



# Taking a Data Informed Look at the Prosperity of City Neighborhoods

A Decision Support Tool for the City of Austin

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# Office of Innovation

The Innovation Office is a **nimble team with well-rounded expertise**. We are unique in that we:

Work effectively with **internal and external partners** on civic innovation projects.



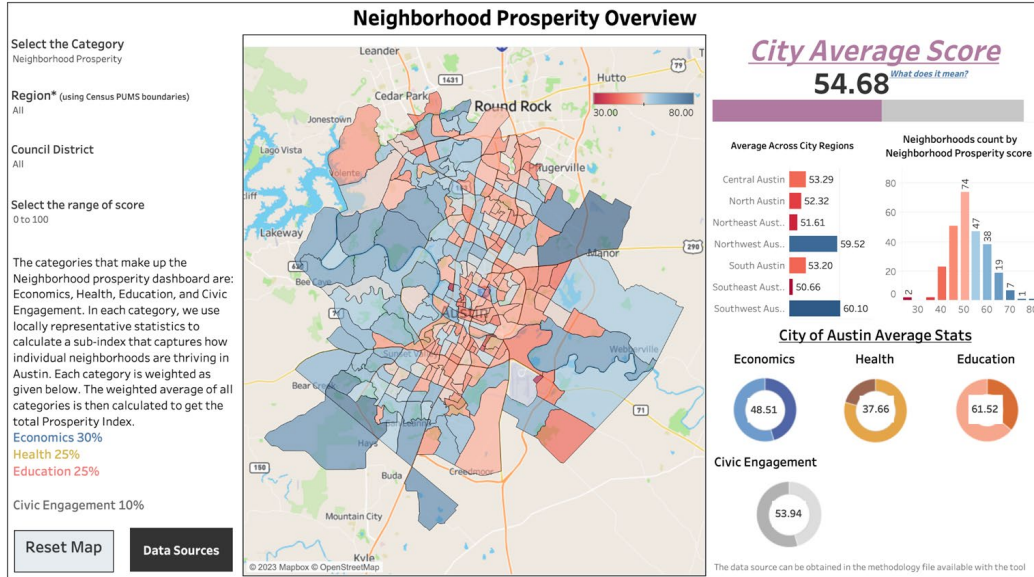
Can work at all levels, from **informal advising** to **full-scale program design** and management.

Collaborate with **diverse teams** on **complex topics**, beginning at high levels of abstraction.



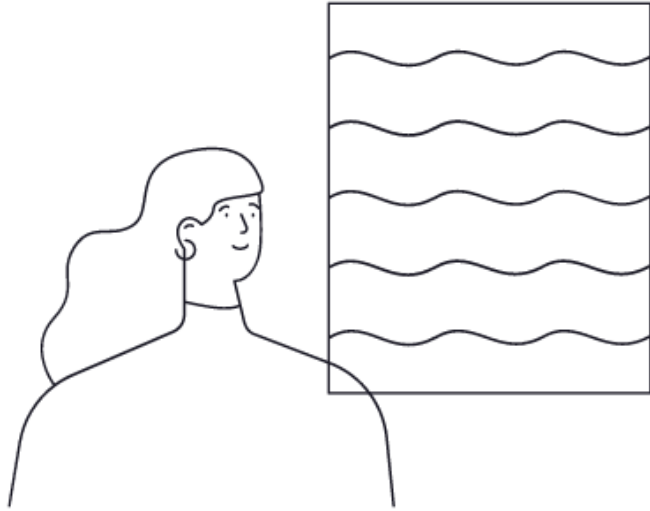
Are **topic-agnostic**: we can work on almost anything, and collaborate/hand off as appropriate.

# The Neighborhood Prosperity Dashboard



- Current state of demographic, health, economic, and social factors on a neighborhood scale.
- Most recent data available, automatically updates.
- Supports insights and decisions that are more current, clear, and specific.

# Decision Support Tools



**Decision Support Tools** sharpen our ability to **analyze large amounts of data from disparate data sets** so that the organization can **operate in a data-informed** way.

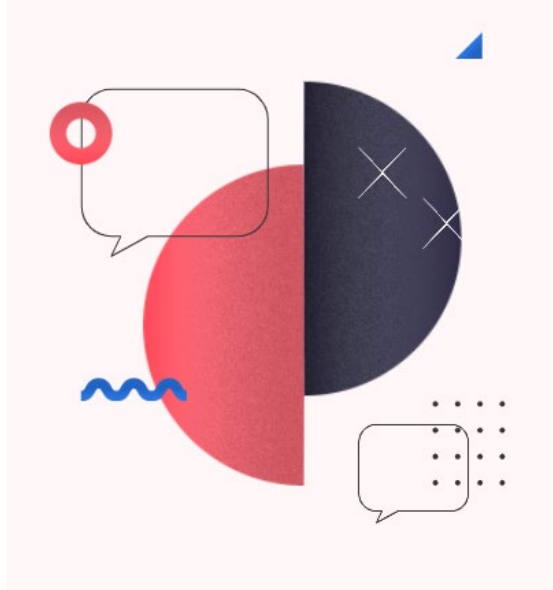
They:

- Use **visuals** to present data in various formats and can include, maps, graphs, charts, icons, toggles, illustrations, animations and more.
- Can be **interactive, dynamic, and automated**.
- Can point us in certain directions, but we **must combine them with practitioner knowledge to address the complexity in our environments of practice**.

# Data-informed Decision-making Challenges

Data often does not cross org silos, but people's life experiences are much more complex than the divisions in our org structure.

Data is often presented at a city-wide or zip code level, but reality at the neighborhood level is often more nuanced.



