



Digital Health Surveillance

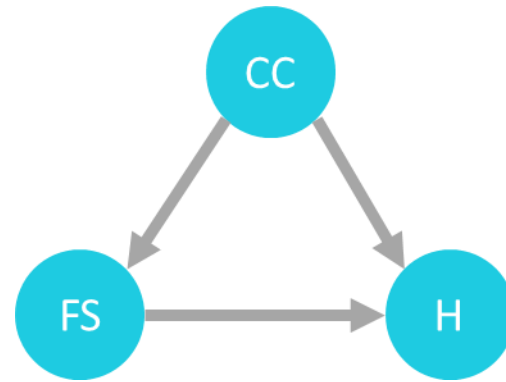
Unlocking the potential for real-time
health data analysis
in the Maltese Islands



Educational journey

- Studied Medicine at the University of Malta
- Specialised at the LSHTM in Environmental public health
- Worked at UoM on ImaGenX, looking at environmental and lifestyle risk factors of Breast Cancer in Malta
- PhD in Brisbane, Australia, focusing on Climate Change, Food Security and Health. Fieldwork in Kiribati.

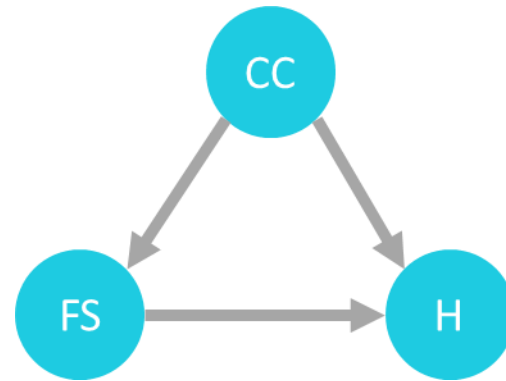
Research



- Focus: Climate change, Food security and Health interactions
- **Mixed methods**, applying both qualitative and quantitative data analysis to triangulate closer to the truth.
- This experience taught me the importance of **accurate data collection**, ascertaining **meaning** from numbers and words, and **applying** that information.
- **Data was often missing**, making it very hard for me to come to conclusions



Research



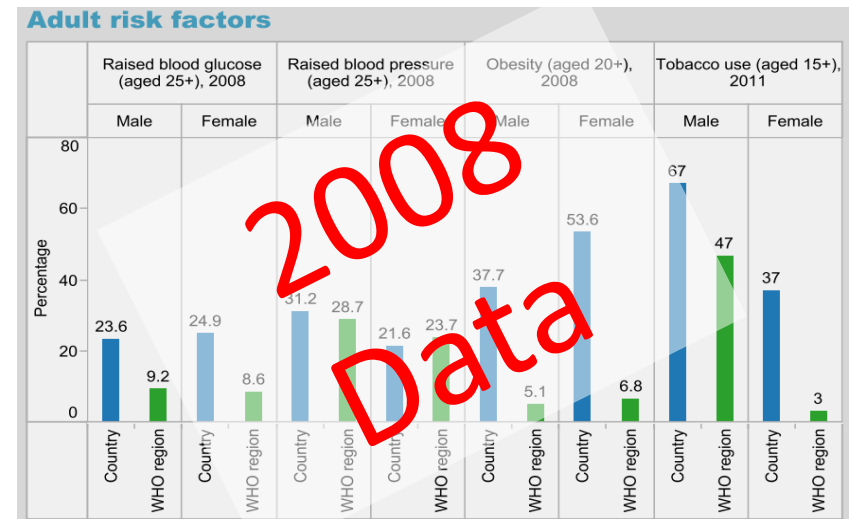
- Data which is absent can be both disappointing and dangerous – **it fails to give you the complete picture, and makes it difficult to know the present situation.**
- **Data is key**
- **Data analysis** is a process of inspecting, **cleaning, transforming, and modeling** data with the goal of **discovering useful information, informing conclusions,** and supporting **decision-making.**

Attempted to get datasets for analysis in the form of Time Series Analysis for correlations:

- Precipitation
- Temperature
- Health data

Significant gaps in data

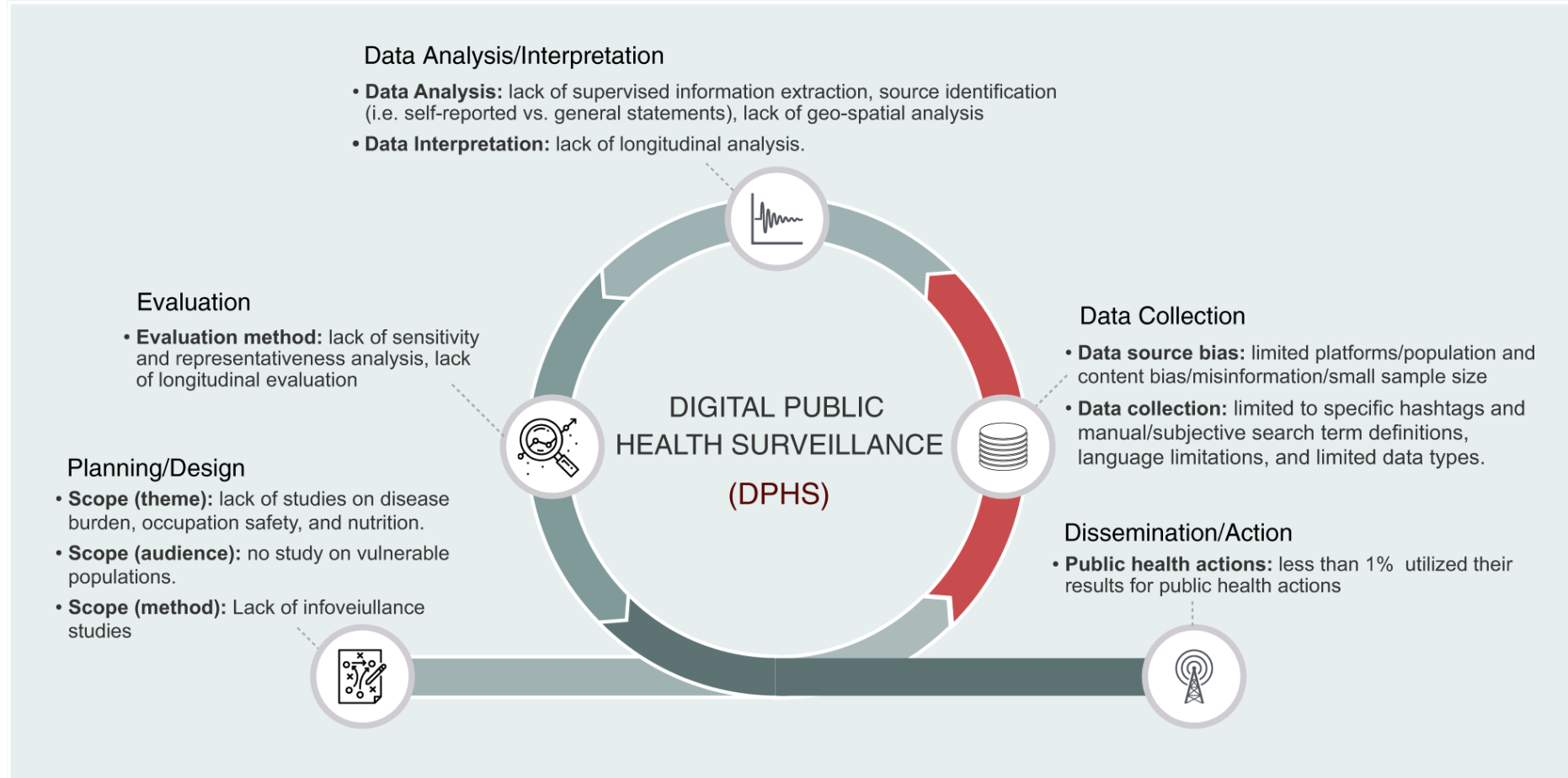
- *E.g. dataset obtained for monthly rainfall in Nonouti from 1953 to 2013 had Jan 1991 to Sep 2010 missing...*



