

A Case-based Search Engine for Mapping Urban Patterns and Cases Integrating Street View Imagery

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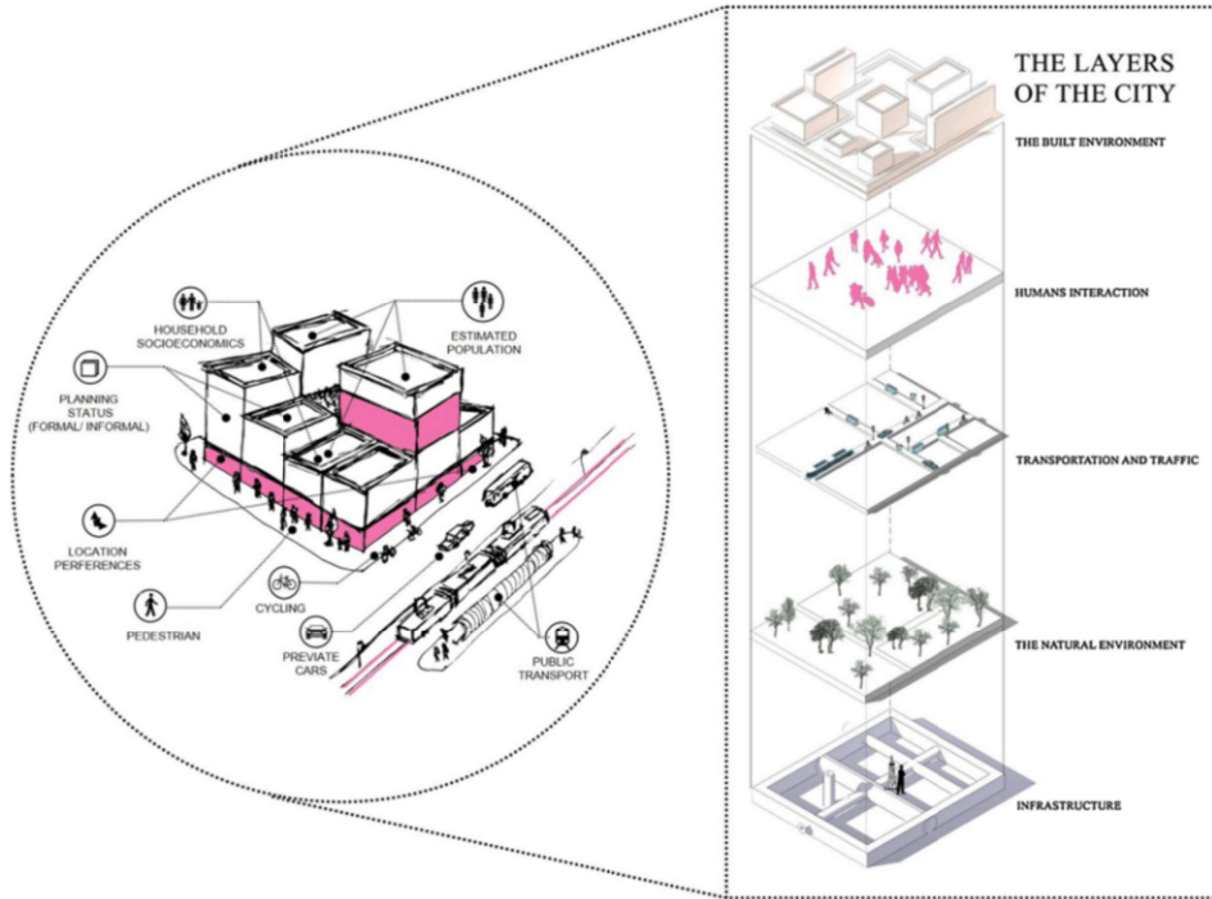
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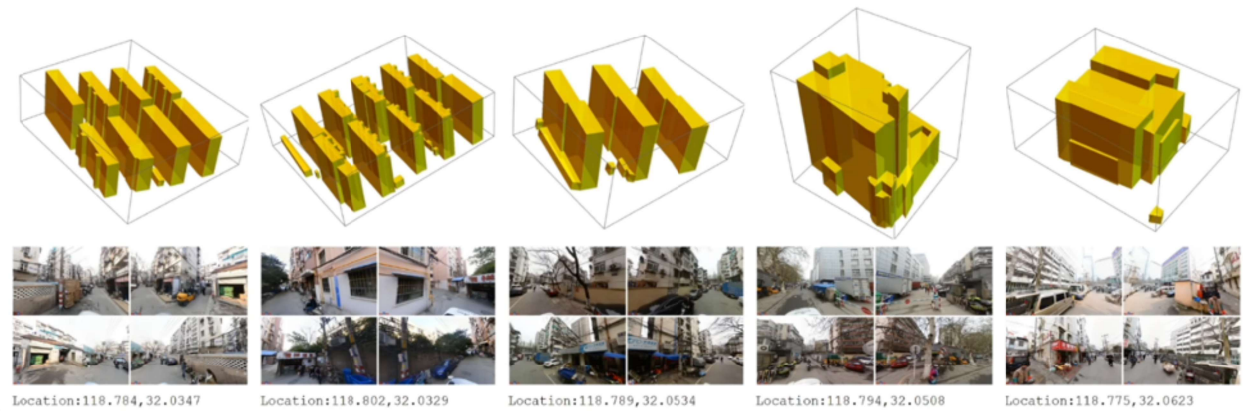
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Cities are complex systems with multi-dimensional characteristics.
Urban designers rely on case-based understanding to develop approaches.