It is difficult to see and interpret the complexity of residents' lived experience because our data sets are not combined and sometimes not racially disaggregated.

Data in reports and plans are static snapshots that depend on manual updating, which usually does not occur.

Without a meaningful way to integrate qualitative inputs, our practice stays superficial and we risk being tone deaf to community sentiment.

# COA's Neighborhood Prosperity Dashboard (NPD)

- **Holistic:** provides a way to think across categories of the experience: health, economics, education, civic engagement, incorporating 34 different locally representative statistics.
- **Precise:** neighborhood-level data for 266 census tracts.
- **Outcomes-oriented:** factors depict outcomes experienced in neighborhoods, pushing NPD users to consider outcomes when assessing and planning action.
- **Up-to-date:** incorporates automatically ingests and analyzes new data as it is available.

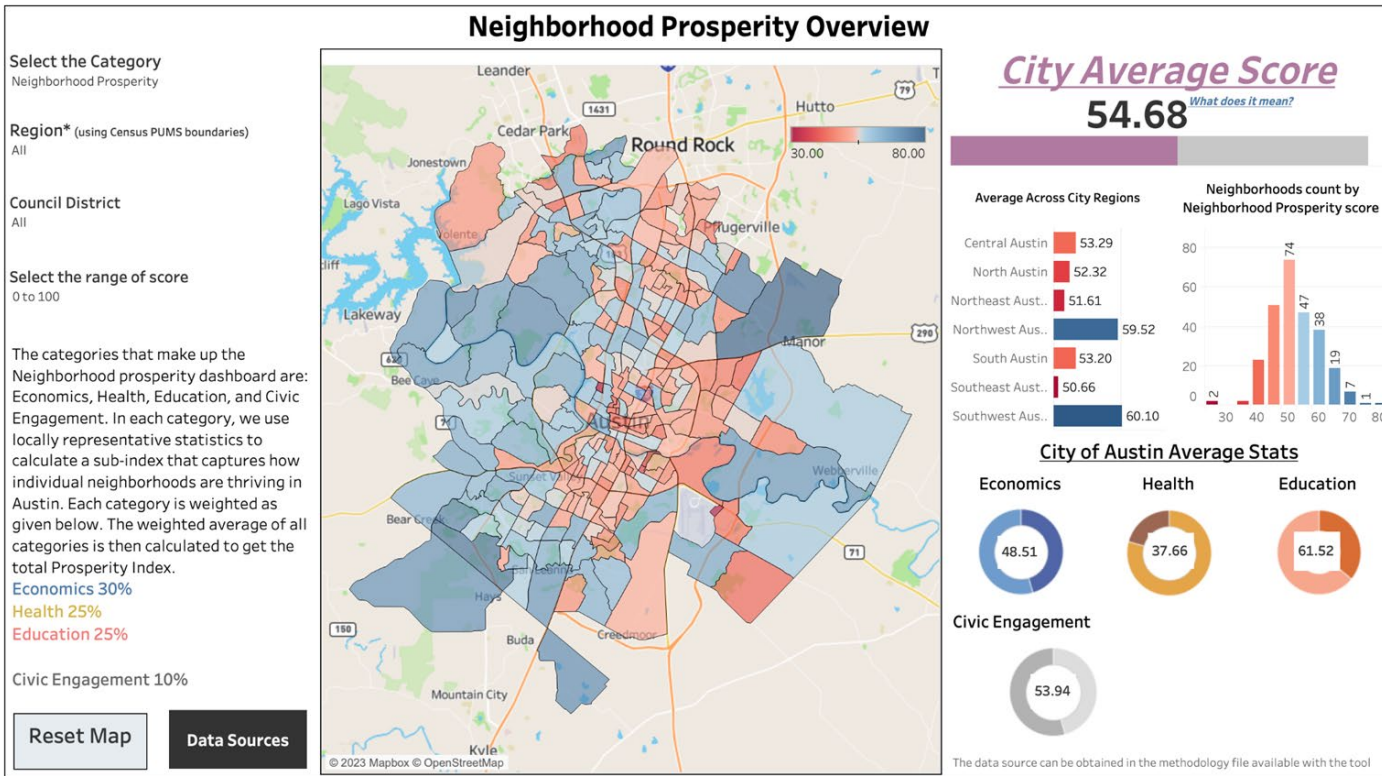
# Methodology

- Census tract-level data for the entire Austin MSA region.
- Uses publicly available sources including the American Community Survey (ACS), CDC PLACES, and others. Also uses data sources from the City of Austin's Open Data Portal, and others that City departments provide.
- Pulls ACS data with an in-house tool that uses the Census public API.
- The tool performs specific functions for each dataset to produce the final combined dataset.
- Data is cleaned and scaled against the highest valued neighborhood. Measures are then combined using a weighted average method.
- Weights and calculations for index scoring are based on methodology from the National Urban League.

