



Analysis and Characterization of Community Projects for Resilience

Innovations in Climate Resilience

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Session B1

**The views expressed in this presentation are those of the author and do not necessarily represent the views or the policies of the U.S. Environmental Protection Agency.*



Hello there!

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Office of Research and Development

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As one of the UN's Sustainable Development Goals, city resilience is now accepted as a critical urban agenda. But how can we make resilience **tangible** and **practical** for cities? How can resilience be applied by cities to build sound strategies and prioritise investments?

Prevailing resilience literature and applications alike inadequately research what is otherwise standard practice in web application development: **understanding the audience.**

OUR OBJECTIVE: INFORM PRACTICAL RESILIENCE APPLICATION

Research underpinning public-facing storymap development

1) Develop resilience lexicon

- Summarize academic-defined criteria

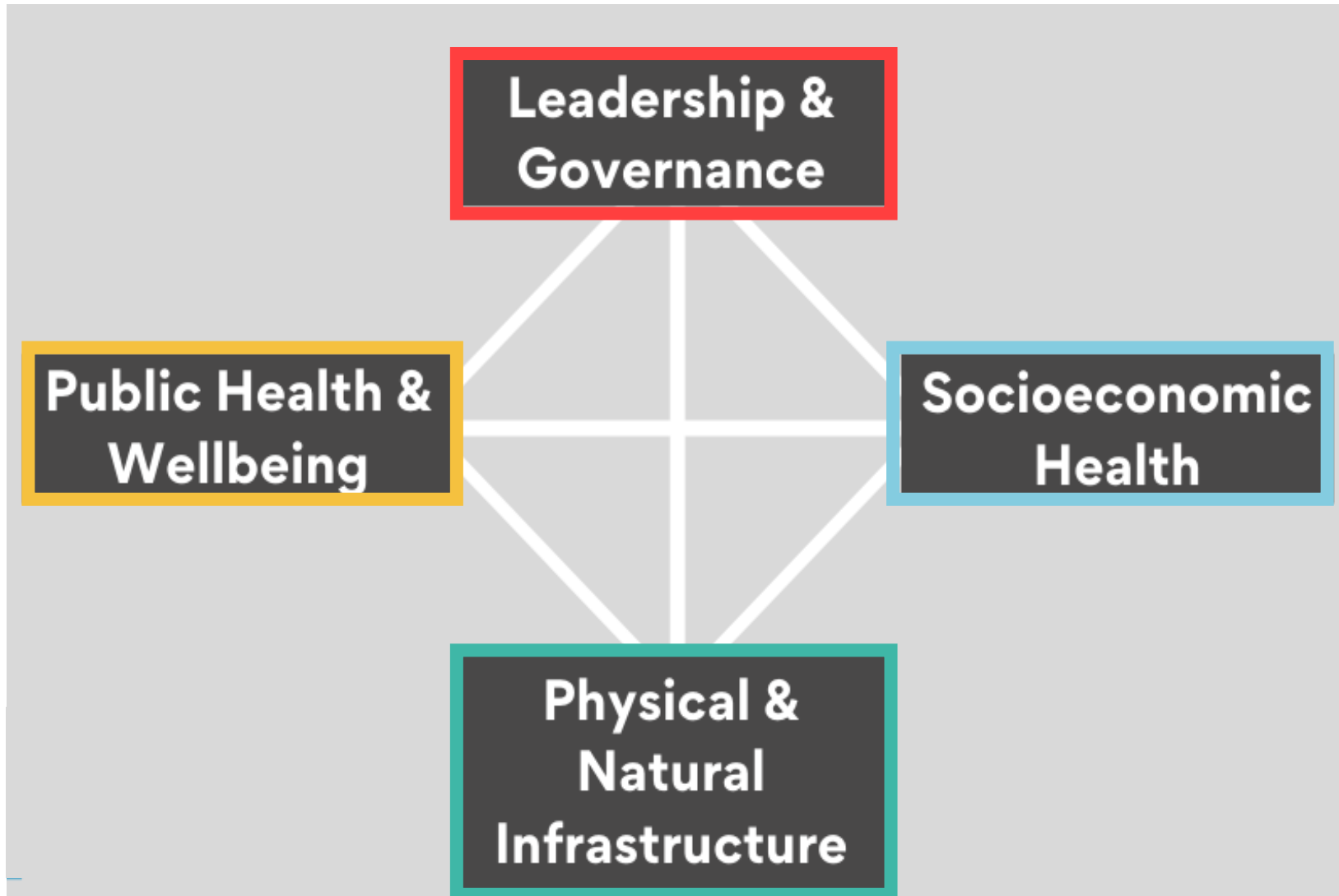
2) Develop community priority lexicon:

- Synthesize community priorities
- 1600+ real projects; 250+ cities

3) Evaluate overlap between resilience lexicon and community lexicon

4) Results **inform UX of future resilience storymap**

Background & Methods

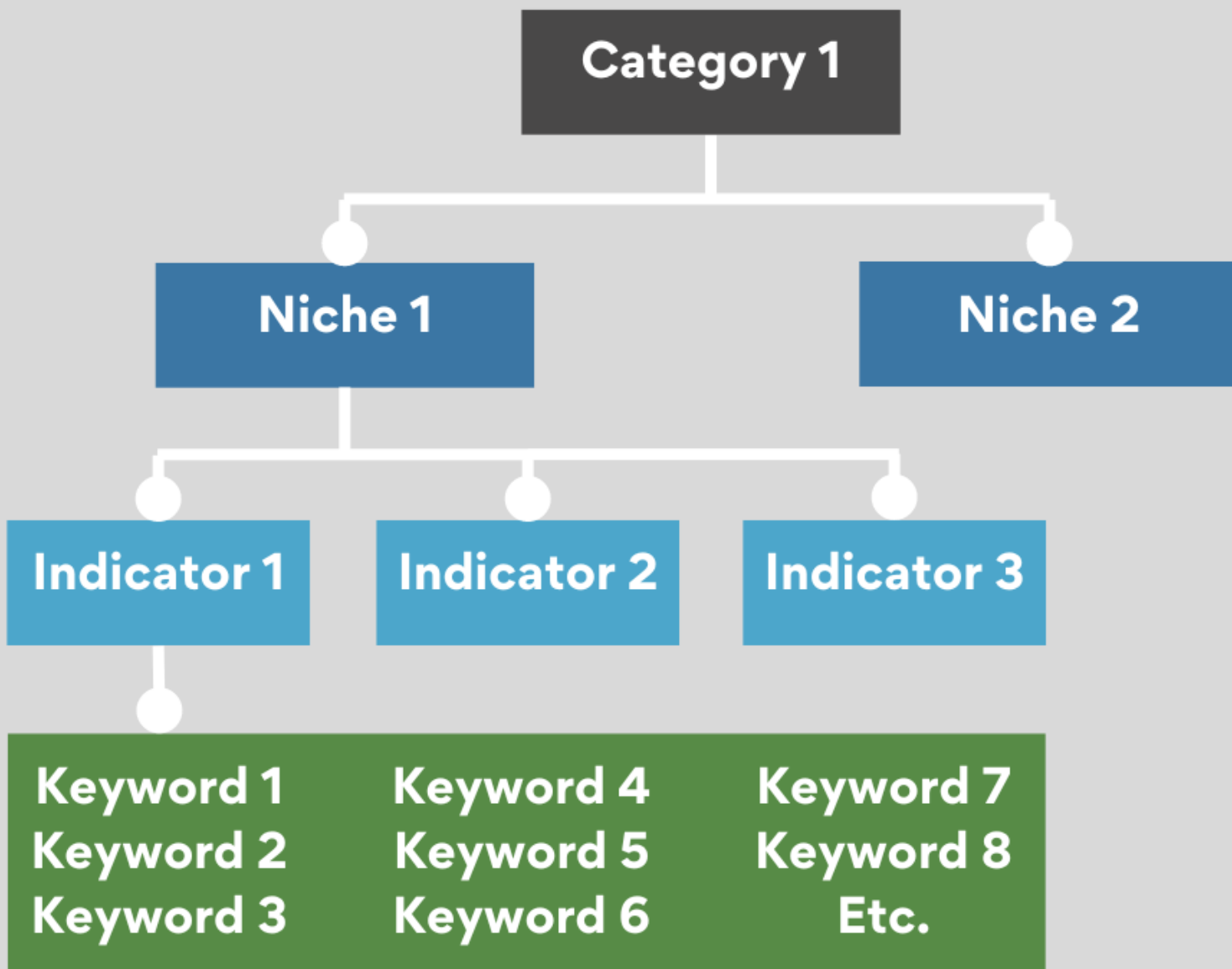


Identification of 4 common resilience categories

- Adapted from ARUP & Rockefeller Foundation's City Resilience Index
- Validated against other dominant resilience frameworks

