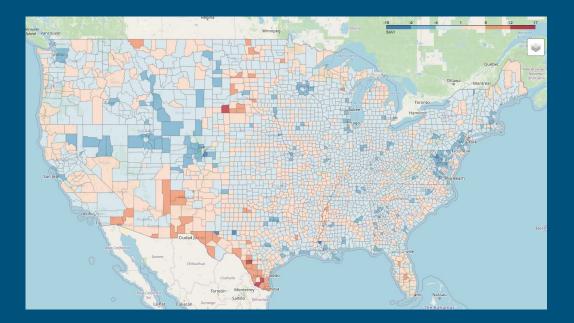
The Social Vulnerability Index: A Replication

Liam Smith and Joseph Holler, Middlebury College Peter Kedron, UCSB

#### Four-Act Story of Open Science

- 1. Cutter et al (2003) Social Vulnerability Index: SoVI
- 2. Spielman et al (2020) Replication: 21 different geographic extents
- 3. Reproduce Spielman et al
- 4. Replicate over time



# 1: Cutter et al (2003) SoVI

#### What is the Social Vulnerability Index (SoVI)?

- Cutter, S. L., Boruff, B. J., & Shirley, W. L. (2003). Social vulnerability to environmental hazards. Social Science Quarterly, 84(2), 242–261. <u>https://doi.org/10.1111/1540-6237.8402002</u>
- Geographic measure of social susceptibility to harm
- Widely applied to hazards and climate change planning/policy
- 7,597 Google Scholar citations on 4/12/2024

#### **SoVI** Construction

28+ Census Variables by County

**Dimensionality Reduction** 

#### Unweighted Combination

Z-score normalization42 variables in first version

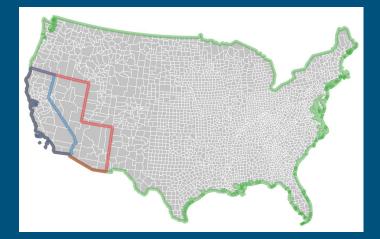
Principal Component Analysis with Varimax rotation

Select components Invert direction to match expected vulnerability Unweighted addition or average Z-score normalization

# 2: Spielman et al (2020) Replication

## Spielman et. al Replication

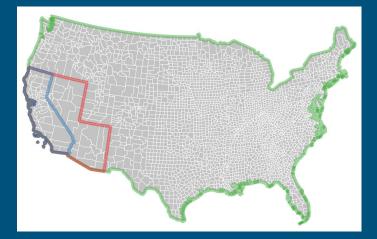
- If the study extent varies...
- Is SoVI internally consistent?
  - Vulnerability ranking for **places** is inconsistent
- Is SoVI theoretically consistent?
  - Direction and contribution of variables is inconsistent
- GitHub repository with data and python code



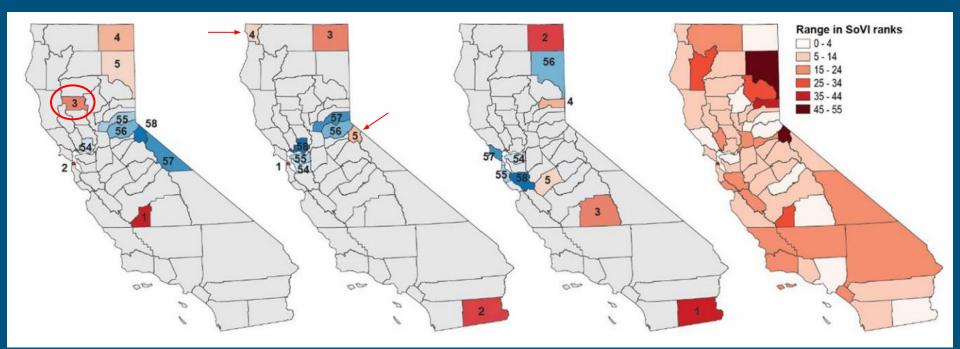
# 3: Reproduction and Reanalysis of Spielman et. al

#### **Reproduction and Reanalysis Purpose**

- Can we *reproduce* Spielman et. al. to confirm their results?
- Reproducible research compendium



#### Internal Consistency



#### California

FEMA #9

U.S.A.