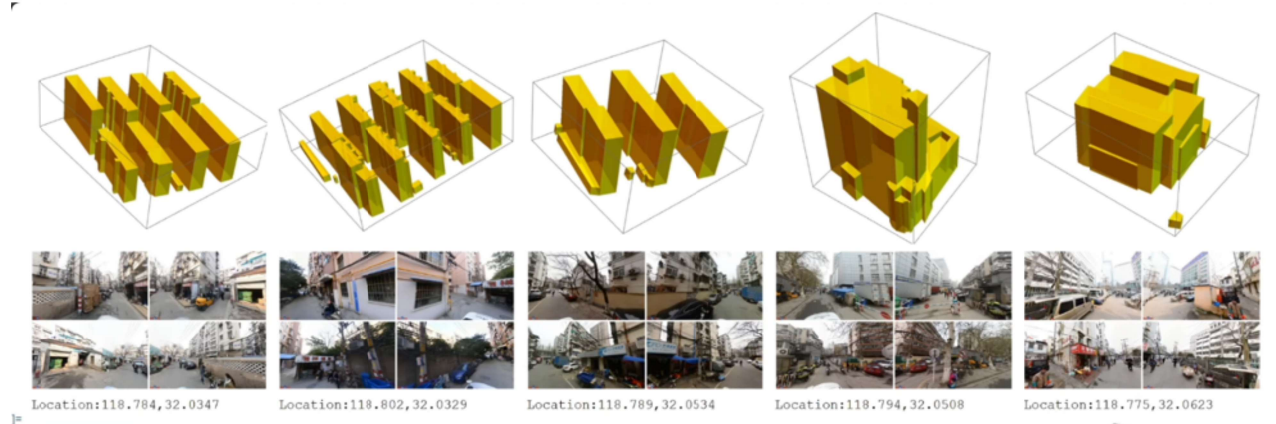
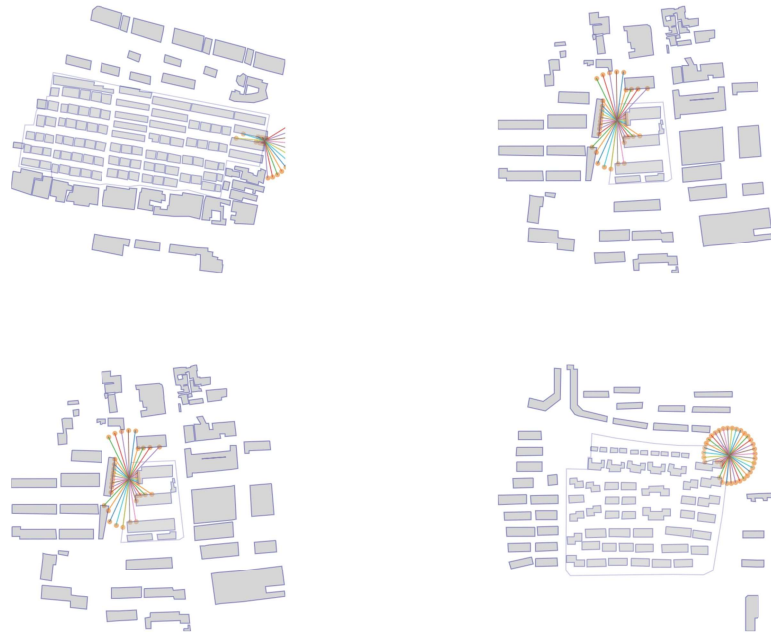
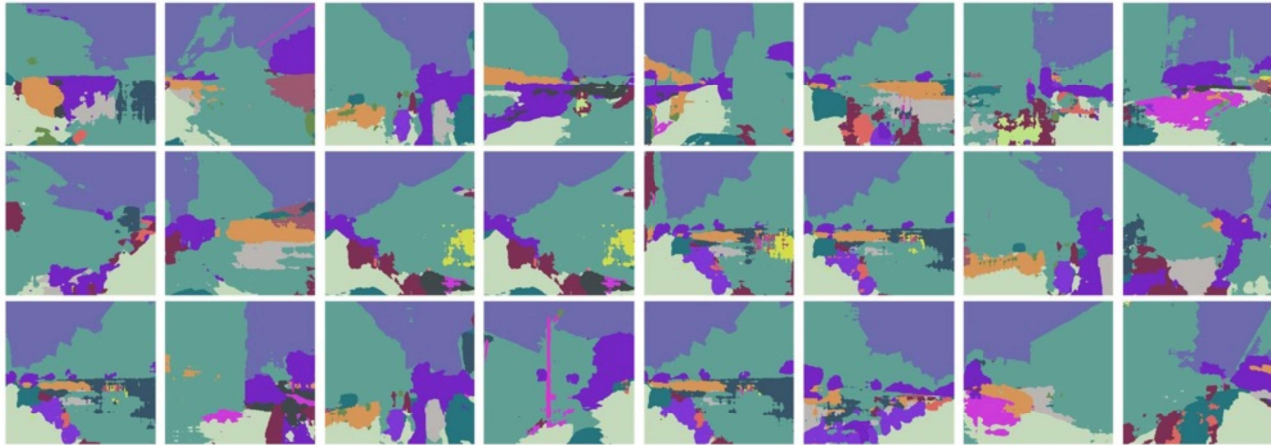


