



## Scenario Planning and Visualization

Webinar 8 of an 8-part TMIP  
Webinar series on land use  
forecasting methods.

Paul Waddell, 2011

## Land Use Forecasting Webinar Series

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1. The Evolving State of the Practice
2. Land Use Theory and Data
3. Scenario Planning and Visioning (I-PLACE3S)
4. Spatial Input-Output Frameworks (PECAS)
5. Dynamic Microsimulation (UrbanSim)
6. Modeling Real Estate Demand
7. Modeling Real Estate Supply
8. Scenario Planning and Visualization

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1. **Urban Visualization**
2. Bridging the Gap Between Urban Simulation, Visualization and Geometric Modeling
3. Application: UrbanVision

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## **URBAN VISUALIZATION**

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## Urban Visualization

- Visualizations of land use forecasting results
  - Used by regional planning agencies to evaluate
    - Alternative transportation investments
    - Land use regulations
    - Environmental protection policies

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## Urban Visualization

- Visualizations of land use forecasts
  - Interest several groups of population with different levels of expertise in handling data
    - Policy makers
    - The public
    - Modelers running the simulation

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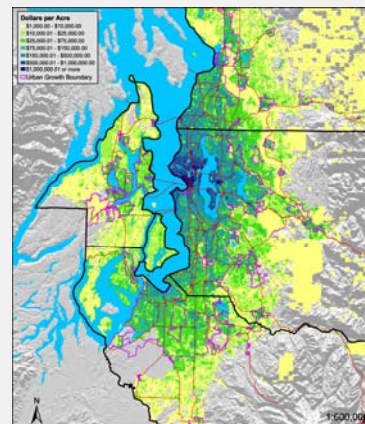
## Urban Visualization

- Traditional urban visualization techniques
  - Focused on handling large urban simulation datasets
  - Making their analysis more intuitive to urban planners
- In the following, we outline a few representative techniques

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## Urban Visualization

- Traditional urban visualization techniques
  - Choropleth maps:  
Areas **shaded** in proportion to the values of the displayed variables
  - (standard GIS representation)



Example simulation output:  
Map-based indicator display for Puget Sound  
(Total land value per acre, 2000)  
From UrbanSim Application in Seattle, WA

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## Urban Visualization

- Traditional urban visualization techniques
  - Cartograms: Distort a map by **resizing** its regions according to the values of the displayed variable, but keeping the map recognizable

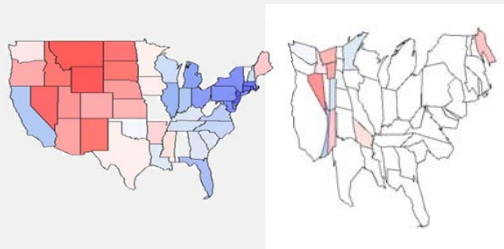
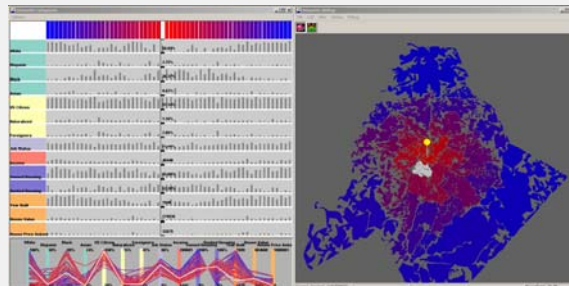


Image from:  
Daniel Keim, Stephen North, Christian Panse, "CartoDraw: A Scanline based Cartogram Algorithm", 2004.

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## Urban Visualization

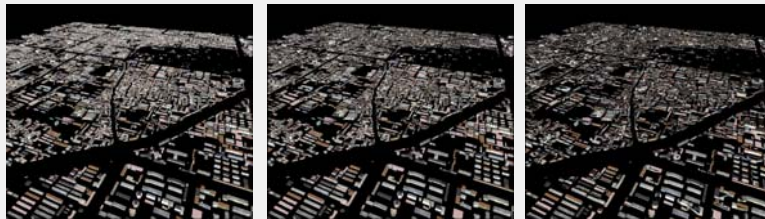
- **Legible Cities**  
Chang, Wessel, Kosara, Sauda, Ribarsky
- TVCG 2007



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## Urban Visualization

- Goal: Visualize an urban model in a focus-dependent, multi-resolution fashion, while retaining the legibility of the city

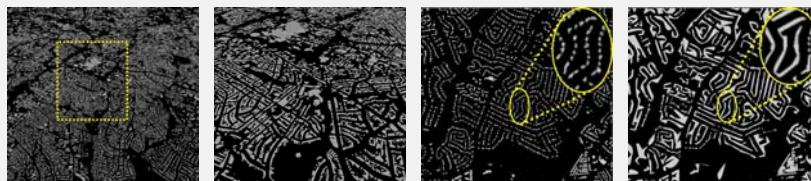


Original Model   45% polygons   18% polygons

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## Urban Visualization

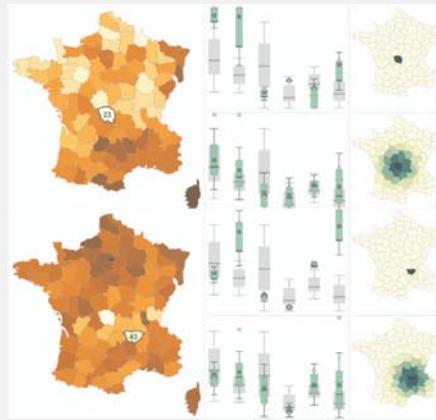
- Integrate 3D model view and data view
  - Relationships between the geospatial information of the urban model and the related urban data can be more intuitively identified



## Urban Visualization

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- **Geographically Weighted Visualization**  
Dykes, Brunson
- TVCG 2007



## Urban Visualization

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- Visually encode information about geographic and statistical proximity and variation through
  - geographically weighted (GW)-choropleth maps
  - multivariate GW-boxplots
  - GW-shading and scalograms
- New graphic types reveal information about GW statistics at several scales concurrently

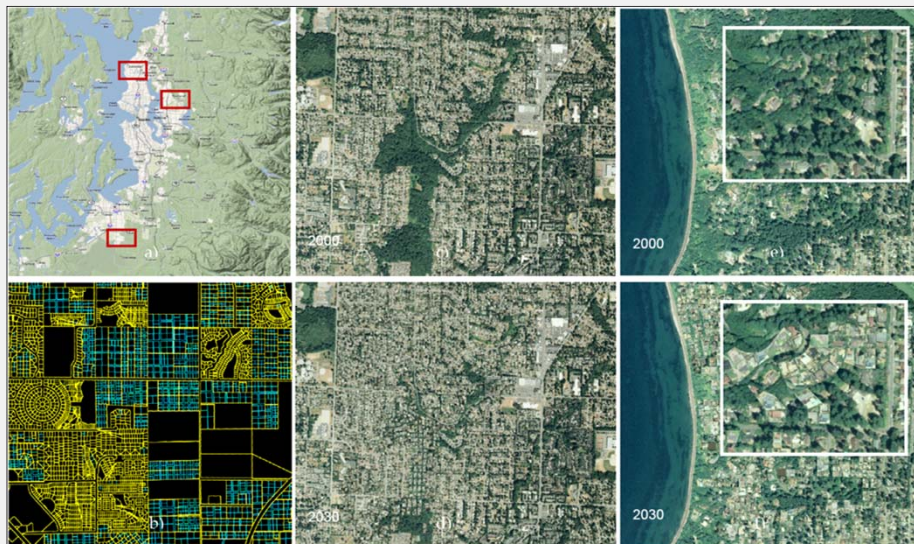
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## Visualization of Land Use Model Results