Methods Precedent: Elsevier Sustainable Development Goal Mapping Initiative

- Educational Partnerships for Innovation in Communities Network (EPIC-N)
 - 1,600+ unique projects;
250+ cities
- Similarities w/Elsevier initiative & data structure:
 - Large text database of project names and abstracts
 - keywords used as proxies for indicators



Keyword 1

Keyword 2

Keyword 3

Keyword 4

Keyword 5

Keyword 6

Keyword 7

Keyword 8

Etc.

Project Name

Abstract

Project 1

Abstract 1

Project 2

Abstract 2

Project 3

Abstract 3



&



Abstract 1

Word 1

Word 1

Word 2

Word 2

Keyword 1

Word 3

Word 4

Word 4

Project Name

Abstract

Keyword

Category

Project 1

Abstract 1

Keyword 1

Public Health

Project 2

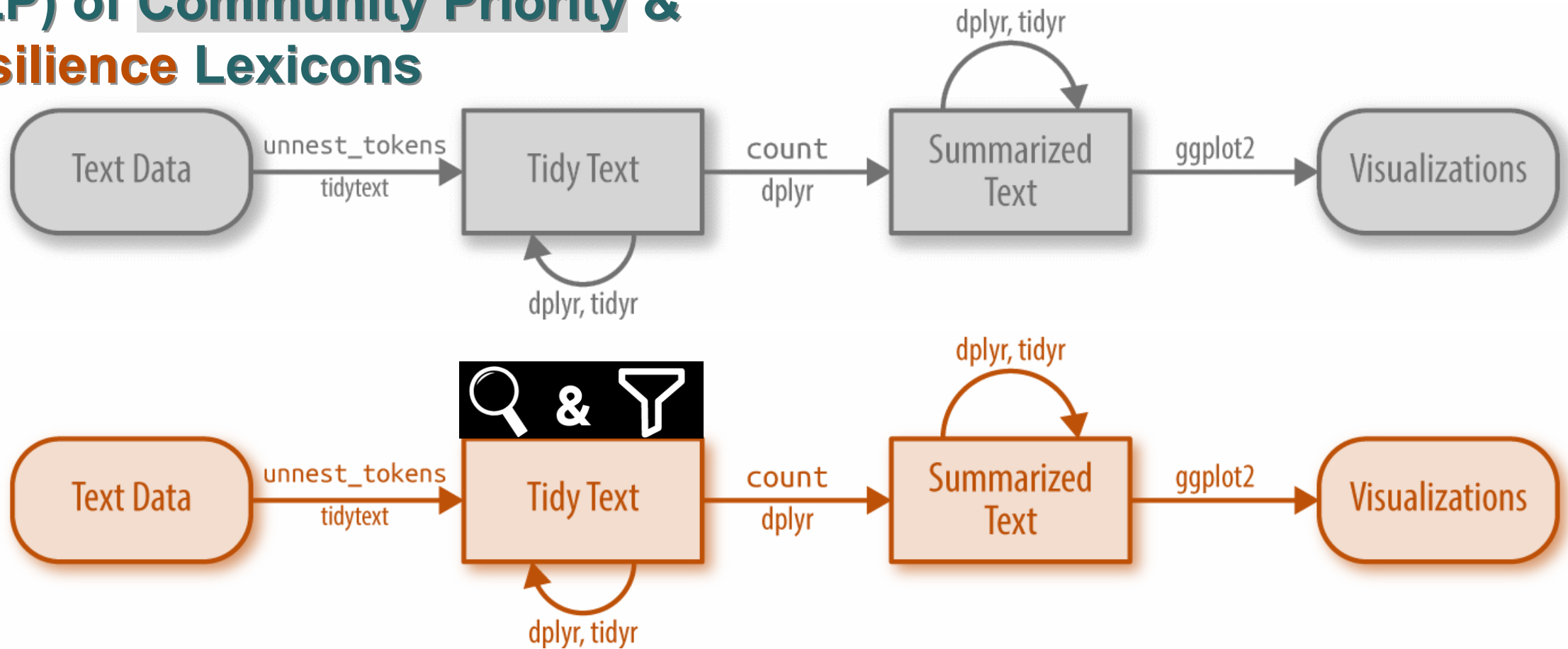
Abstract 2

Keyword 1

Public Health

**Methods: Resilience
Lexicon &
Community
Resilience Profiling**

Methods: Natural Language Processing (NLP) of Community Priority & Resilience Lexicons

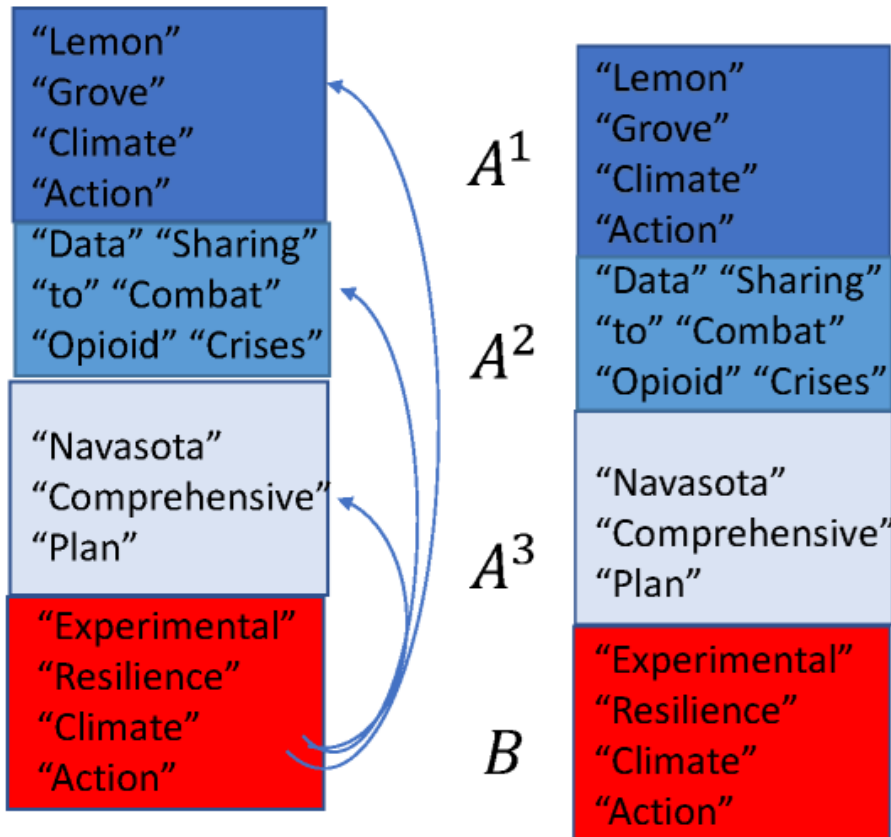


- raw frequencies
- tf-idf rankings
- Markov chain visualization of bigrams (word pairs)



[Image adapted from: *Text Mining with R!* Silge & Robinson, 2022.](#)

Methods: Similarity of Community Priority & Resilience Lexicons



	“Lemon” “Grove” “Climate” “Action”	“Data” “Sharing” “to” “Combat” “Opioid” “Crises”	“Navasota” “Comprehensive” “Plan”	“Experimental” “Resilience” “Climate” “Action”
A ¹	1	0	0	0.33
A ²	0	1	0	0
A ³	0	0	1	0
B	0.33	0	0	1

