

# The Urban Toolkit: A Grammar-based Framework for Urban Visual Analytics

**Gustavo Moreira, University of Illinois Chicago**

Maryam Hosseini, Massachusetts Institute of Technology

Md Nafiul Alam Nipu, University of Illinois Chicago

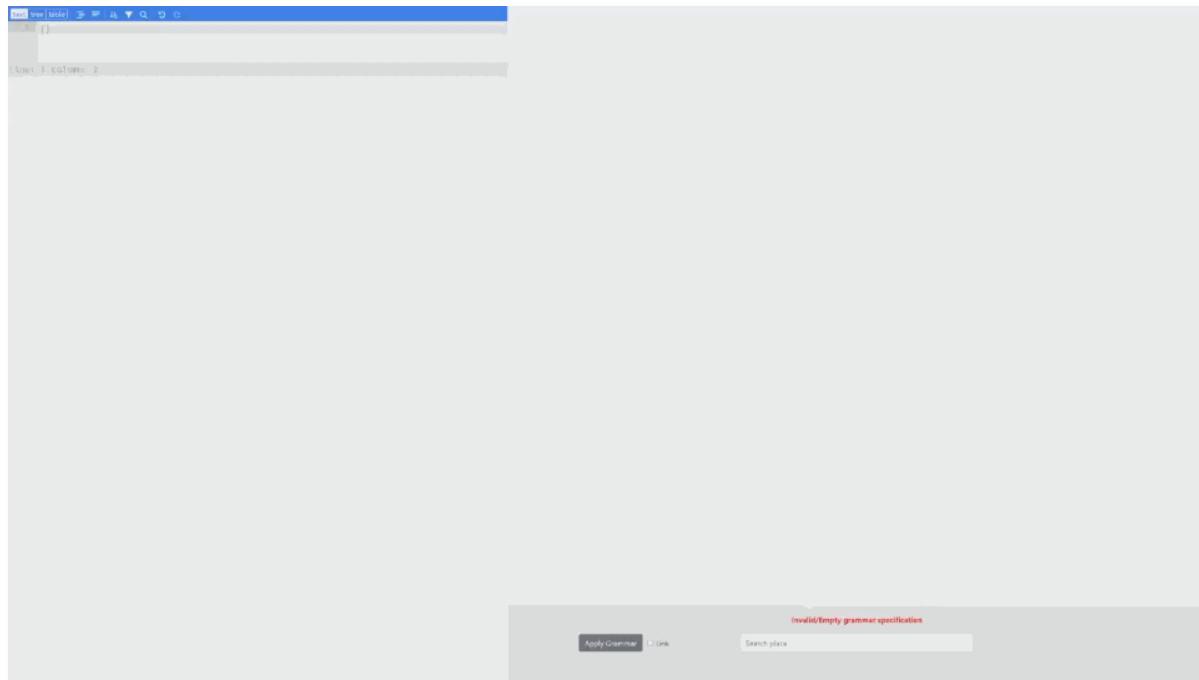
Marcos Lage, Universidade Federal Fluminense

Nivan Ferreira, Universidade Federal de Pernambuco

Fabio Miranda, University of Illinois Chicago



# The Urban Toolkit



COMPUTER SCIENCE

# Diverse data



# Diverse data



# Diverse data



# Diverse data



Occupational therapists

Urban noise experts

Transportation  
engineers

Public health experts

Environmental  
scientists

Architects

Urban planners

## Diverse users

## Diverse data



**Diverse users**

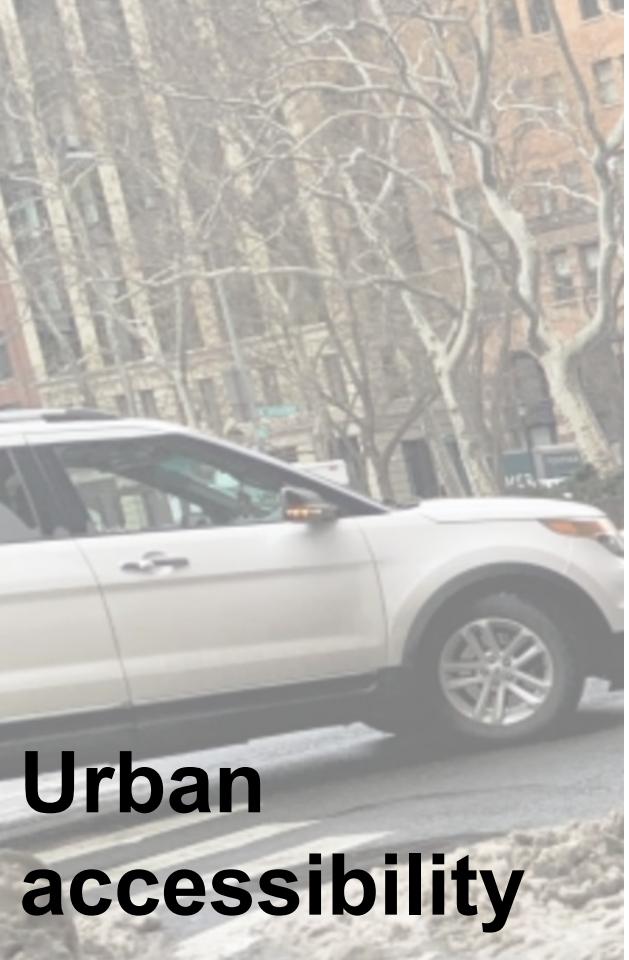
---

**Diverse data**

**Diverse problems**

---





Urban accessibility



Air and noise pollution



Sunlight access



Impact of  
climate  
change

Diverse problems

---

Diverse users

---

Diverse data



# Urban visual analytics surveys

## Visual Analytics in Urban Computing: An Overview

Xian Zheng, Wenchao Wu, Yuanzhe Chen, Huamin Qu, *Member, IEEE*, and Lionel M. Ni, *Fellow, IEEE*

**Abstract**—Nowadays, various data collected in urban context provide unprecedented opportunities for building a smarter city through urban computing. However, due to heterogeneity, high complexity and large volumes of these urban data, analyzing them is not an easy task, which often requires integrating human perception in analytical process, triggering a broad use of visualization. In this survey, we first summarize frequently used data types in urban visual analytics, and then elaborate on existing visualization techniques for time, locations and other properties of urban data. Furthermore, we discuss how visualization can be combined with automated analytical approaches. Existing work on urban visual analytics is categorized into two classes based on different outputs of such combinations: 1) For *data exploration and pattern interpretation*, we describe representative visual analytics tools designed for better insights of different types of urban data. 2) For *visual learning*, we discuss how visualization can help in three major steps of automated analytical approaches (i.e., cohort construction; feature selection & model construction; result evaluation & tuning) for a more effective machine learning or data mining process, leading to sort of artificial intelligence, such as a classifier, a predictor or a regression model. Finally, we outlook the future of urban visual analytics, and conclude the survey with potential research directions.

**Index Terms**—Urban computing, visual analytics, visualization, visual learning, spatio-temporal, multivariate

### 1 INTRODUCTION

WITH the development of science and technology, urbanization process has been accelerating worldwide, which on one hand improves people's life quality, on the other hand gives rise to serious problems, such as environmental pollution, traffic congestion and ever-increasing

quite a few issues which have not been addressed satisfactorily. Recently, Zheng et al. [3] presented a survey on urban computing, which introduced general framework, key research problems, methodologies, and applications mainly based on automated data mining approaches. However, as

> 150 papers (Zheng et al., 2016)

## A survey of urban visual analytics: Advances and future directions

Zikun Deng<sup>1</sup>, Di Weng<sup>2</sup> (✉), Shuhan Liu<sup>1</sup>, Yuan Tian<sup>1</sup>, Mingliang Xu<sup>3,4</sup>, and Yingcai Wu<sup>1</sup> (✉)

© The Author(s) 2022.