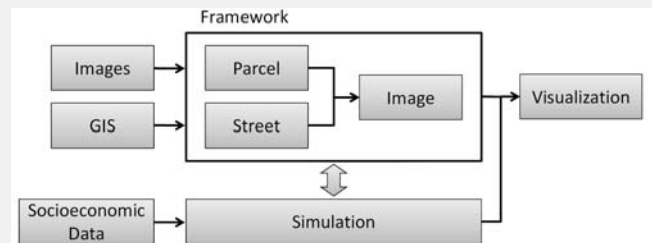
- Vanegas, Aliaga, Benes, Waddell, TVCG 2009

[Video](#)



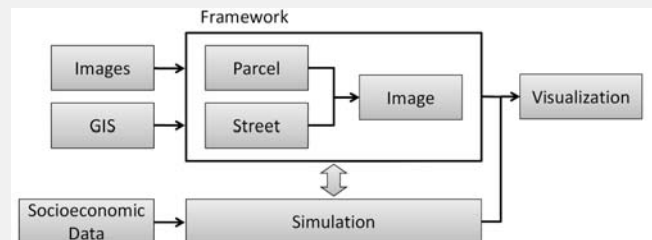
## Visualization of Simulated Urban Spaces

- Infer an urban layout
    - Images (aerial view) + Structure (streets, parcels)
- from the values of a set of simulation variables at any given time step



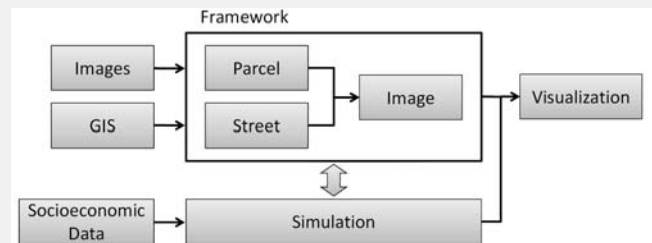
## Visualization of Simulated Urban Spaces

- Approach
  - Spatially match socioeconomic data set with input aerial images and structure of the urban space



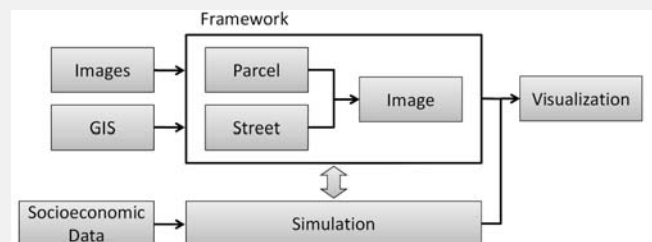
## Visualization of Simulated Urban Spaces

- Approach
  - Create new structure that matches a set of attributes inferred from the simulation variables
  - New blank lots are created



## Visualization of Simulated Urban Spaces

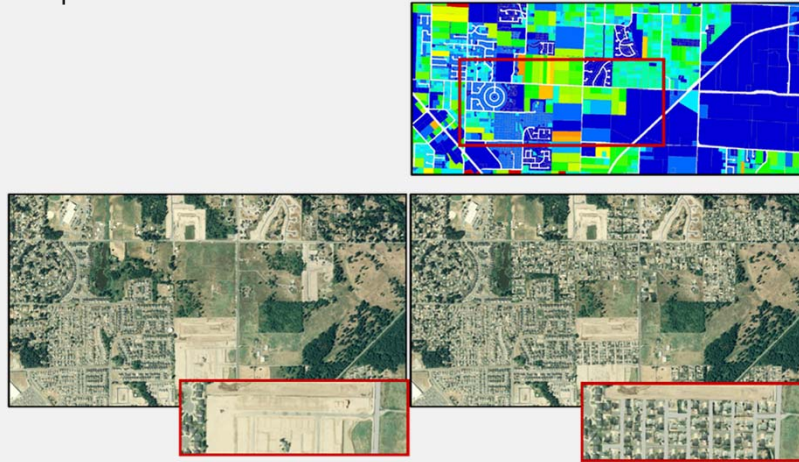
- Approach
  - Aerial view imagery is “borrowed” from existing lots of the city with similar socioeconomic attributes as the new blank lot



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## Visualization of Simulated Urban Spaces

- Example result



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## Visualization of Simulated Urban Spaces

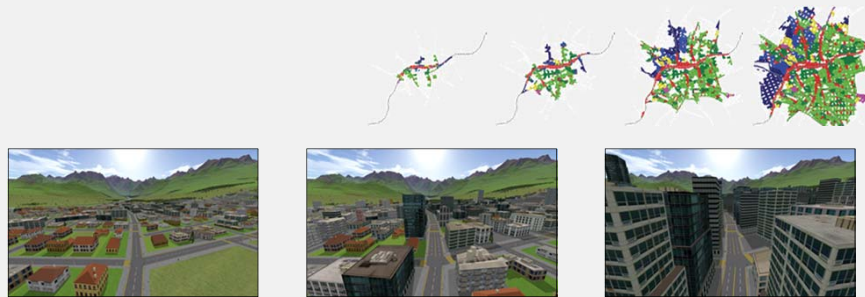
- Example result



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## Bridging the gap between urban simulation, visualization and modeling

- **Interactive Geometric Simulation of 4D Cities**  
Weber, Müller, Wonka, Gross
- Eurographics 2009



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## Interactive Geometric Simulation of 4D Cities

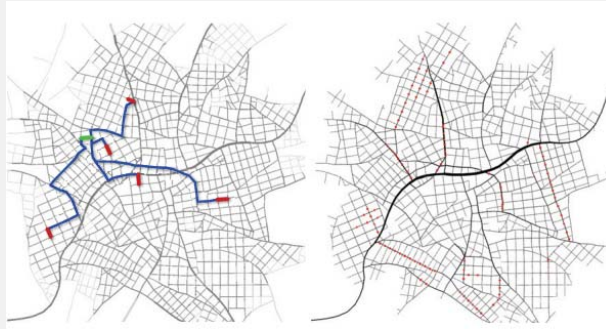
- Problem:
  - How to model cities that are changing over time?
  - How to use the urban simulation data to infer the geometry of the city (roads, lots, buildings)?



