. Spatial Lag regression (SL) is preferred based on spatial dependence diagnostics (i.e., Lagrange Multiplier).



Geospatial Analysis of Dengue Incidences

Spatial lag Model for 2015 Using Land Use Variables Only

$$NEC2_TOT15 = 4.25566 + 0.503008 * W_NEC2_TOT15 + 2.26656 * OPNSPCS + 4.54279 * INF_SET + 1.81258 * VL_RESD$$

- Same variables as in the OLS model.
- **Spatial lag regression improved the R-square to 0.71. S.E. is 38.6.**



Geospatial Analysis of Dengue Incidences

OLS Model for May 2015 (Low Dengue Case)

$$NEC2_0515 = -2.48342 + 0.064177*INF_SET + 0.352647*NEC2_0415 + 0.276018*APR_RF - 0.0340807*MAY_RF$$

- Indicates **significant contribution of the previous month's dengue cases (NEC2_0415) and rainfall (APR_RF)**.
- R-squared is 0.65. S.E. is significantly lower at 1.02.
- Based on diagnostics for spatial dependency, analysis should proceed to spatial error (SE) regression. This yielded an R-squared of 0.771 and S.E. of 0.812 at around 2-km lag.



GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences

OLS Model for September 2015 (High Dengue Case) Using All Variable Types

	OLS_S1	OLS_S2	OLS_S3
CONSTANT	430.649	571.315	-11.608
<i>NEC2_0815</i>	1.2378	1.28206	1.30283
<i>INF_SET</i>	0.517221	0.512069	0.479771
<i>AUG_AT</i>	-1.37287	---	---
<i>AUG_RF</i>	-0.118146	---	---
<i>SEP_AT</i>	---	-1.81117	---
<i>SEP_RF</i>	---	-0.216222	---
<i>LST_AUG</i>	---	---	3.01199
<i>LST_SEP</i>	---	---	-2.29511
<i>R-squared</i>	0.891201	0.894165	0.898082
<i>S.E.</i>	6.53452	6.44489	6.32449
<i>AIC</i>	940.984	937.062	931.707

- The models indicate **significant contribution of the previous month's dengue cases, meteorological condition, and even land surface temperature (LST)**.
- Among the land uses, **Informal Settlement** is the only type included in the models, indicating that such areas may be breeding grounds of mosquitos.
- Based on diagnostics for spatial dependency, analysis should proceed to spatial lag (SE) regression.

GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences

SL Model for September 2015 (High Dengue Case) Using All Variable Types

	SL_RF	SL_LST	SL_Combi
CONSTANT	-58.3262	-6.79409	-113.872
<i>W_NEC2_0915</i>	-0.524919	-0.187042	-0.317454
<i>NEC2_0815</i>	1.28829	1.35122	1.25994
<i>INF_SET</i>	0.514707	0.51866	0.518478
<i>AUG_RF</i>	-0.404695	---	0.109881
<i>SEP_RF</i>	0.706446	---	
<i>LST_AUG</i>	---	1.82658	2.89623
<i>LST_SEP</i>	---	-1.33582	
<i>R-squared</i>	0.902351	0.901424	0.902154
<i>S.E.</i>	6.08064	6.10946	6.08678
<i>AIC</i>	928.08	929.037	928.093

- For the high dengue case month, spatial lags model using **6-km threshold** distance provided the **best models, incorporating the rainfall and LST of the previous month.**

GeoHealth Applications: Dengue

Geospatial Analysis of Dengue Incidences

- **Informal Settlement** variable was found significant in all regression models and even in factor analysis. This indicates that such areas **being breeding grounds is highly probable**.
- The inclusion of **rainfall and temperature** variables, *including temporally lagged*, **can improve the modelling** of dengue cases.
- Modelling of dengue cases was enhanced with the used of **spatial lags (spatial dependence) and temporal lag**.
- Seasonal Autoregressive Integrated Moving Average (**SARIMA**) modelling is ongoing.



Challenges

- Data availability and quality
 - Health and epidemiological data may not be available in desired spatial and temporal scales; incomplete at times
 - Mobility studies are also needed.
- Realization of the value chain
 - Are insights and information used and acted upon?
 - Are the methods and systems developed put in place?



Opportunities

- SST for health applications is recognized → funding
- Networking and collaboration through the PhilSA Integrated Network for Space-enabled Actions towards Sustainability
- Citizen science



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Thank you!



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