Id	Pop	SqM/HH	Respon	Available	Sex	Age	Marital	Religion	Education	Household	Island	Time_Islar	Reason_fc	Longterm	Living_why	Worker	Jobcat	
52381	142.2215	1070.048	No	Yes	F	31-40	Living tog	Mormon	Technical	5	Tarawa	5-10 years	School	Yes	Plan to stay long term	Full-time worke	Air Kiribati	Tertiar
52381	142.2215	1070.048	Yes	Yes	F	31-40	Married	Roman Ca	University	8	Tarawa	10-20 year	School	Yes	Plan to stay long term	Full-time worke	Ministry of Educ	Public
52381	142.2215	1070.048	Yes	No	F	31-40	Living tog	Kiribati Ur	Technical	6	Marakei	5-10 years	Work	Yes	Plan to stay long term	Full-time worke	Air Kiribati	Tertiar
52381	142.2215	1070.048	Yes	Yes	F	21-30	Living tog	Seventh D	High Scho	3	Tarawa	5-10 years	School	Yes	Plan to stay long term	Part time worke	Bus Driver	Tertiar
52381	142.2215	1070.048	Yes	Yes	M	31-40	Married	Protestan	None	10	Abemama	5-10 years	Family	Yes	Plan to stay long term	Retired	Retired	Pensio
52381	142.2215	1070.048	Yes	Yes	M	31-40	Living tog	Roman Ca	High Scho	10	Beru	5-10 years	School	Yes	Plan to stay long term	Fisherman	Fisherman	Primar
52381	142.2215	1070.048	Yes	Yes	M	41-50	Married	Kiribati Ur	High Scho	7	Arorae	5-10 years	Family	Yes	Plan to stay long term	Part time worke	Bus Driver	Tertiar
52381	142.2215	1070.048	Yes	Yes	M	31-40	Married	Seventh D	Secondary	9	Tarawa	10-20 year	Family	Yes	Plan to stay long term	Full-time worke	Kiribati Police Se	Public
52381	142.2215	1070.048	Yes	Yes	M	31-40	Living tog	Mormon	University	5	Abemama	5-10 years	School	Yes	Plan to stay long term	Full-time worke	Ministry of Educ	Public
52381	142.2215	1070.048	Yes	Yes	F	21-30	Widowed	Seventh D	High Scho	7	Nikonau	5-10 years	Family	Yes	Plan to stay long term	Student	Student	Studen
645455	115.4044	639.9697	Yes	Yes	F	51-60	Married	Kiribati Ur	Secondary	7	Makin	20+ years	Family	Yes	Plan to stay long term	Unemployed	Unemployed	Unemp
645455	115.4044	639.9697	Yes	Yes	M	31-40	Living tog	Protestan	None	10	Abemama	5-10 years	Family	Yes	Plan to stay long term	Unemployed	Unemployed	Unemp
645455	115.4044	639.9697	Yes	Yes	M	31-40	Living tog	Protestan	None	10	Abemama	5-10 years	Family	Yes	Plan to stay long term	Full-time worke	Kiribati Port Autl	Public
645455	115.4044	639.9697	No	Yes	F	41-50	Married	Protestan	Secondary	6	Malana	20+ years	Family	No	Life is getting harder in	Part time worke	Garment Factory	Second
645455	115.4044	639.9697	No	Yes	F	51-70	Married	Protestan	Secondary	6	Malana	20+ years	Family	No	Plan to stay long term	Retired	Retired	Pensio
645455	115.4044	639.9697	No	Yes	F	51-60	Widowed	Protestan	Secondary	6	Malana	20+ years	Family	No	Home sick	Unemployed	Unemployed	Unemp
645455	115.4044	639.9697	Yes	No	F	41-50	Married	Protestan	Secondary	6	Malana	20+ years	Family	No	Plan to stay long term	Fisherman	Fisherman	Primar
645455	115.4044	639.9697	Yes	Yes	M	21-30	Living tog	Roman Ca	High Scho	7	Tarawa	10-20 year	Farming	Yes	Plan to stay long term	Full-time worke	Nurse	Tertiar
645455	115.4044	639.9697	Yes	Yes	F	31-40	Married	Jehovah's	Technical	5	Tarawa	20+ years	Family	Yes	Migration to NZ (PAC)	Full-time worke	Primary School T	Tertiar
645455	115.4044	639.9697	Yes	Yes	F	71-80	Widowed	Protestan	None	10	Abemama	5-10 years	Family	Yes	Plan to stay long term	Make and sell cr	Make and sell cr	Second
16129	423.4822	3456.161	Yes	Yes	F	18-20	Living tog	Protestan	None	10	Abemama	5-10 years	Family	Yes	Plan to stay long term	Full-time worke	NA	NA
16129	423.4822	3456.161	Yes	Yes	F	41-50	Married	Roman Ca	Secondary	8	Teauia	20+ years	School	Yes	Plan to stay long term	Unemployed	Unemployed	Unemp
16129	423.4822	3456.161	Yes	Yes	M	41-50	Married	Roman Ca	Primary	7	Malana	20+ years	Family	No	NA	Fisherman	Fisherman	Primar
16129	423.4822	3456.161	Yes	Yes	F	21-30	Married	Kiribati Ur	High Scho	8	Tarawa	<5 years	Work, Sch	Yes	Plan to stay long term	Full-time worke	NA	NA
16129	423.4822	3456.161	Yes	Yes	F	51-60	Married	Roman Ca	High Scho	13	Abemama	20+ years	School	Yes	Plan to stay long term	Full-time worke	NA	NA
16129	423.4822	3456.161	Yes	Yes	M	41-50	Married	Kiribati Ur	High Scho	5	Nikonau	20+ years	Work	Yes	Plan to stay long term	Full-time worke	MOH Laundry	Tertiar
16129	423.4822	3456.161	Yes	Yes	F	21-30	Married	Roman Ca	Secondary	12	Abemama	5-10 years	Work	Yes	Plan to stay long term	Full-time worke	NA	NA
16129	423.4822	3456.161	Yes	Yes	F	21-30	Living tog	Roman Ca	University	15	Abalang	10-20 year	School	No	Migration to NZ (PAC)	Full-time worke	Lawyer	Tertiar
16129	423.4822	3456.161	Yes	Yes	M	21-30	Married	Mormon	University	3	Tarawa	20+ years	Home Isl	Yes	Plan to stay long term	Other	Self-employed	Tertiar
16129	423.4822	3456.161	Yes	Yes	M	31-40	Living tog	Assemblis	Primary	3	Tarawa	20+ years	Home Isl	No	Plan to stay long term	Part time worke	Contracted build	Tertiar
6.65	49.56015	329.575	Yes	Yes	F	51-60	Married	Roman Ca	Secondary	8	North Tar	10-20 year	Farming	Yes	Plan to stay long term	Full-time worke	Contracted build	Tertiar
6.65	49.56015	329.575	Yes	Yes	F	41-50	Married	Roman Ca	Secondary	8	Tarawa	20+ years	Home Isl	Yes	Plan to stay long term	Full-time worke	Contracted build	Tertiar
6.65	49.56015	329.575	Yes	Yes	F	41-50	Married	Roman Ca	High Scho	7	North Tar	20+ years	School	Yes	Plan to stay long term	Fisherman, Part	Fisherman	Primar
6.65	49.56015	329.575	Yes	Yes	F	31-40	Married	Seventh D	High Scho	8	Tarawa	<5 years	Work	Yes	Plan to stay long term	Part time worke	Pastor, Contracte	Tertiar
6.65	49.56015	329.575	Yes	Yes	F	31-40	Married	Roman Ca	High Scho	10	Tabuera	10-20 year	School	No	Homesick	Full-time worke	Airport	Tertiar
6.65	49.56015	329.575	Yes	Yes	M	31-40	Married	Protestan	High Scho	9	Butaritari	10-20 year	Work, Fan	Yes	Plan to stay long term	Full-time worke	Self-employed, C	Tertiar
6.65	49.56015	329.575	Yes	Yes	F	61-70	Widowed	Kiribati Ur	Secondary	9	Tarawa	20+ years	Family	Yes	Plan to stay long term			
6.65	49.56015	329.575	Yes	Yes	M	21-30	Single	Kiribati Ur	High Scho	6	Makin	5-10 years	School	Yes	Plan to stay long term	Full-time worke	Government Off	Public
6.65	49.56015	329.575	Yes	Yes	F	61-70	Widowed	Roman Ca	None	4	Kiritimat	20+ years	Family	Yes	Plan to stay long term	Full-time worke	Government Off	Public

How to transform this data into something useful?

Public Health Data Surveillance



Public Health Data Surveillance

- 2020 – ongoing: Public Health IDCU department (currently part-time)
 - Working on Malta's Digital Health surveillance.
 - In 2020, the ECDC basically complained that John Hopkin's University (left) in the US had better data on COVID-19 in Europe than the ECDC did!
 - **E-SARI Network** was born – involving 15 countries that pool their data on Severe Acute Respiratory Illness (SARI), which can be used for both decisions in policy-making AND in ascertaining vaccine effectiveness in Europe.



Cumulative Confirmed Cases

Active Cases

156

countries/regions

Lancet Inf Dis Article: [Here](#). Mobile Version: [Here](#). Visualization by [Esri Living Atlas team](#) and [JHU APL](#).