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## Interactive Geometric Simulation of 4D Cities

- Traffic simulation for street generation



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## Interactive Geometric Simulation of 4D Cities

- Land use simulation
  - Optimization of a land use value function

$$luv = \lambda_{global} \cdot luv_{global} + \lambda_{local} \frac{\sum_{\forall i} lot[i].area \cdot lot[i].luv}{\sum_{\forall i} lot[i].area}$$

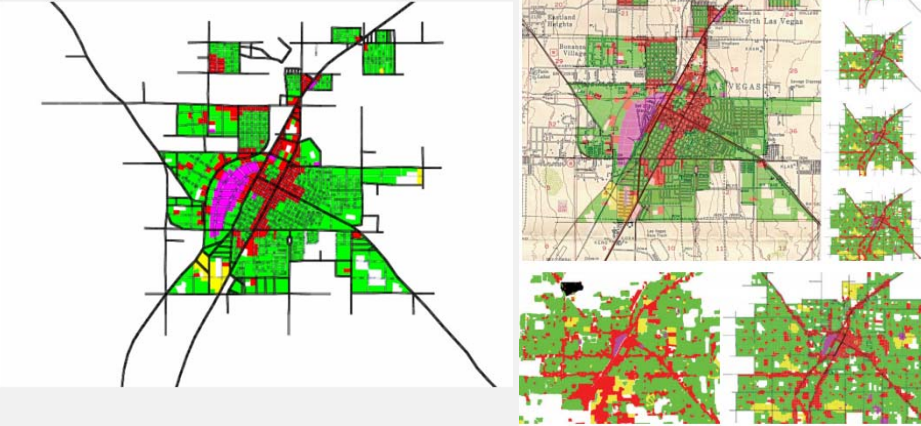
- Global and Local land use goals



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## Interactive Geometric Simulation of 4D Cities

- Validation



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## Interactive Geometric Simulation of 4D Cities

[Video](#)

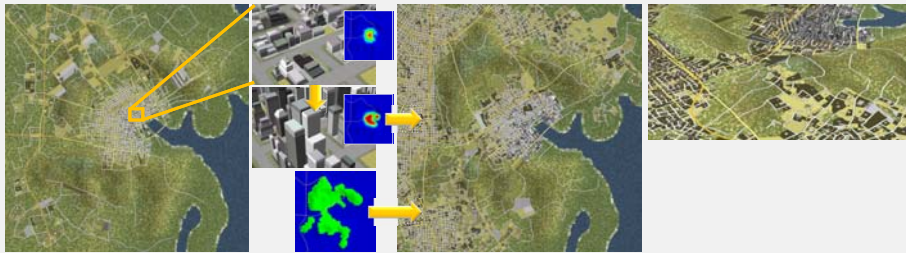


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## Bridging the gap between urban simulation, visualization and modeling

- **Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling**  
Vanegas, Aliaga, Benes, Waddell
- SIGGRAPH Asia 2009

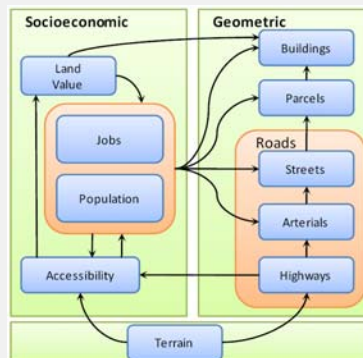
[Video](#)



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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

- Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

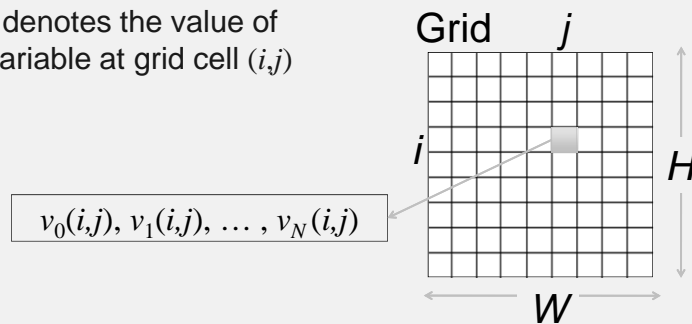


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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

- System

- Consists of  $N$  variables defined over a spatial domain
- Each variable sampled over a 2D spatial grid  $G$  of size  $W \times H$
- $v_k(i,j)$  denotes the value of  $k$ -th variable at grid cell  $(i,j)$

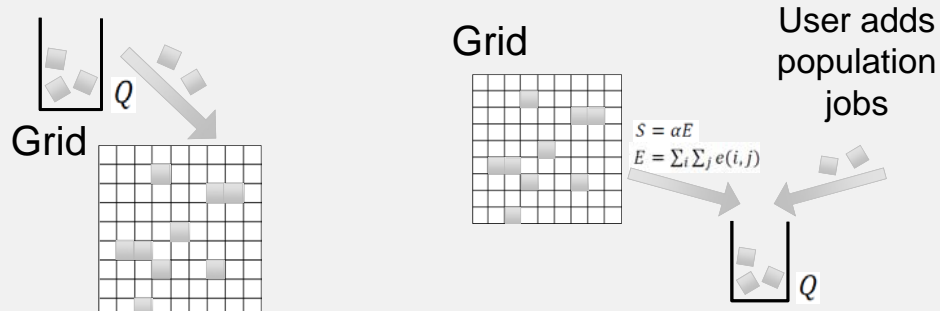


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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

- Operations

- Location and de-location of behavioral variables using location choice and mobility algorithms



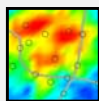
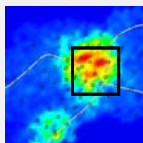


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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

- Arterials and Streets

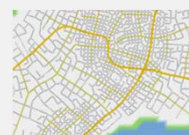
- Seeds



- Expansion of Arterials



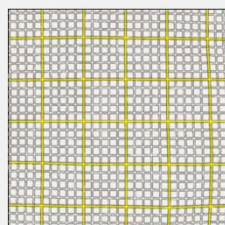
- Expansion of Streets



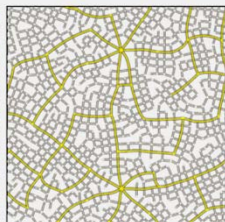
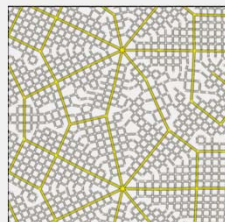
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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

Grid



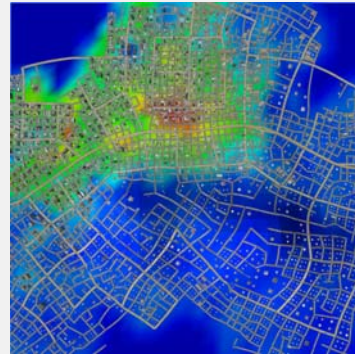
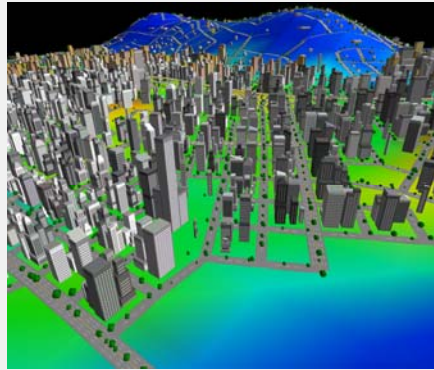
Radial