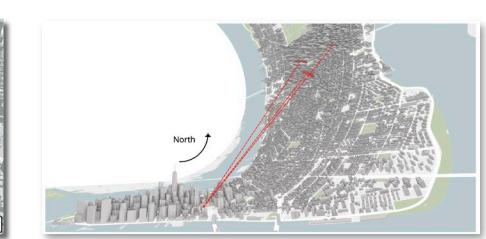
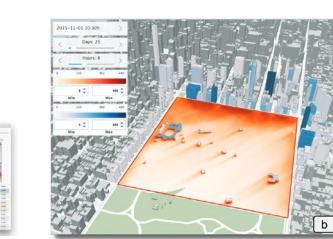
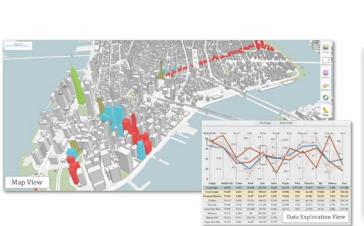
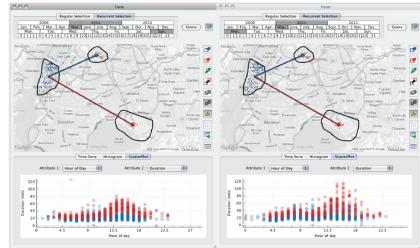
**Abstract** Developing effective visual analytics systems demands care in characterization of domain problems and integration of visualization techniques and computational models. Urban visual analytics has already achieved remarkable success in tackling urban problems and providing fundamental services for smart cities. To promote further academic research and assist the development of industrial urban analytics systems, we comprehensively review urban visual analytics studies from four perspectives. In particular, we identify 8 urban domains and 22 types of popular visualization, analyze 7 types of computational method, and categorize existing systems into 4 types based

knowledge and expertise into the analysis loop. Thus, urban visual analytics [7] is used to empower urban experts using a combination of intuitive data visualization and fast computational methods, enabling experts to visually and interactively perceive, explore, manipulate, and reason about urban data [8].

When developing an urban visual analytics approach, practitioners like urban analysts and researchers may have the following four questions:

1. Which urban *domain problems* have been solved or remain unsolved by visual analytics?
2. What *visualization* techniques have been applied to visually interpret urban data?

> 200 papers (Deng et al., 2022)



**TaxiVis**  
(Ferreira et al., 2013)

**Urbane**  
(Ferreira et al., 2015)

**Catalogue**  
(Doraiswamy et al., 2015)

**Shadow Profiler**  
(Miranda et al., 2019)

**UrbanRama**  
(Chen et al., 2020)

**UTK**  
(Moreira et al., 2023)

2014

2016

2018

2020

2022

2013

2015

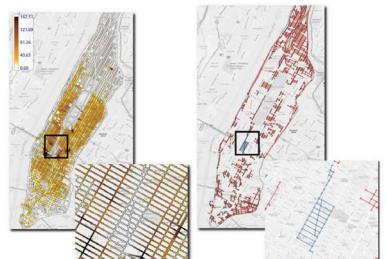
2017

2019

2021

2023

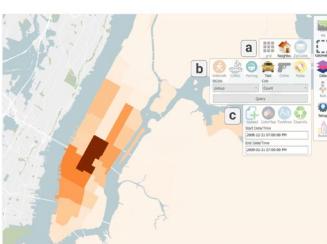
**Taxi Patterns**  
(Doraiswamy et al., 2016)



**Urban Pulse**  
(Miranda et al., 2016)



**Raster-Join**  
(Doraiswamy et al., 2018)

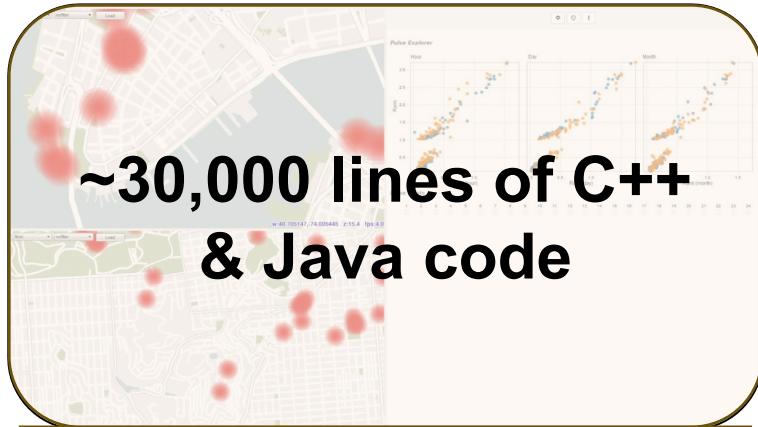


**Urban Mosaic**  
(Miranda et al., 2020)



**Urban Rhapsody**  
(Rulff et al., 2022)

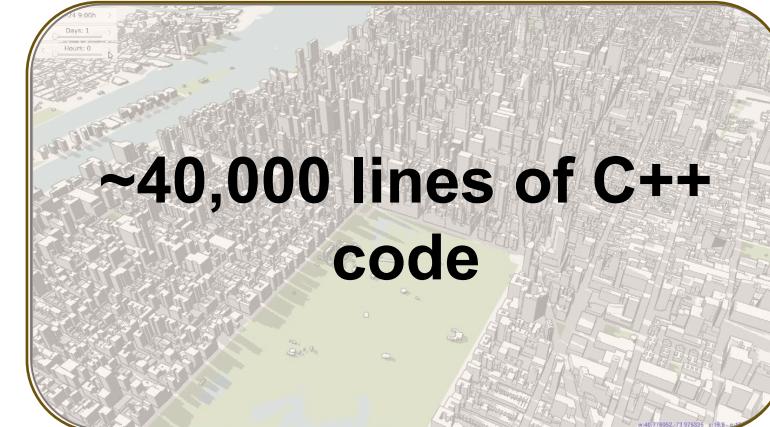




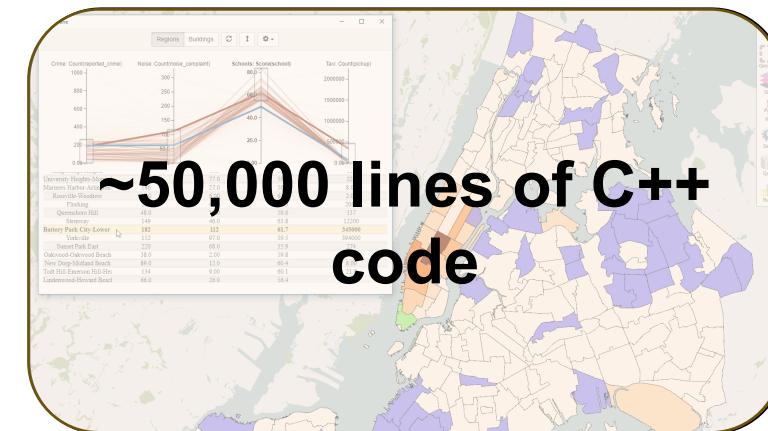
**Urban Pulse:**  
Large-scale data mining of social media data