Data sources: [WHO](#), [CDC](#), [ECDC](#), [NHC](#) and [DXY](#) and local media. [blog](#). [Contact US](#). [FAQ](#).

Public Health Data Surveillance

- Problems identified:
 - Poor data collection methodologies
 - Lack of standardisation
 - Different definitions for the same illness
 - Archaic methods of data collection (Malta included)
 - Lack of coordination
 - Poor stakeholder engagement



Cumulative Confirmed Cases

Active Cases

156

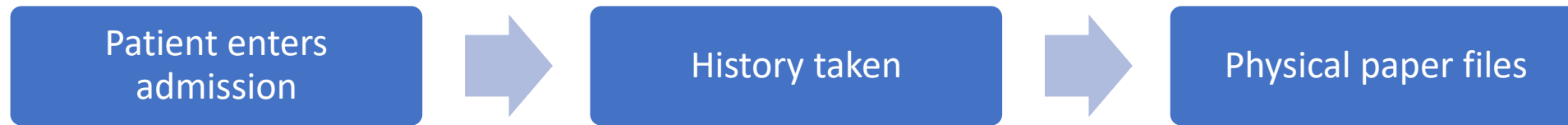
countries/regions

Lancet Inf Dis Article: [Here](#). Mobile Version: [Here](#). Visualization by Esri Living Atlas team and JHU APL.

Data sources: [WHO](#), [CDC](#), [ECDC](#), [NHC](#) and [DXI](#) and local media. [blog](#). [Contact US](#). [FAQ](#).

Malta had significant problems

- Malta had only JUST shifted from a paper-based system of reporting health data to a digital one!



Advantages: Standard format

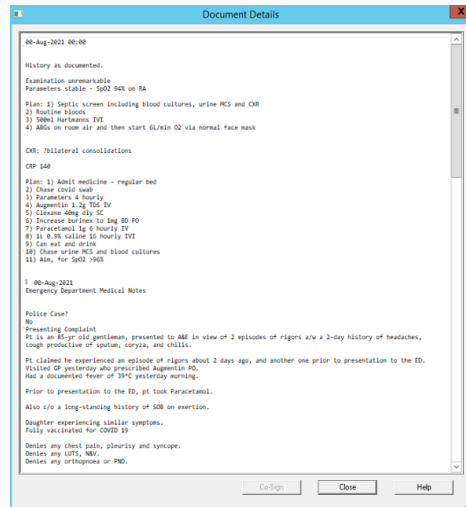
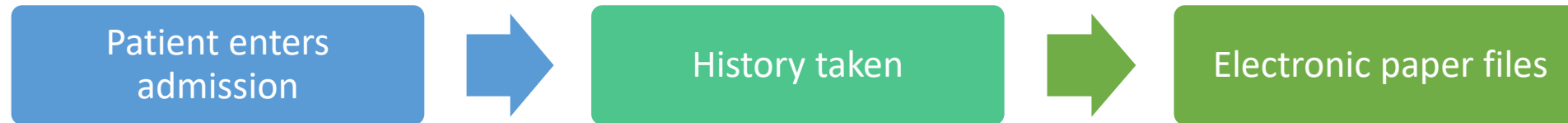
Disadvantages: Difficult to access, cumbersome, error prone

Impossible to carry out data surveillance



New system – step in the right direction, but far from ideal...

- The new system was... a step in the right direction. However...



Covid-19 accelerated an effort to digitise the system of data entry at admissions

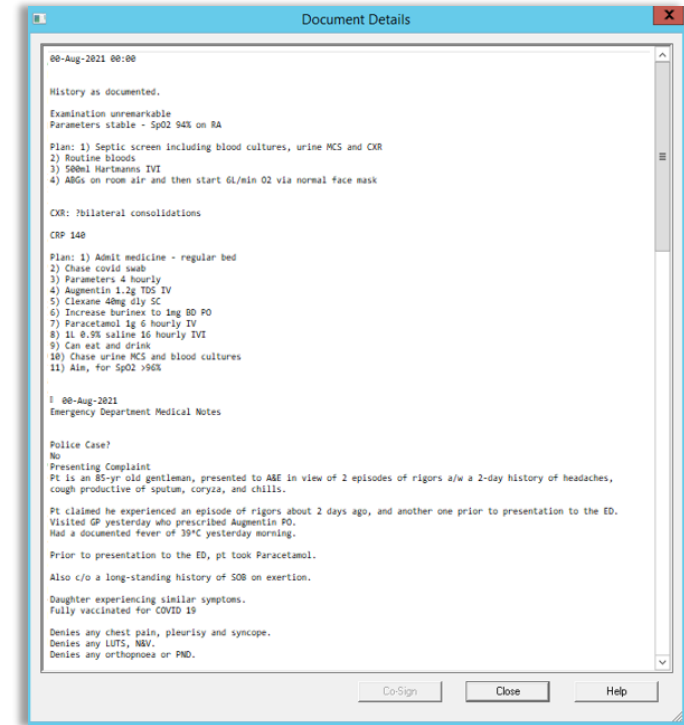
Data is now entered onto a system as text. Effectively an 'electronic paper'. At least it is accessible from computers!

Still insufficient. More easily accessible, but no means of extracting data other than manual extraction

A significant change, but long way ahead

Questionnaire based surveillance

- Data extraction of **symptoms and comorbidities** commences using available software
- Manual extraction is
 - **time-consuming**
 - **prone to human error** both at data entry and data extraction level



Search

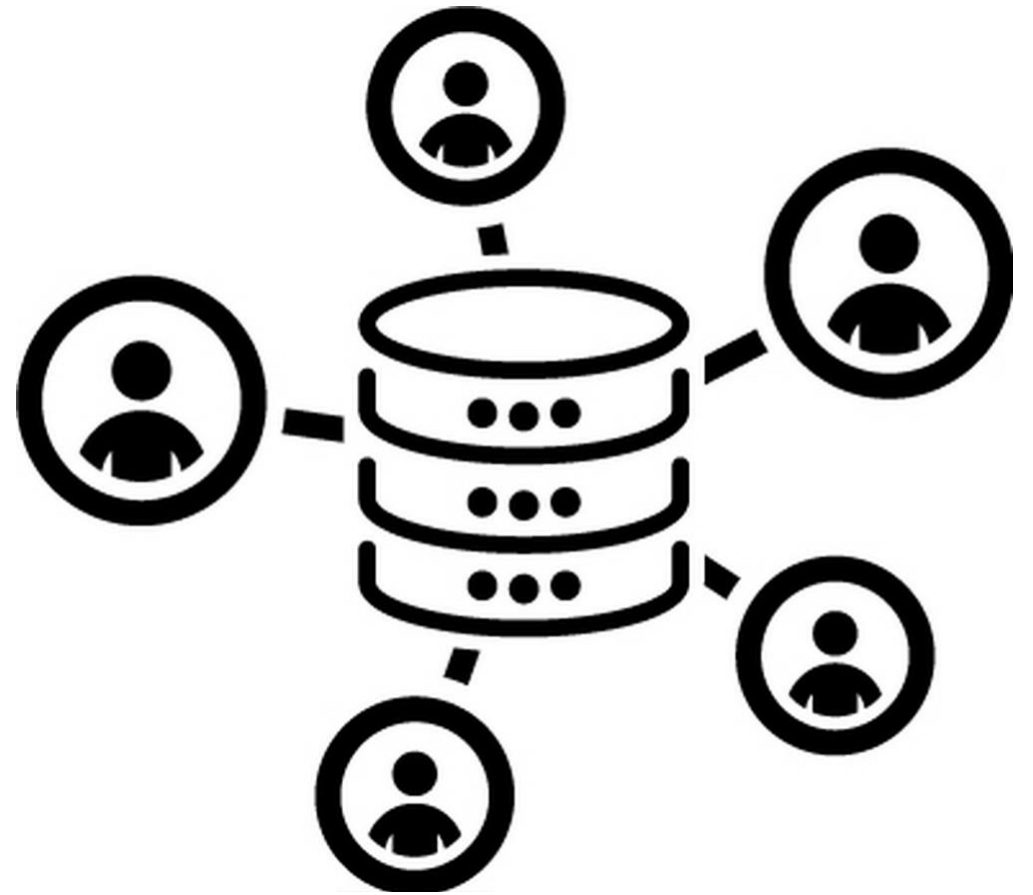
Insert Draw Page Layout Formulas Data Review Open in Desktop App