Tortuosity →

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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling



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## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

- Validation of urban behavioral+geometric simulation model



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## Procedural Buildings, Parcels and Cities

[Buildings Video](#)

[Parcels Video](#)

[Cities Video](#)

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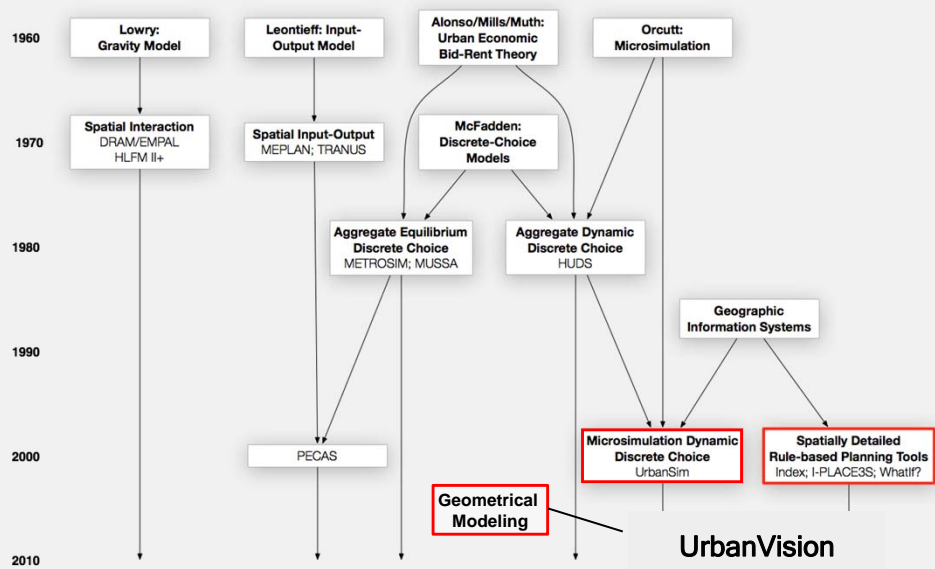
## Interactive Design of Urban Spaces using Geometrical and Behavioral Modeling

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## Genealogy: Land Use Models & Scenario Planning Tools

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## Stakeholders Create Scenarios Using Place Types

LAND USE CHIP SET

1	1	1	1	1	1	1	1	1	1	1	1
2	2	2	2	2	2	2	2	2	2	2	2
3	3	3	3	3	3	3	3	3	3	3	3
4	4	4	4	4	4	4	4	4	4	4	4
5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)	5(O)
5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)	5(R)
6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)	6(O)
6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)	6(R)
7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)	7(O)
7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)	7(R)
8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)	8(O)

Stakeholders assign place types to map: must match target population and employment



Source: SACOG

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## Fusion: Visioning, Modeling, Visualization

- Take the best elements of modeling and scenario planning and **hybridize**
- Use scenario planning to engage community in creating a preferred **Vision**
- Use disaggregate land use models to **Analyze** scenarios
- Use 3D visualization and indicators to **Visualize** scenarios
- This is the aim of the **UrbanVision** platform

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## The UrbanVision Project

- Funded by Metropolitan Transportation Commission, NSF, and the University of California (MRPI)
  - MTC Plan Bay Area, a Sustainable Communities Strategies Planning Process
  - Involves visioning, modeling, and visualization for community engagement
- Collaborative Project between UC Berkeley and Purdue University
- Summary:
  - Develop an extension to UrbanSim
  - Add 3D geometric modeling and rendering
  - Add flexible indicator and accessibility framework
  - Add scenario editing/creation interface

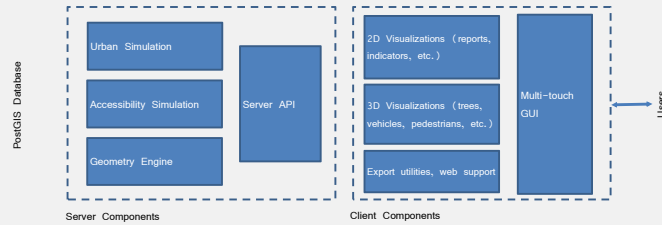
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## UrbanVision Design Elements and Use Cases

- **Use Case 1:** Visualize completed scenarios
  - Generate 3D buildings and streetscapes consistent with scenario
  - Support interactive exploration of 3D rendering, including comparison of scenarios
  - Generate animated visualization of traffic and pedestrians consistent with scenario
  - Generate indicators consistent with scenario
- **Use Case 2:** Generate detail for a zone-level scenario
  - Given initial vision-based scenario at a zone level, fill-in details
  - Use zoning editor to set zoning and overlays for scenario at a parcel level
  - Generate buildings within building envelopes, up to zone-level targets
  - Allocate target population and employment
- **Use Case 3:** Create, Model, and Visualize scenarios, generate preferred scenario
  - Use UrbanSim and new developer model + zoning editor + 3D Visualization

## UrbanVision System Design

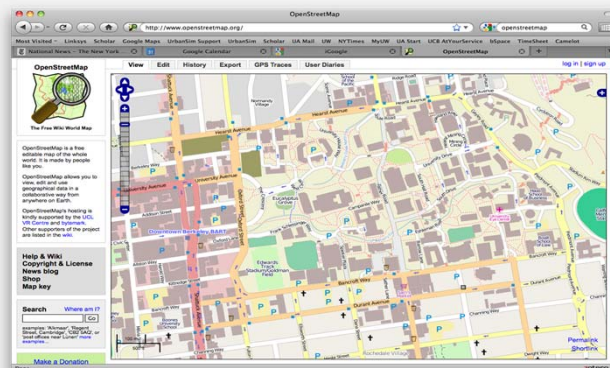
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## Data Sources

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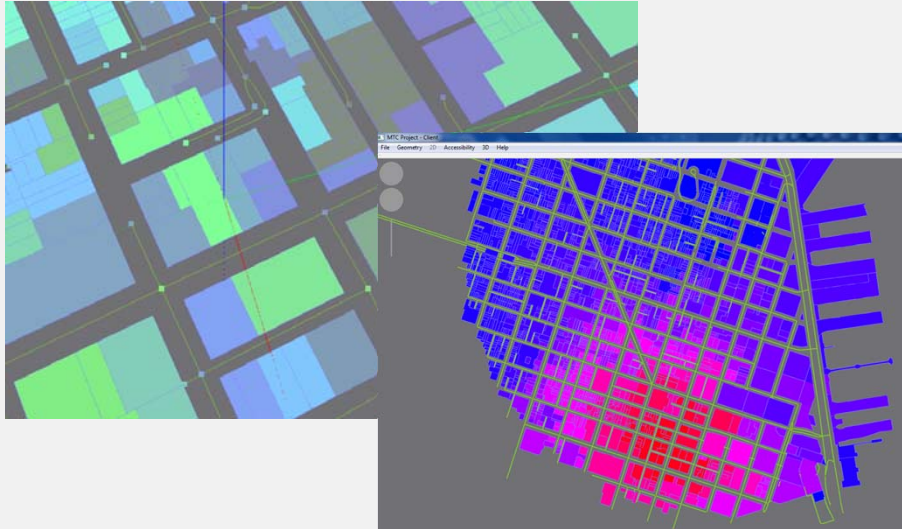
- Digital terrain models
- Digital orthophotos
- Street Network
  - [openstreetmap.org](http://openstreetmap.org)
- Parcels
- Building attributes
- Google buildings where available and of good quality
- Zoning
- General Plans
- Planned Developments
- Business establishments
- Synthesized population
- Planning boundaries