MR Ibrahim, 2020, Understanding cities with machine eyes

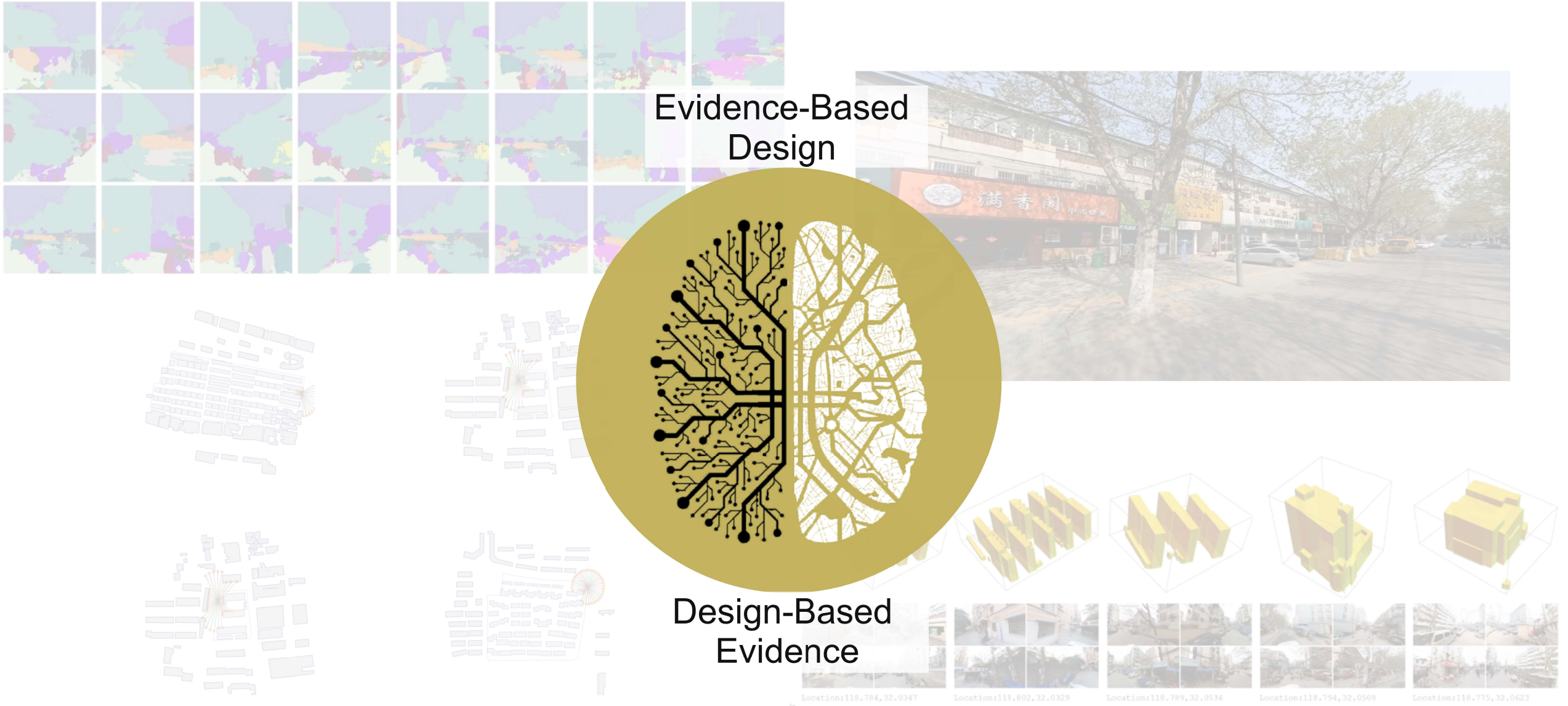


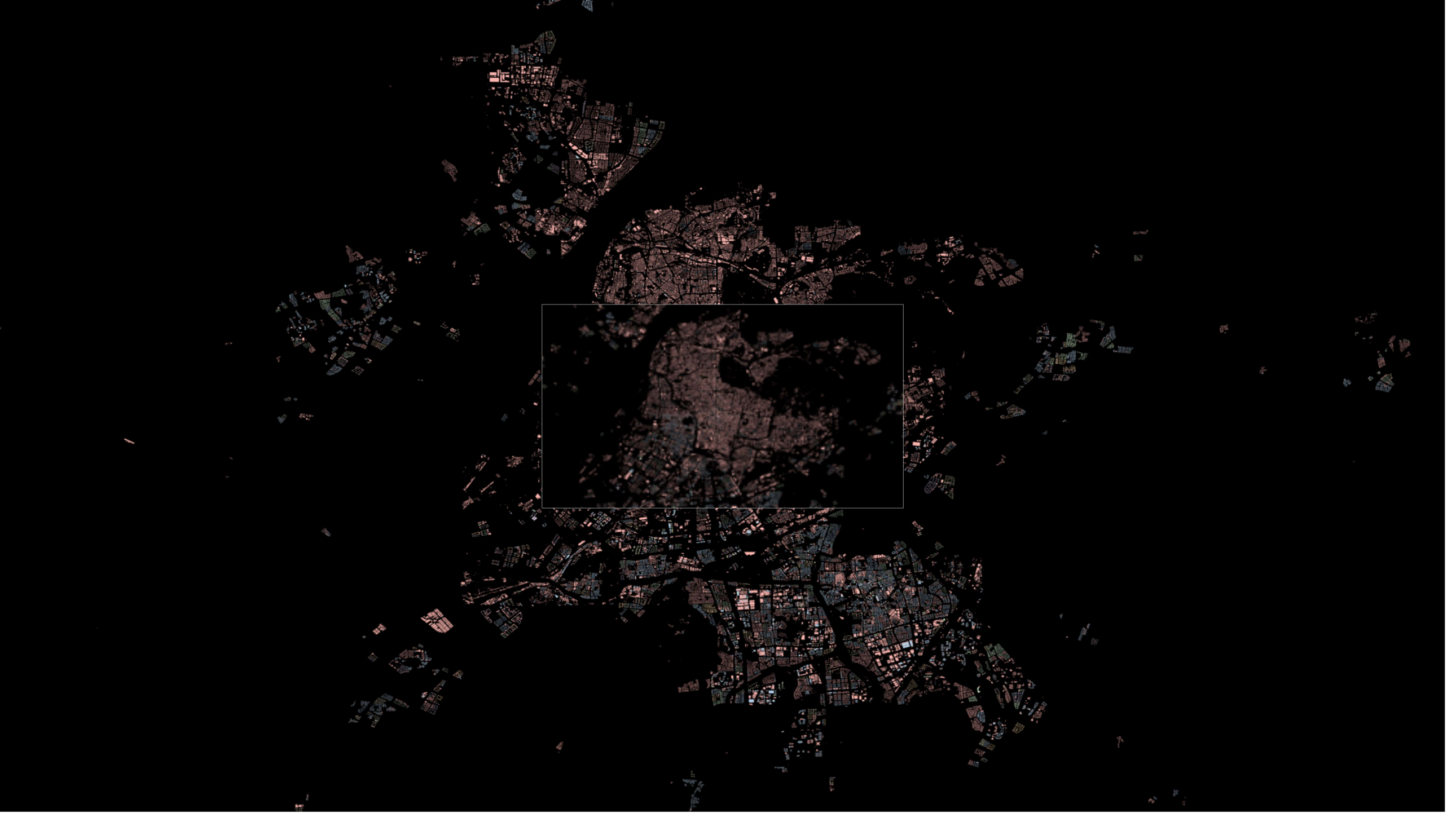
Cities are complex systems with multi-dimensional characteristics.

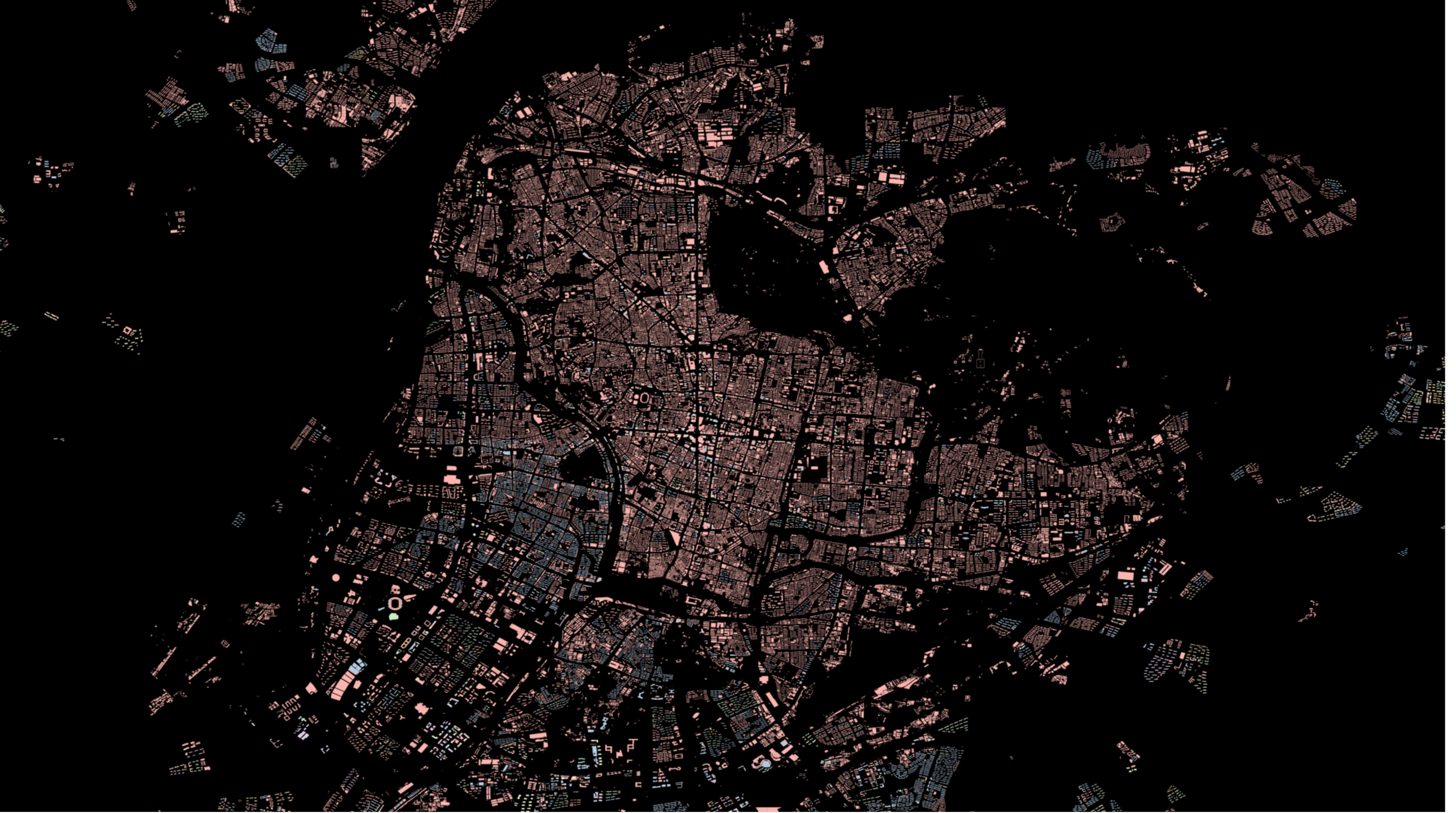
Urban scientists search for general patterns that apply across unique cases.