**Urban Mosaic:**  
Interactive exploration of large imagery data



**Shadow Profiler:**  
City-scale assessment of sunlight access



**Urbane:**  
Interactive exploration of large data



# Current state of urban tools

**Lack of flexibility:**  
Tools and techniques are not translatable to other domains or regions  
(Acuto et al., 2018)

**Lack of extensibility:**  
Hard to add new functionalities needed for specific workflows  
(Lobo et al., 2020)

**Lack of reproducibility:**  
Results are rarely reproducible  
(Ziegler and Chasins, 2023)

**Lack of scalability:**  
Analyses are rarely interactive, limiting the number of hypothesis from the exploratory process  
(Ziegler and Chasins, 2023)

**Lack of accessibility:**  
Tools and techniques are often difficult to use, limiting stakeholders' ability to conduct large-scale analysis  
(Kontokosta, 2021)



How to support (1) accessible,  
(2) flexible, (3) extensible, (4)  
reproducible and (5) scalable  
tools across domains and users?



```

1 #include "UrbaneMapView.hpp"
2
3 #include <QApplication>
4 #include "../MapView/BuildingRenderingLayer.hpp"
5
6 #include "../MassingGeneration/massinggeneration.h"
7 #include "../Util/ColorMapDivergent.hpp"
8 #include "UrbaneManager.hpp"
9
10 #include <QElapsedTimer>
11 #include <QThread>
12 #include <QDir>
13
14 #include <vector>
15
16 UrbaneMapView::UrbaneMapView(const QString &filename, const QRectF &vp, QWidget *parent)
17 | : MapView(filename, vp, parent), graphLayer(NULL)
18 {
19     initialized = false;
20     skyExposureData = false;
21     this->centerIndex = GridIndex(1024, 1024);
22     this->currentLayer = NULL;
23     this->lotUpdate = true;
24 }
25
26 UrbaneMapView::~UrbaneMapView() {}
27
28 void UrbaneMapView::initializeGL() {
29     if(!initialized) {
30         MapView::initializeGL();
31         this->buildingScore.initComputeShader();
32         this->skyScore.initComputeShader();
33     }
34     initialized = true;
35 }
36
37 void UrbaneMapView::paintGL()
38 {
39     this->showOsd(false);
40
41     // Lot data initialization in manager
42     // TODO Don't know of a better place to do this
43     if(lotUpdate && this->parcelLayer->isDataReady()) {
44         updateLotDataDB();
45         lotUpdate = false;
46     }
47
48     UrbaneManager *manager = UrbaneManager::getInstance();
49     QPair<RenderingOperation, UIOperation> state = manager->getState();
50
51     RenderingOperation operation = state.first;
52     UIOperation what = state.second;
53     switch(operation) {
54     case RenderingOperation::UpdateVis:
55     {
56         bool updateFunction = false;

```



**Abstracts low-level functionalities**

**Easy access to data analytics**

**Self-contained & sharable JSON file**

**Lower the barrier for the construction of urban tools & systems**

```

1 {
2     "components": [
3         "map": {
4             "position": [-13961, -115, 149, -56, -42],
5             "direction": {
6                 "right": [946, 6354370117188, -423, 6624084472656, 497, 6396560824219],
7                 "at": [113852, 390, 162, 6354370117188, 13, 6396560824219]
8             },
9             "up": [0.0188353286012, 6.6915485185187342, 0.0188353286012]
10         },
11         "pureparks", "purewater", "pureroads", "shadowToBuildings"],
12         "interactions": ["NONE", "NONE", "NONE", "NONE"]
13     },
14     "plots": [
15         {
16             "id": "pureparks",
17             "integration_scheme": {
18                 "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "parks", "level": "OBJECTS"}
19             },
20             "knots": [
21                 {
22                     "id": "pureparks",
23                     "integration_scheme": {
24                         "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "parks", "level": "OBJECTS"}
25                     },
26                     "management": "LINKED"
27                 }
28             ]
29         },
30         {
31             "id": "purewater",
32             "integration_scheme": {
33                 "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "water", "level": "OBJECTS"}
34             },
35             "knots": [
36                 {
37                     "id": "purewater",
38                     "integration_scheme": {
39                         "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "water", "level": "OBJECTS"}
40                     },
41                     "management": "LINKED"
42                 }
43             ]
44         },
45         {
46             "id": "pureroads",
47             "integration_scheme": {
48                 "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "roads", "level": "OBJECTS"}
49             },
50             "knots": [
51                 {
52                     "id": "pureroads",
53                     "integration_scheme": {
54                         "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "roads", "level": "OBJECTS"}
55                     },
56                     "management": "LINKED"
57                 }
58             ]
59         },
60         {
61             "id": "shadowToBuildings",
62             "integration_scheme": {
63                 "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "buildings", "level": "OBJECTS"}
64             },
65             "knots": [
66                 {
67                     "id": "shadowToBuildings",
68                     "integration_scheme": {
69                         "in": {"bin": true, "field": "shadowToBuildings_abstract"}, "out": {"name": "buildings", "level": "OBJECTS"}
70                     },
71                     "management": "LINKED"
72                 }
73             ]
74         }
75     ]
76 }

```

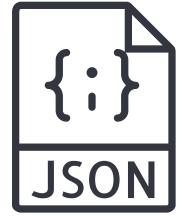




Views

— dashed line —

```
{  
  "views": [  
    {  
      "map": {  
        "camera": {  
          "position": [...],  
          "direction": {...}  
        },  
        ...  
      },  
      "plots": [...],  
      "knots": [...]  
    }  
  ]  
}
```

