



**CANUE**

# Mobilizing Environmental Data to Build Healthier Cities for All

September 29 | 2021

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<sup>3</sup>Research Institute of the McGill University Health Centre

# Presentation overview



**Jeffrey Brook** | CANUE Scientific Director  
and Nominated Principal Investigator



**Eleanor Setton** | CANUE Managing Director  
and Environmental Exposure Expert



**Dany Doiron** | CANUE Data Linkage Lead  
and Environmental Epidemiologist

**Leadership:**  
**Jeff Brook (PI)**  
**Philip Awadalla**  
**Michael Brauer**  
**Howard Hu**  
**Kim McGrail**  
**Dave Stieb**  
**PJ Subbarao**

## Key contributors:

Amir Hakami - Carleton University  
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Johannes Feddema – University of Victoria  
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Paul Villeneuve – Carleton University  
Lorien Nesbitt – University of British Columbia  
Matilda van den Bosch- University of British Columbia  
Audrey Smargiassi - University of Montreal  
Hugh Davies - University of British Columbia  
Tor Oiamo – Ryerson University  
Michael Widener – University of Toronto  
Daniel Fuller – Memorial University  
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Darren Scott – McMaster University  
Ahsan Habib – Dalhousie University  
Meghan Azad – University of Manitoba  
Stephanie Atkinson – McMaster University  
John McLaughlin – University of Toronto  
Chris Carlsten – University of British Columbia  
Paul Demers - Cancer care Ontario - UofT  
Doug Manuel – University of Ottawa  
Daniel Rainham – Dalhousie University  
Greg Evans – University of Toronto  
Larry Frank - University of British Columbia  
Trevor Dummer - University of British Columbia  
Piushkumar Mandhane – University of Alberta  
Zachary Patterson – Concordia University

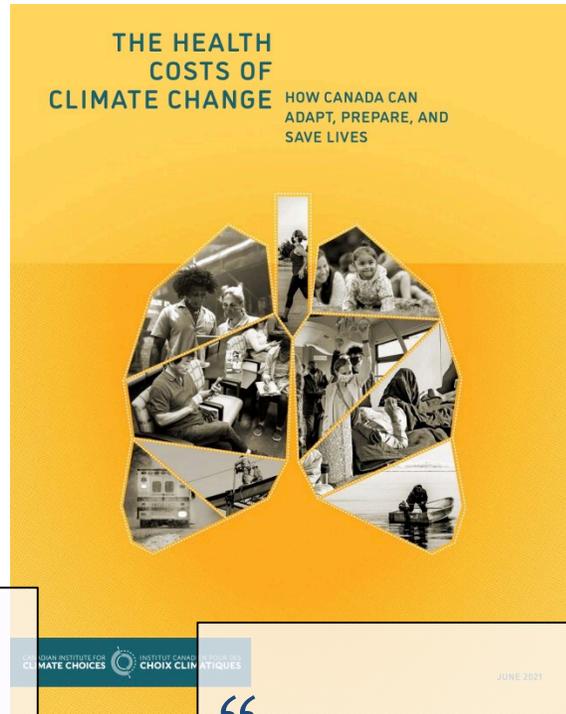
# Big questions for the future of Canadian cities

- How to steer investments in urban infrastructure towards **better health and equity for all** Canadians?
- What **environmental risks are most responsible for Canada's chronic disease burden** and for who, at what ages are policy interventions most effective or conversely less likely to reverse or halt progression?
- How to **maximize public health benefits** in the measures taken by Canadian cities to achieve **net zero carbon** emissions and adapt to climate change?
- How best to **compile and share the environmental data** needed to address these questions and to accelerate and evaluate progress?

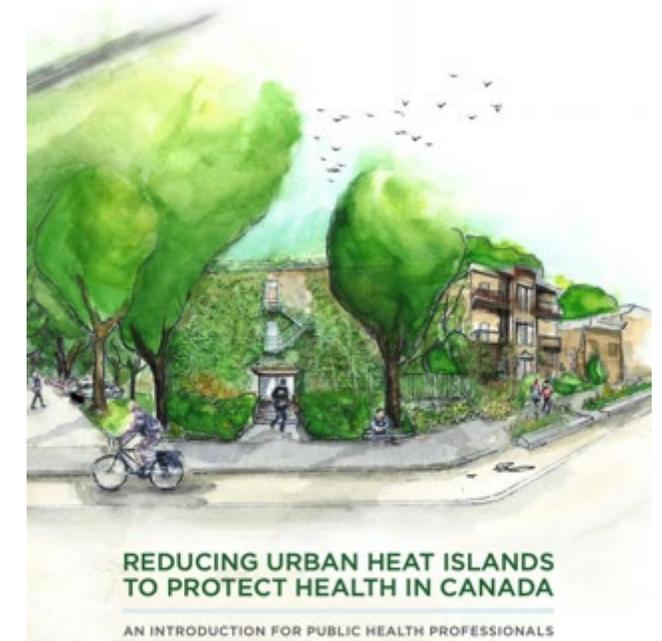
# Data are an essential element to addressing these questions



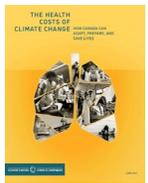
“ Standardized, open data collection would support knowledge sharing and identification of approaches that can be effective across different communities.



“ Governments should invest in research on emerging, unknown, and local climate change health impacts.



“ Evaluating the effectiveness of UHI-reduction actions to public health is important and remains an area for further work [...] There's a need for heat-health vulnerability maps to municipalities.



***“Groups that are disadvantaged because of disproportionate exposure to hazards [...] and poverty are often more vulnerable to the health risks of climate change”***



Toronto

### Finding a patch of green: COVID-19 highlights inequities in Toronto park space, experts say

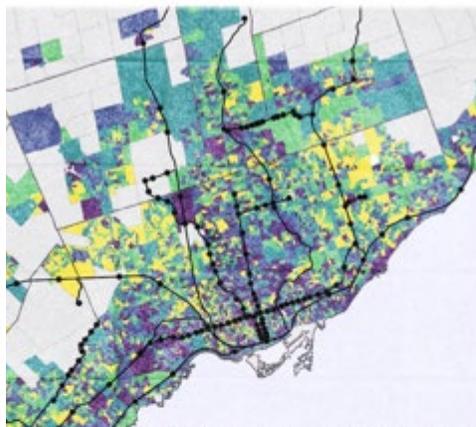


CBC analysis finds many Toronto neighbourhoods with least amount of park space per capita are downtown

Nicole Brockbank · CBC News · Posted: Jul 08, 2020 4:00 AM ET | Last Updated: July 8, 2020



The amount of nearby green space available to get outside and socialize safely can vary greatly depending on where you live in Toronto. (Evan Mitsui/CBC)

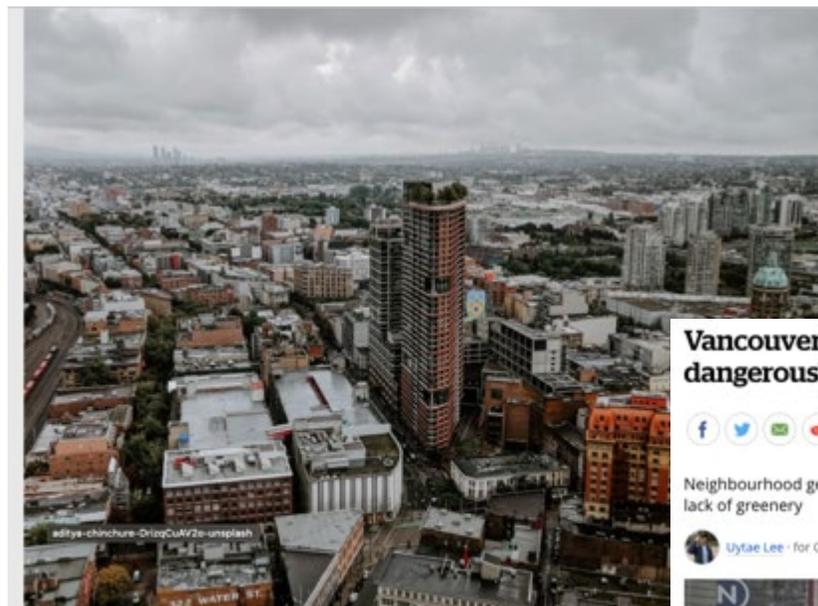


### Planning for Transit Equity in the GTHA: Quantifying the Accessibility-Activity Participation Relationship for Low-Income Households