# Overview

Navigate by clicking through tabs to see other dashboards

Dropdown filters to select different geographies and prosperity category



Count of neighborhood by range of total score

Link to go to methodology and data sources document

Map shows census tract boundaries and total score as a color factor (High score -> Bluer Color)

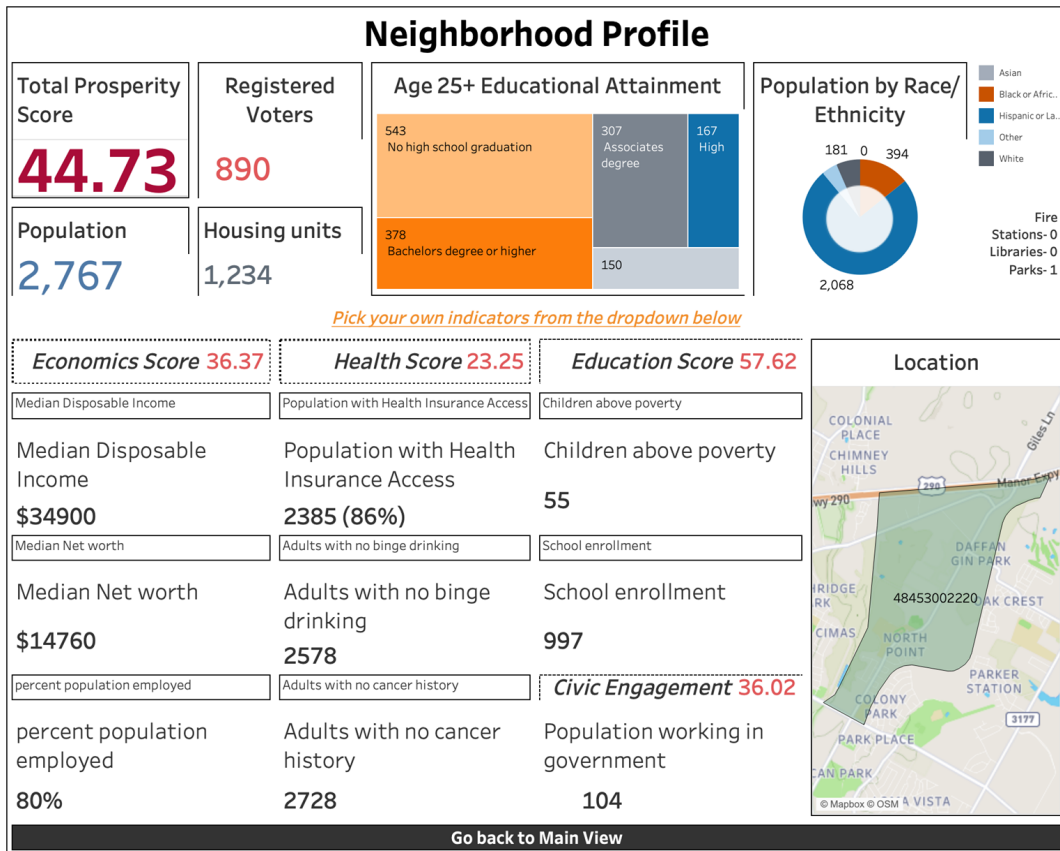


# Neighborhood Profile View

Every census tract has a dashboard view where you can view all factors.

You can also use dropdowns to customize what is displayed on the dashboard.

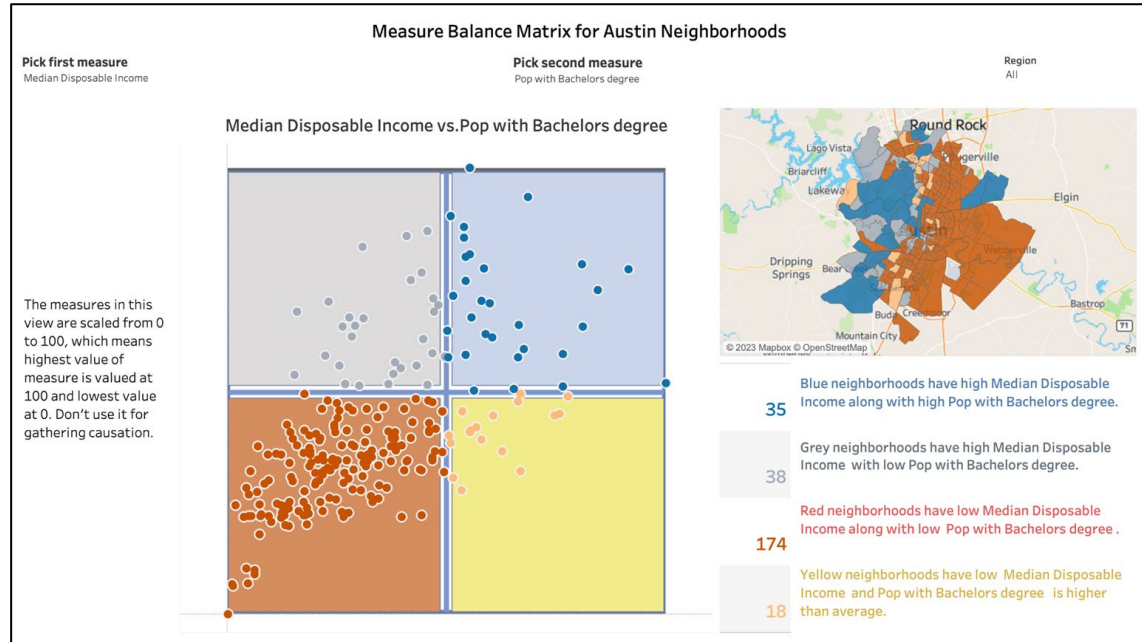
There is also a comparison view where you can view dashboards for two neighborhoods side-by-side