We need approaches that tightly couple our advances in urban design **and** science, in case-based reasoning and pattern detection.

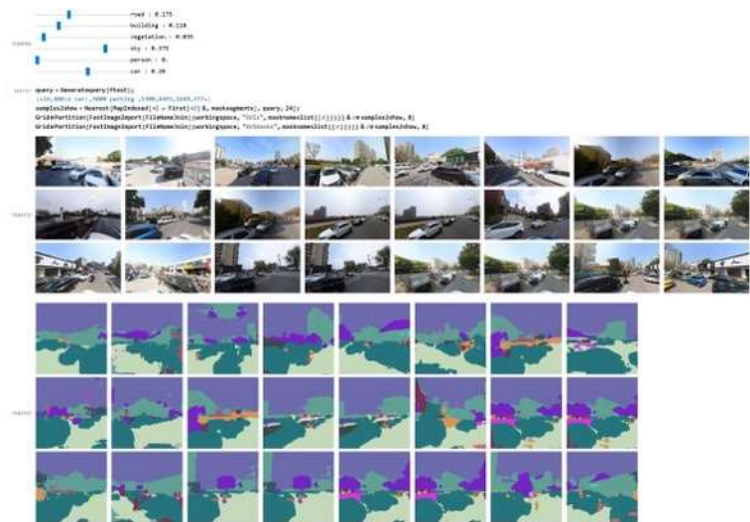







Case-based search engines can help designers find case-based patterns e.g. searching for cases with similar *proportions of visible elements*

> This search engine retrieves cases with similar proportions of visible elements, such as roads, buildings, vegetation, or cars.



Case-based search engines can help designers find case-based patterns
e.g. searching for cases with similar *plot shapes*

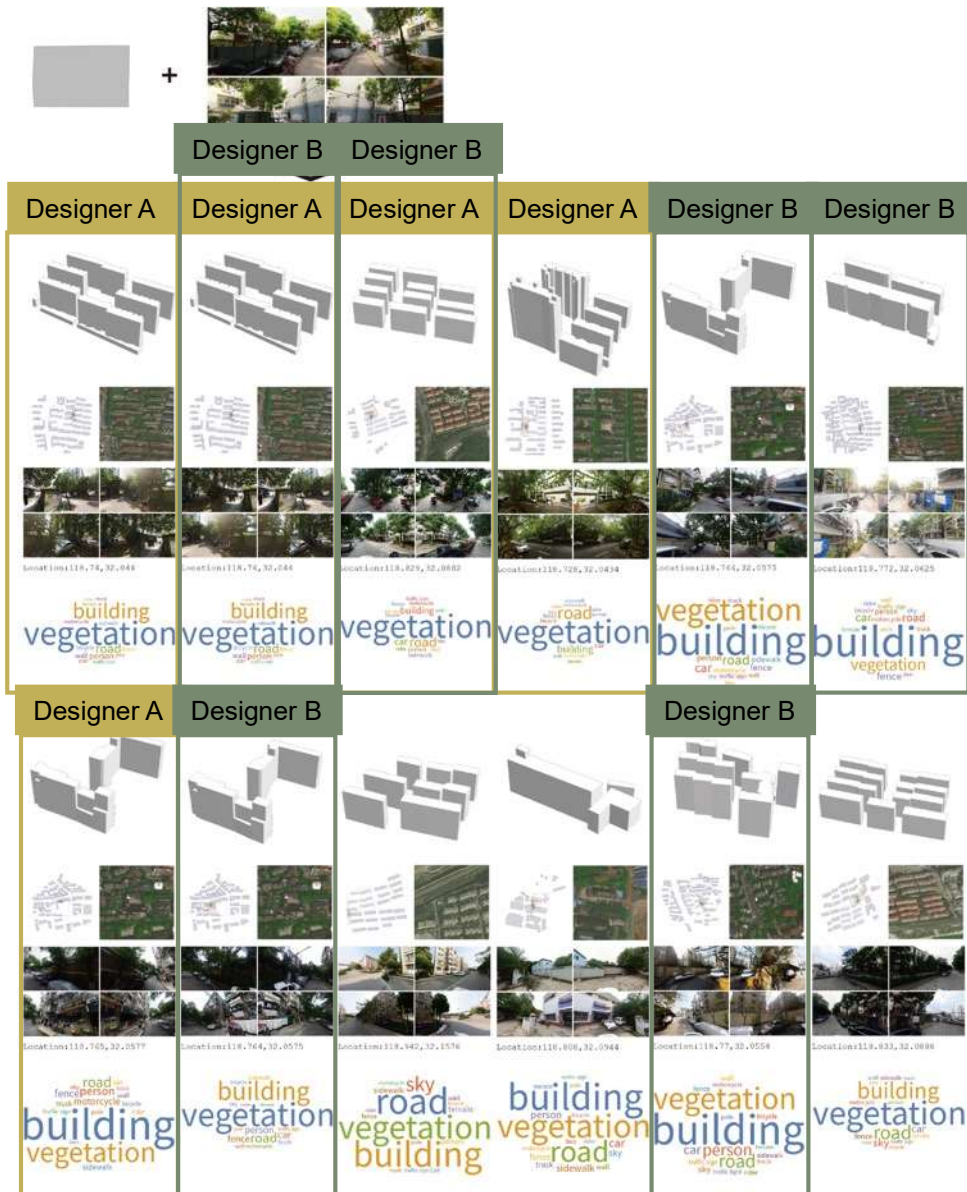
```
shapequery = 7;  
ShowEmptyPlot[plotrayindex[[shapequery]]]  
nearestshape = Queryplot[plotrayvec[[shapequery]], 500];  
Grid@Partition[ShowPlotModelbyAOI[plotrayindex[[#]]] & /@ nearestshape[[1 ;; 21]], 7]
```

The image shows a Mathematica notebook interface. At the top, there is a pink header bar containing the following code:

```
shapequery = 7;  
ShowEmptyPlot[plotrayindex[[shapequery]]]  
nearestshape = Queryplot[plotrayvec[[shapequery]], 500];  
Grid@Partition[ShowPlotModelbyAOI[plotrayindex[[#]]] & /@ nearestshape[[1 ;; 21]], 7]
```

Below the code, the plot area is mostly empty, but it contains a gray rectangle in the upper left corner and a small yellow circle with the number '1' inside it, located in the upper middle part of the plot area.