Report prepared for Metrolinx - May 29, 2019

Dr. Steven Farber  
Assistant Professor  
Department of Human Geography  
University of Toronto, Scarborough

Jeff Allen  
PhD Student  
Department of Geography and Planning  
University of Toronto, St. George



### Vancouver's Downtown Eastside can get dangerously hot; the answer is more trees



Neighbourhood gets hotter than other parts of Metro Vancouver due to trapped heat, lack of greenery

Uytae Lee · For CBC News · Posted: Jun 18, 2019 12:22 PM PT | Last Updated: June 18, 2019

### Marginalized groups experience higher cumulative air pollution in urban Canada

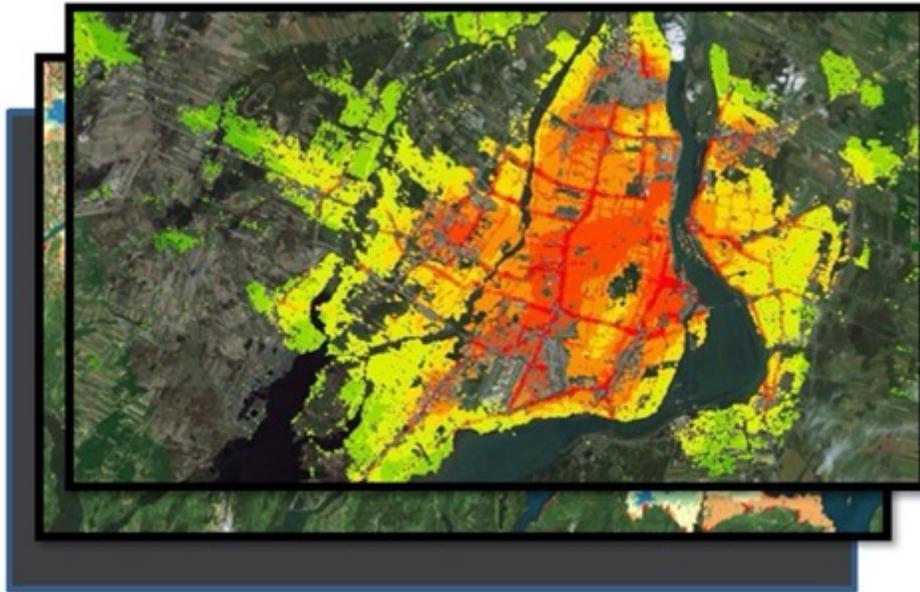
SCIENCE, HEALTH & TECHNOLOGY

Dec 21, 2020 | For more information, contact Sachintha Wickramasinghe



A summer sidewalk scene of East Hastings Street in Vancouver's Downtown Eastside, between Columbia and Carrall streets. (Rafferty Baker/CBC)

# CANUE is advancing efficient, local to national application of environmental health data



## Epidemiological studies

Is there a relationship with health? If so, how strong and who is most vulnerable?

## Population exposure surveillance

Where are the biggest issues and how many people live there? How is it this changing over time?

## Knowledge transfer /exchange to move policy

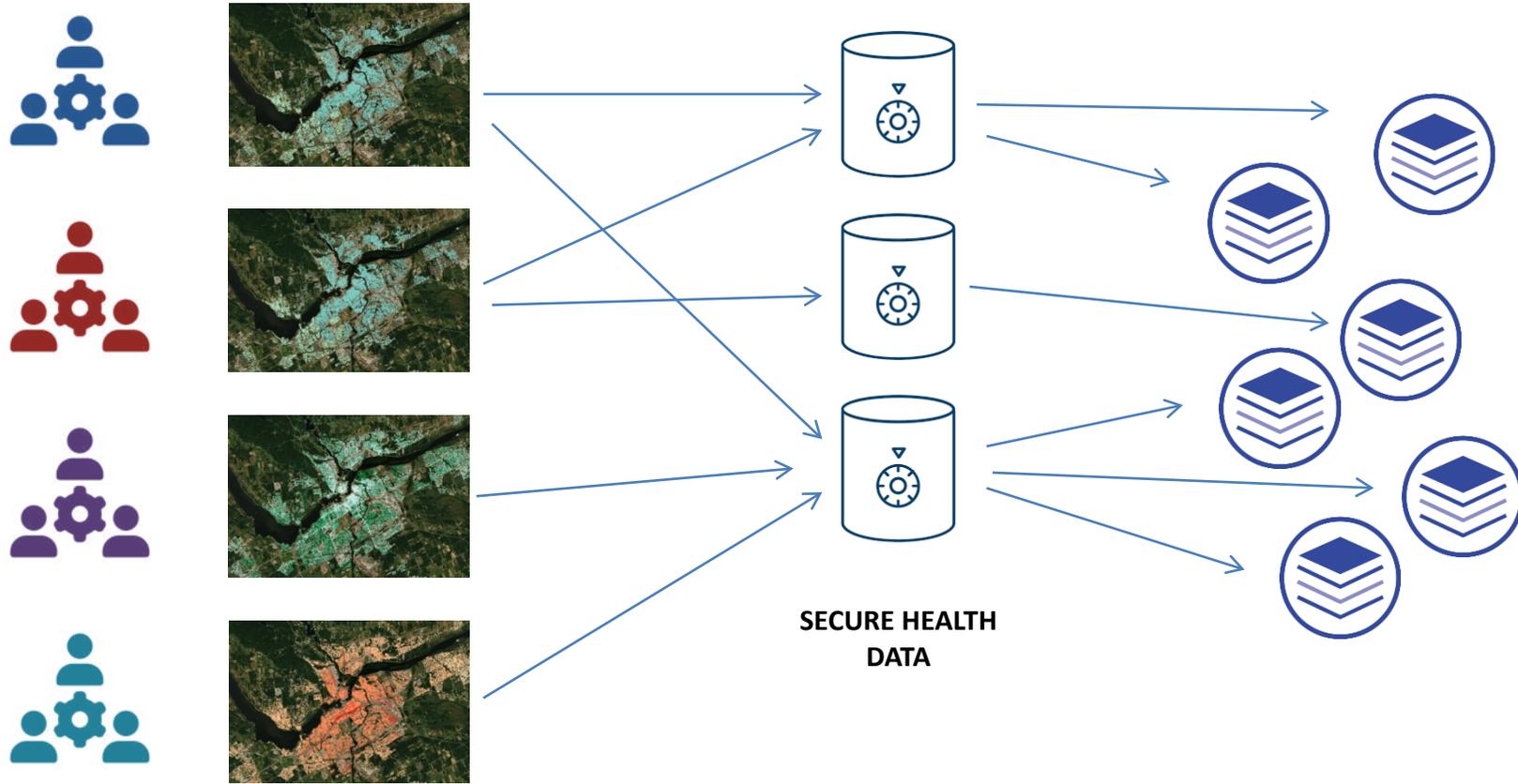
How can changes in urban form:

- improve health and equity?
- reduce or increase exposures?
- reduce healthcare costs?
- engage communities?

What investments in our cities can mitigate impacts of climate change on health?