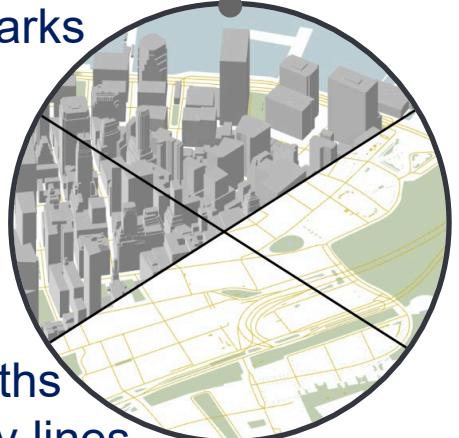


UIC COMPUTER SCIENCE



Views

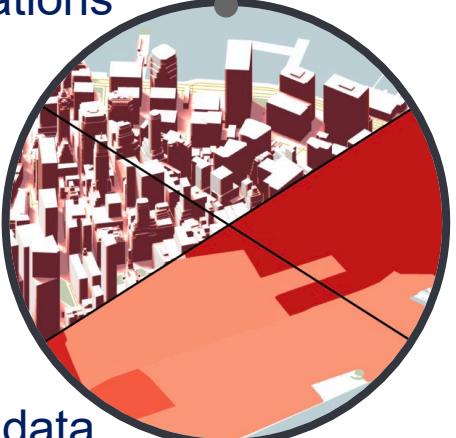
Buildings  
Landmarks



Streets  
Footpaths  
Subway lines

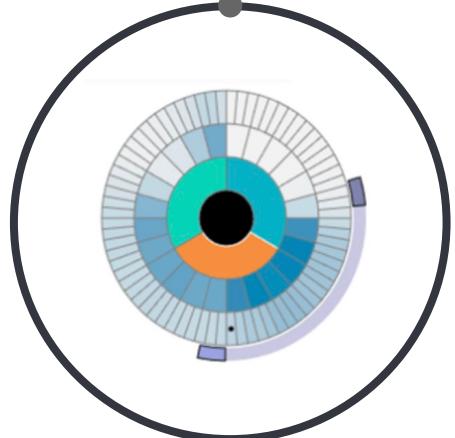
Physical layers

Simulations



Open  
urban data

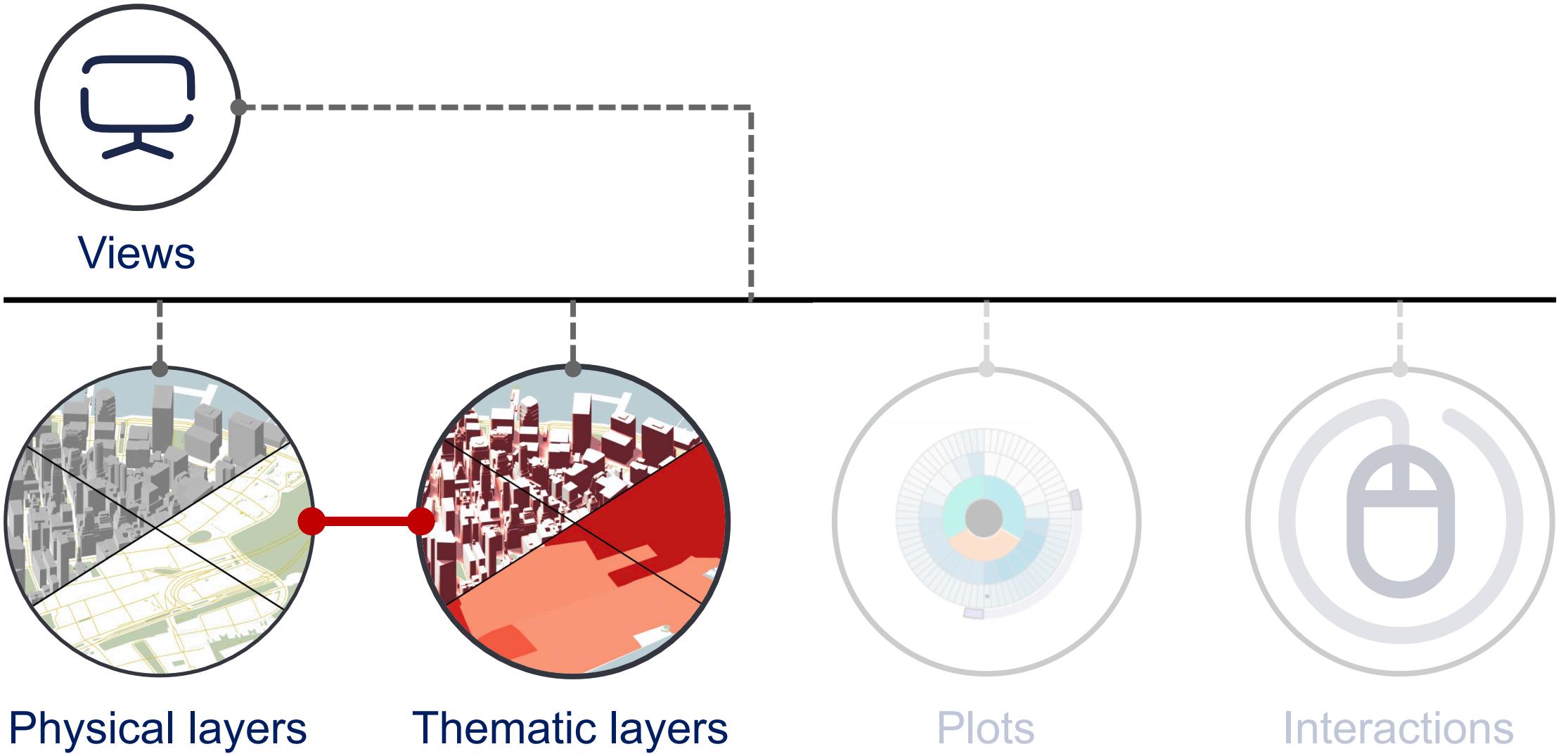
Thematic layers



Plots

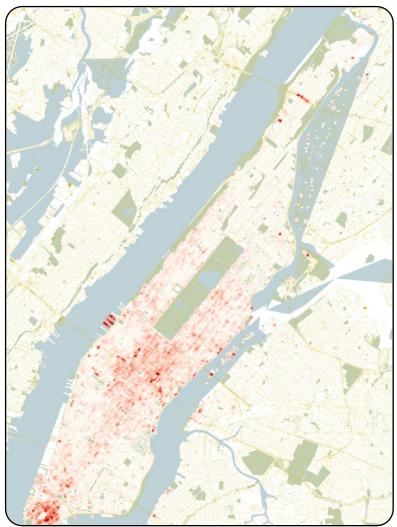


Interactions

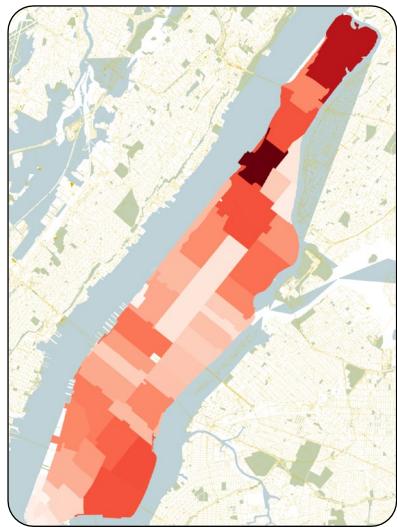




Views



Grid