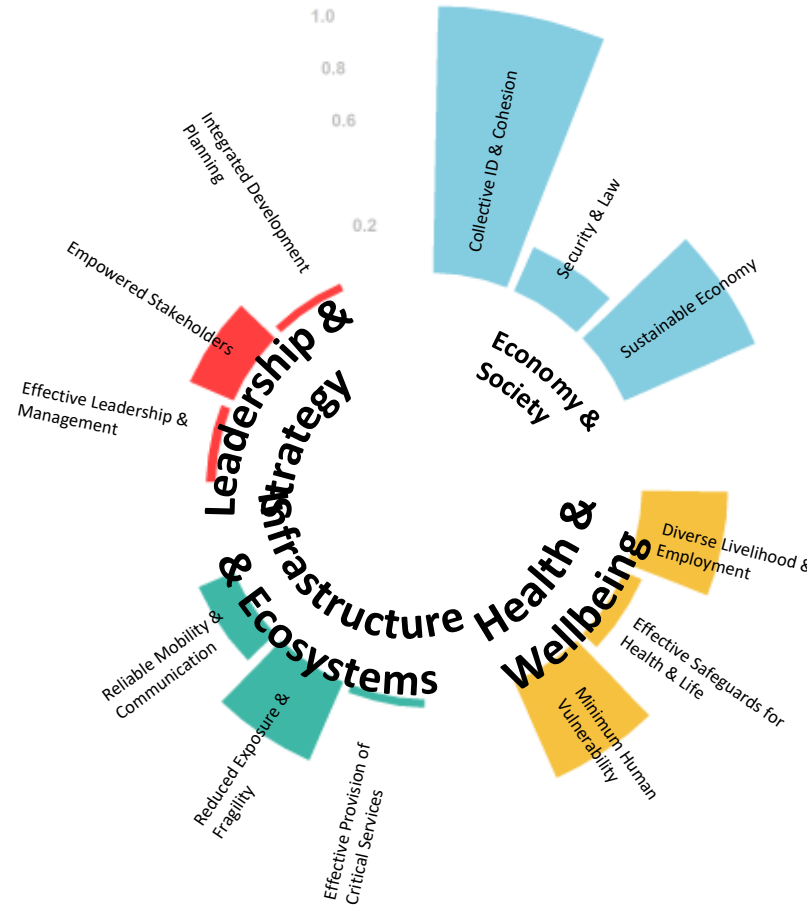
$$\frac{A^n \cap B}{A^n \cup B}$$

- Evaluation of Experimental vs Control Lexicons
 - Text similarity using Jaccard’s similarity index
- Unsupervised topic models

Results: Resilience Lexicon

- 40 communities in particular stood out for a combination of:
 - High frequency of terms
 - Geographic and community diversity represented

Resilience Indices of Saint Paul



Top Terms Overall

word	n	tf
public	538	0.049
development	517	0.047
water	318	0.029
planning	311	0.028
management	288	0.026
data	284	0.026
housing	276	0.025
transportation	243	0.022
local	238	0.022
information	230	0.021

Results: Resilience Lexicon NLP

Top Terms by Project

Project.Name	word	n	tf	idf	tf_idf
Improving Energy Efficiency at Juda School	energy	11	0.647	2.942	1.904
Chronic Illness: Promoting Healthy Lifestyles	chronic	9	0.333	5.460	1.820
Marketing 'Energy City'	energy	16	0.615	2.942	1.810
Eco-Green Business Park	green	9	0.600	2.926	1.756
Future growth of organic solar cells in the building integrated photovoltaic market	energy	8	0.571	2.942	1.681
Green Roof Design	green	16	0.571	2.926	1.672
National City Police Culture	police	12	0.387	4.073	1.577
Solar Panel Recommendations for Juda School District	energy	10	0.500	2.942	1.471
Air Quality and Noise Pollution in Lemon Grove	air	8	0.308	4.430	1.363
San Diego State University Mission Valley Policy Tools and Recommendations, Approaches to Affordable Housing	affordable	9	0.360	3.635	1.309

Top Terms by City

City	word	n	tf	idf	tf_idf
Eugene	mobility	21	0.276	2.133	0.589
Gonzales	policies	18	0.333	1.504	0.501
Liberty	planning	18	0.500	0.671	0.336
San Diego	housing	40	0.278	0.973	0.270
Ramsey City	resilient	29	0.073	3.519	0.258
Glendale	social	27	0.225	1.013	0.228
Navasota	resources	24	0.200	1.055	0.211
Portland	transit	79	0.120	1.686	0.203
State College	safety	19	0.116	1.727	0.200
Paoli	care	18	0.081	2.197	0.178