Calibri 11 B

id	symptom_onset	symptom_fever	symptom_feverishness	symptom_cough	symptom_sob	symptom_sorethroat
	01/08/2021	Yes	Yes	Yes	No	Unk
	29/08/2021	Yes	Unk	Yes	Unk	Unk
	26/08/2021	Yes	Unk	Yes	Yes	Unk
	30/08/2021	No	Unk	Yes	Yes	Unk
	30/08/2021	Yes	Unk	Yes	Unk	No
	29/08/2021	Yes	Yes	Yes	Yes	Unk

Over time, we identified other sources of data

- COVID-19 testing
- Respiratory panel of 32 pathogens
- COVID-19 vaccinations database
- Mortality data
- Hospital census
- Influenza vaccination



Tools required

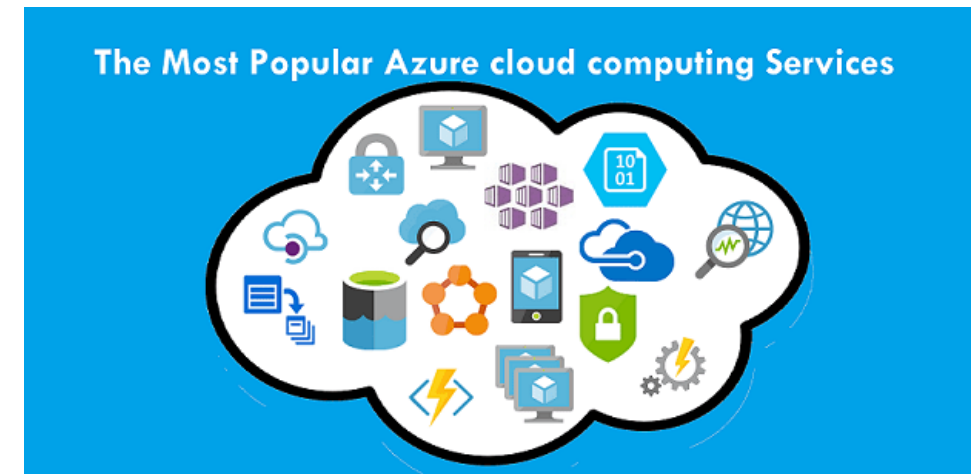
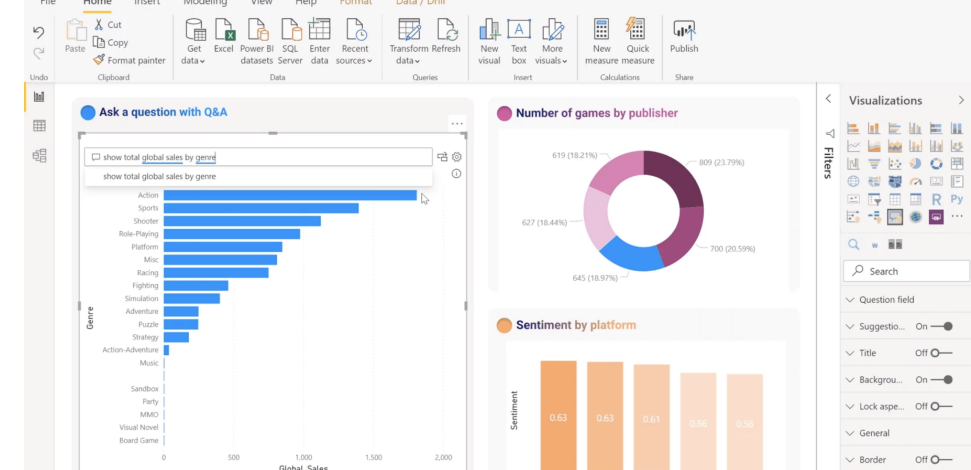
- **R software – statistical computing**
- This software enabled us to link data from various databases **using ID as a common identifier.**
- Efficient, constantly upgradeable, allows heavy statistical analysis
- Magnitudes of speed better than using colour-coded excel sheets for work processing.



Other Software being explored

- Microsoft Azure Text Analytics
- Power BI
- SQL

- These software packages are being explored for their potential to extract data automatically, or to visualise data in a compelling way.



SQL

Patient Dashboard: mid 2023

- This system would involve **entering of symptoms into fields** that can be extracted from a database, allowing automation
- **Cases can be extracted based on symptoms entered into respiratory forms**
- Could also be **expanded to other illnesses**, allowing real-time surveillance
- This would permit faster, better decision-making. It could also provide real-time information of outbreaks based on symptom combinations.



The importance of Health Data Analysis


- Can be integrated with other systems, such as Environmental Data, Zoonotic data which could lead to expanded surveillance.
- Allows for public health research to be carried out locally using large datasets.
- This can improve Malta's public health capacity, audit its abilities and improve on what we already know.
- Helps us be prepared for the next pandemic!


Coronaviruses

Hybrid immunity and protection against infection during the Omicron wave in Malta

John Paul Cauchi , Ausra Dziugyte, Maria-Louise Borg, Tanya Melillo, Graziella Zahra, Christopher Barbara, ...show all

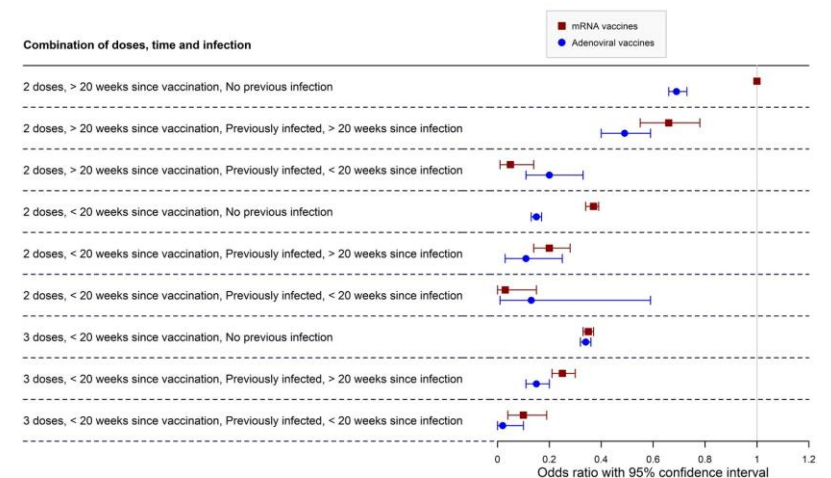
Article: e2156814 | Received 11 Aug 2022, Accepted 05 Dec 2022, Accepted author version posted online: 13 Dec 2022, Published online: 02 Jan 2023

 Download citation

 <https://doi.org/10.1080/22221751.2022.2156814>

 Check for updates

Forest Plot showing odds ratios for Omicron infection, comparing mRNA and Adenoviral vaccine groups



A composite image of Earth from space. The right side shows the illuminated side of the planet with blue oceans, white clouds, and green landmasses. The left side shows the dark side of the planet, with numerous small, bright yellow and orange lights representing city lights at night. The text "Imaginary Scenario: Pollox, 2025" is overlaid in white in the center.

Imaginary Scenario: Pollox, 2025

Imaginary Scenario: Pollox, 2025

Old system

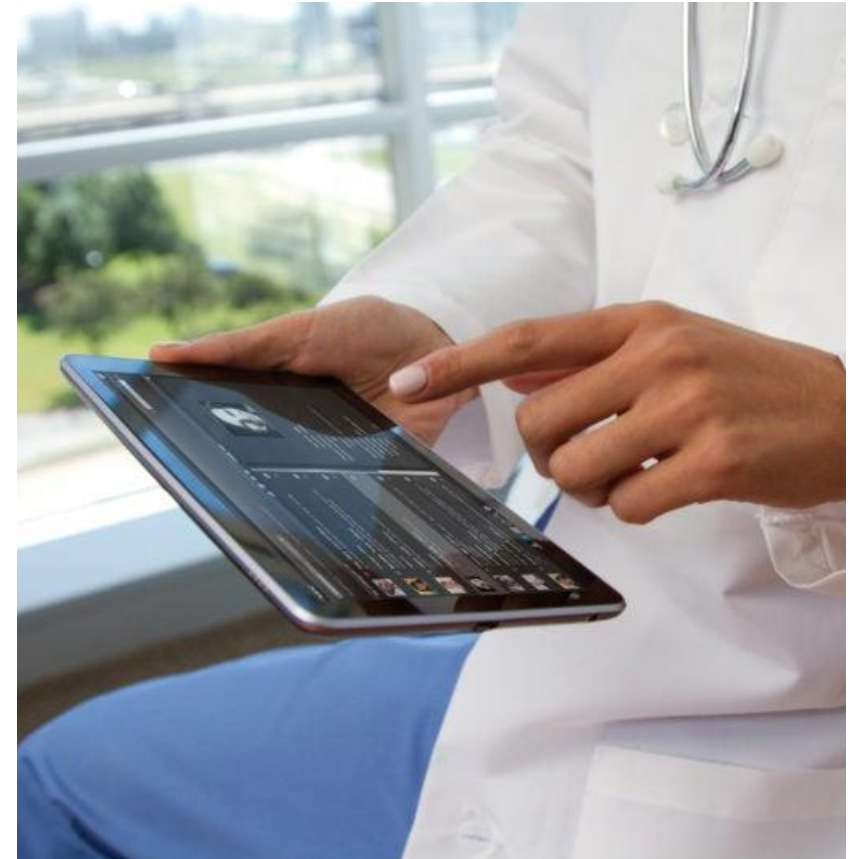
- Data is present in manual files.
- **Virtually impossible to ascertain symptom combination** to determine presence of disease in people entering hospital
- Have to wait for test kits to arrive from abroad. Considerable impact on economy and mounting anxiety
- Inability to trace the presence of symptom combination
- Mortality increase, draconian actions taken
- Clinicians anxious, unable to be sure who has what