Case-based search engines can help designers find case-based patterns e.g. searching for cases of similar *plot shape* and *street view appearance*



> We developed a case-based search engine that enables flexible case retrieval based on street view imagery characteristics and 3D built environment models.

> e.g. **Designer A** might use our engine to search for rectangular plots with good greenery.

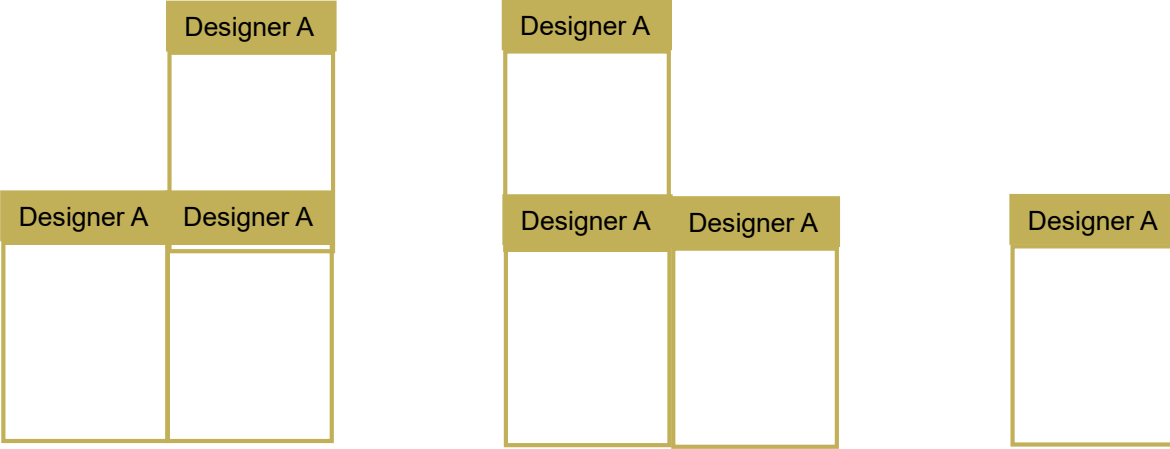
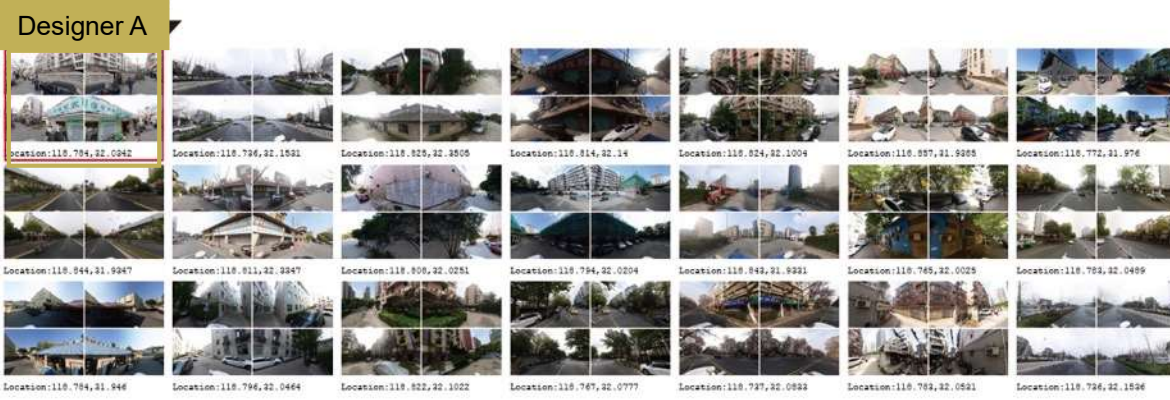
> e.g. **Designer B** might do the same search, but looking for examples of streets with good enclosure.

> Both **A** and **B** have certain assumptions or hypotheses about which characteristics make a particular urban design case good (or bad).

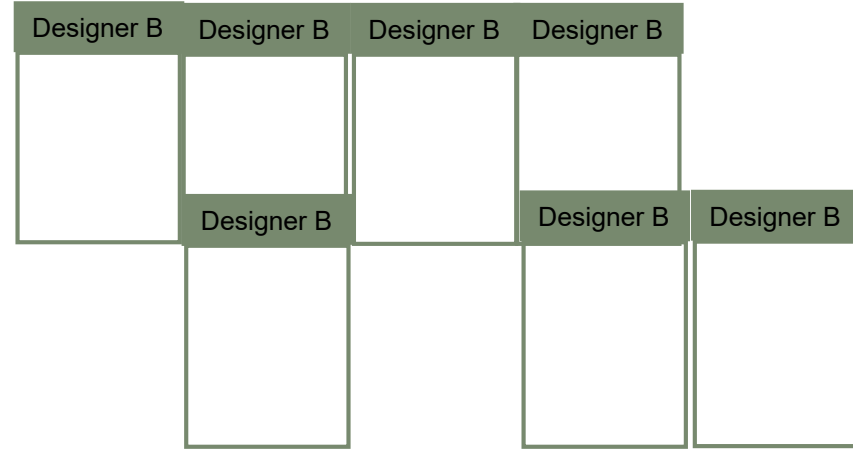
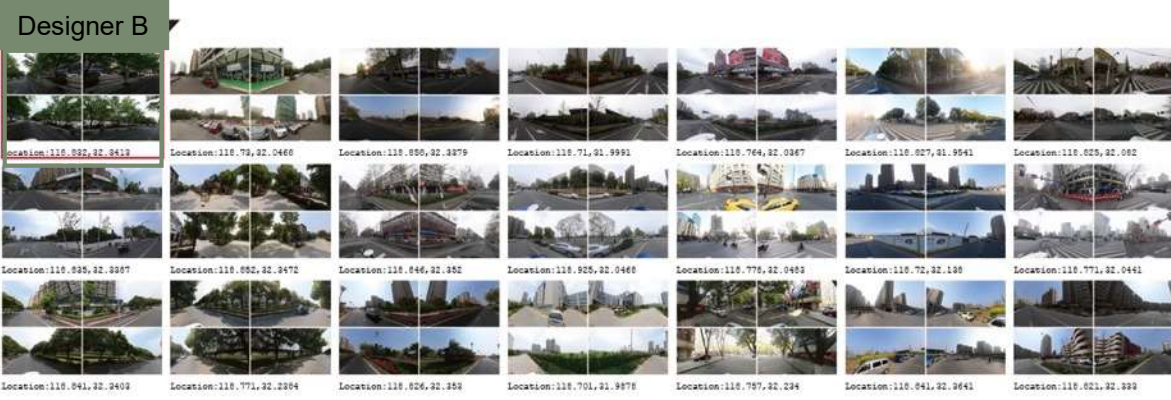
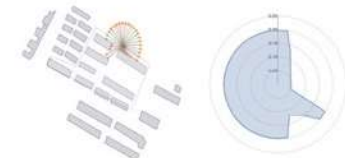
> **Search A** might support assumptions, while **Search B** might contradict them, depending on which characteristics are of interest to the designer.