# Environmental Health research landscape in Canada

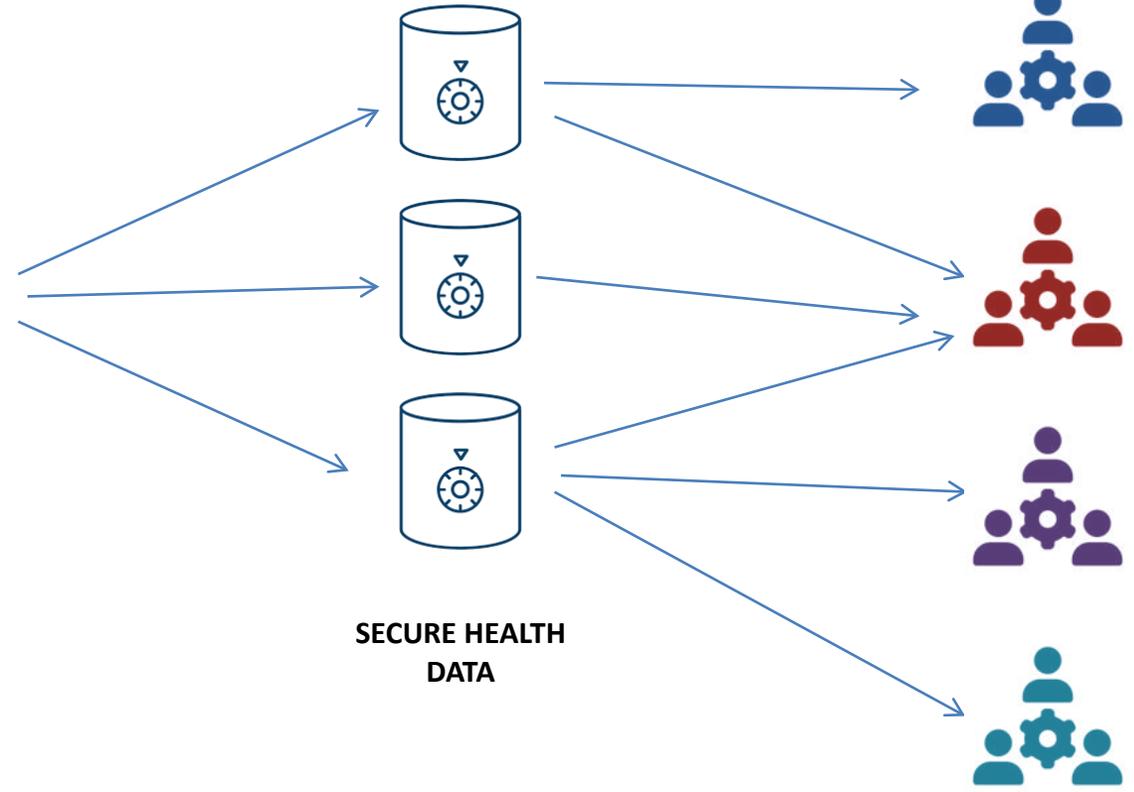
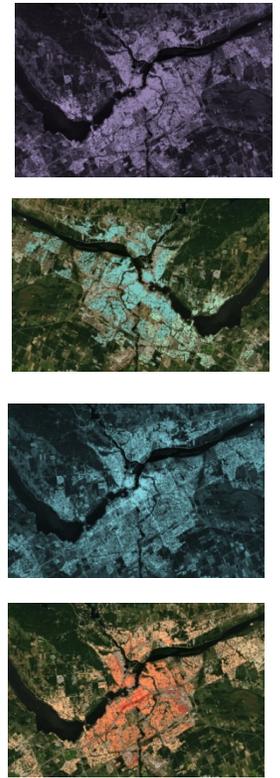
**BEFORE CANUE:** *siloes exposure data, ad hoc linkage to health databases*



- DIFFICULT TO COMPARE
- DIFFICULT TO REPRODUCE
- DIFFICULT TO REUSE
- TIME-CONSUMING or REDUNDANT LINKING

# Environmental Health research landscape in Canada

**WITH CANUE: “FAIR” data: *Findable, Accessible, Interoperable, Reusable***



-  - STANDARD METRICS
-  - STUDIES CAN BE REPRODUCED
-  - CAN BE USED BY MANY RESEARCHERS
-  - EFFICIENT FOR HEALTH DATA HOLDERS

INDEXED TO POSTAL CODES → ACADEMIC USE

# The Canadian Urban Environmental Health Research Consortium



ADVANCING RESEARCH ON URBAN LIVING AND HUMAN HEALTH

**INCREASED SCIENTIFIC UNDERSTANDING** of the interactions among the physical features of the urban environment and health will lead to cost-effective actions promoting healthy childhood development and aging, reducing the burden of chronic disease, and minimizing the impact of changing environments.

### DATA AND TOOLS

We use and develop tools to process complex data from diverse sources into a simple, easily readable common format.

### LINKING TO HEALTH

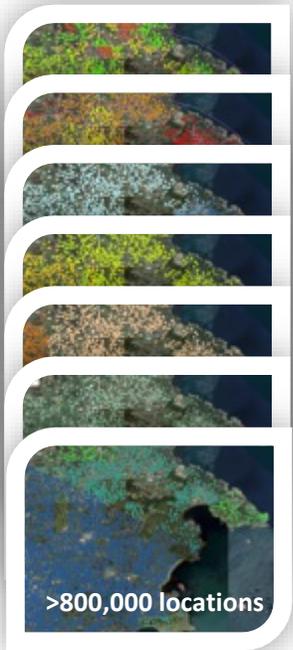
We provide data directly to researchers and a wide range of health data organizations who pre-link and distribute data securely.

### NEW CAPACITY AND EVIDENCE

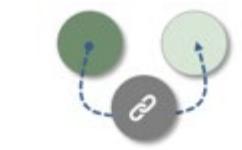
We are a pan-Canadian initiative bringing together individuals across different sectors and providing a one-stop shop for environmental exposure data in Canada.

### CANUE DATA PORTAL

- Nitrogen Dioxide
- Fine Particulates
- Sulfur Dioxide
- Ground-level Ozone
- NDVI greenness
- Nighttime Light
- Heat & Cold events
- Rain, Snow & Soil Moisture
- Local Climate Zones
- Material & Social Deprivation
- Marginalization
- Gentrification
- Active Living Index
- Access to Employment
- Ultraviolet



### HEALTH DATA PARTNERS



CANUE data are sent directly to health data organizations so researchers can have one-stop access to environmental and health data:



CANADA'S LARGEST AGING COHORT



CANADA'S LARGEST POPULATION COHORT



ADMINISTRATIVE HEALTH DATA



CANADA'S LARGEST BIRTH COHORT

We are now working on the next wave of pre-linking with Canada's wealth of census-based cohorts, surveys, and administrative health data via the Pan-Canadian Real-World Health Data Network.

> 260 members

From academia, governments, and NGOs



10 Canadian provinces



9 Countries



Multiple disciplines including data science, environmental exposure assessment, public health, urban planning, public policy and more...

### COLLABORATING NOW TO BUILD THE FUTURE

We see the future as a global living laboratory that connects international environmental health researchers and knowledge users with a common goal to increase human wellbeing. We are looking to connect with major cohorts and data initiatives around the world.



CONTACT: [info@canue.ca](mailto:info@canue.ca)

<https://canue.ca>

# CANUE Data Portal and Tools

## Canada's prime source for nationally-consistent urban environmental data



DATA PORTAL | AVAILABLE DATA | MAP BROWSER | DATA REQUEST | DATA DOWNLOAD | RESTRICTED AREA

### CANUE DATA PORTAL

ADVANCING RESEARCH ON URBAN LIVING AND HUMAN HEALTH

WELCOME TO CANUE DATA PORTAL



### DATA PORTAL

Available Data

Annual Datasets

Greenness

- 🔍 Landsat - Annual
- 🔍 Landsat - Growing Season
- 🔍 Landsat - Greenest
- 🔍 Modis - Annual Mean
- 🔍 Modis - Annual Max
- 🔍 Modis - Growing Season Mean
- 🔍 Modis - Growing Season Max
- 🔍 AVHRR - NDVI

Neighborhood

- 🔍 Active Living Environments
- 🔍 Nighttime Light
- 🔍 Material and Social Deprivation Index
- 🔍 Canadian Marginalization Index
- 🔍 Canadian Access to Employment