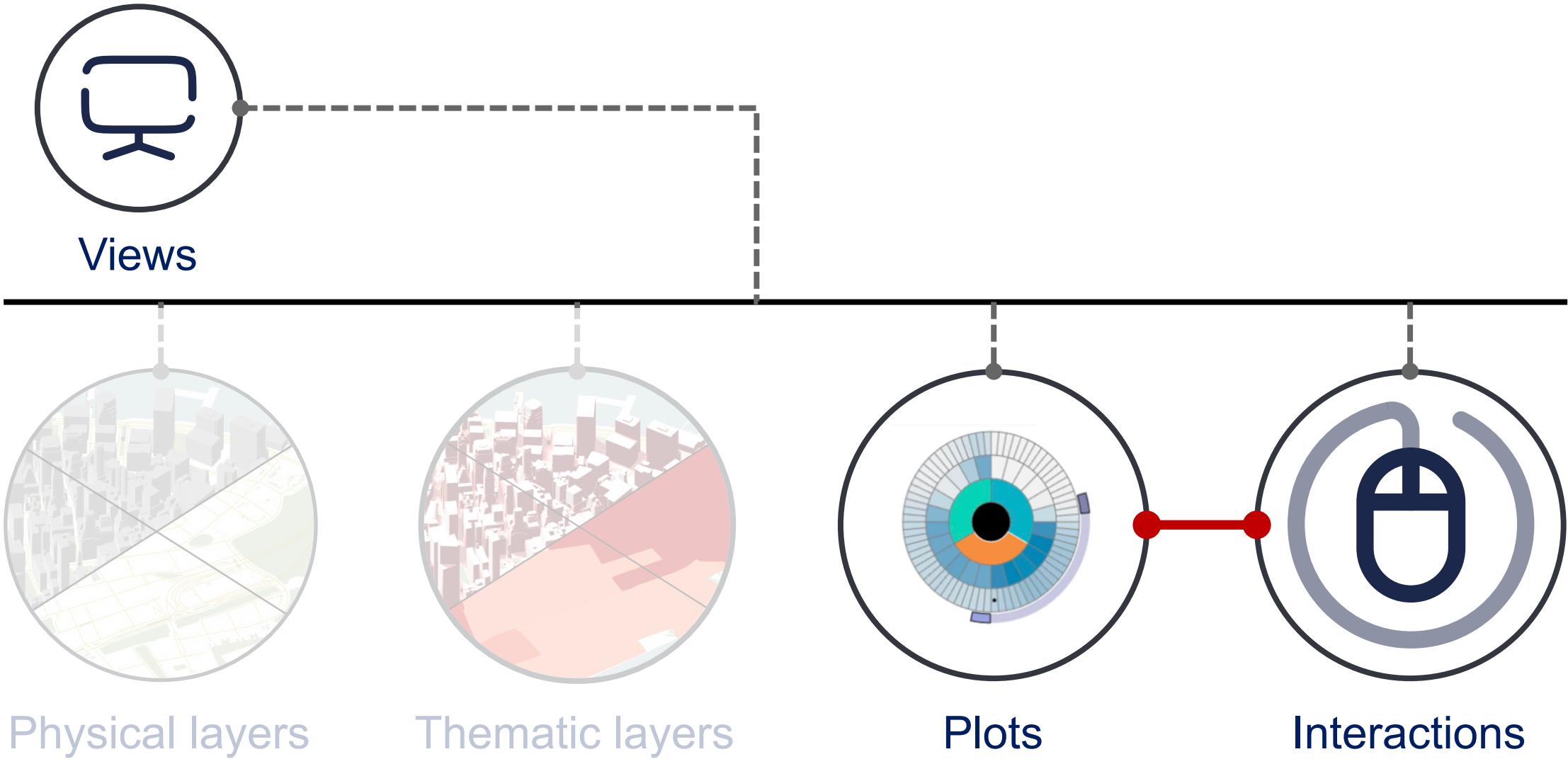
Areas



Buildings

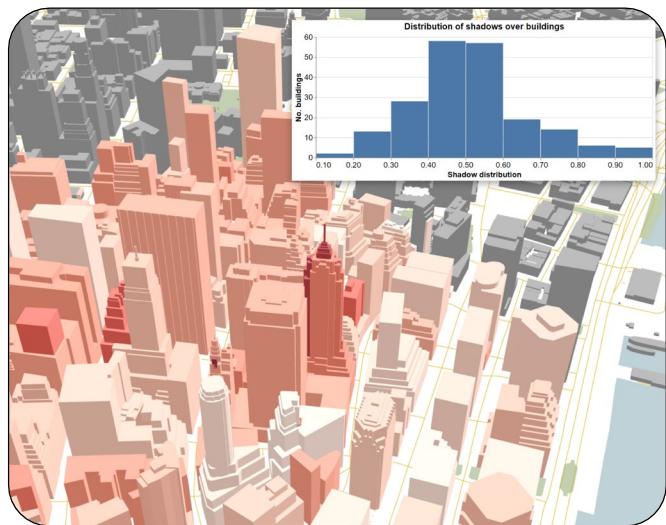


Networks



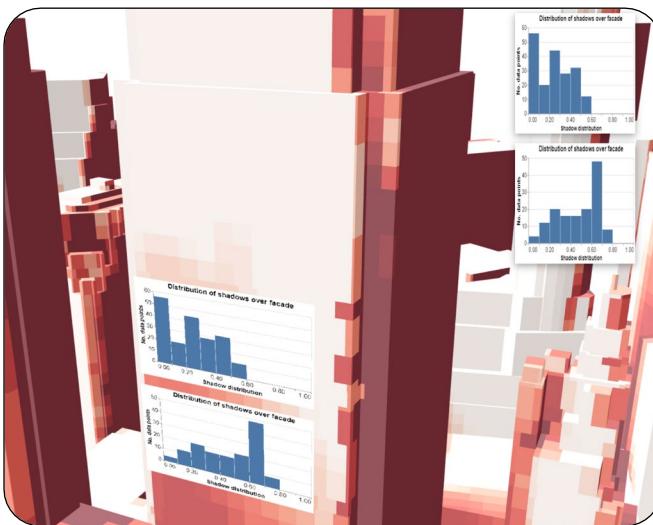


## Views

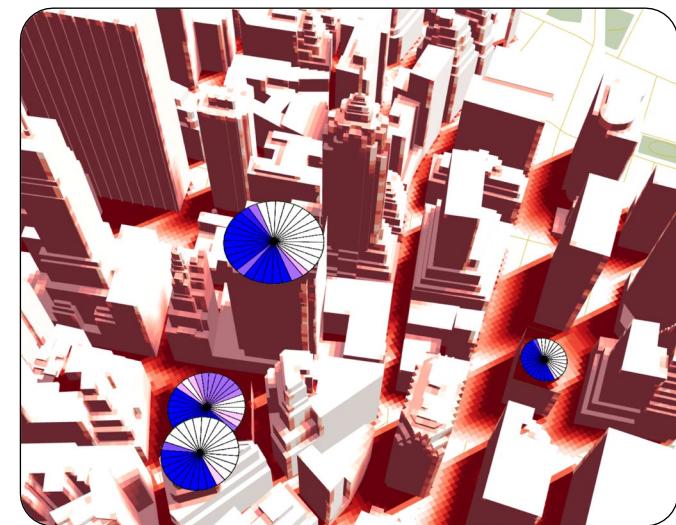


Juxtaposed

Taxonomy by Mota et al. (VIS 2022)



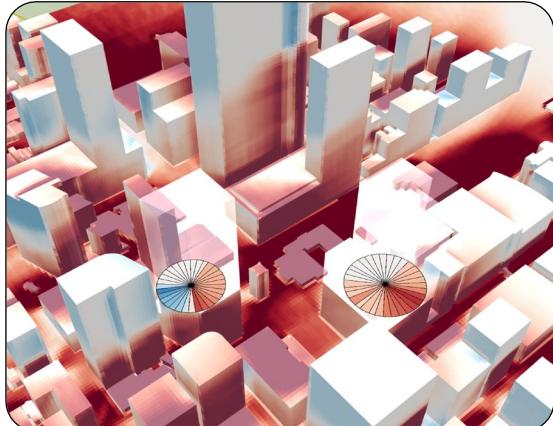
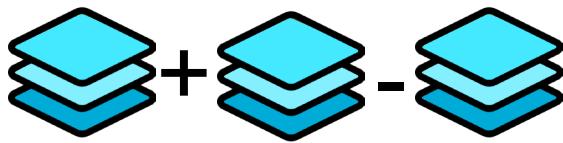
Embedded (surface)



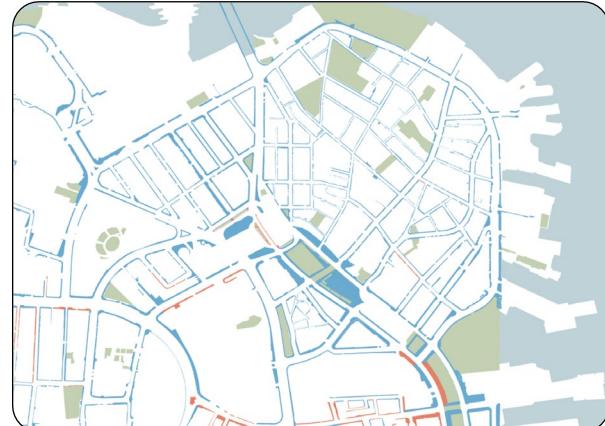
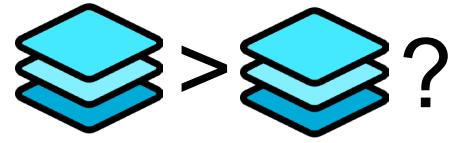
Embedded (crosscut)