Case-based search engines can help designers find case-based patterns e.g. searching for cases with similar *isovists* and *street view* appearances

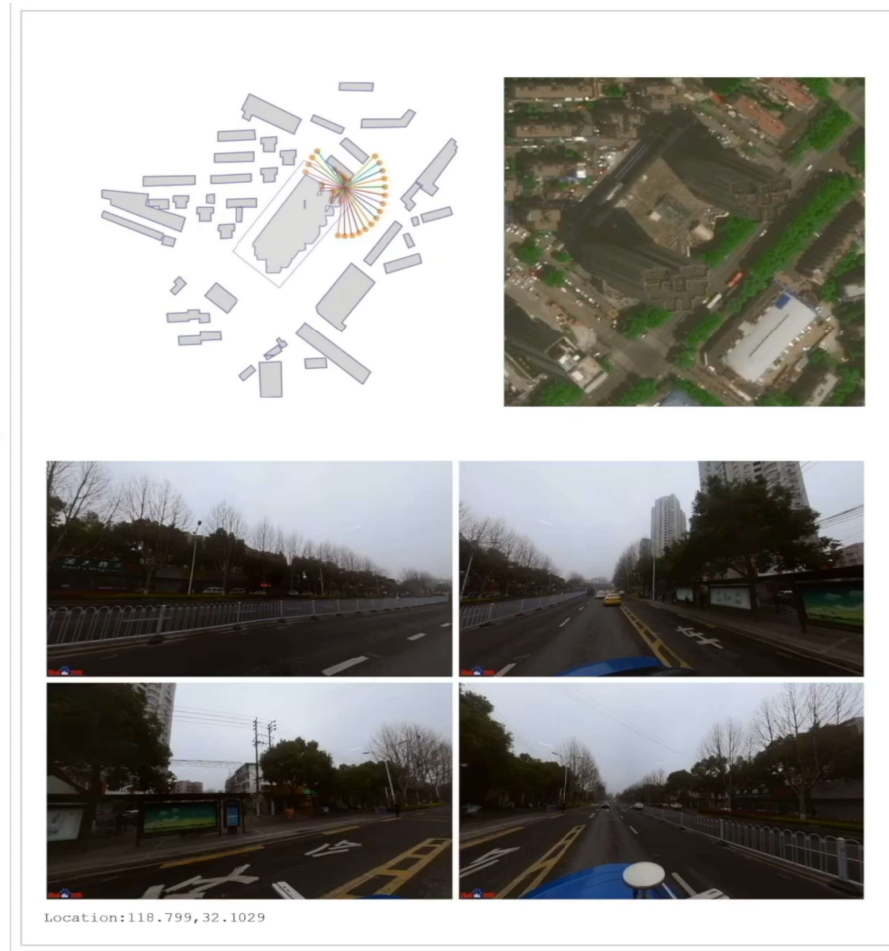
> **Designer A** looks for cases with narrow streets and old residential buildings.



> **Designer B** looks for cases with semi-open space and significant amounts of greenery.



The workflow to create our search engine platform automatically collects urban semantic, spatial and image data



> The data required for all the search engine examples shown can be gathered automatically

> Street View Image (SVI) panoramas are retrieved for each point of observation.

> Spatial elements are extracted by applying Isovist analysis in each point of observation.

> Satellite images of the plots are requested.

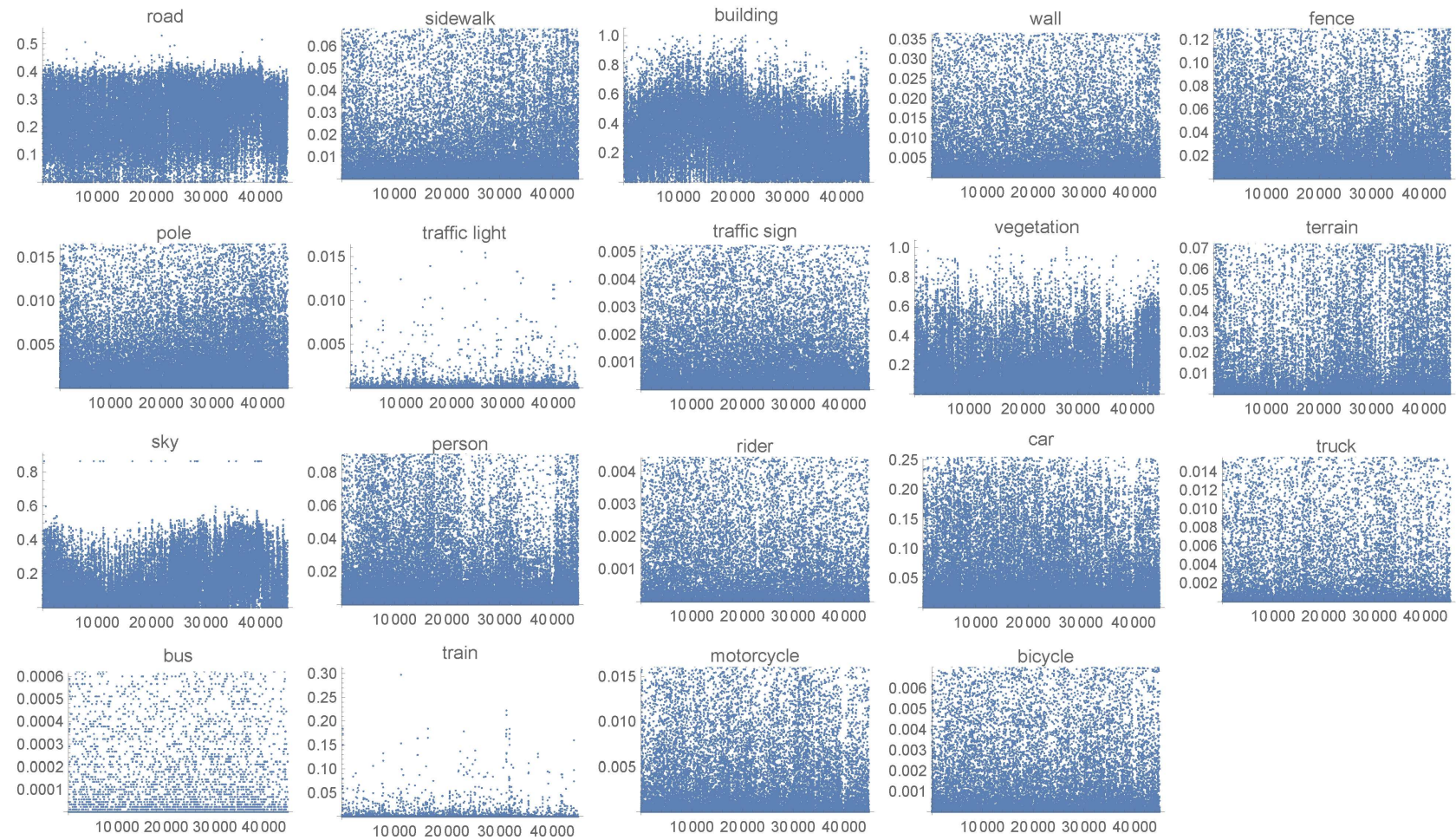
> 3D buildings and plot outlines are extracted from shapefile data.