Imaginary Scenario: Pollox, 2025

New system

- Data is present in digital files
- Symptom combination is **immediately identified**, determining presence of disease in people entering hospital
- Measures are taken to immediately quarantine those with symptom combination matching that of Pollox
- Ability to trace symptom combination in clinics across Malta and Gozo
- Prevalence of disease is kept under control
- Clinicians feel reassured, knowing who is likely to be an infected patient



In Summary

- **Now is an exciting time to enter data visualisation**
- **AI tools, such as Chat GPT,** are immensely powerful and can save a lot of time on searching and finding coding syntax
- Malta's requirements in this sector are **increasing**, especially because there is little to no such capacity in the health sector at this time



Examples of Visualising Data

183.102

154.178

245.5

Single | Explore | Compare ▾

Settings Use advanced settings

Display Cause Risk

Measure Deaths YLDs DALYs

Location Global

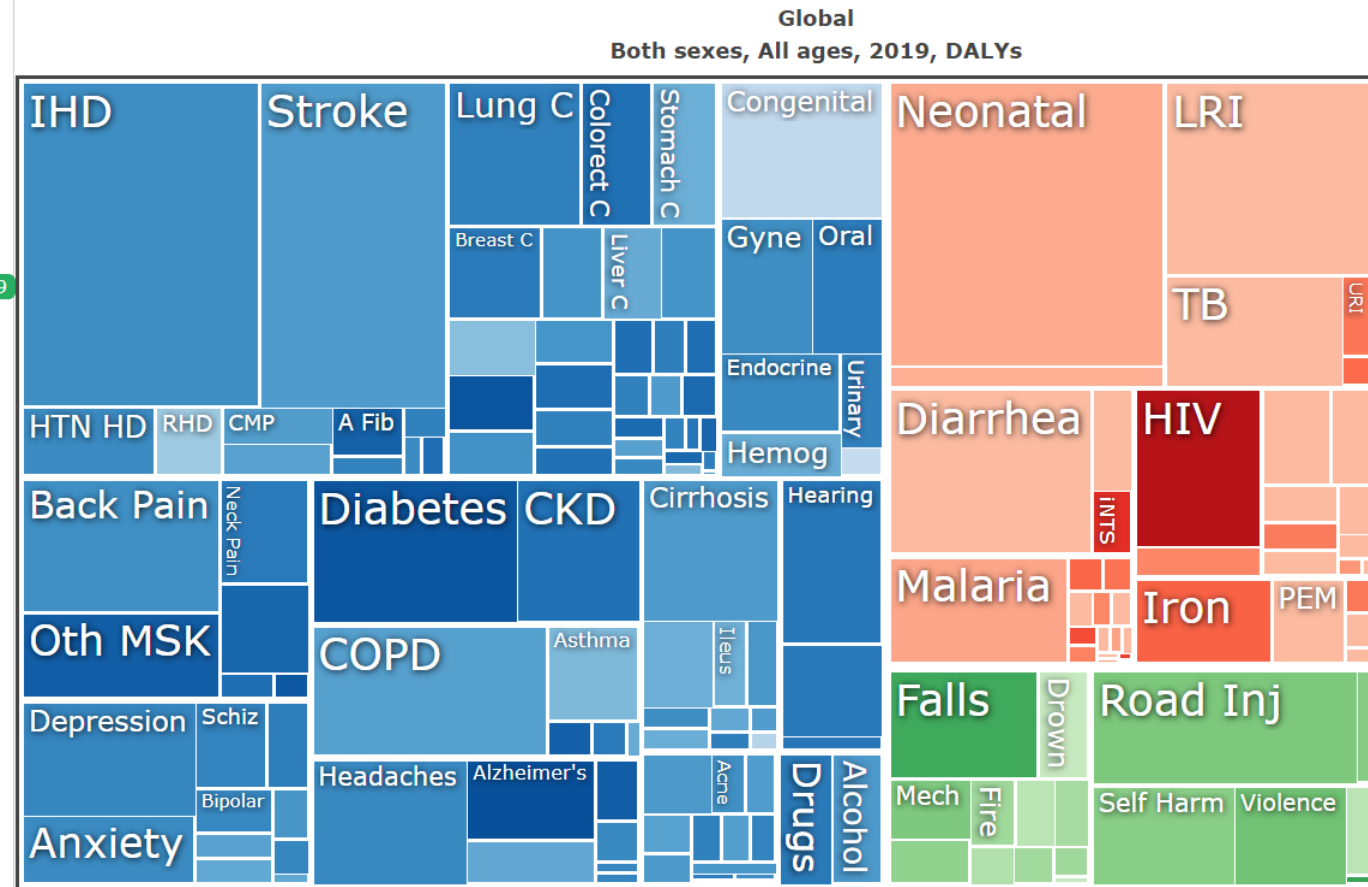
Year 2019

Age All <5 5-14
15-49 50-69 70+

Sex Male Female Both

Take tour ▶

IHME



Single Explore Compare ▾

Settings Use advanced settings

Display **Cause** Risk

Rank **Cause** Location

Category All causes ▾

Level 2

Measure Deaths YLDs **DALYs**

Location Global ▾

Range 1990 2019

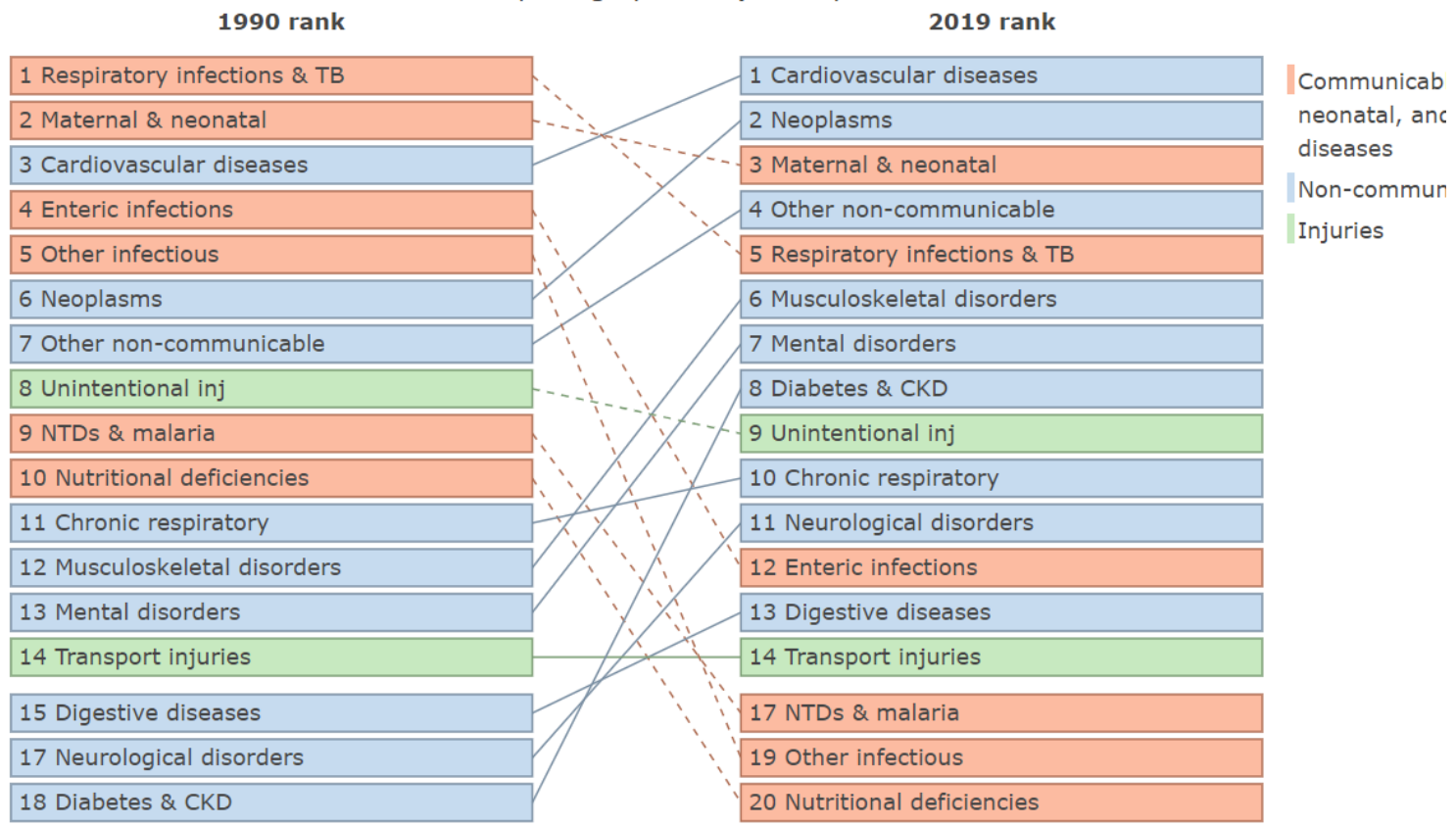
Age **All** <5 5-14
15-49 50-69 70+

Sex Male Female **Both**

Units # **Rate** %

Take tour ▶

Global
Both sexes, All ages, DALYs per 100,000



Communicable, neonatal, and infectious diseases
Non-communicable diseases
Injuries

Single Explore Compare ▾

Settings Use advanced settings

Display Cause Risk

Measure Deaths YLDs DALYs

Locations Switch location group
Add/Remove locations (21) ✕

Year 2019

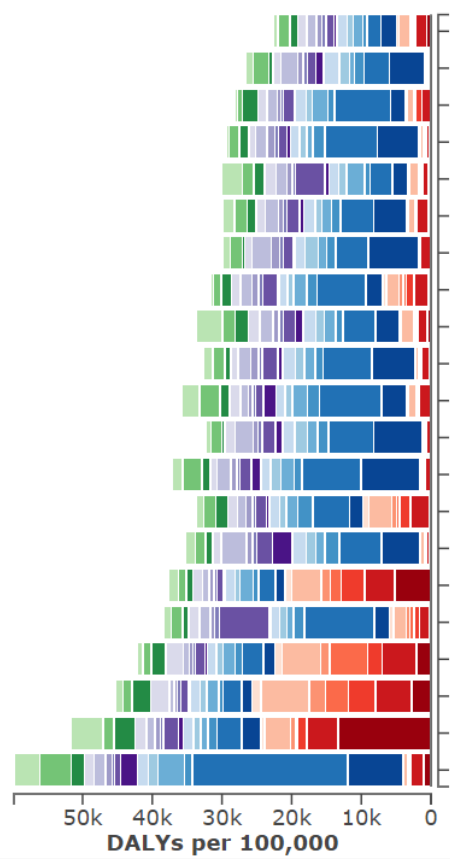
Age All <5 5-14
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Units # Rate %

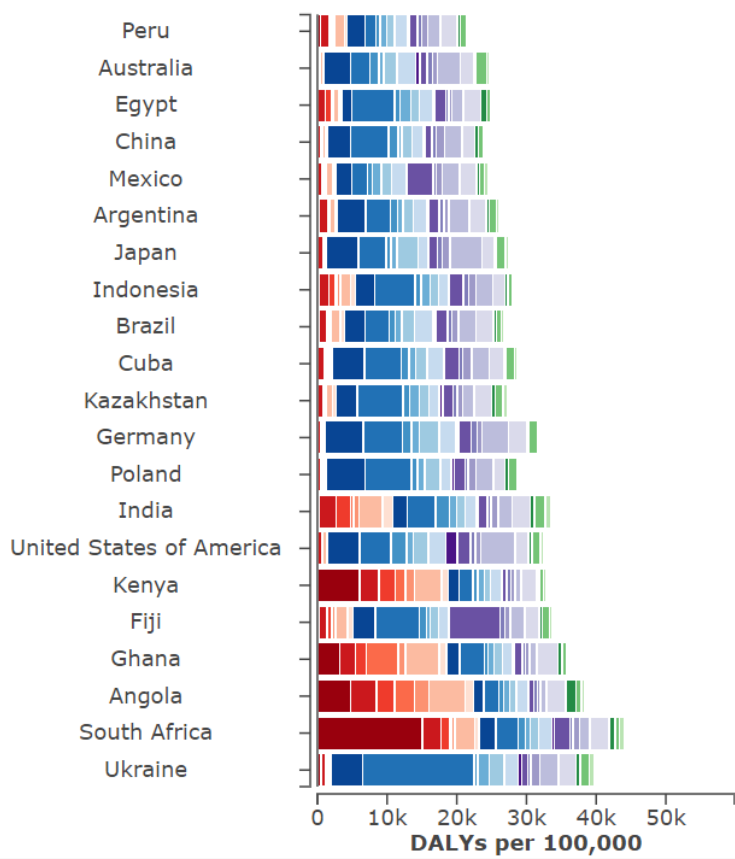
[Take tour ▶](#)

IHME

Males, All ages, 2019



Females, All ages, 2019



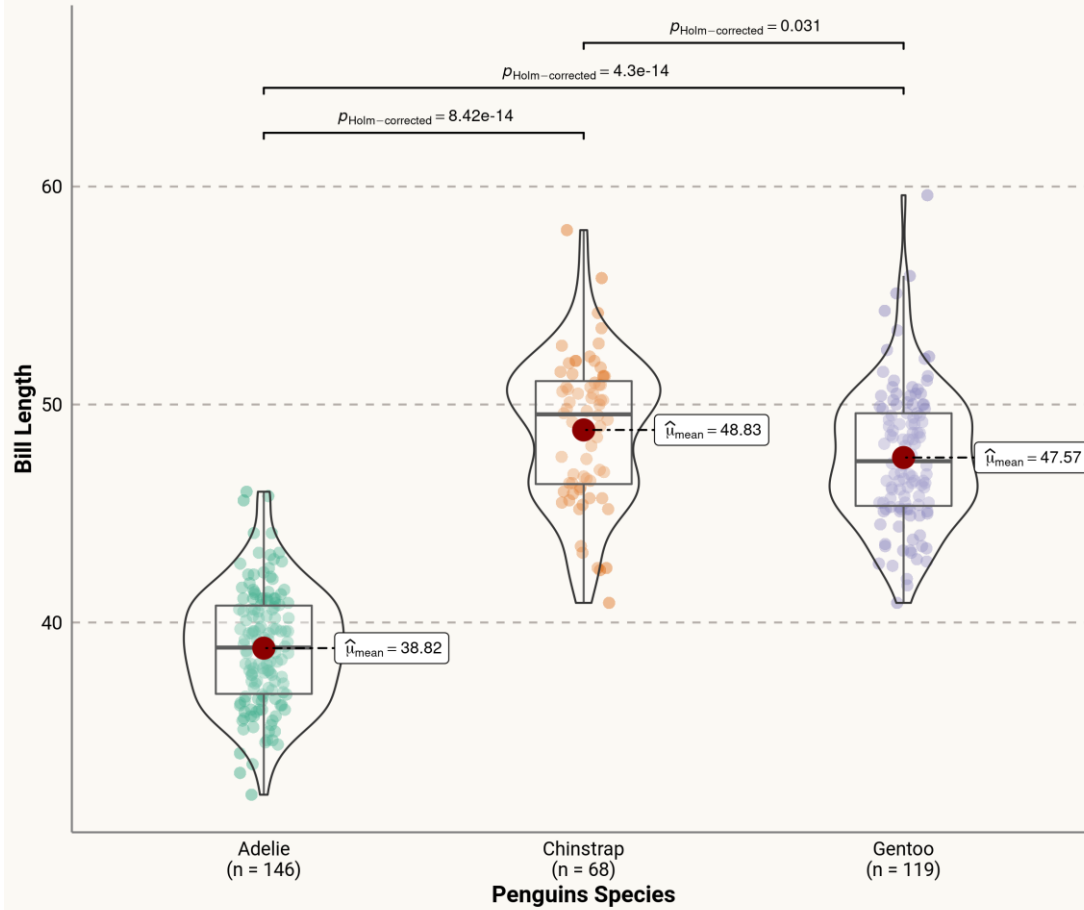
Switch cause group ▾

Add cause

- Self-harm & violence ✕
- Unintentional inj ✕
- Transport injuries ✕
- Other non-communicable ✕
- Musculoskeletal disorders ✕
- Sense organ diseases ✕
- Skin diseases ✕
- Diabetes & CKD ✕
- Substance use ✕
- Mental disorders ✕
- Neurological disorders ✕
- Digestive diseases ✕
- Chronic respiratory ✕
- Cardiovascular diseases ✕
- Neoplasms ✕
- Nutritional deficiencies ✕
- Maternal & neonatal ✕
- Other infectious ✕
- NTDs & malaria ✕
- Enteric infections ✕
- Respiratory infections & ✕