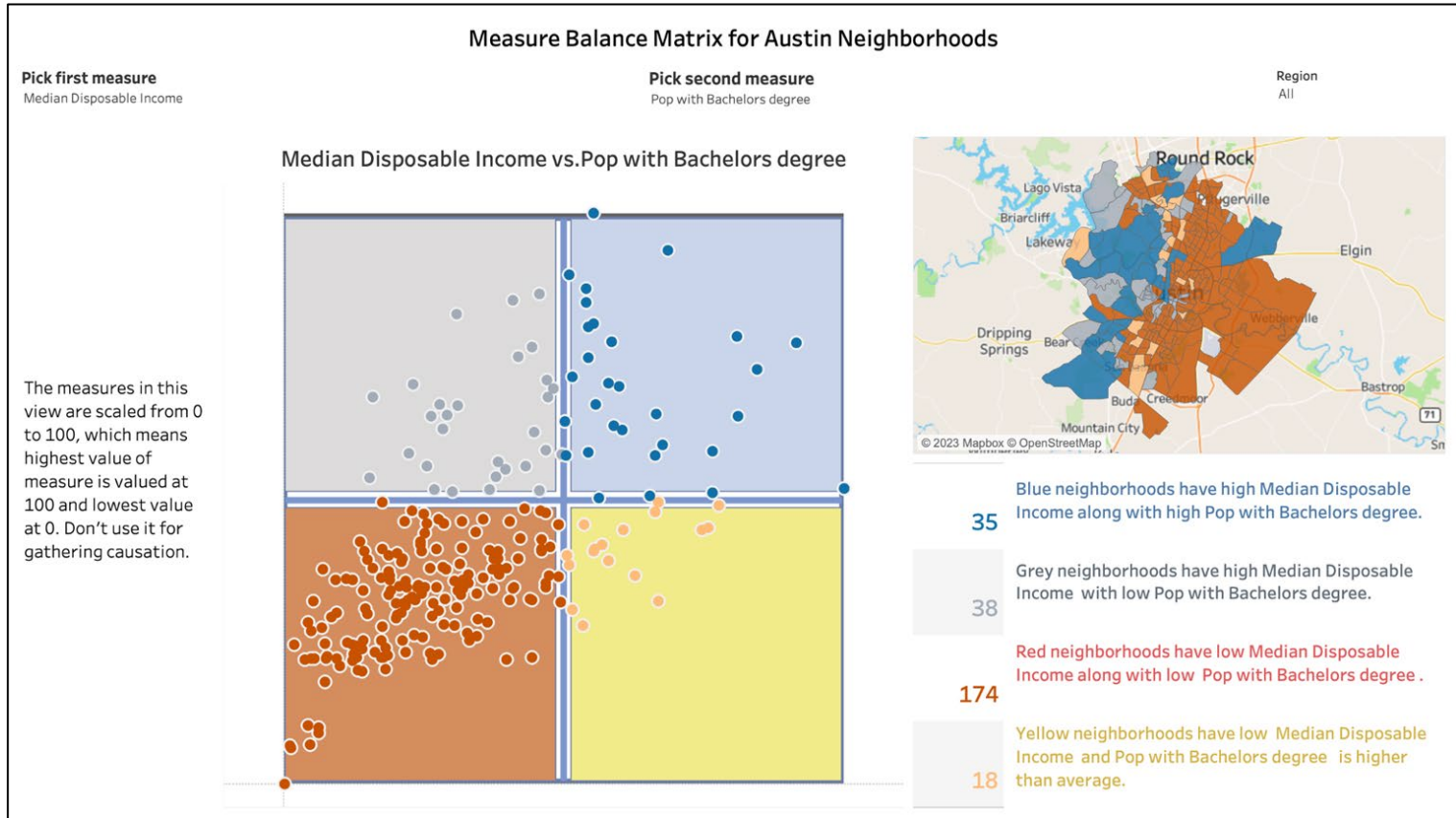
# Measure Comparison Scatter Plot - Concept

This view lets you see how and where the combined effects of two factors are distributed along a trend line.

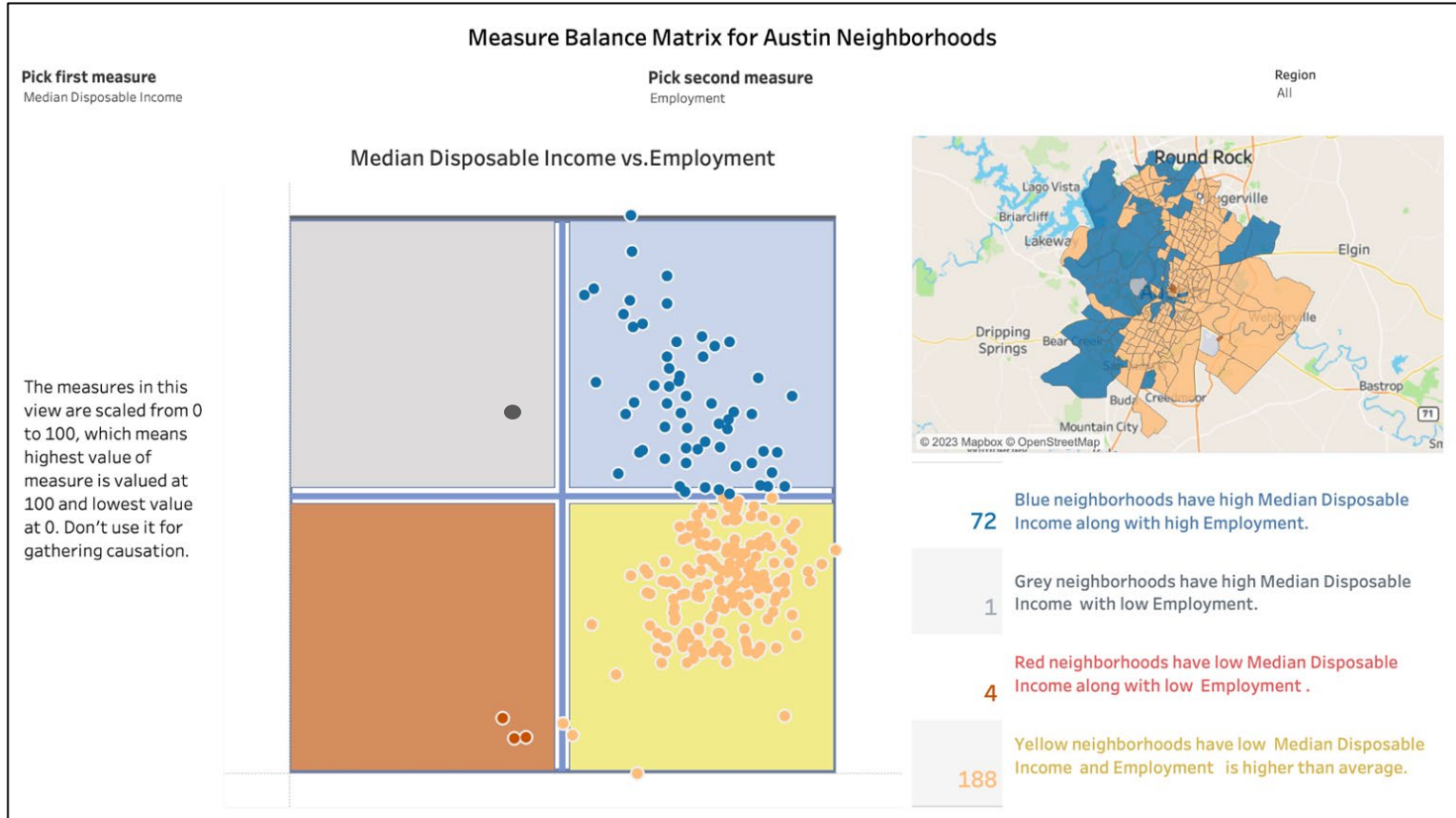
“How, where, and to what extent do these two factors manifest in Austin neighborhoods?”



# Measure Comparison Scatter Plot - Income vs Age 25+ with Bachelor's Degree



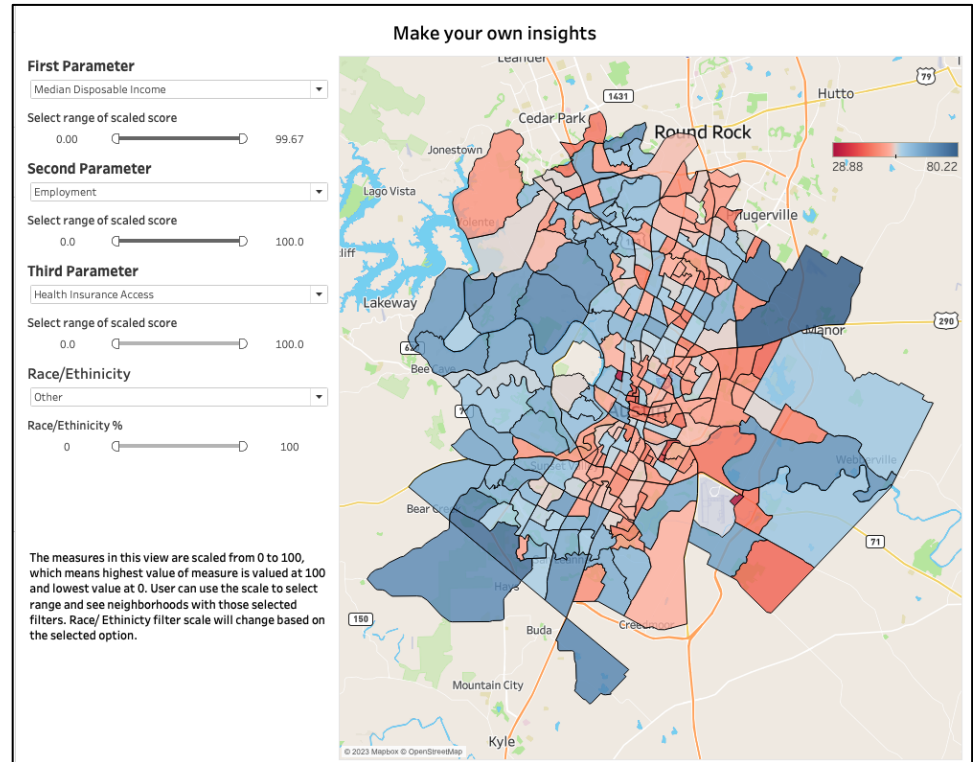
# Measure Comparison Scatter Plot - Income vs Employment Rate



# Make your own insights - Concept

This view lets you create combinations of factors at different intensity levels to see where those conditions are true.

“Show me where conditions X, Y, and Z are true.”



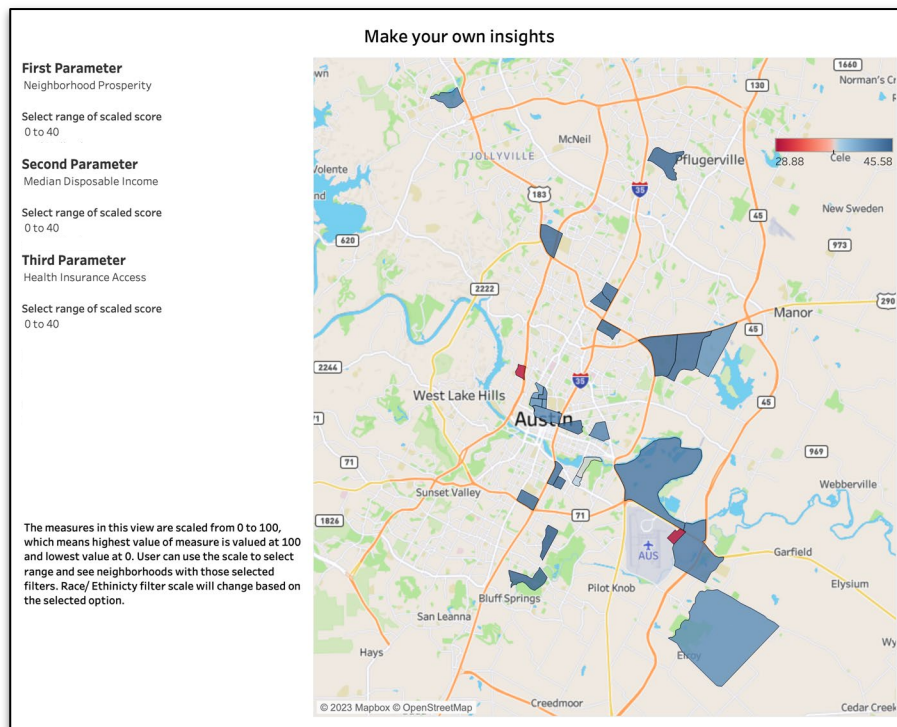
The measures in this view are scaled from 0 to 100, which means highest value of measure is valued at 100 and lowest value at 0. User can use the scale to select range and see neighborhoods with those selected filters.

# Make your own insights- Result

Hypothetical: Where can we best direct program resources to improve access to health care?

We used following filters:

- Bottom 40% for overall prosperity score
- Bottom 40% for Median Disposable Income
- Bottom 40% for Health Insurance Access



The measures in this view are scaled from 0 to 100, which means the highest value of the measure is valued at 100 and lowest value at 0. The user can use the scale to select range and see neighborhoods with those selected filters.

# Data Sources

<b>Data Source</b>	<b>Link to access</b>
American Community Survey (ACS)	<a href="https://www.census.gov/programs-surveys/acs/data.html">https://www.census.gov/programs-surveys/acs/data.html</a>
CDC PLACES	<a href="https://www.cdc.gov/places/index.html">https://www.cdc.gov/places/index.html</a>
ESRI Demographics Data	<a href="https://www.esri.com/en-us/arcgis/products/data-management">https://www.esri.com/en-us/arcgis/products/data-management</a>
Austin ISD Open Data	<a href="https://www.austinisd.org/planning-asset-management/district-demographics">https://www.austinisd.org/planning-asset-management/district-demographics</a>
Travis County Voters record	<a href="https://tax-office.traviscountytexas.gov/about-us/reports-data/voters">https://tax-office.traviscountytexas.gov/about-us/reports-data/voters</a>
City of Austin Open Data Portal	<a href="https://data.austintexas.gov/">https://data.austintexas.gov/</a>

# Data Currently Available

## **Economics**

Median Disposable Income

Age 16+ Employed Population

Above Poverty Population

Median Net Worth

Median Rent

Median Housing Cost

Access to internet

Access to a car

## **Education**

Population over 25 with bachelor's degree

Population over 25 with High School diploma

School Enrollment for all ages

Children living above Poverty

Children with Internet Access



## Health

Adults with no cancer history

Adults with no diagnosed diabetes

Adults with no kidney disease history

Adults with no stroke history

Adults with no obesity

Health Insurance Access

Adults with routine checkup last year

Adults with self-rated good health

Adults with no binge drinking

Adults with good mental health for last 14 days

Adults with no depression record

## Civic Engagement

Percentage of voters who voted in last national election

Residents who work in government

## Other Variables

Population by Race/ Ethnicity

Population by Educational Attainment

Number of Parks, Libraries and Fire Stations

Housing Units

Registered Voters

# All potential factors

1. Median Household Income ( Real) Dollars
2. Median Male Earnings, Dollars
3. Median Female Earnings, Dollars
4. Total population
5. Race: White
6. Race: Black or African American
7. Race: Asian
8. Race: Hispanic or Latino
9. Race: Other
10. Population Living Above Poverty Line
11. Children above poverty line
12. Population Living Below Poverty Line (18-64)
13. Percent of population employed
14. Unemployment Rate
15. State government workers
16. Local government workers
17. Federal government workers
18. Percent of Owner-Occupied Households
19. Percent of Renter Occupied Households
20. People with health insurance
21. Median Home Value
22. Median Home Value
23. Households With Computer at Home (Desktop or Laptop)
24. Households With Internet Access
25. Adult Users with Broadband Access
26. Under 18 with internet access at home
27. Means of Transportation to Work: Drive Alone
28. Means of Transportation to Work: Public Transportation
29. Car ownership by household
30. Median Gross Rent
31. Employment (Male)
32. Employment (Female)
33. Employment (Ages 16-19)
34. In Workforce (16-19)
35. In Workforce (16 and older)
36. Median monthly housing costs
37. People over 25 - High school graduation
38. People over 25 - Some college, no degree
39. People over 25 - Associates degree
40. People over 25 - Bachelor's degree or higher
41. People over 25 - No high school graduation
42. School Enrollment: All Ages

# All potential factors cont.

43. Preprimary School Enrollment %
44. Ages 3-4 enrolled in school %
45. Ages 5-9 enrolled in school %
46. Ages 10-14 enrolled in school %
47. Ages 15-17 enrolled in school %
48. Ages 18-19 enrolled in school %
49. Ages 20-24 enrolled in school %
50. Ages 25-34 enrolled in school %
51. Ages 35 and over enrolled in school %
52. Bachelor's degree or higher: Science and Engineering
53. Bachelor's degree or higher: Business
54. Bachelor's degree or higher: Education
55. Bachelor's degree or higher: Arts, Humanities and Others
56. year
57. Crashes
58. FatalCrashes
59. All teeth not lost among adults aged  $\geq 65$  years
60. No arthritis among adults aged  $\geq 18$  years
61. No binge drinking among adults aged  $\geq 18$  years
62. No cancer (excluding skin cancer) among adults aged  $\geq 18$  years
63. Cervical cancer screening among adult women aged 21-65 years
64. Cholesterol screening among adults aged  $\geq 18$  years
65. No chronic kidney disease among adults aged  $\geq 18$  years
66. No chronic obstructive pulmonary disease among adults aged  $\geq 18$  years
67. No coronary heart disease among adults aged  $\geq 18$  years
68. No asthma among adults aged  $\geq 18$  years
69. People with health insurance among adults aged 18-64 years
70. No smoking among adults aged  $\geq 18$  years
71. No depression among adults aged  $\geq 18$  years
72. No diagnosed diabetes among adults aged  $\geq 18$  years
73. Good self-rated health status among adults aged  $\geq 18$  years
74. Fecal occult blood test, sigmoidoscopy, or colonoscopy among adults aged 50-75 years
75. No high blood pressure among adults aged  $\geq 18$  years
76. No high cholesterol among adults aged  $\geq 18$  years who have been screened in the past 5 years
77. Mammography use among women aged 50-74 years
78. Mental health good for  $\geq 14$  days among adults aged  $\geq 18$  years

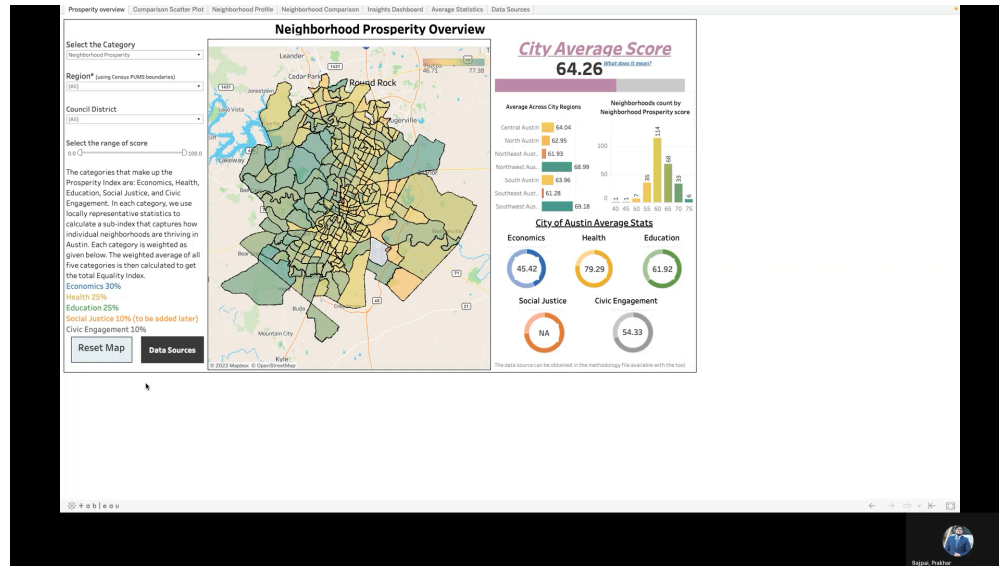
# All potential factors cont.

79. Leisure-time physical activity among adults aged  $\geq 18$  years
80. No obesity among adults aged  $\geq 18$  years
81. Older adult men aged  $\geq 65$  years who are up to date on a core set of clinical preventive services: Flu shot past year, PPV shot ever, Colorectal cancer screening
82. Older adult women aged  $\geq 65$  years who are up to date on a core set of clinical preventive services: Flu shot past year, PPV shot ever, Colorectal cancer screening, and Mammogram past 2 years
83. Physical health good for  $\geq 14$  days among adults aged  $\geq 18$  years
84. Sleeping more than 7 hours among adults aged  $\geq 18$  years
85. No stroke among adults aged  $\geq 18$  years
86. Not taking medicine for high blood pressure control among adults aged  $\geq 18$  years with high blood pressure
87. Visits to dentist or dental clinic among adults aged  $\geq 18$  years
88. Visits to doctor for routine checkup within the past year among adults aged  $\geq 18$  years
89. AFD: Priority 1
90. AFD: Priority 2
91. AFD: Priority 3
92. AFD: Priority 4
93. AFD: Priority 5
94. AFD: Abdominal Pain
95. AFD: Alarm Activation Med
96. AFD: Allergic Reaction
97. AFD: Altered Mentation
98. AFD: Animal Bite
99. AFD: Assault
100. AFD: Attended Patient
101. AFD: Back Pain
102. AFD: Burn
103. AFD: Chest Pain
104. AFD: Choking
105. AFD: Diabetic
106. AFD: Electrocutation
107. AFD: Environmental Exposure
108. AFD: Eye Injury
109. AFD: Fall
110. AFD: Gunshot Wound
111. AFD: Hanging
112. AFD: Headache
113. AFD: AFD: Heart Problems

# Demo 1: A holistic approach to vulnerability

**Commonly used terms** like “vulnerable”, “economic mobility”, or “wealth” used across many City publications, programs, service, and resources are often undefined or oversimplified. This makes them difficult to measure.