Our search engine automatically extracts and analyses geometry and image using machine learning



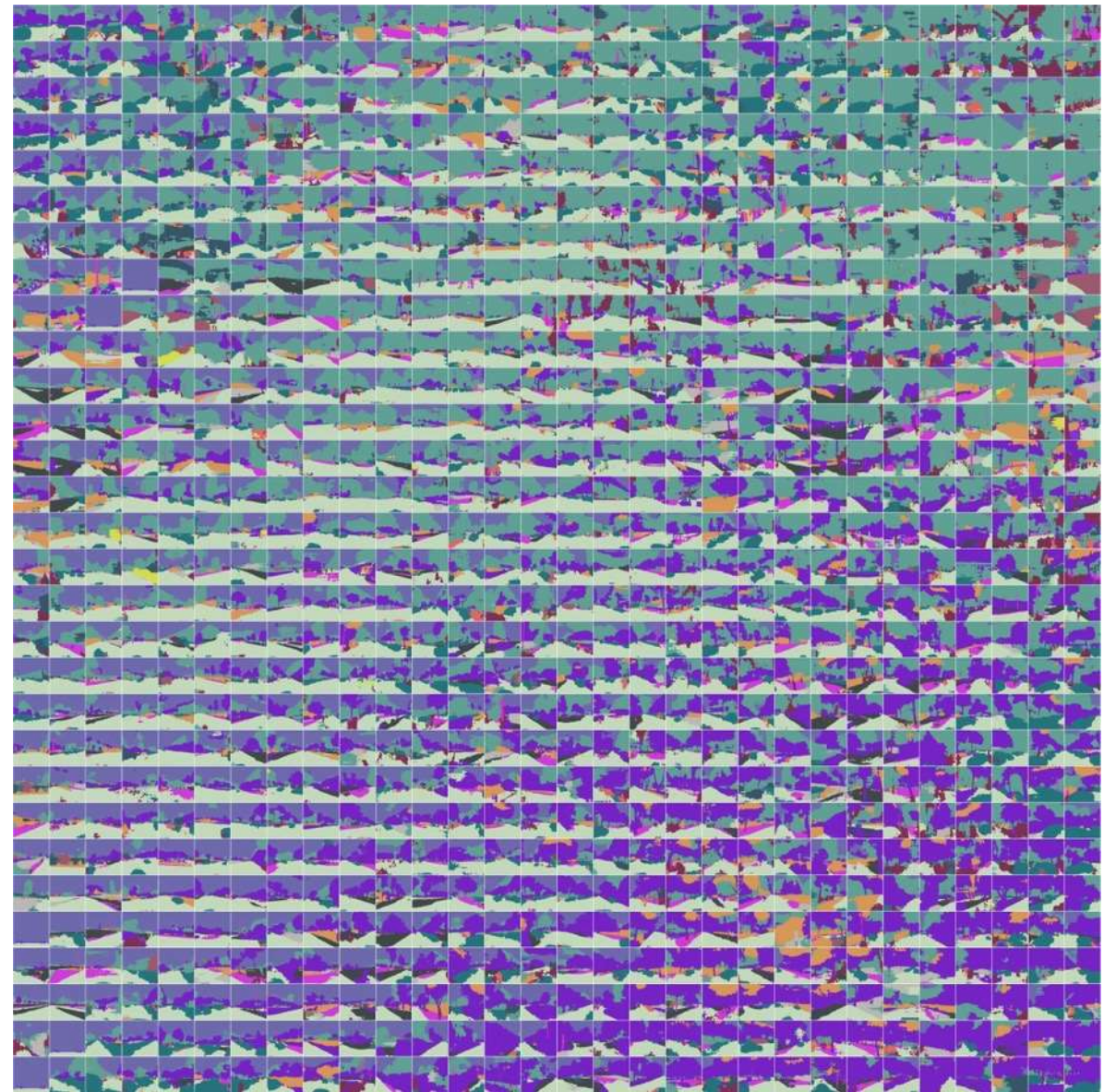
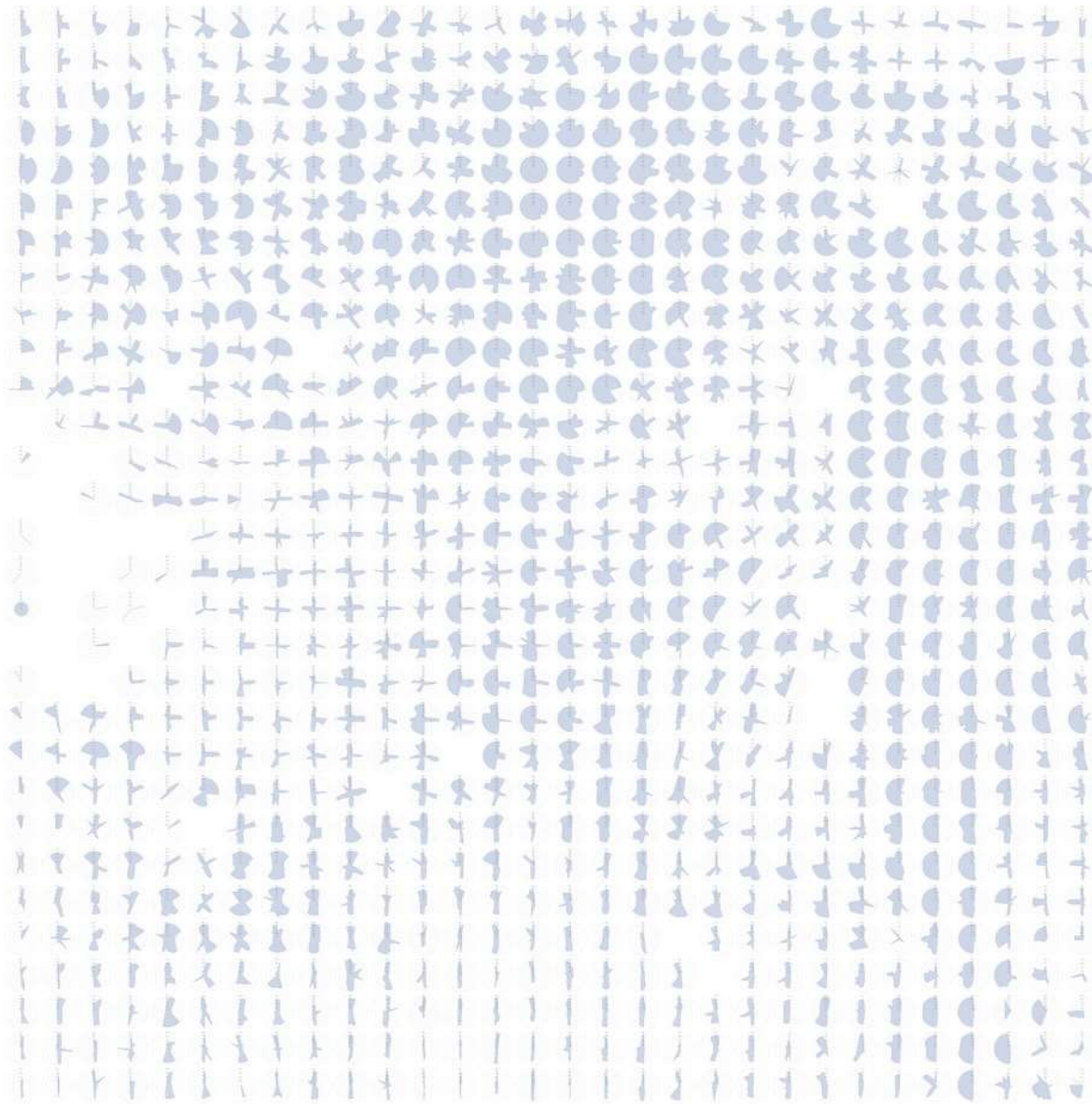
> **Semantic Segmentation** of the SVIs is done using a pre-trained machine learning model (Ademxapp Model A1 Trained on Cityscapes Data) in Mathematica. The images above color-code nineteen visible element types (road, sidewalk, ...) as semantic features.