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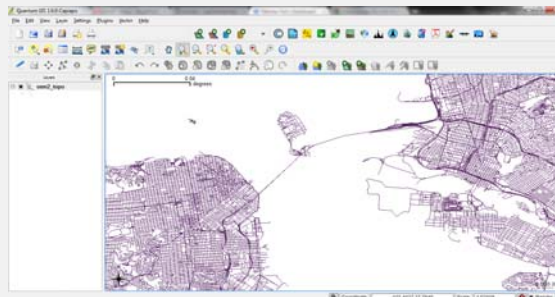
## Connecting Urban Geometry, Computing Accessibilities



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## San Francisco Bay Area Case Study

- Full street network - 463K street edges
- Full parcel set - 2.1M parcels
- Data stored as households, businesses, buildings





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## The “buffer query”

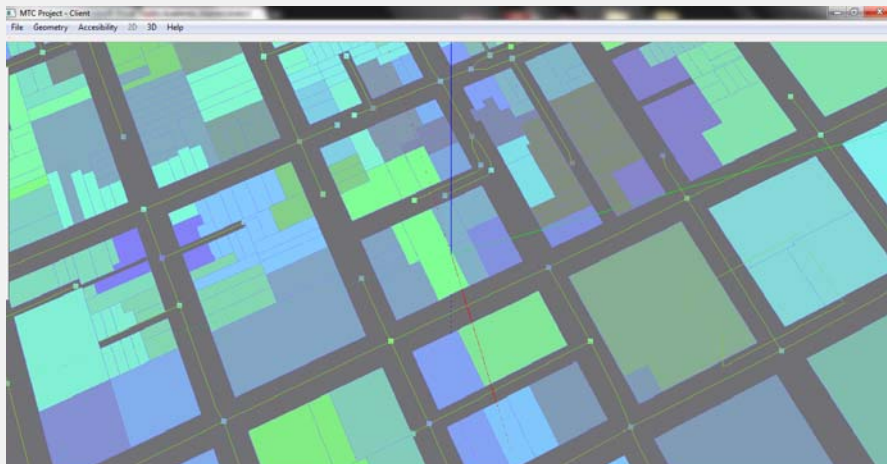
- Variables in location choice models
- Variables in travel model generators/attractors
- Real estate comparables
- Micro-accessibility measures for walkability



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## Parcel - Street Network Linkage

- Given a variable associated with a parcel, connect it to the street network and aggregate



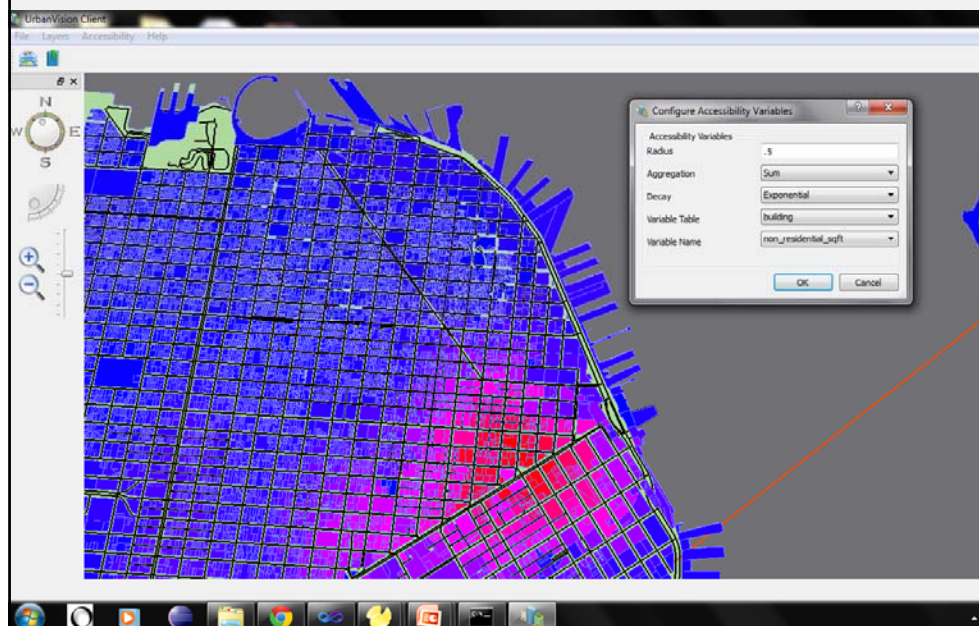
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## Types of Data

Parcels	Buildings	Households	Persons	Jobs
Parcel id	Building id	Household id	Person id	Job id
Zones, cities, zip code, etc.	Parcel id	Building id	Household id / Job id (if worker)	Building id
1.18 million parcels	1.0 million buildings	1.28 million households	3.2 million people	1.85 million jobs

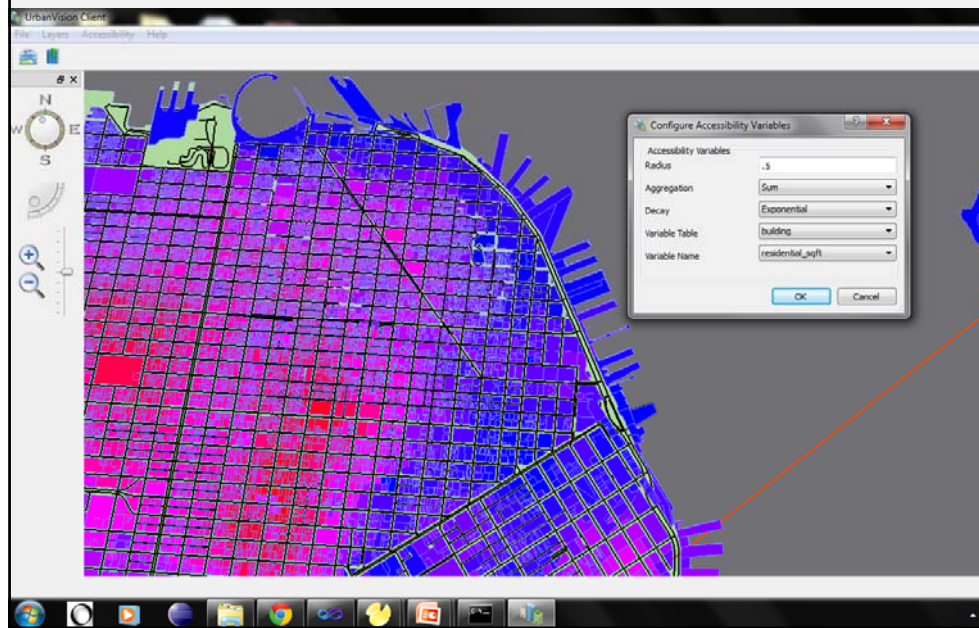
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## Heatmap #1: Non-residential Sqft