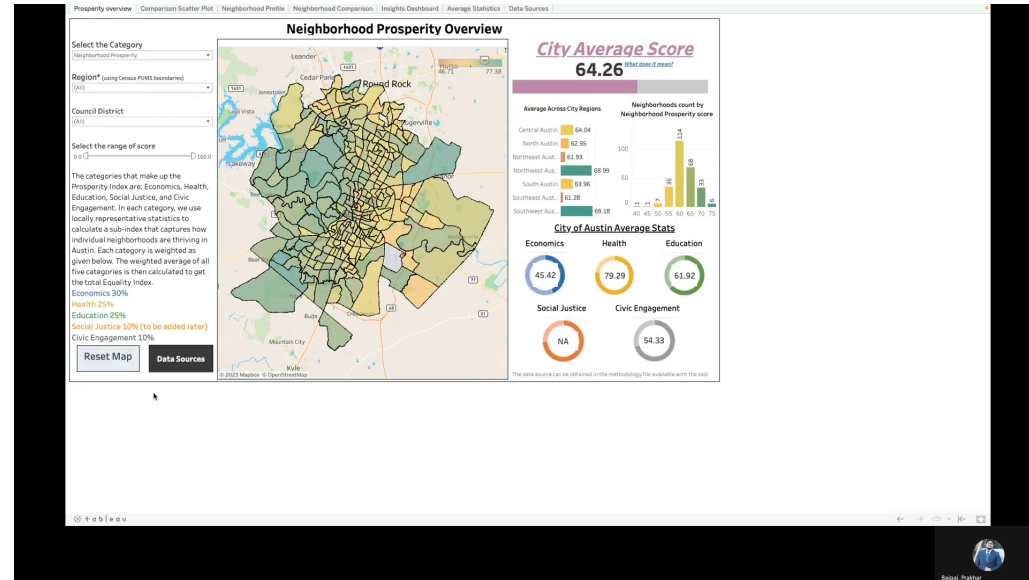
**How can a decision support tool help the City define and measure practice terms toward a more calibrated, data-informed approach?**



# Demo 2: Index score vs. single indicator

We can miss the full picture of lived experience and even misrepresent it, cause erasure, or exclude people when we **use single indicators to determine how we deliver** programs and services or to establish selection criteria.

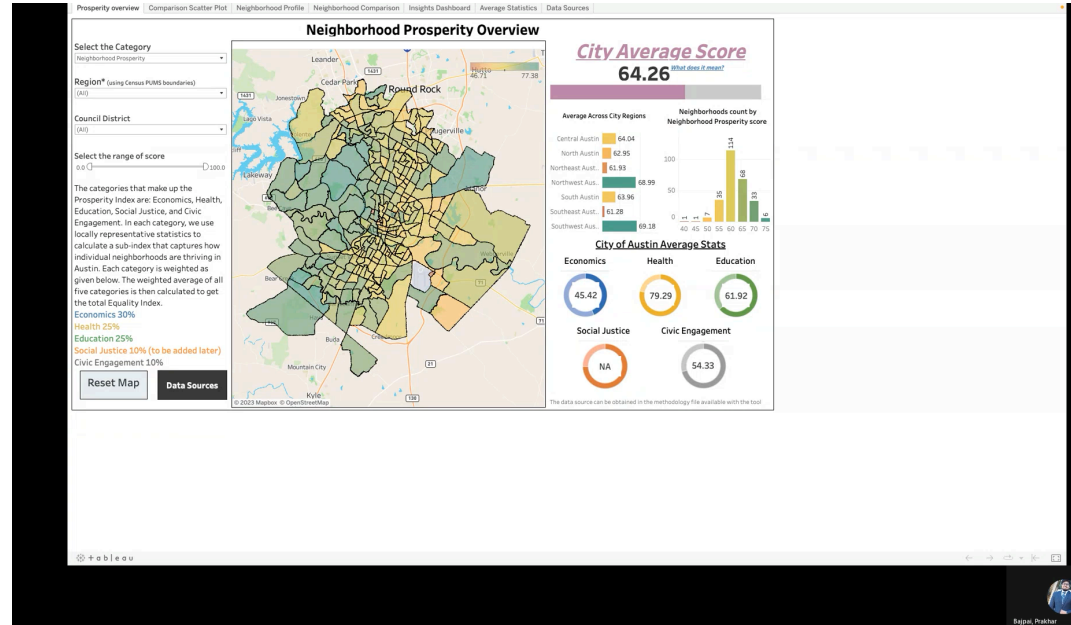
**What happens when you consider the prosperity of neighborhoods based on a single indicator like the employment rate vs. looking at a more robust group of indicators together like the Neighborhood Prosperity Index Score?**



# Demo 3: Make your own insights

**Static reports, briefs, and neighborhood profiles** don't let the end user interact with data to craft insights; they restrict the user to predetermined insights that may not be useful for their use cases.

**What is possible with a Decision Support Tool v. a static offering?**





## Acknowledgements

### **Innovation Office Team Members on this Project**

Prakhar Bajpai  
Alba Sereno  
Ian Sapp  
Daniel Culotta  
Vicky Pridgen

### **Co-Creation Contributors**

HPD - Displacement Prevention Team,  
Demographer  
EDD - Small Business Division  
Sustainability - Food Systems Team  
APH - Office of Violence Prevention  
EMS  
Office of Police Oversight

### **Executive Sponsor**

City Manager Office

### **External Collaborators**

AISD





## Next Steps

The NPD is growing over time to include both **current state** and **forecasting and scenario visualizations**.

### In 2023:

- The **current state** component is available to City Staff (Q1 2023).
- IO has initiated **continuous improvement** for the current state component by constructing and integrating **departmental use cases** with City staff
- IO is undertaking a **sprint** to explore how we might integrate **neighborhood assets data**. We will ID the types of decisions this data can support, and what data is feasible to obtain, integrate, and upkeep.
- IO is working with UT researchers to architect and **integrate forecasting and scenario analysis** models that will help the City grow its futures practice.



**Thank you !**

**Questions?**

**Contact**

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**Link to [Neighborhood Prosperity Dashboard](#)**