Top Terms by City

Results: Community Priority Lexicon NLP

Control Group: Top Terms by City

City	word	n	tf	idf	tf_idf
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Top Terms Overall

word	n	tf
city	1920	0.021
students	1442	0.015
community	1018	0.011
project	945	0.010
plan	577	0.006
design	548	0.006
public	538	0.006
development	517	0.006
county	443	0.005
residents	425	0.005

Top Terms by Project

Project.Name	word	n	tf	idf	tf_idf
Developing Content for the University of St. Thomas Pollinator Path	pollinator	20	0.088	6.440	0.570
Decreasing Use of Plastic Shopping Bags	plastic	20	0.076	6.440	0.488
Evaluating Stormwater Management Graphics	mwmo	20	0.088	5.187	0.455
Developing Content for the University of St. Thomas Pollinator Path	path	20	0.088	4.648	0.411
Developing PR for Organics and Recycling	recycling	18	0.111	3.699	0.411
Green Roof Design	roof	18	0.071	5.342	0.379
Decreasing Use of Plastic Shopping Bags	bags	16	0.061	6.035	0.366
Wikiup Junction Community Advisory Council	pine	22	0.068	5.342	0.365
Inventorying Albany's Cultural Resources	cultural	20	0.087	3.668	0.319
Marketing 'Energy City'	energy	16	0.105	3.006	0.316

Results: Similarity of Community Priority & Resilience Lexicons

- Jaccard's similarity index table: low/no similarity between community priority (control) and resilience (experiment) lexicons, both across terms individually and across groups
- Unsupervised topic models did not predict groupings consistently either

Jaccard's Similarity Matrix

OUR OBJECTIVE: INFORM PRACTICAL RESILIENCE APPLICATIONS

1) Clear mismatch between academic resilience lexicon and community priority lexicon

- **E.g. mismatch in communication between researchers and community practitioners?**

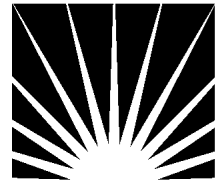
2) Potential categorical overlap and latent emergence of governing topics

- **TOPICS == main resilience categories?**
- **Unsupervised clustering methods & focus groups**

OUR OBJECTIVE: INFORM PRACTICAL RESILIENCE APPLICATIONS

Research informs the **practical application** of a public Community Resilience Assessment and Planning Storymap, with paired case studies and corresponding national-extent standardized data.

Acknowledgements



OAK RIDGE INSTITUTE
FOR SCIENCE AND EDUCATION



epic-network



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Community Resilience Profile



Case Study maps:

- Population near major roadway with little to no tree buffer: https://enviroatlas.epa.gov/enviroatlas/interactivemap/?eaLayer=eaLyrNum_228
- Estimated floodplains: https://enviroatlas.epa.gov/enviroatlas/interactivemap/?eaLayer=eaLyrNum_361
- Residential address vacancy rate for 2014: https://enviroatlas.epa.gov/enviroatlas/interactivemap/?eaLayer=eaLyrNum_761

[Add to map](#) [View in GeoPlatform](#)

Filter by Community Size ▼

Filter by topic: ▼

Filter by Rurality Code ▼

Selected Community:
Salem, OR

Layer List

Residential address vacancy rate for 2014

Population near major roadway with little to no tree buffer

192,440 - 1,311,085

28,246 - 192,439

4,145 - 28,245

608 - 4,144

88 - 607

12 - 87

0 - 11

Estimated floodplains

Area in Estimated Floodplain

0 1 2mi | -123.110 44.948 Degrees | ASA, NGA, USGS | City of Salem, Oregon, Oregon Metro, State of Oregon GEO, Esri, ...

Sustainable City Year Program

City, State: Salem, Oregon

Community size: 175,535

Rurality Code: [2]

Community Summary: Salem, Oregon participated in EPIC-N program year 2014-2015. University of Oregon: Sustainable City Year Program.

Topics: Critical transit; affordable housing

Summary of what was done to address resilience: Salem EPIC-N projects highlighted the need for increased reliability of critical services, including transit in the event of crises requiring evacuation. Many projects also underscored the importance of affordable housing for the health and adaptability of city residents. External sites: [Salem Webpage](#) [EPIC-N Write up](#)

EnviroAtlas Community? No.

Relevant Sustainable Development Goals:

