

## GeoHealth

The Importance of Place in Understanding Health

Associate Professor Neil Coffee Health Research Institute University of Canberra



## The Art, <u>Science</u> and Business of Geospatial

## GeoHealth

## **Tobler's Law**



Everything is related to everything else, but near things are more related than distant things.



Tobler W., 1970, A computer movie simulating urban growth in the Detroit region, Economic Geography, 46(2): 234-240.

## "All Pervasive Enabler"



# All: DATA Pervasive: ALL disciplines Enabler: <u>GIS</u>

### Early GeoHealth Work



## Not John Snow! Charles Booth



## Charles Booth's London poverty maps







https://booth.lse.ac.uk/learn-more/download-maps/sheet12





| T | he Streets are coloured according to the            | general condition of the inhabitants, as under                |
|---|---|---|
|   | Lowest class.Vicious, semi-criminal.                | Fairly comfortable.Good ordinary earnings.                    |
|   | Very poor, casual. Chronic want.                    | Middle-class.Well-to-do.                                      |
|   | Poor. 18s. to 21s. a week for a moderate<br>family. | Upper-middle and Upper classes.Wealthy.                       |
| 2 | Mixed.Some comfortable, others poor.                | A combination of colours- as dark blue and black, or pink and |

A combination of colours— as dark blue and black, or pink and red— indicates that the street contains a fair proportion of each of the classes represented by the respective colours.

## **Evolving Interest**





## Well established link between social disadvantage and poorer health outcomes



## Socio-economic Status



- SES strong relationship with health outcomes.
- Includes:
  - Obesity
  - Diabetes
  - Cardio vascular Disease
  - Cancer
  - Mental Illness
  - Hypertension
  - High Cholesterol
  - Metabolic Syndrome......

## Importance of "Place" to health



- Associations
  - Obesity
  - Diabetes
  - Cardio vascular Disease
  - Cancer
  - Mental Illness
  - Hypertension
  - High Cholesterol
  - Metabolic Syndrome......

## **GIS and Health**



## World Examples





#### New map shows undiagnosed dementia cases in UK

#### E March () dold "& Sechlyr Day

A multy of dementia diagnosis in UK produced by The Alzheimer's Society and Alzheimer's Sociand with the help of the supermarket chain Tesco predicts that more than a million people will suffer from dementia by 2021 in the UK. The researchers say their figures show that half a million people are now living without a diagnosis.



MON TOTALS

#### Vaccine-preventable disease outbreaks

Browse our interactive map to track outbrooks of vacative preventable diseases around the globe.

The map case information published by news, governments and global health organizations to plot outpeaks of vaccineproventable disease over time, including meetice, manys, polis, rubels and whooping sough (perturb). Originally created and published by the US-based Council on Foreign Relations in 2004, this immerchance tool is widely recognized by the global health community for its role in raising awareness of the continued provalence of easily preventable diseases.











| T        | phidu.torrens.edu.au |
|----------|----------------------|
| <u> </u> | principlication      |





ABOUT PHIDU

HELP AND INFORMATION

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#### Social Health Atlas, Population Health Areas, Published 2017

| Send the  |         | PR YORK | PIDE DI DIMINI DE DATE   |          |
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TOOLS

PUBLICATIONS

SOCIAL HEALTH ATLASES



## **SES and Place**



- Associations are common
- Spatial SES
- Create a measure at the property level that could provide a disaggregated SES indicator
- Application in Adelaide used GIS, Sales and Property Cadastre data" Relative Location Factor (RLF)"
- For more detail regarding the Methodology see:
  - Coffee N, Lockwood T, 2012, The Property Wealth Metric and Socio Economic Indicators. *Proceeding of Pacific Rim Real Estate Society, 18th Annual Conference*, 15-18 January 2012.
  - NT Coffee, T Lockwood, G Hugo, C Paquet, NJ Howard, M Daniel, 2013, Relative residential property value as a socio-economic status indicator for health research, International journal of health geographics 12 (1), 22.
  - T Lockwood, NT Coffee, P Rossini, T Niyonsenga, S McGreal, 2018, Does where you live influence your socio-economic status?, Land Use Policy 72, 152-160.

## Methodology



- Georeferenced sales data for May to October to avoid changes to sales market
- The RLF was calculated using the hedomic global Ordinary Least Squares (OLS) regression model comprising independent variables that were deliberately <u>'blind</u>' to location
- The residual was then considered to represent these omitted location variables at each sale point
- These are then interpolated across the study area to give a continuous RLF surface from which values can be extracted for each property

## **Continuous RLF**



## MAUP & ABS SEIFA Index



- ABS\* calculate several Indices
- ABS confidentiality prohibits unit record census data being made available
- ABS provide SEIFA for spatial units
  - Collection District (pre 2011) or SA1 smallest unit
  - Also (pre 2011)Suburb, Postal Area, SLA,LGA and 2011 the SA1-SA4
- Remember MAUP & Ecological Fallacy
- Lets look at some of these spatial units in Adelaide

\* Australian Bureau of Statistics















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Spatial Epidemiology and Evaluation Research Group









| Spatial Unit | Low SEIFA House | HIGH SEIFA House |
|--------------|-----------------|------------------|
| CCD          | 826.42          | 1059.35          |
| SSC          | 891.45          | 1025.43          |
| POA          | 891.45          | 939.69           |
| SLA          | 889.32          | 938.27           |
| LGA          | 922.53          | 922.53           |
| Change       | 96.11           | -136.82          |

#### Decile

| Spatial Unit | Low SEIFA House | HIGH SEIFA House |
|--------------|-----------------|------------------|
| CCD          | 1               | 10               |
| SSC          | 2               | 8                |
| POA          | 2               | 5                |
| SLA          | 2               | 5                |
| LGA          | 5               | 5                |
| Change       | 4               | -5               |











## **RLF: Within CD variation**





- Spatial variation within the RED CD noted through the change in decile of the individual property scores
- More aligned with neighbouring CDs which may suggest CD boundaries are inappropriate SES boundaries

#### **Utility of General Practice Data Capture and Spatial Analysis** for Understanding COPD and Asthma

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#### Prevalence and standardised incidence ratios of COPD by medical practice

|            | Active patients | Observed<br>cases | Expected cases | Prevalence<br>(=O/A*100%) | SIR<br>(=O/E) |
|------------|-----------------|-------------------|----------------|---------------------------|---------------|
| Practice 1 | 12,032          | 374               | 409            | 3.1                       | 0.91          |
| Practice 2 | 8,004           | 345               | 290            | 4.3                       | 1.19          |
| Practice 3 | 7,085           | 243               | 269            | 3.4                       | 0.90          |
| Practice 4 | 4,140           | 103               | 154            | 2.5                       | 0.67          |
| Practice 5 | 2,464           | 65                | 77             | 2.6                       | 0.84          |
| Total      | 33,725          | 1,130             | 1,228          | 3.4                       | 0.92          |

|                      |                               |        | Model 1 Model 2 |          |         |         |        |       |          |         |         |
|----------------------|-------------------------------|--------|-----------------|----------|---------|---------|--------|-------|----------|---------|---------|
| regression of active | Covariates                    | Est.   | SE              | р        |         | CI]     | Est.   | SE    | р        | [95%    | CI]     |
| COPD                 | Within-cluster                |        |                 |          |         |         |        |       |          |         |         |
|                      | Age                           |        |                 |          |         |         | 2.348  | 0.239 | < 0.0001 | [ 1.880 | 2.816]  |
|                      | Age <sup>2</sup>              |        |                 |          |         |         | -0.697 | 1.121 | < 0.0001 | [-0.933 | -0.461] |
|                      | Male                          |        |                 |          |         |         | 0.522  | 0.077 | < 0.0001 | [ 0.372 | 0.672]  |
|                      | Female                        |        |                 |          |         |         | 0.0    |       |          |         |         |
|                      | Smoker                        |        |                 |          |         |         | 2.477  | 0.116 | < 0.0001 | [ 2.251 | 2.704]  |
|                      | Ex-smoker                     |        |                 |          |         |         | 1.522  | 0.093 | <0.0001  | [ 1.340 | 1.704]  |
|                      | Never smoked                  |        |                 |          |         |         | 0.0    |       |          |         |         |
|                      | Indigenous<br>Australian      |        |                 |          |         |         | 0.871  | 0.341 | 0.011    | [ 0.203 | 1.540]  |
|                      | Non- Indigenous<br>Australian |        |                 |          |         |         | 0.0    |       |          |         |         |
|                      | Unmarried                     |        |                 |          |         |         | 0.365  | 0.126 | 0.004    | [ 0.118 | 0.613]  |
|                      | Married                       |        |                 |          |         |         | 0.0    |       |          |         |         |
|                      | <b>N-Comorbidities</b>        |        |                 |          |         |         | 1.060  | 0.029 | < 0.0001 | [ 1.004 | 1.117]  |
|                      | Between-cluster               |        |                 |          |         |         |        |       |          |         |         |
|                      | IRSD (Q4)                     | -1.280 | 0.171           | < 0.0001 | [-1.614 | -0.945] | -0.513 | 0.182 | 0.005    | [-0.870 | -0.155] |
|                      | IRSD (Q3)                     | -0.712 | 0.114           | < 0.0001 | [-0.936 | -0.489] | -0.299 | 0.117 | 0.010    | [-0.528 | -0.071] |
|                      | IRSD (Q2)                     | -0.358 | 0.083           | < 0.0001 | [-0.520 | -0.196] | -0.156 | 0.091 | 0.088    | [-0.335 | 0.023]  |
|                      | IRSD (Q1)                     | 0.0    |                 |          |         |         | 0.0    |       |          |         |         |

COPD

tion Research Group





#### Getis-Ord Gi\* Hot Spot analysis for COPD and Asthma



### The North West Adelaide Health Study (NWAHS)







- longitudinal population-based biomedical cohort
- three waves of data collected between 2000 and 2010.
- self-report socio-demographic and health data.
- clinic biomedical data and prescription medication.
- residential address used to geocode.
- ethics approval form the Human Research Ethics Committees of:
  - the University of South Australia;
  - the North West Adelaide Health Service: and
  - the South Australian Department of Health.

## **NWAHS Analysis**

| Natural breaks            |            | RR   | 95%  | 6 CI | Р      |
|---------------------------|------------|------|------|------|--------|
| Central Obesity***        | RLF: 3 v 1 | 0.89 | 0.83 | 0.95 | 0.0004 |
|                           | RLF: 2 v 1 | 0.93 | 0.89 | 0.98 | 0.0033 |
| Hypertriglyceridemia***   | RLF: 3 v 1 | 0.79 | 0.70 | 0.90 | 0.0005 |
|                           | RLF: 2 v 1 | 0.90 | 0.82 | 0.98 | 0.0173 |
| Reduced HDL#              | RLF: 3 v 1 | 0.79 | 0.67 | 0.92 | 0.0025 |
|                           | RLF: 2 v 1 | 0.87 | 0.78 | 0.97 | 0.0159 |
| Hypertension***           | RLF: 3 v 1 | 0.94 | 0.88 | 1.01 | 0.0824 |
|                           | RLF: 2 v 1 | 0.90 | 0.85 | 0.95 | <.0001 |
| Diabetic\diabetes Risk*** | RLF: 3 v 1 | 0.52 | 0.43 | 0.64 | <.0001 |
|                           | RLF: 2 v 1 | 0.79 | 0.70 | 0.89 | <.0001 |
| High LDL^                 | RLF: 3 v 1 | 0.95 | 0.77 | 1.17 | 0.6277 |
|                           | RLF: 2 v 1 | 1.05 | 0.90 | 1.23 | 0.5399 |
| CMR Score***              | RLF: 3 v 1 | 0.81 | 0.76 | 0.86 | <.0001 |
|                           | RLF: 2 v 1 | 0.91 | 0.86 | 0.95 | <.0001 |

Gender, Age and Bachelor Education were included in all models.

\*\*\* Gender, Age and Bachelor Education Significant.

# Gender Significant.

^ Age Significant.



- Wave 1 NWAHS, 2001, n=3585
- Factors Log binomial generalized linear models
- CMR score Poisson regression
- Parameter estimates exponentiated relative risk (RR)
- Accounted for age, gender and education (no university degree)
- Statistical significance was set at alpha = 0.05
- Statistically significant relationship between RLF & CMR score all but one of the risk factors.
- Participants in the advantaged and intermediate group had a lower risk for CMD.
- CMR score RR for the most advantaged was 19% lower (RR = 0.81; CI 0.76-0.86; p <0.0001) and the middle group was 9% lower (RR = 0.91; CI 0.86-0.95; p <0.0001) than the least advantaged group.

Coffee et al. International Journal of Health Geographics 2013, http://www.ij-healthgeographics.com/content/12/1/22





Health & Place 21 (2013) 163-169

EL SEVIER

Health & Place

Contents lists available at SciVerse ScienceDirect

journal homepage: www.elsevier.com/locate/healthplace

Is walkability associated with a lower cardiometabolic risk? Neil T. Coffee <sup>a,b,\*</sup>, Natasha Howard <sup>a</sup>, Catherine Paquet <sup>a,c</sup>, Graeme Hugo <sup>b</sup>, Mark Daniel <sup>a,d</sup>



Fig. 2. Geographic scale variation, selected NWAHS participant.



## IEALTH RESEARCH

#### Table 3

HEALTH & PLACE

CrossMark

Parameter estimates for associations between cardiometabolic risk score and spatial unit walkability score  $(n=3593)^a$ .

| Walkability score   | RR   |      | 95% CI | Р       |  |
|---------------------|------|------|--------|---------|--|
| 500 m road buffer   | 0.97 | 0.94 | 1.00   | 0.04    |  |
| 1000 m road buffer  | 0.94 | 0.91 | 0.98   | 0.002   |  |
| 1600 m road buffer  | 0.94 | 0.90 | 0.97   | < 0.001 |  |
| Collection district | 0.98 | 0.94 | 1.03   | 0.47    |  |
| derived suburb      | 0.97 | 0.91 | 1.04   | 0.37    |  |

<sup>a</sup> Adjusted for individual gender, age ( < 55 or  $\geq$  55), education (no university or university degree), weekly income (0–19,999; 20,000–59,999, >60,000) and suburb weekly median household income.

Lower CMR score was associated with higher WI for the three road buffer representations of the built environment with a three per cent reduction in relative risk for the 500 m road buffer, and six per cent for the 1000 m and 1600 m road buffers. No statistical relationship was found for either of the two predetermined administrative spatial unit. These results indicate that the choice of spatial unit used and its scale influence the nature of relationships estimated between the built environment and clinical risk factors.