Distribution of bill length across penguins species

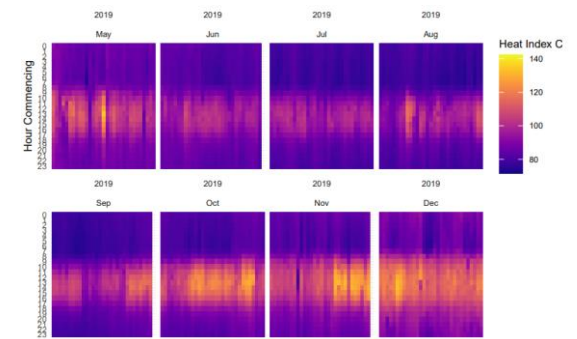
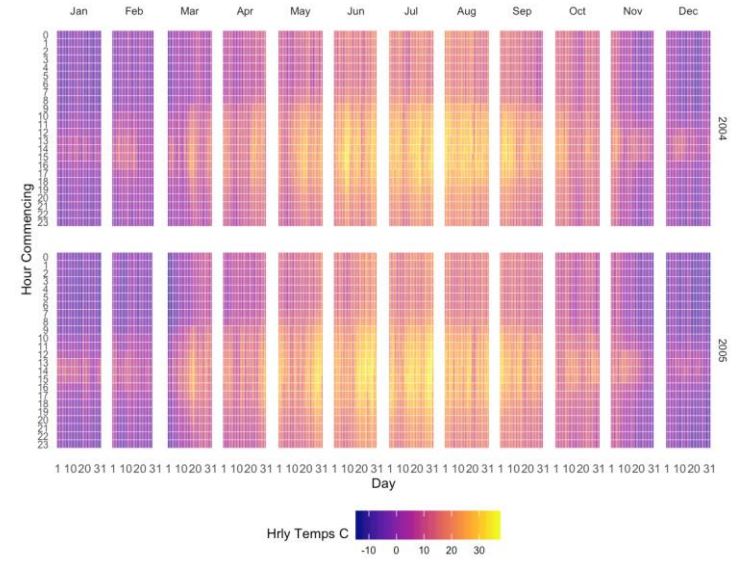
$F_{Welch}(2,165.34) = 409.93, p = 8.27e-65, \hat{\omega}_p^2 = 0.83, CI_{95\%} [0.79, 0.86], n_{obs} = 333$

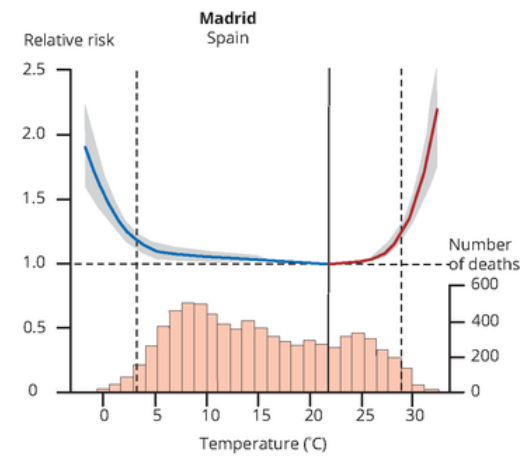
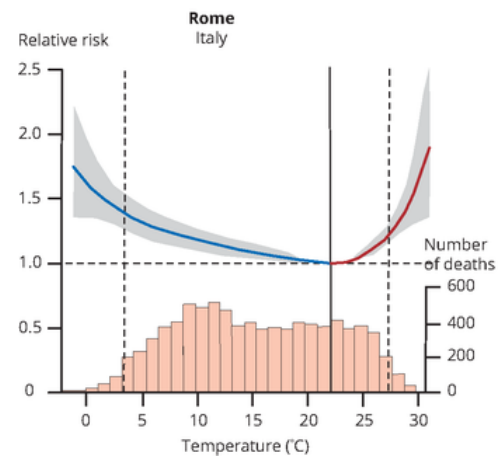
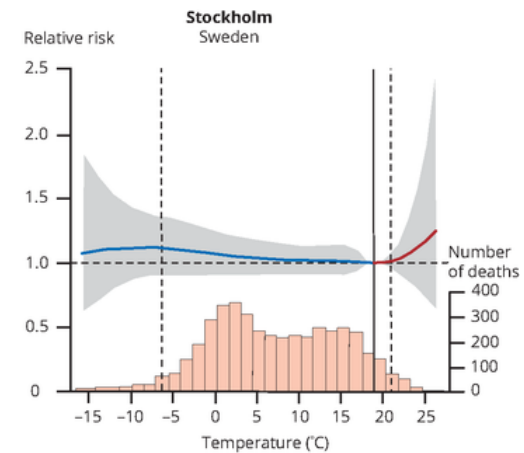
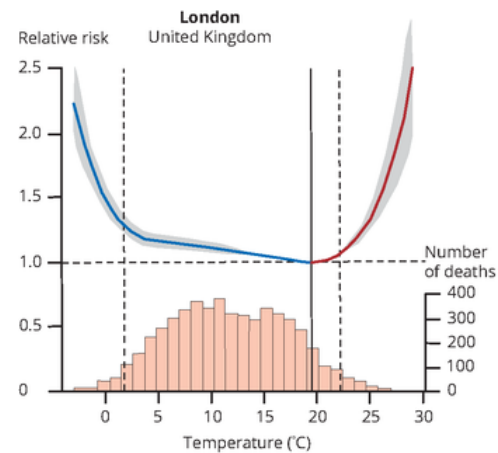
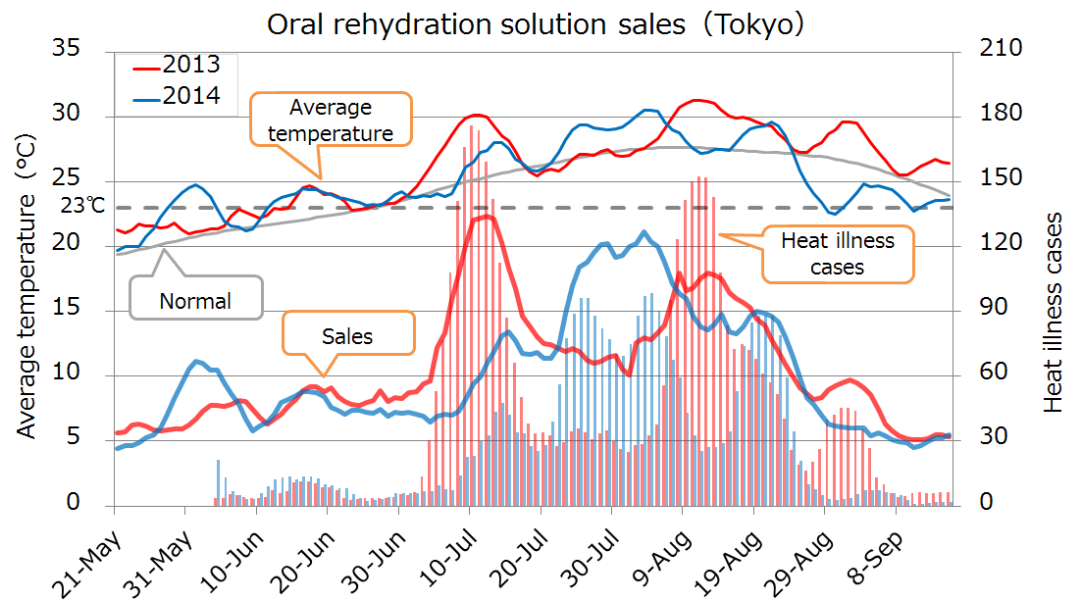


$\log_{10}(BF_{01}) = -195.59, R_{Bayesian}^{posterior} = 0.70, CI_{95\%}^{HDI} [0.67, 0.73], r_{Cauchy}^{JZS} = 0.71$