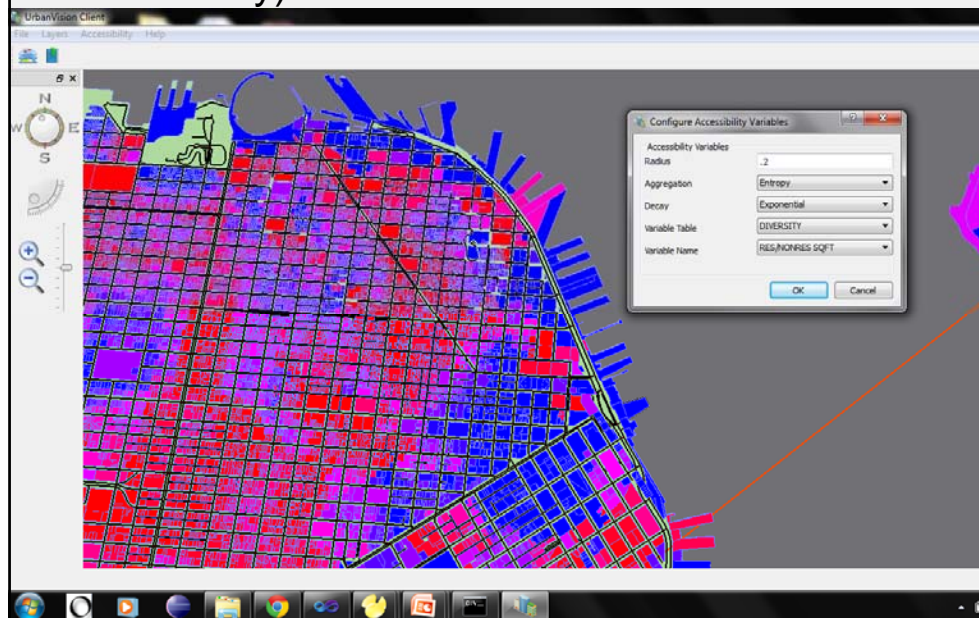
## Heatmap #2: Residential Sqft

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## Heatmap #3: Entropy Res/Nonres Sqft (areas of diversity)

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## Accessibility Engine: High-performance Accessibility Queries

- On a Bay Area all-streets network has 456K links, 355K Nodes, computing a Walk Score (our implementation), accumulating approximately 15 different Points of Interest for each node, takes less than 3 seconds.
- On a national all-streets network with approximately 12 million nodes, queries such as the number of intersections within 1/3 kilometer runs in 15 seconds (total, for all nodes in the national network)
- Point-to-Point Accessibilities (minimum path) queries are extremely fast:
  - Bay Area sized network: ~ 20-40 microseconds per query
  - Continental sized network: ~ 100 microseconds per query
- This Accessibility Engine is being developed into an API for use in models and other ad-hoc queries

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## Building Types in UrbanVision Used for Proforma Real Estate Modeling and for Procedural Modeling of 3D Buildings

Single-Family Detached	Includes Manufactured/Prefab/Mobile Homes
Single-Family Attached	Townhouses
Multi-Family	Includes Affordable/Senior Housing
Office	Includes Civic, Institutional, Infrastructure...
Hotel	
Light Industrial	
Warehouse Industrial	
Heavy Industrial	
Strip Mall	
Big-Box Retail	
Residential Focus Mixed	
Retail Focus Mixed	Includes Traditional Main Street Type
Employment Focus Mixed	Urban Village, Downtown

14 base types, total of 64 sub-types, used for both real estate modeling (pro-formas), and procedural modeling and rendering

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## Procedurally-Generated Buildings

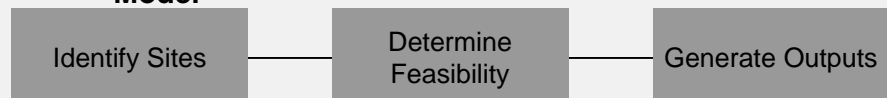
### Video



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## Developer Model Uses Geometry & Accessibility Engines

### Spec Development Model



- Optimize proforma NPVs of auto-generated, physically feasible, and entitled development proposals

- Provide information to parcel and building databases

### Fee Development Model

#### User Specified Events

- Accepts inputs from cities, counties, and others regarding redevelopment projects and other projects made possible by public subsidy rather than market demand



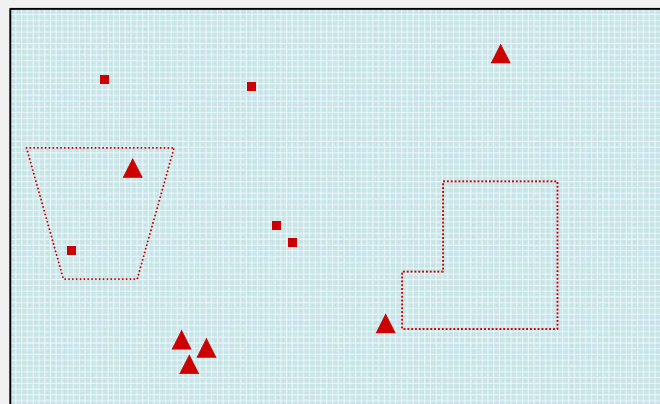
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## Layout of Planned Developments



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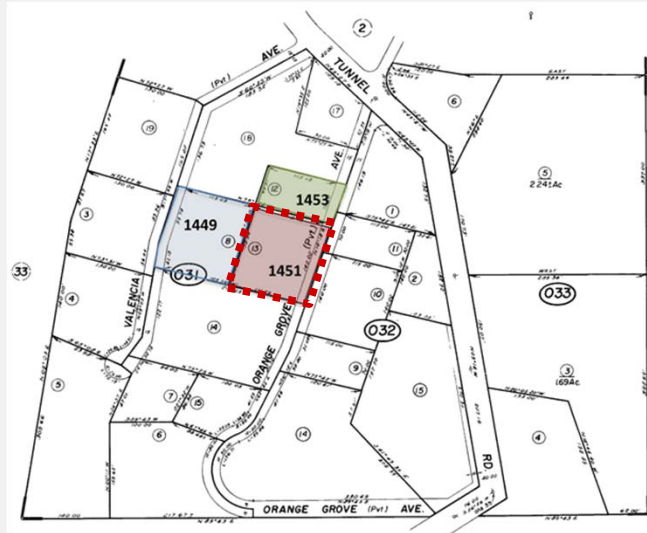
## Simulating Developer Site Selection Process Filtering on Spatial Criteria (what is adjacent and nearby)