## **Location Data**

- Dwelling density
- Destination choice
- Road system
  - connectivity/accessibility/barriers
  - Main road exposure/traffic/noise
- Open space/Greenspace/Parks/Sport and recreation
- Crime and Safety
- Food environment
  - Unhealthy
  - Healthy
- Topography
- Service and facility locations



## **Health Data**



- Hard health outcomes difficult to access at a spatial scale that is meaningful
- Confidentiality problems
- We have the technology but generally lack the access to data
- Data available for administrative units that are not meaningful!
- MAUP issues

## Measures

- Counts
- Distance
- Density
- Access
- Index
- Ratio



### **Data Issues**



- Confidentiality
- Data linkage costs
- Large spatial units that mask spatial variation
- Poor quality data especially address data
- Enormous cost and time to geocode health data
- Apart from these issues it is very difficult to get data for research



## **Example: Geocoding**



#### N=572,496

| Category     | Number         | Remark  |
|--------------|----------------|---|
| Actual XY    | 453674 (79.2%) | Exact match found (or almost exact where unit/flat/appt number wasn't found)  |
| SA2          | 7009 (1.2%)    |   |
| Review       | 8963 (1.6%)    | Manual clerical review needed to classify as XY, SA1, SA2 or reject   |
| Unclassified | 102009 (17.8%) | Not enough information to be geocoded at XY/SA1 level; SA2 codes could be generated where locality and postcode were known; some could still be worth cleaning for future geocoding |
| Reject       | 841 (0.1%)     | No match possible   |

## **New Projects**



- Signing a <u>\$2.7m</u> collaboration with the Dasman Diabetes Institute to build Geohealth infrastructure, capability and conduct research
- Developing a <u>MOU with ESRI</u> to build a GeoHealth Hub at University of Canberra
- Starting a Graduate Certificate in GeoSpatial Health Semester 2 at UC
- Delivery of Graduate Certificate in GeoSpatial Health in Kuwait starting October 2018

## Geo-Health Lab

Built environment Land use / zoning Dwelling type Road network Satellite images (NDVI) Public/private sector businesses Transport grid and modes Food sources Open space Infrastructure, Service environment

#### **Geocoding** Residential location Census Geographic Areas

#### **Physical Environment** Climate (e.g., Rainfall, Temperature)

River systems, drainage Topography DEM





Social Census Income Education Crime rates Unemployment Poverty Collective hopelessness Social networks

**Health Data** 





cohort

Theo Niyonsenga<sup>1</sup> and Mark Daniel<sup>1,4,5</sup>

Suzanne J. Carroll<sup>1\*</sup>, Catherine Paquet<sup>1,2</sup>, Natasha J. Howard<sup>1</sup>, Neil T. Coffee<sup>1</sup>, Robert J. Adams<sup>3</sup>, Anne W. Taylor<sup>3</sup>,

For local governments areas most met the standard. For the postcodes and suburbs, the ABS Meshblock under reported and the Parks data over reported. The results varied depending on the spatial unit and choice of data and this demonstrated the importance of the choice of spatial data set and spatial unit.

November 2017

uation Research Group



associated with a better cardiometabolic health? Catherine Paguet a. b. a 🖉 🖾, Thomas P. Orschulok º. a 🖾, Neil T. Coffee a. a 🖾, Natasha J. Howard a. a 🖾, Graeme

Hugo d 🖾, Anne W. Taylor e 🖾, Robert J. Adams e 🖾, Mark Daniel a. f. g 🖾

#### Show more

Circulation. published online March 26, 2012; Circulation is published by the American Heart Association, 7272 Greenville Avenue, Dullas, TX 75231 Commission 7 Hand Accessio

Robyn A. Clark, Neil Coffee, Dorothy Turner, Kerena A. Eckert, Deborah van Gaans, David Wilkinson, Simon Stewart and Andrew M. Tonkin

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American

Heart Association

## Conclusions



- We can do great things (with access to data!!!)
- Partner with health agencies to gain confidence
- We do not do this to embarrass anyone, but to improve population health
- Spatial industry has data providers, software and applied (users)
- I am not a young professional but still believe in "not giving up" (especially around data access!!!)

## Thank You

I HAVE UNCONTROL-LABLE URGES TO SHOW PEOPLE BETTER WAYS TO DO THINGS.





## Questions

e:neil.coffee@canberra.edu.au