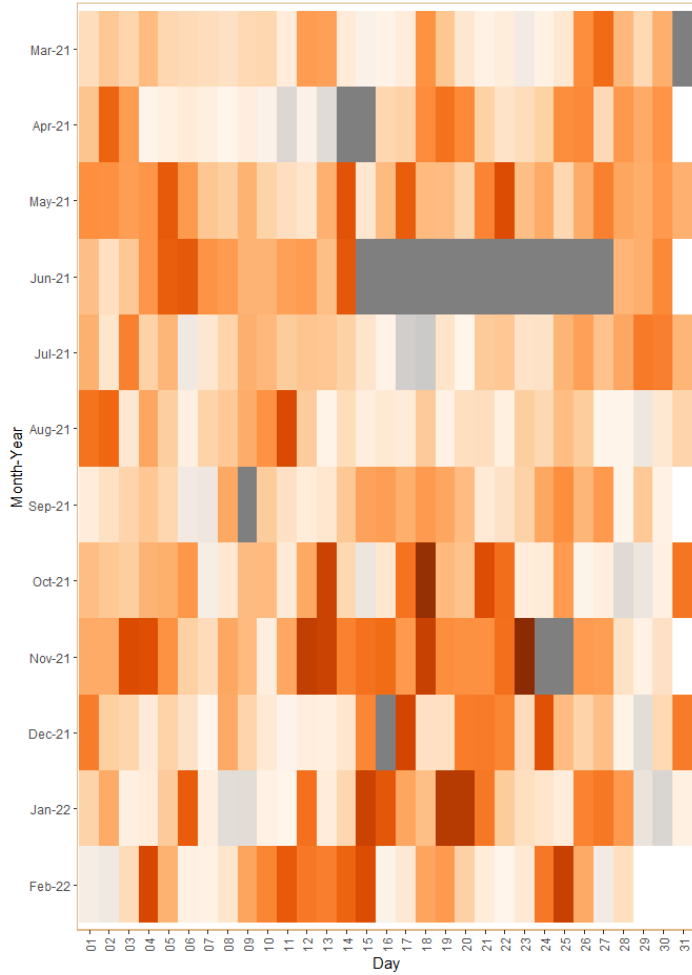
Pairwise test: **Games-Howell test**; Comparisons shown: **only significant**

Hourly Temps - Station T0001

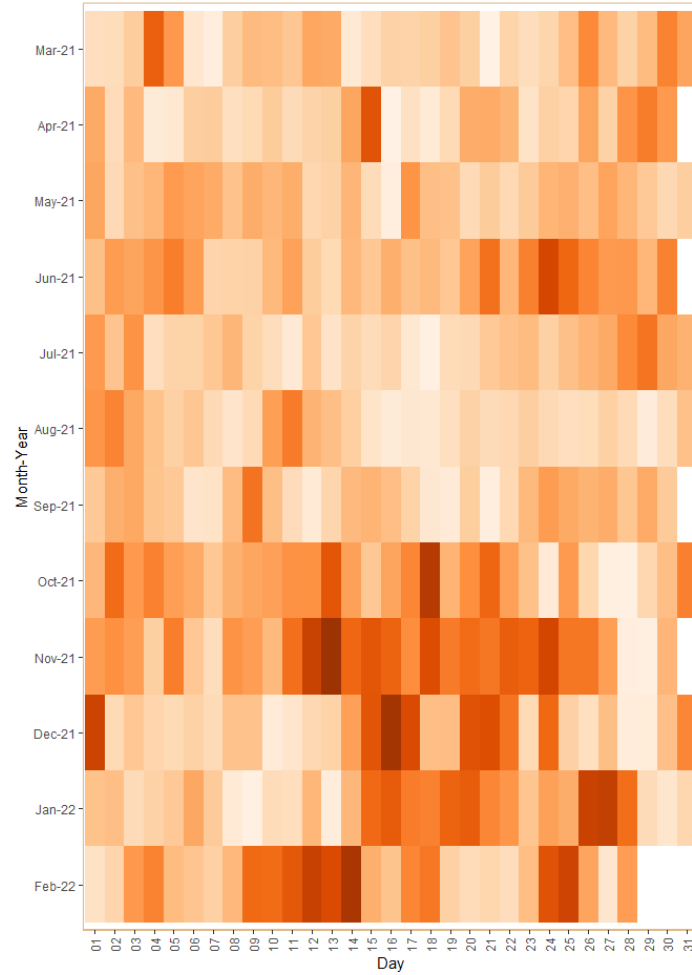




Senglea - NO2



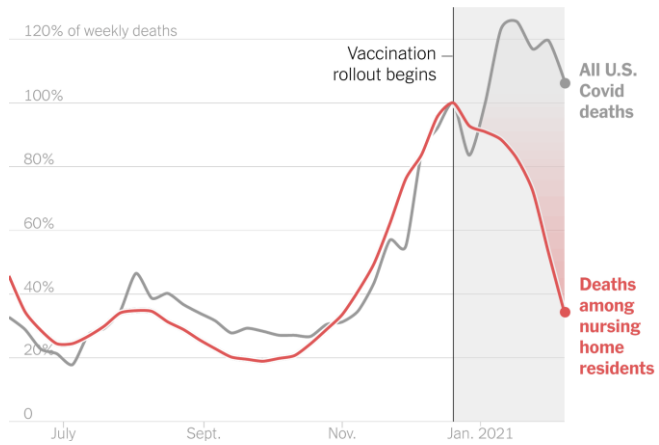
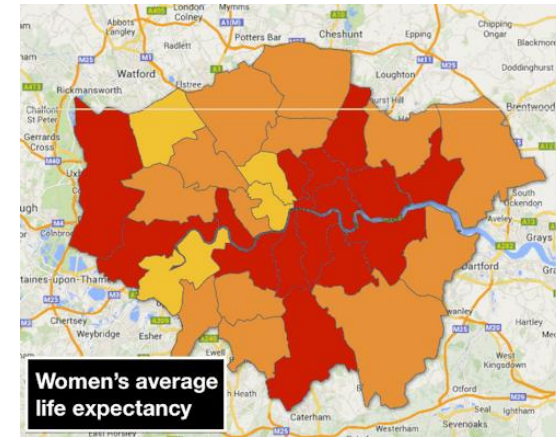
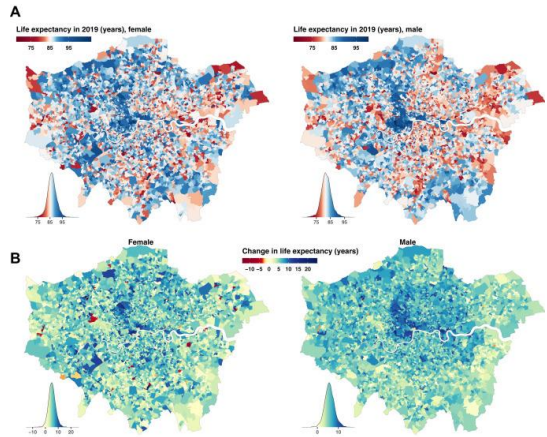
Msida - NO2



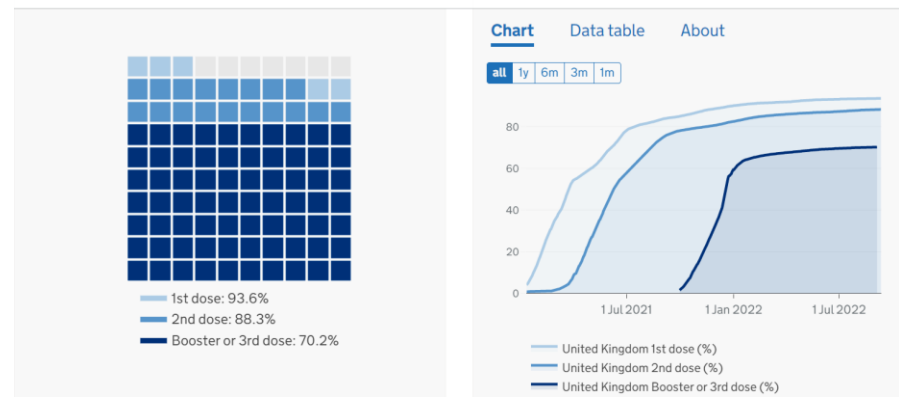
Days when NO2 levels exceeded safe values of 25.0 µg/m³ over a 24-hour period*

Location	Exceeds limit	Acceptable
Msida	52% (n = 189/365)	48% (n = 176/365)
Senglea	47% (n = 161/346)	53% (n = 185/346)

Levels above 25 µg/m³ (light orange) are dangerous to health...



Vaccinations in United Kingdom



Conclusion

- Data analysis is key to effective policy decision-making
- Malta needs to invest in its capacity to carry out effective health surveillance
- ‘**We’ve always done it this way**’ just doesn’t hold water any longer – things are rapidly changing and we need to improve our capabilities
- **Centralisation** of data makes it easier to carry out effective health data analysis
- **Integration** with other data sources is possible – geographical, environmental, economic, sociological
- **Result:** better community health care, better health outcomes, cost-saving