▲ Underutilized property   ■ Listed property   ○ Hot market

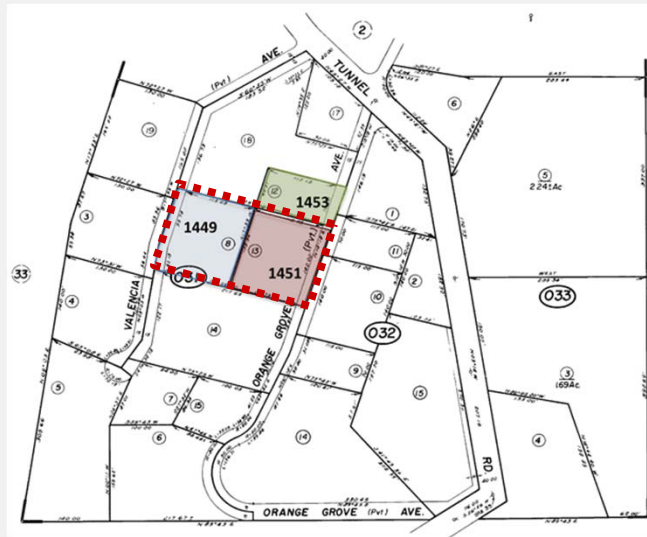
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## Considering Alternative Development Configurations for Redevelopment and Subdivision



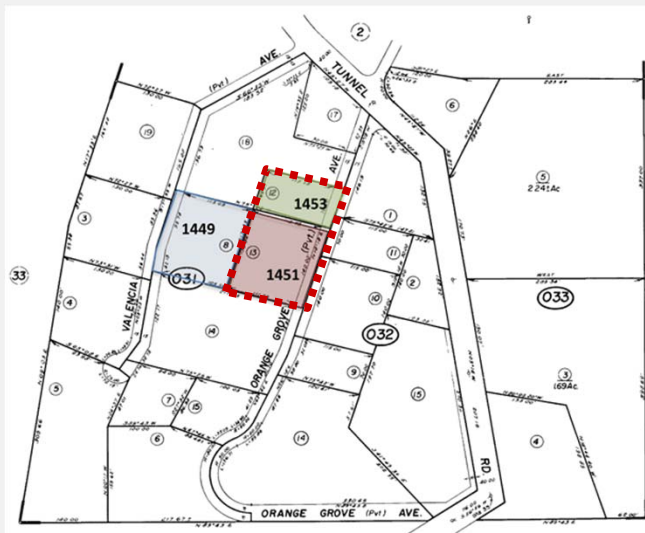
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## Considering Alternative Development Configurations for Redevelopment and Subdivision



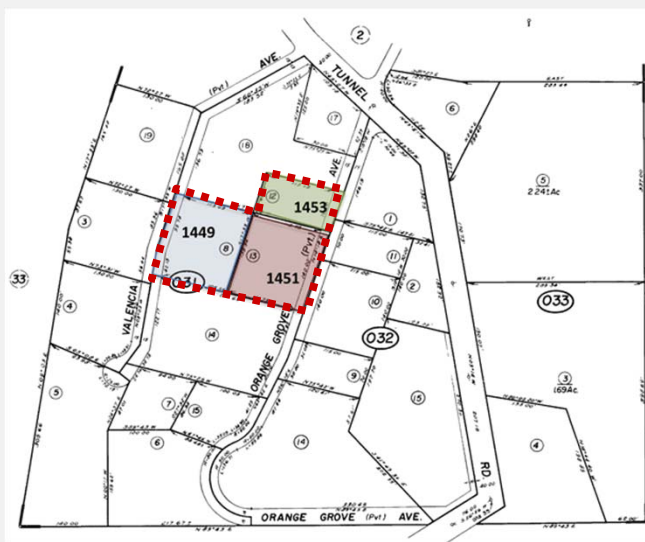
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## Considering Alternative Development Configurations for Redevelopment and Subdivision



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## Considering Alternative Development Configurations for Redevelopment and Subdivision





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## Doing Market Analysis

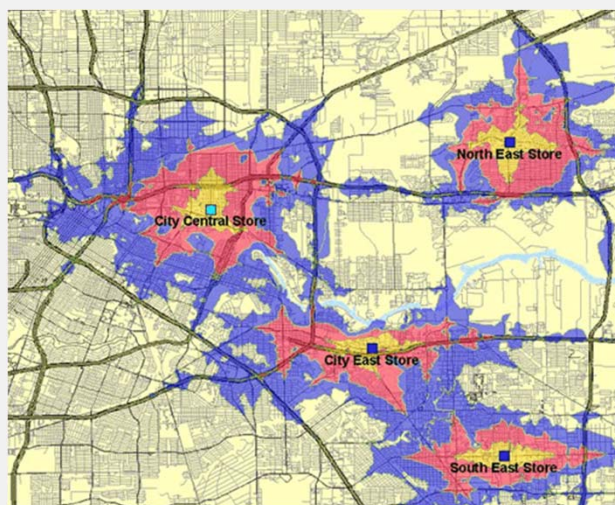
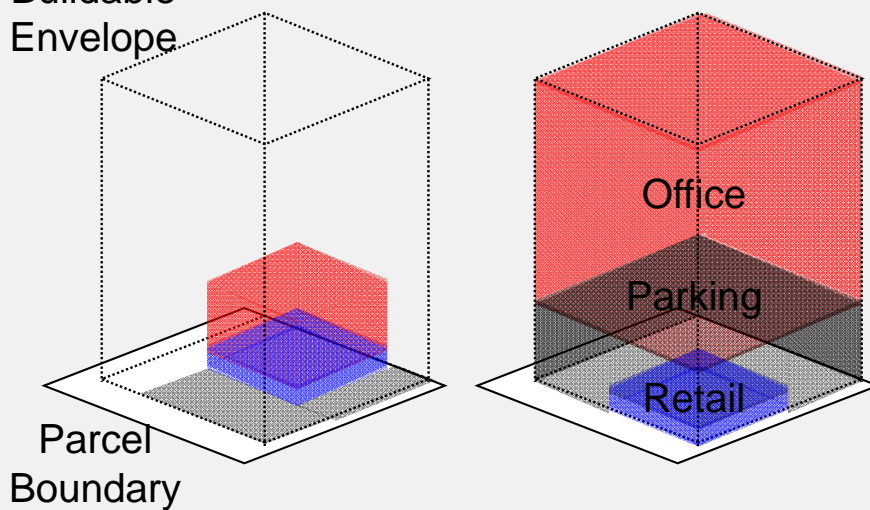


Image source: MappingAnalytics.com

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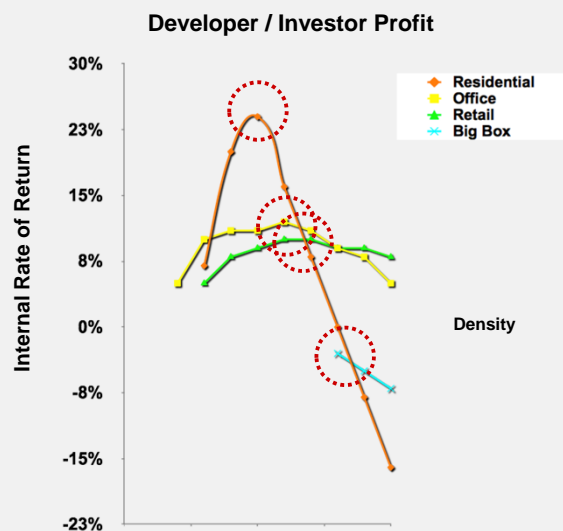
## Assessing Building Envelope from General Plan and Zoning