# Operating with layers

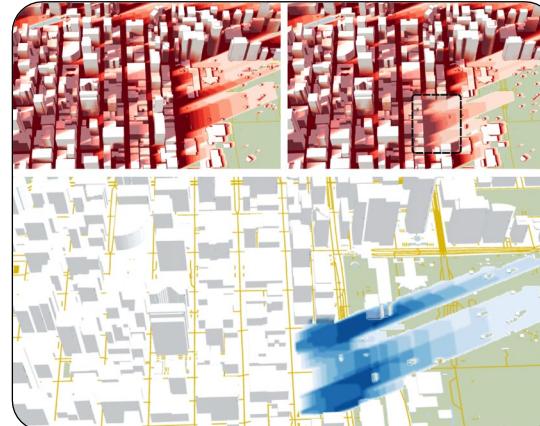
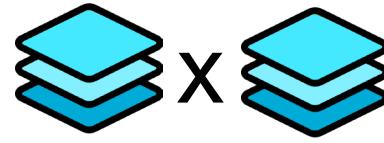
Arithmetic operations



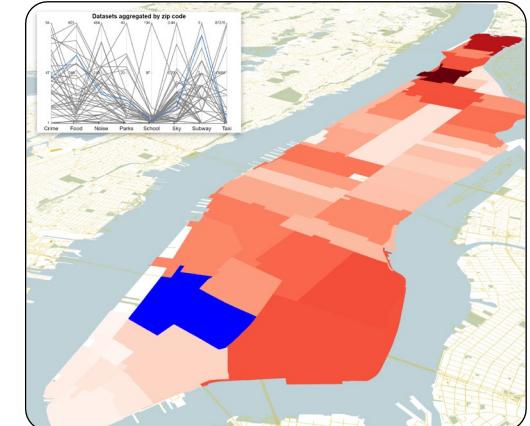
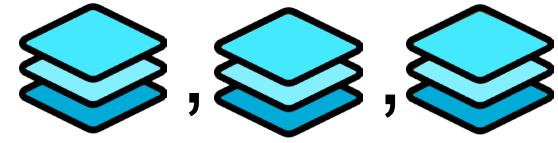
Logical operations



What-if analyses



Data exploration



Editing the  
JSON  
specification

Visualization

Invalid/Empty grammar specification

Apply Grammar



Search place

# Data functionalities

---

- Converting data: Pandas' DataFrame, GeoJSON, shapefile, CSV and Protocolbuffer Binary Format (PBF).
- Loading data: OpenStreetMap (OSM).
- Generating data: Sunlight access simulation (Miranda et al., TVCG 2018).

```
import utk
uc = utk.OSM.load('Chicago,USA', layers=['buildings'])
uc.save('chicago')
uc.view()
```