### DATA PORTAL

Available Data

keyword

Annual Datasets

Greenness

- 🔍 Landsat - Annual
- 🔍 Landsat - Growing Season
- 🔍 Landsat - Greenest
- 🔍 Modis - Annual Mean

Greenness - Landsat - Annual (Annual Dataset)

Dataset Description

Data Source and Quality Assessment

Data Use Conditions

Support Documentation

Variables

Maintenance and Contact

#### Description:

Top of Atmosphere (TOA) reflectance data in bands from the USGS Landsat 5 and Landsat 8 satellites were accessed via Google Earth Engine. CANUE staff used Google Earth Engine functions to create cloud free annual growing season composites, and mask water features, then export the resulting band data. NDVI indices for each time period were then calculated as (band 4 - Band 3)/(Band 4 + Band 3) for Landsat 5 data, and as (band 5 - band 4)/(band 5 + band 4) for Landsat 8 data. Annual maximum NDVI calculated by Google from Landsat 5 and Landsat 8 were also accessed via Google Earth Engine. These composites are created from all the scenes in each annual period beginning from the first day of the year and continuing to the last day of the year. All the images from each

#### Geographic Coverage:

65.14N, -141.02W



41.68S, -52.62E

Coordinate System: Geographic Coordinate System

Datum: WGS84

Type: Point Unit: Decimal Degree

EPSG: 4326

#### Geometry Data Source:

DMTI Spatial Inc. postal codes

Greenness - Landsat - Annual (Annual Dataset)

Dataset Description

Data Source and Quality Assessment

Data Use Conditions

Support Documentation

Variables

Maintenance and Contact

#### Variables:

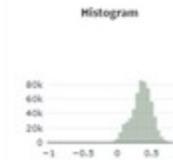
- 🔍 Annual Mean Value at Postal Code
- 🔍 Annual Mean of Means 100m
- 🔍 Annual Mean of Means 250m
- 🔍 Annual Mean of Means 500m
- 🔍 Annual Mean of Means 1000m
- 🔍 Annual Max of Means 100m
- 🔍 Annual Max of Means 250m
- 🔍 Annual Max of Means 500m
- 🔍 Annual Max of Means 1000m

Year	1984	1985	1986	1987	1988	1989	1990	1991	1992	1993	1994
1995	1996	1997	1998	1999	2000	2001	2002	2003	2004	2005	
2006	2007	2008	2009	2010	2011	2012	2013	2014	2015	2016	

VIEW MAP

CRLANS4\_01 - Annual Mean Value at Postal Code

Annual mean NDVI at postal code (range -1 to 1)



#### Summary

Total Number of Postal Codes:	572927
Postal Codes with Value:	572374
Postal Codes with No Data:	553
Min Value:	-1.00
Max Value:	0.79
Average:	0.36

Variable Type: Numeric

#### % of Postal Codes with Value (blue) and No Data (red)



# New Canadian-specific evidence in urban environmental health



From **2017 to 2021**  ... **> 250** Data requests  ... **> 80** scientific publications  **12** MSc and PhD theses

## Environment-health association studies

**Urban greenness and mortality in Canada's largest cities: a national cohort study**  
 THE LANCET Planetary Health  
 Dan L. Coarse, Lauren Pinault, Adèle Balram, Perry Hystad, Paul A. Peters, Hong Chen, Aaron van Donkelaar, Randall V. Martin, Richard M. Martin, Alain Robichaud, Paul J. Villeneuve

**Ambient air pollution and incidence of early-onset paediatric type 1 diabetes: A retrospective population-based cohort study**  
 Michael Elten, Jessy Donelle, Isaac Lima, Richard T. Burnett, Scott Weichenthal, Paul M. Stieb, Perry Hystad, Aaron van Donkelaar, Hong Chen, Isaac Lima, Sharon Dell

**Landscape and Urban Planning**  
 Research Paper  
**Greenspace access does not correspond to nature exposure: Measures of urban natural space with implications for health research**  
 Ingrid Jarvis, Sarah Gergel, Mieke Koehoorn, Matilda van den Bosch

**Early life exposure to air pollution and incidence of childhood asthma, allergic rhinitis and eczema**  
 Teresa To, Jingjin Zhu, Dave Stieb, Natasha Gray, Ivy Fong, Lauren Pinault, Michael Jerrett, Alain Robichaud, Richard M. Martin, Aaron van Donkelaar, Randall V. Martin, Paul J. Villeneuve, Scott Weichenthal, Jeffrey R. Brook and Sharon Dell

**Low concentrations of fine particle air pollution and mortality in the Canadian Community Health Survey cohort**  
 Tanya Christaki, Anders C. Ericsson, Amanda J. Papp, Daniel L. Coarse, Lauren L. Pinault, Scott A. Weichenthal, Jeffrey R. Brook, Aaron van Donkelaar, Perry Hystad, Randall V. Martin, Michael Tjepkema, Richard T. Burnett and Michael Brauer

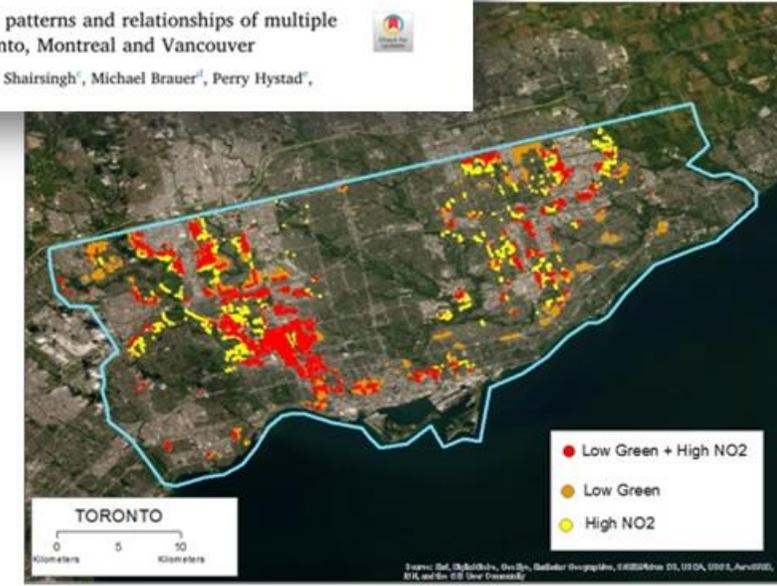
**Road proximity, air pollution, noise, green space and neurologic disease incidence: a population-based cohort study**  
 Wilson Yuchi, Hind Stah, Hugh Davies, Ullan Tamburic and Michael Brauer

**Complex relationships between greenness, air pollution, and mortality in a population-based Canadian cohort**  
 Dan L. Coarse, Lauren Pinault, Adèle Balram, Michael Brauer, Richard T. Burnett, Randall V. Martin, Aaron van Donkelaar, Paul J. Villeneuve, Scott Weichenthal

## Environmental equity research

Contents lists available at ScienceDirect  
**Environment International**  
 journal homepage: [www.elsevier.com/locate/envint](http://www.elsevier.com/locate/envint)

**Healthy built environment: Spatial patterns and relationships of multiple exposures and deprivation in Toronto, Montreal and Vancouver**  
 Dany Doiron, Eleanor M. Setton, Kerolyn Shairsingh, Michael Brauer, Perry Hystad, Nancy A. Ross, Jeffrey R. Brook

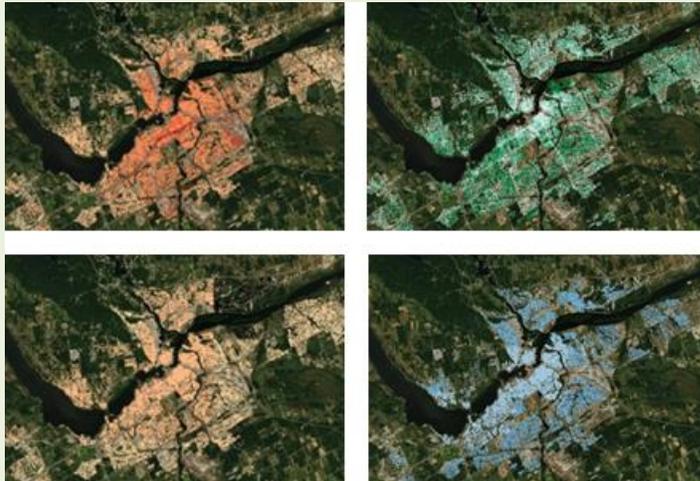


# HealthyDesign.city: leveraging CANUE data for “actionable” tools



**CANUE**

Nationally-standardized  
datasets



## Healthy Design .City

TOOLS THAT SUPPORT AN EQUITABLE  
AND HEALTHY BUILT ENVIRONMENT

Supported by:



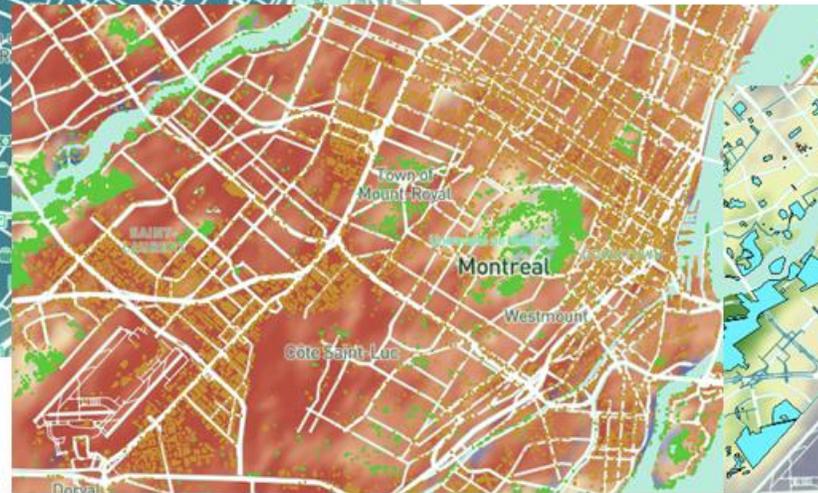
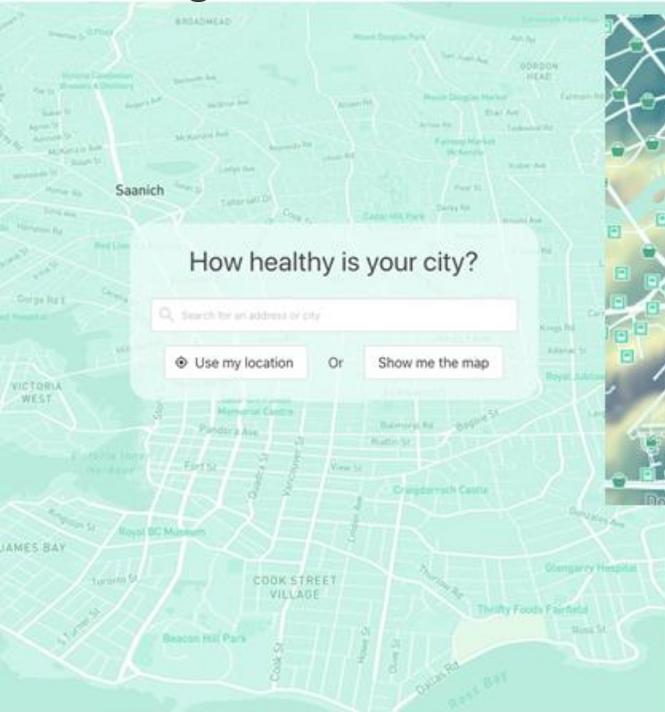
Public Health  
Agency of Canada

Agence de la santé  
publique du Canada

Enhanced Surveillance for Chronic  
Disease Program (ESCDP)

## HealthyPlace.City

- **Aim:** Communication, public engagement, awareness
- **Audience:** Public health professionals, community organizations, members of the public



## HealthyPlan.City

- **Aim:** Analysis and reporting tool with a focus on equity
- **Audience:** Public health professionals, urban planners, policy makers

# HealthyDesign.City: Built environment characteristics and equity

## Built Environment Characteristics



### Amenities

Diversity of destinations to walk/bike to:

- Schools
- Services
- Shopping



### Heat

Heat modifying built environment features:

- Large buildings and pavement
- Tree canopy and large water bodies



### Parks and Recreation

Infrastructure that promotes physical activity:

- Recreation centres
- Parks
- Non-car pathways

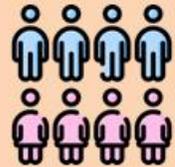


### Noise and air pollution

Point sources and continuous surfaces:

- Traffic-related pollution
- Noise

## Demographic Characteristics



### Populations

- Male/Female
- Under 15/Over 65
- Unemployed/Low-Income/Rent >30% of income
- Indigenous identity
- Visible minority

## Reporting Areas



### Reporting Areas

- National
- Large, Medium and Small Cities

# HealthyDesign.City: Timeline

March 2021 – December 2021

- Review data options
- Prioritize indicators
- Review/prioritize existing KT
- Select tool functions

July - December 2022

- Review feedback and results of UX testing
- Address pain points
- Improve usability

**Develop tools**

**User testing**

**Refine Tools**

**Final Tools**

January 2022

- Recruit ~100 users (50 per tool)
- Conduct one-to-one UX testing
- Determine pain points
- Feedback and recommendations

January 2023

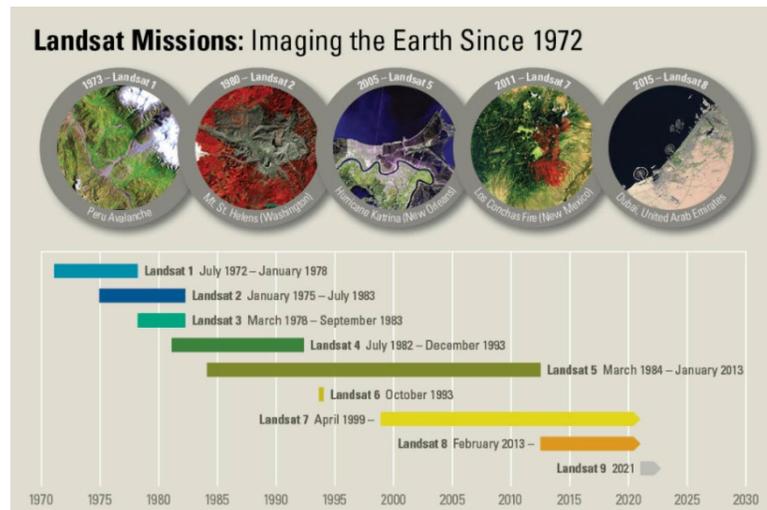
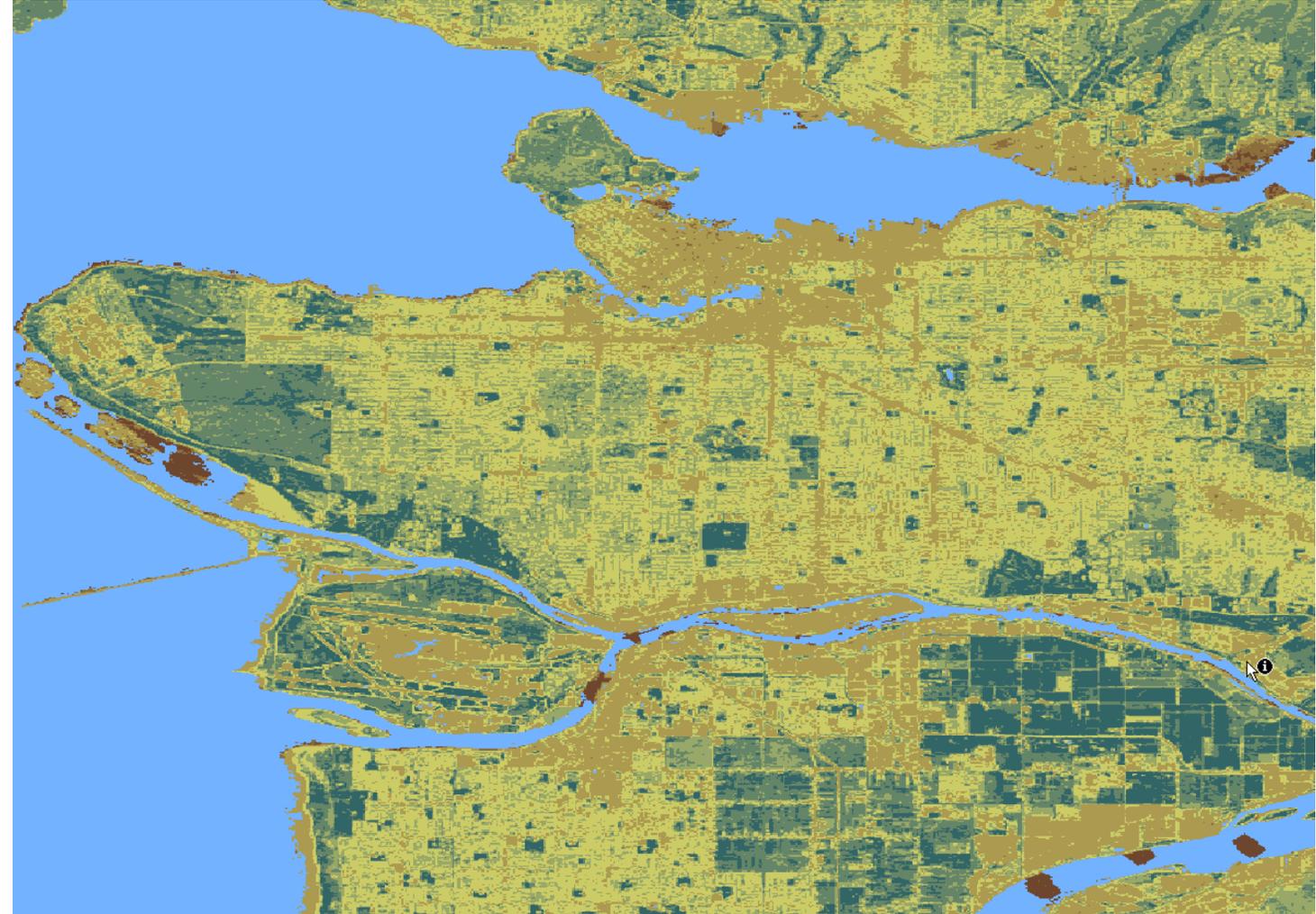
# New frontiers for urban data