Buildable  
Envelope



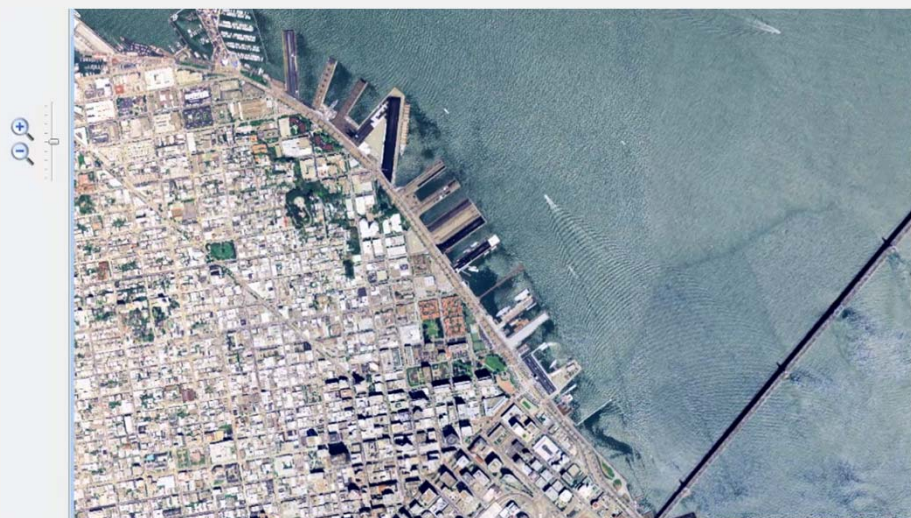
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## And Simulating the Proforma Analysis to Maximize Profit based on Alternative Densities and Uses



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## UrbanVision: Visualization Interface

[Video](#)

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## UrbanVision: Visualization Interface - Street View

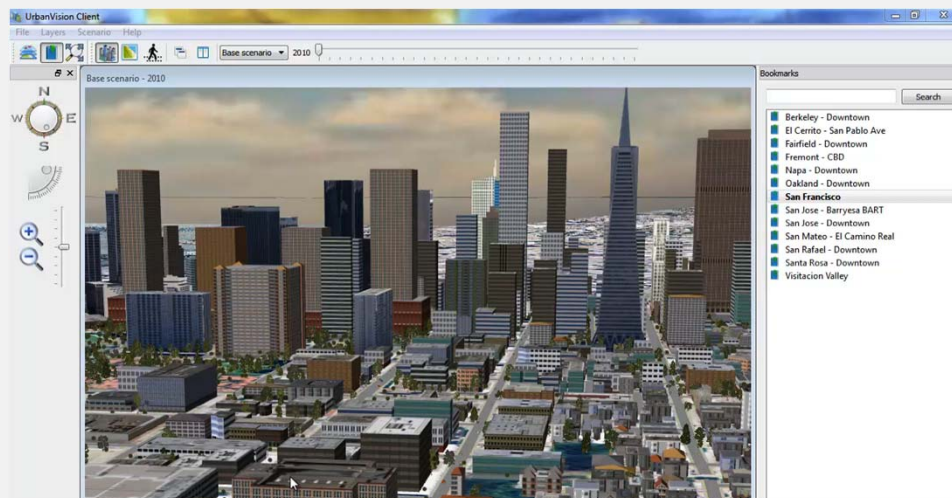
### Video



Paul Waddell, 2011

## UrbanVision: Indicator Workspace

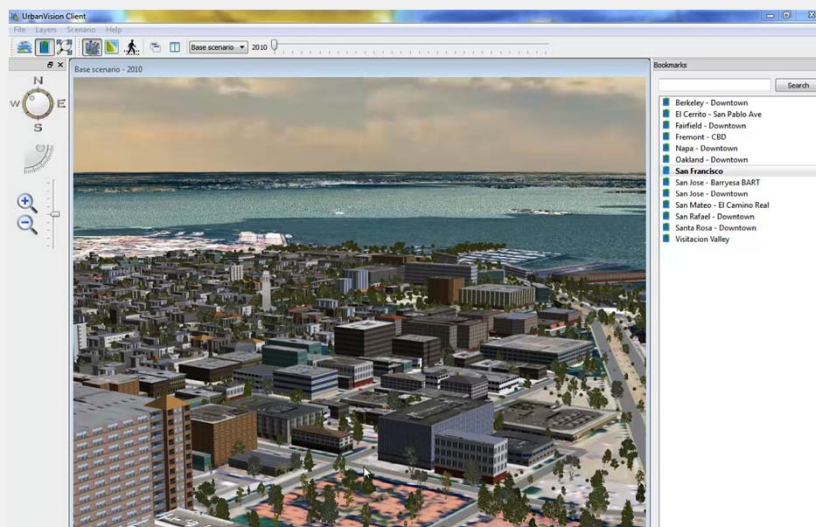
### Video



## UrbanVision: Zoning Editor Interface

Paul Waddell, 2011

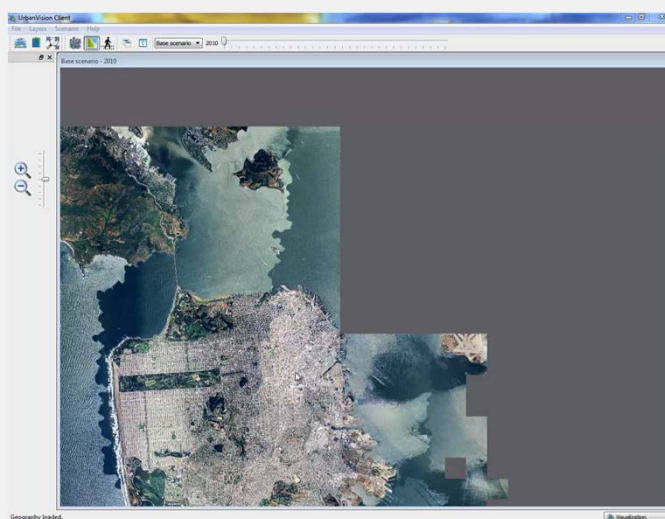
### Video



## UrbanVision: Travel Model Network Matching

Paul Waddell, 2011

### Video



Paul Waddell, 2011

## Summary and Next Steps

- Developed an integrated UrbanVision platform for
  - **Visioning**: engaging communities in designing their future
  - **Modeling**: analyzing alternative land use and transportation policy/design scenarios
  - **Visualizing**: 3D representation of alternative scenarios, with indicators
- Developed efficient pedestrian-scale accessibility and urban design calculator
- Implementing a realistic real estate development simulator
- Tightly coupling: UrbanSim+Activity-Based Travel Model+UrbanVision
- Will launch in public workshops in the Bay Area in January 2012
- **Immersive Cities Lab** at UC Berkeley

## Questions and Discussion

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