# Evaluation

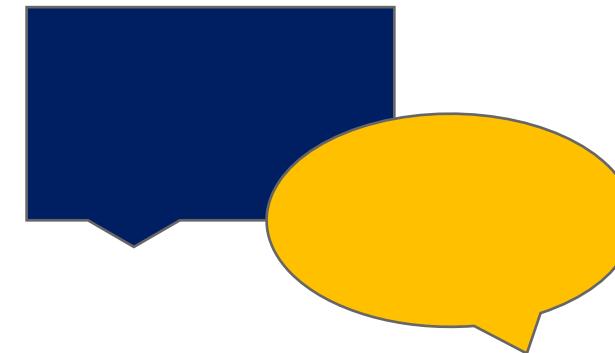
## Case studies

- Motivated by real-world problems
- Inspired by previous collaborations



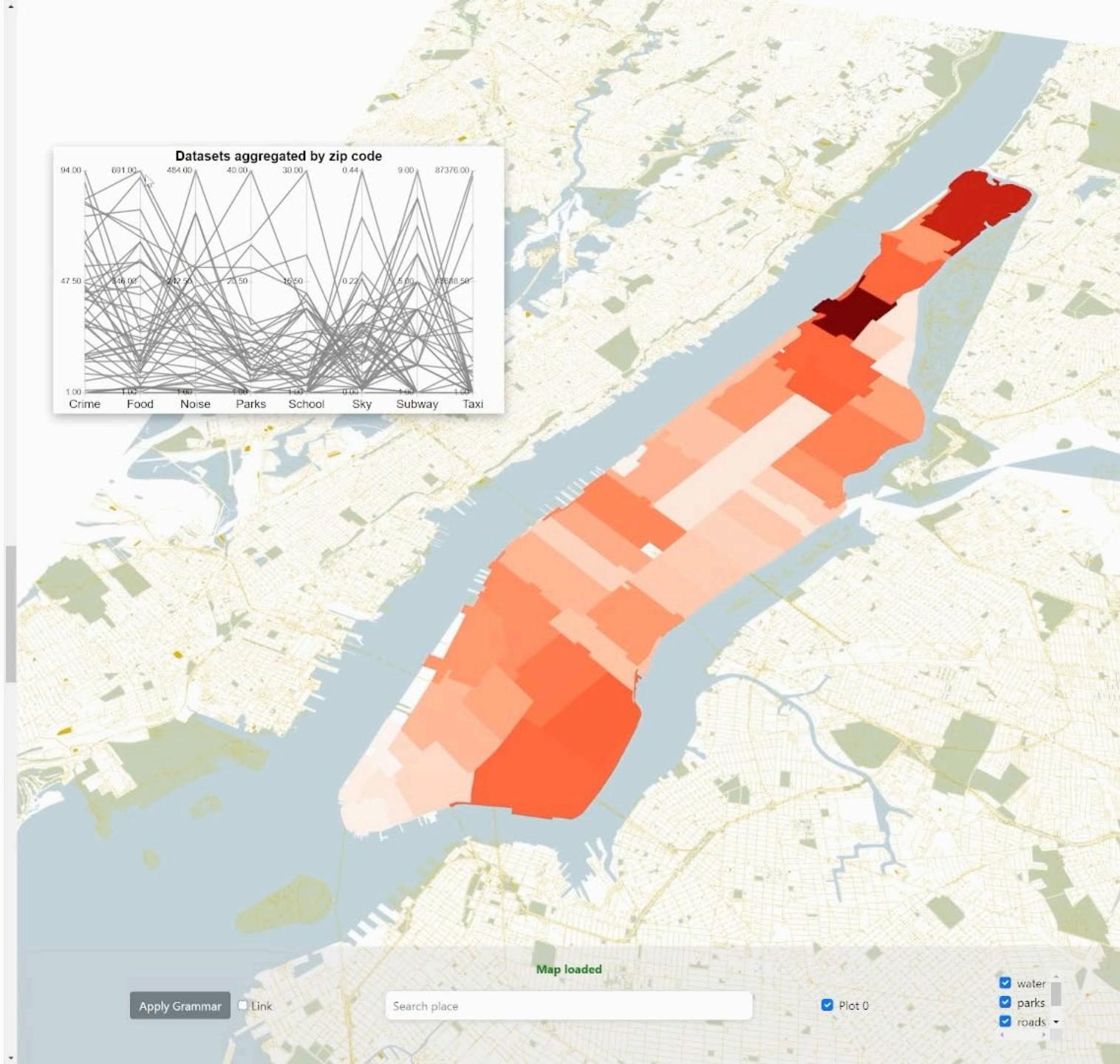
## Experts' feedback

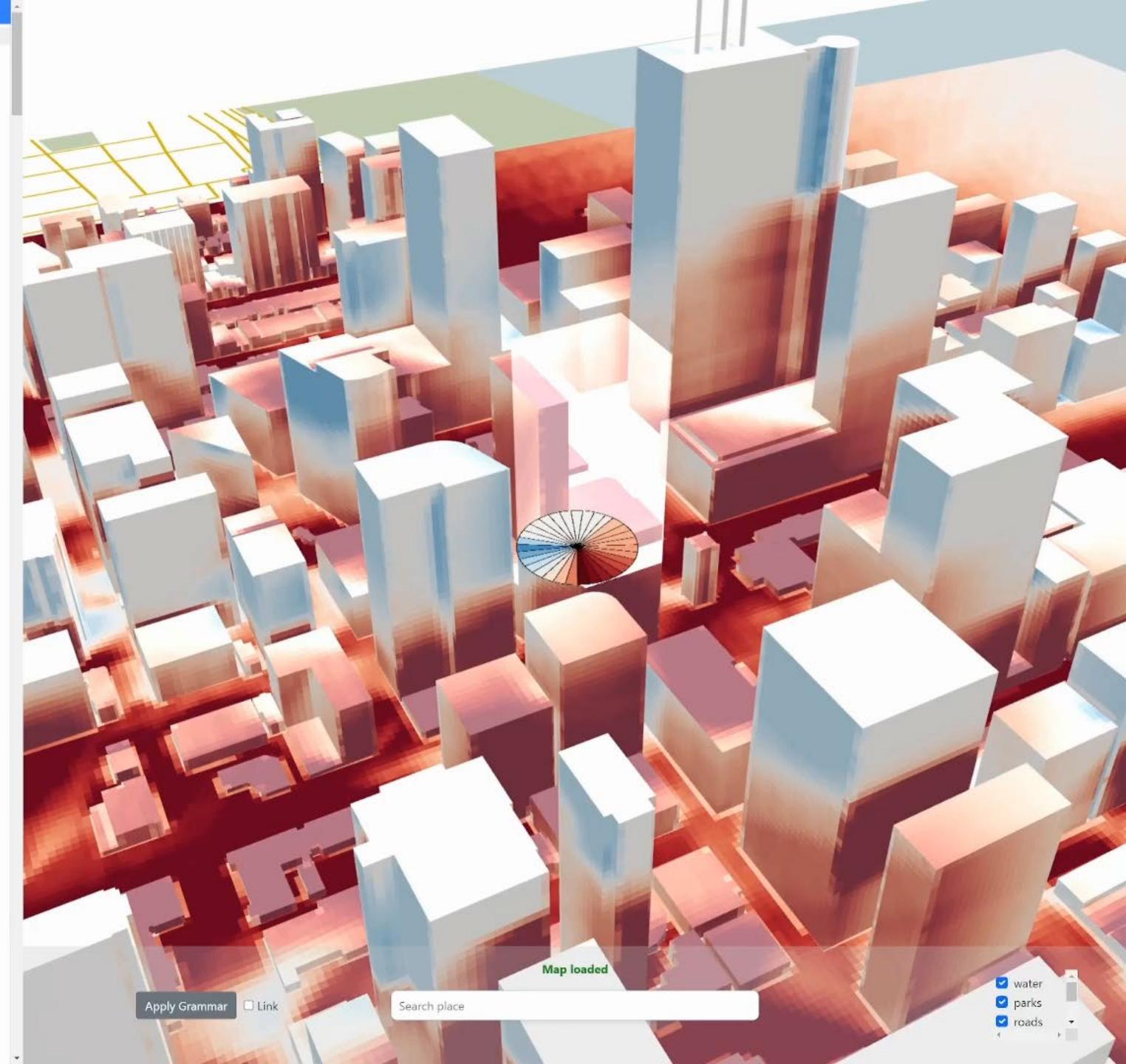
- One-hour semi-structured interviews
- Their perspectives on UTK's usability, limitations and needed features



```
234  
235  
236  
237  
238  
239  
240 v  
241 v  
242  
243  
244  
245  
246  
247  
248  
249  
250  
251 v  
252 v  
253  
254  
255  
256  
257  
258  
259 v  
260  
261  
262 v  
263 v  
264  
265  
266  
267  
268 v  
269  
270  
271  
272  
273  
274 v  
275  
276  
277  
278  
279  
280  
281  
282  
283  
284  
285  
286  
287  
288 v  
289 v  
290 v  
291 v  
292 v  
293 v
```

```
        "aggregate": "min",
        "field": "min",
        "format": ".2f"
    }
},
{
    "mark": {
        "type": "tick",
        "style": "tick",
        "size": 8,
        "color": "#ccc"
    }
}
]
],
"config": {
    "axisX": {
        "domain": false,
        "labelAngle": 0,
        "tickColor": "#ccc",
        "title": null,
        "labelFontSize": 16
    },
    "view": {
        "stroke": null
    },
    "style": {
        "label": {
            "baseline": "middle",
            "align": "right",
            "dx": -5
        },
        "tick": {
            "orient": "horizontal"
        }
    }
},
"knots": [
    "taxiPickupToZip",
    "noiseToZip",
    "crimeToZip",
    "restaurantsToZip",
    "subwayToZip",
    "schoolToZip",
    "skyToZip",
    "parksToZip"
],
"arrangement": "LINKED",
"interaction": "HOVER"
},
"knots": [
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "94.00"
        }
    ],
    "x": 100,
    "y": 100
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "691.00"
        }
    ],
    "x": 100,
    "y": 150
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "494.00"
        }
    ],
    "x": 100,
    "y": 200
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "40.00"
        }
    ],
    "x": 100,
    "y": 250
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "30.00"
        }
    ],
    "x": 100,
    "y": 300
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "0.44"
        }
    ],
    "x": 100,
    "y": 350
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "9.00"
        }
    ],
    "x": 100,
    "y": 400
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "87376.00"
        }
    ],
    "x": 100,
    "y": 450
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "47.50"
        }
    ],
    "x": 100,
    "y": 500
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "346.00"
        }
    ],
    "x": 100,
    "y": 550
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "292.00"
        }
    ],
    "x": 100,
    "y": 600
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "25.50"
        }
    ],
    "x": 100,
    "y": 650
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "10.50"
        }
    ],
    "x": 100,
    "y": 700
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "0.22"
        }
    ],
    "x": 100,
    "y": 750
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "5.00"
        }
    ],
    "x": 100,
    "y": 800
},
{
    "id": "noiseToZip",
    "linkingScheme": [
        {
            "predicate": "CONTAINS",
            "value": "0.0000000000000001"
        }
    ],
    "x": 100,
    "y": 850
}
]
```





# Experts' feedback

---

“... facilitates engagement not only across disciplines, but also across urban communities” (Weather scientist)

“... researchers could easily share their visualizations instead of cumbersome GIS files” (Urban planner)

“3D makes it more attractive to users and a great tool for communication” (Urban planner)

“It would require training to educate people on the grammar, with examples to showcase its use” (Urban planner)

# Future opportunities

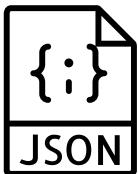
---

- Incorporate other functionalities that have been highlighted in previous urban visual analytics works:
  - Computational topology
  - Wavelet
  - Techniques for model inspection



Transportation experts

- What-if scenarios
- Model inspection
- ...