Standardized data are powerful!

Example: satellite-based 'greenness' measures (NDVI)

Globally available, consistent metric, high spatial resolution

10,000+ peer-reviewed journal articles related to 'greenness' + 'health' + 'NDVI' since 2010



# New frontiers for urban data



Street level imagery from mobile cameras – Google Street View

Researchers/data developers can virtually visit locations and characterize kinds of green (trees, grass, etc) as well as vehicles, types of building, people, etc.

1000+ per-reviewed journal articles related to ‘Google Street View’ + ‘virtual’ + ‘audit’ since 2010

[HTML] Developing and testing a street audit tool using Google Street View to measure environmental supportiveness for physical activity  
 P Griev, M Hillsdon, C Foster ... - International ... 2013 - [ibnpa.biomedcentral.com](#)  
 ... Download PDF. Research, Open Access. Published: 23 August 2013.  
 Developing and testing a street audit tool using Google Street View to measure environmental supportiveness for physical activity ...  
 ☆ 99 Cited by 134 Related articles All 24 versions 80

The promise, practicalities, and perils of virtually auditing neighborhoods using Google Street View  
 MDM Bader, SJ Mooney, B Bennett ... - The ANNALS of the ... 2017 - [journals.sagepub.com](#)  
 ... Format, Tips on citation download. Download Citation. Download article citation data for: The Promise, Practicalities, and Perils of Virtually Auditing Neighborhoods Using Google Street View.  
 Michael DM Bader, Stephen J. Mooney, Blake Bennett, and Andrew G. Rundle ...  
 ☆ 99 Cited by 43 Related articles All 4 versions

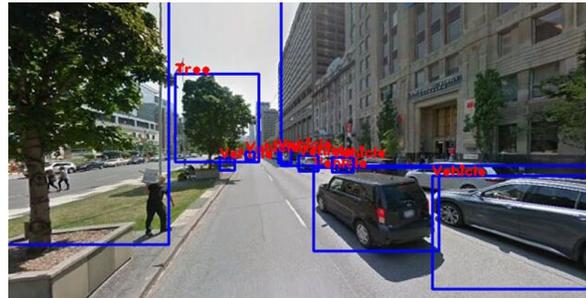
[HTML] Using Google Street View to audit neighborhood environments  
 AG Rundle, MDM Bader, CA Richards ... - American journal of ... 2011 - Elsevier  
 ... Using Google Street View, researchers can conduct ‘virtual’ field audits of neighborhoods ... 31  
 Street View audits can be implemented in multiple cities from one central location, eliminating travel costs as well as concerns about intrusiveness and research staff safety ...  
 ☆ 99 Cited by 480 Related articles All 13 versions

[HTML] Assessing the micro-scale environment using Google Street View: the virtual systematic tool for evaluating pedestrian streetscapes (virtual-STEPS)  
 M Steinmetz-Wood ... - BMC public ... 2019 - [bmcpublihealth.biomedcentral.com](#)  
 ... audits with the enviable properties of cost-efficiency from elimination of travel time and increased safety for auditors. This study examined the reliability of the Virtual Systematic Tool for Evaluating Pedestrian Streetscapes (Virtual-STEPS), a Google Street View-based auditing ...  
 ☆ 99 Cited by 15 Related articles All 14 versions 80

[HTML] Built environment and violent crime: An environmental audit approach using Google Street View  
 L He, A Pérez, D Liu - Computers, Environment and Urban Systems, 2017 - Elsevier  
 ... we proceed to analyze the spatial filter to select sites for virtual environmental audits ... Built environment. Violent crime. Spatial filtering. Environmental audit. Google Street View ... Second, most conventional environmental audits involve on-site observations (Edwards et al., 2013) ...  
 ☆ 99 Cited by 37 Related articles All 3 versions

# New frontiers for urban data

## High resolution imagery + deep learning



**Image classification** – images are grouped into classes, and then used for training a neural network to recognize each class.

e.g. high/low quintiles of ambient air pollution, socio-economic factors

**Object detection** - the number of features in an image are identified

**Image segmentation** – the percent pixel coverage of a feature is calculated

e.g. road, sidewalk, building, wall, fence, pole, traffic light, traffic sign, vegetation, terrain, sky, person, rider, car, truck, bus, train, motorcycle, bicycle

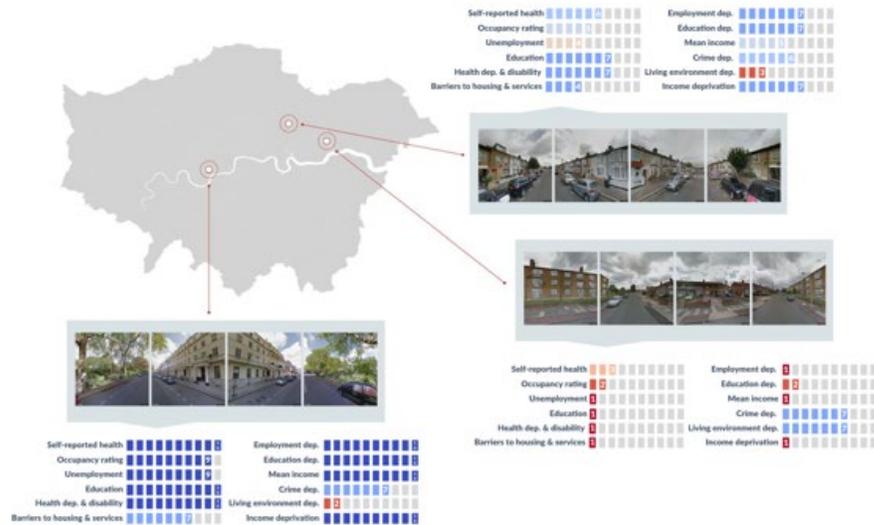
# New frontiers for urban data

## SCIENTIFIC REPORTS

**OPEN** Measuring social, environmental and health inequalities using deep learning and street imagery

vol: 14 November 2018

Esra Suel<sup>1,2,3</sup>, John W. Polak<sup>3,4</sup>, James E. Bennett<sup>1,2</sup> & Majid Ezzati<sup>1,2,3</sup>

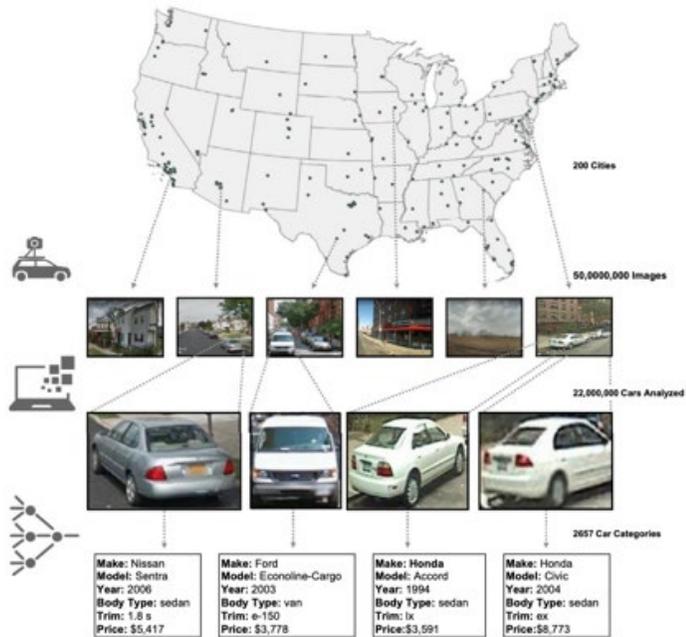


PNAS

## Using deep learning and Google Street View to estimate the demographic makeup of neighborhoods across the United States

Timnit Gebru<sup>1</sup>, Jonathan Krause<sup>2</sup>, Yilun Wang<sup>3</sup>, Duyun Chen<sup>3</sup>, Jia Deng<sup>3</sup>, Erez Lieberman Aiden<sup>4,5\*</sup>, and Li Fei-Fei<sup>6\*</sup>

<sup>1</sup>Artificial Intelligence Laboratory, Computer Science Department, Stanford University, Stanford, CA 94305; <sup>2</sup>Vision and Learning Laboratory, Computer Science and Engineering Department, University of Michigan, Ann Arbor, MI 48109; <sup>3</sup>The Center for Genome Architecture, Department of Genetics, Baylor College of Medicine, Houston, TX 77030; <sup>4</sup>Department of Computer Science, Rice University, Houston, TX 77005; and <sup>5</sup>The Center for Genome Architecture, Department of Computational and Applied Mathematics, Rice University, Houston, TX 77005

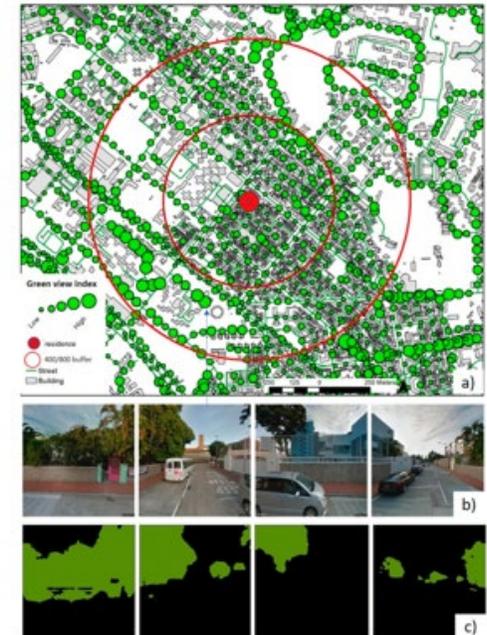


International Journal of Environmental Research and Public Health

MDPI

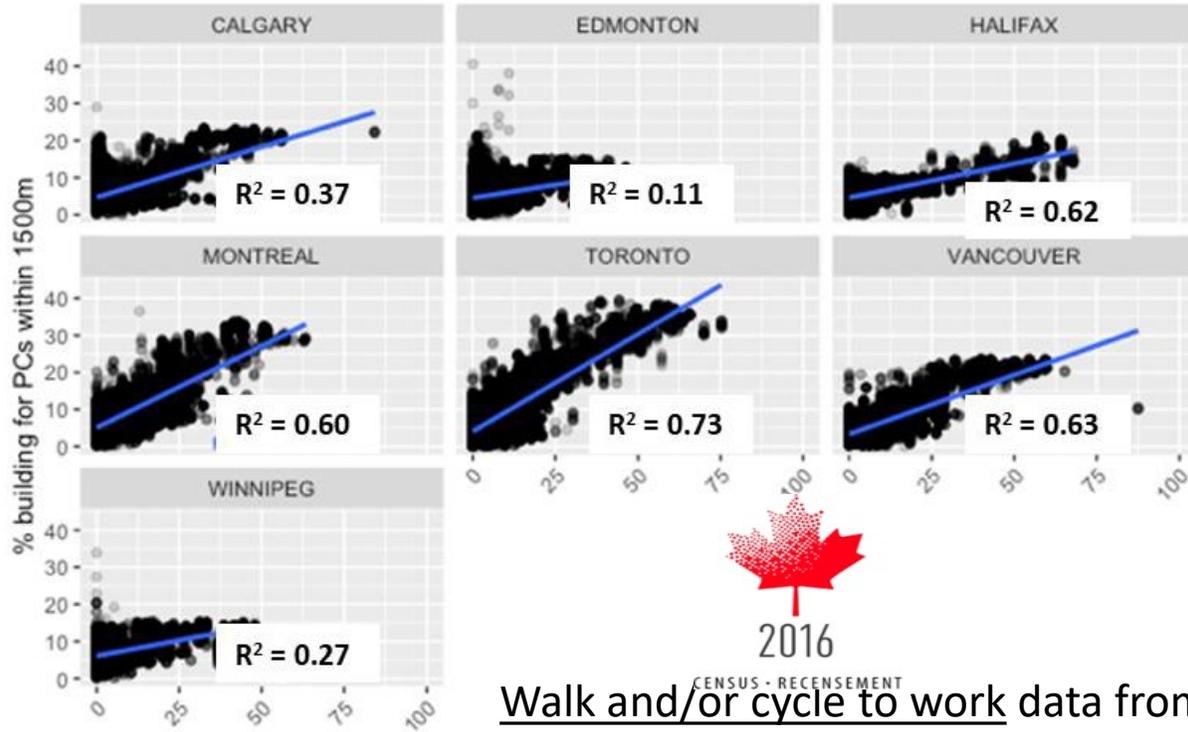
## The Association of Urban Greenness and Walking Behavior: Using Google Street View and Deep Learning Techniques to Estimate Residents' Exposure to Urban Greenness

Yi Li



# New frontiers for urban data

% walk to work and 'building' pixel coverage



Walk and/or cycle to work data from Canadian Census data in 7 large Canadian cities