Our search engine automatically extracts and analyses geometry and image using machine learning



> **19 Semantic Features** have different proportions for each of the samples (approx. 40000 images).

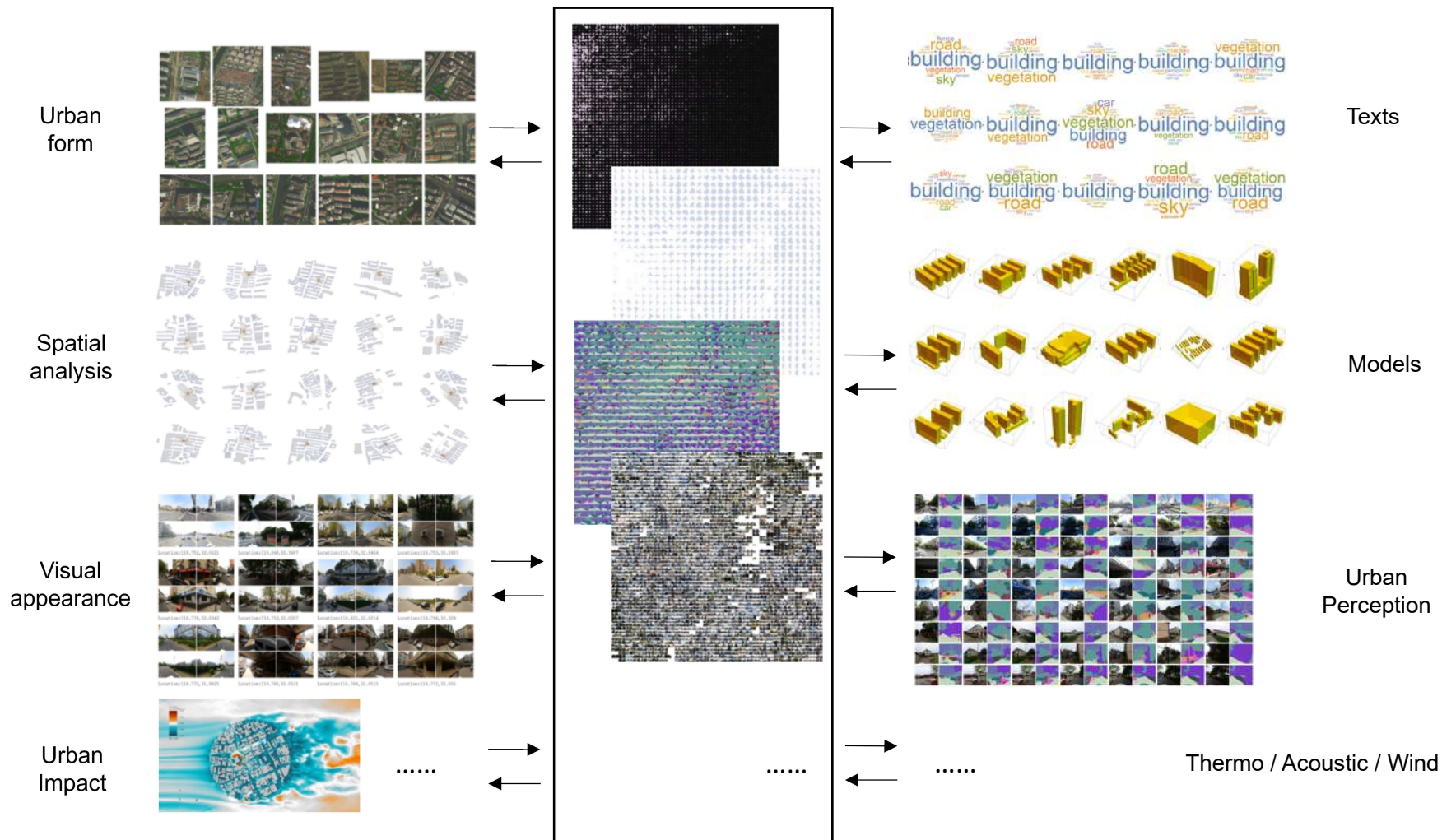
We map links between general patterns and specific cases by training several self-organizing maps (SOMs), resulting in 'urban dictionaries'



We map links between general patterns and specific cases by training several self-organizing maps (SOMs), resulting in 'urban dictionaries'



Our proposed methodology can be expanded by integrating additional heterogenous data



> We can expand these search engines by integrating more datatypes, themes and domains.

> The work I presented is a first step towards new methods to augment the learning and decision-making processes of architects and urban designers

> supporting the derivation of hidden rules in complex cities based on in-field, case-based experiences.

In the Semantic Urban Elements project, we are exploring how case-based search can support new approaches linking urban science and design

Evidence-Based
Design



Design-Based
Evidence



Urban
Analytics

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Simulations

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