Weather experts

- What-if scenarios
- Model inspection
- Data wrangling
- ...



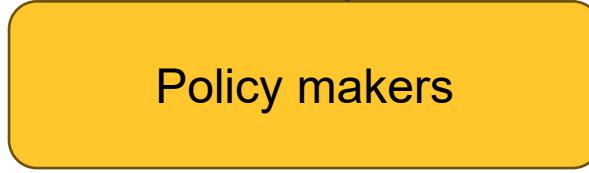
## The Urban Toolkit

- Open urban data
- Modeling & simulation results
- Crowdsourced data
- Urban sensing data



Communities

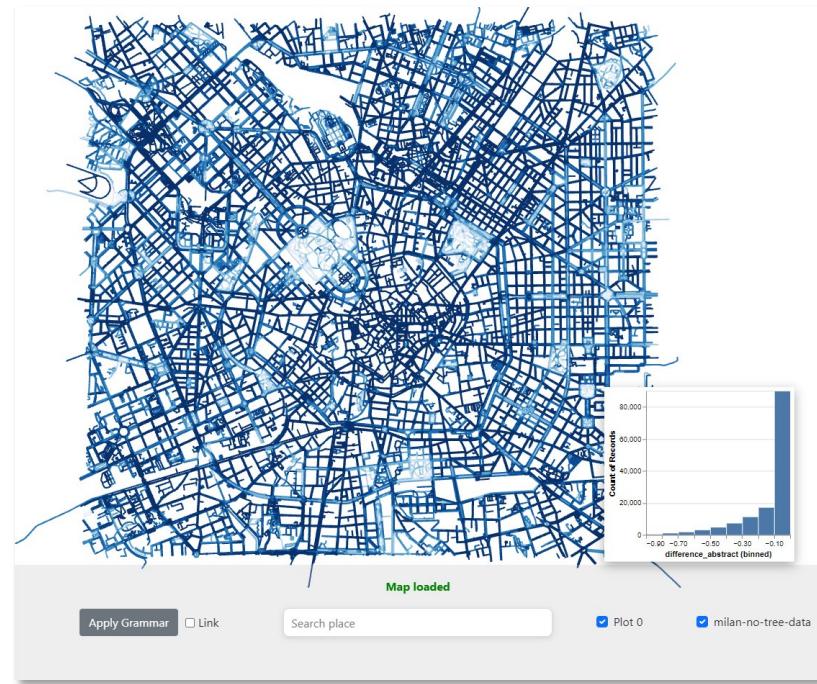
- Engagement
- ...



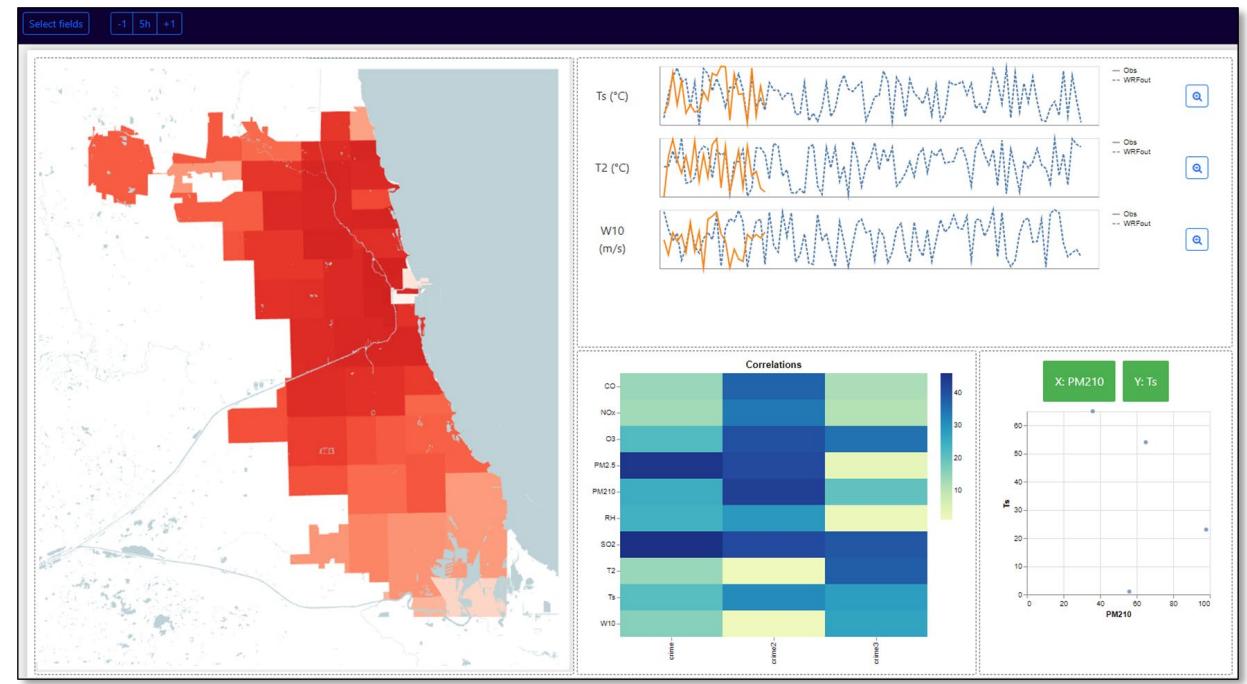
Policy makers

- What-if scenarios
- Engagement
- ...

# Ongoing works extending UTK

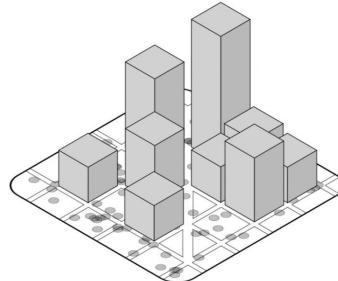


Urban accessibility



Environmental justice





# UrbanTK

.....

Code & tutorials:  
[urbantk.org](http://urbantk.org)



IIT UFF



**Gustavo Moreira, University of Illinois Chicago**

Maryam Hosseini, Massachusetts Institute of Technology

Md Nafiul Alam Nipu, University of Illinois Chicago

Marcos Lage, Universidade Federal Fluminense

Nivan Ferreira, Universidade Federal de Pernambuco

Fabio Miranda, University of Illinois Chicago

The Urban Toolkit  
A Grammar-based Framework for Urban Visual Analytics

Getting Started GitHub Tutorials

While cities around the world are looking for smart ways to channel new advances in data collection, management, and analysis to address their day-to-day problems, the complex nature of urban issues and the overwhelming amount of available structured and unstructured data have posed significant challenges in translating these efforts into actionable insights. In the past few years, urban visual analytics tools have significantly helped tackle these challenges. With this in mind, we present the Urban Toolkit, a flexible and extensible visualization framework that enables the easy authoring of web-based visualizations through a new high-level grammar specifically built with common urban use cases in mind.

The toolkit is described in the [paper](#):  
**The Urban Toolkit: A Grammar-based Framework for Urban Visual Analytics**  
Gustavo Moreira, Maryam Hosseini, Md Nafiul Alam Nipu, Marcos Lage, Nivan Ferreira and Fabio Miranda  
*IEEE Transactions on Visualization and Computer Graphics (Accepted at IEEE VIS 2023, to appear)*