Based on 5 million GSV images

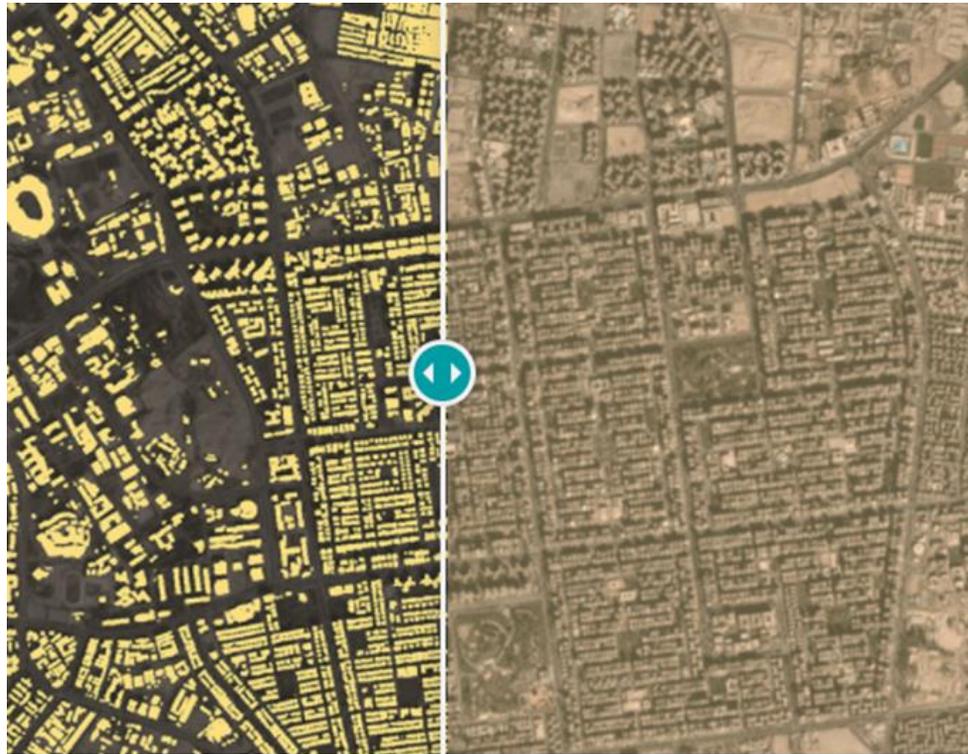
Ranking images in HealthyPlace.City

This place is....

- Clean
- Safe
- Fun
- Relaxing
- ...



# New frontiers for urban data



Building footprints for North America freely available

Increasing resolution of satellite imagery and more frequent (but very expensive still)

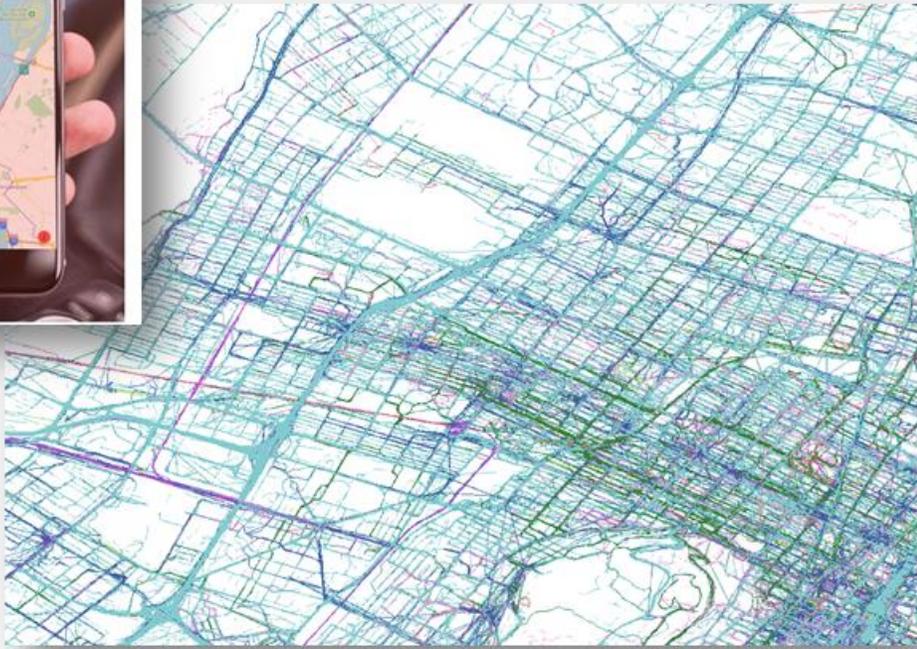


# New frontiers for urban data

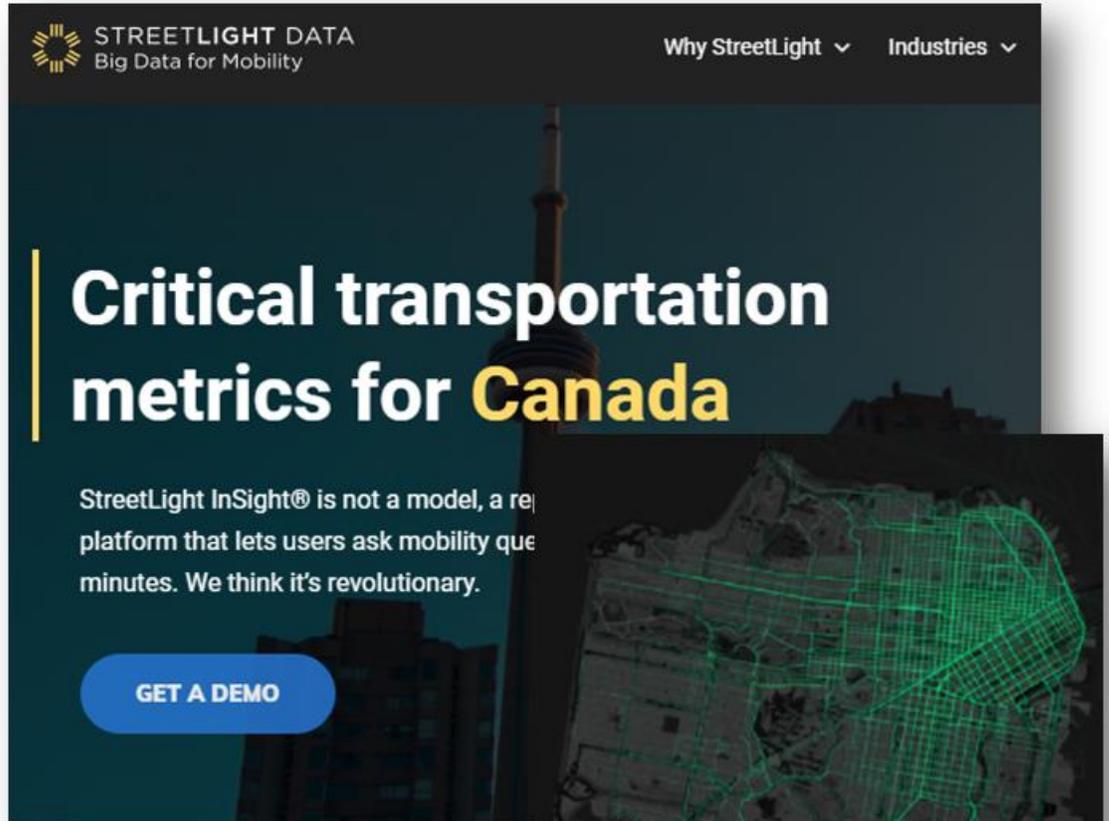
## Mobile data!



Special apps



By mode



The image is a screenshot of the StreetLight Data website. At the top, it says 'STREETLIGHT DATA Big Data for Mobility' with a logo of a sunburst. To the right are navigation links for 'Why StreetLight' and 'Industries'. The main headline reads 'Critical transportation metrics for Canada', with 'Canada' in yellow. Below the headline is a paragraph: 'StreetLight InSight® is not a model, a replacement platform that lets users ask mobility questions in minutes. We think it's revolutionary.' At the bottom of the text area is a blue button that says 'GET A DEMO'. The background of the website features a cityscape at night with a glowing green network map overlaid on it.

Mass aggregation of data by agreements with cell companies

## For more information visit:

CANUE website: [www.canue.ca](http://www.canue.ca)

CANUE data portal: [www.canuedata.ca](http://www.canuedata.ca)

HealthyDesign.City website: [healthydesign.city](http://healthydesign.city)



The Canadian Urban Environmental Health Research Consortium  
advancing research on urban living and human health