## Internal Consistency

 Table 2
 Spearman's rank correlation coefficient for SoVI values calculated using nested subsets of a file describing all counties in the US

	FEMA region									
	I	II	III	IV	V	VI	VII	VIII	IX	X
All US counties input file versus all counties in a state input file	0.75	0.79	0.68	0.50	0.50	0.62	0.90	0.61	0.53	0.66
All counties in a FEMA region versus counties in a state within the FEMA region input file	0.94	0.61	0.90	0.80	0.34	0.65	0.82	0.87	0.69	0.88
State used for comparison	Composite of ME, NH, MA	NY	VA	GA	IL	TX	МО	SD	CA	ID

p < 0.01 for all values

## **Theoretical Consistency**

- Identical results
- Only four variables load consistently positive
- On average, the 28 variables:
  - Change direction 5.4 times
  - Range of ranks is 23.7

	National Model	Reversals	Min	Average	Max	Range
QAGEDEP_ACS	+	0	1.0	10.90	24.0	23.0
QFEMALE_ACS	+	9	1.0	8.33	28.0	27.0
QSERV_ALT	+	3	1.0	12.48	26.0	25.0
QHISP_ACS	+	3	2.0	11.00	28.0	26.0
QFEMLBR	+	4	1.0	11.62	25.0	24.0
QNATAM_ACS	+	9	1.0	9.62	28.0	27.0
QESL_ALT	+	4	1.0	11.29	27.0	26.0
QSSBEN	+	0	3.0	11.76	21.0	18.0
QNOAUTO_ALT	+	0	1.0	14.05	28.0	27.0
QMOHO	-	12	2.0	<mark>15.</mark> 29	27.0	25.0
QPOVTY	+	0	3.0	11.71	27.0	24.0
QNRRES_ACS	+	4	1.0	<mark>10</mark> .19	22.0	21.0
- QFAM	+	2	1.0	13.67	28.0	27.0
QUNOCCHU_ACS	+	6	1.0	10.71	20.0	19.0
- PERCAP_ALT	+	3	9.0	18.48	28.0	19.0
BLACK_ACS	-	12	3.0	17.29	28.0	25.0
- MDGRENT_ALT	+	1	8.0	18.29	27.0	19.0
- QRICH200K	+	6	3.0	<mark>19</mark> .19	27.0	24.0
MEDAGE_ACS	+	1	8.0	18.19	28.0	20.0
QFHH_ACS	+	6	2.0	17.38	28.0	26.0
PRENTER_ACS	+	7	3.0	18.57	27.0	24.0
POPDENS	+	3	<mark>4</mark> .0	<mark>15.8</mark> 6	26.0	22.0
QCVLUN	-	15	1.0	13.38	23.0	22.0
- MHSEVAL_ALT	+	4	5.0	19.29	28.0	23.0
QED12LES_ALT	+	2	<mark>4</mark> .0	15.00	28.0	24.0
QEXTRCT_ALT	+	6	1.0	17.71	28.0	27.0
QASIAN_ACS		14	4.0	18.71	28.0	24.0
QPUNIT_ACS	+	14	2.0	16.05	28.0	26.0

### **Reproduction Findings & Outcomes**

- Reproduction is not trivial
  - Outdated packages
  - Extraneous data and code
  - File organization
  - Code for figures
- Reproducible research compendium
  - <u>https://osf.io/dzpe9/</u>

B HEGSRR / RPI-Spielman-2020 Public generated from HEGSRR/HEGSRR-Template

- Identically reproduced output data
- Subtle differences in results
- Confirm findings
  - internal inconsistency
  - theoretical inconsistency

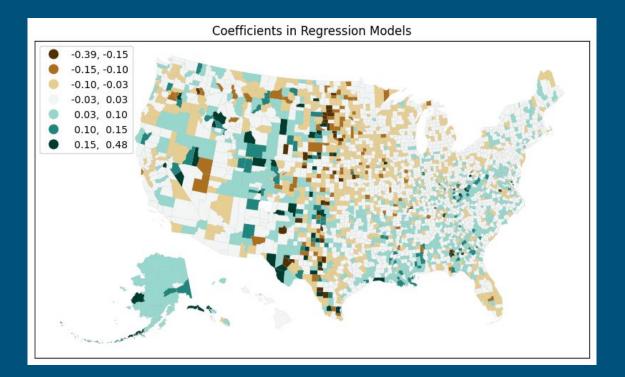
# 4: Replication of Spielman et al over time

#### **Replication Data & Methods**

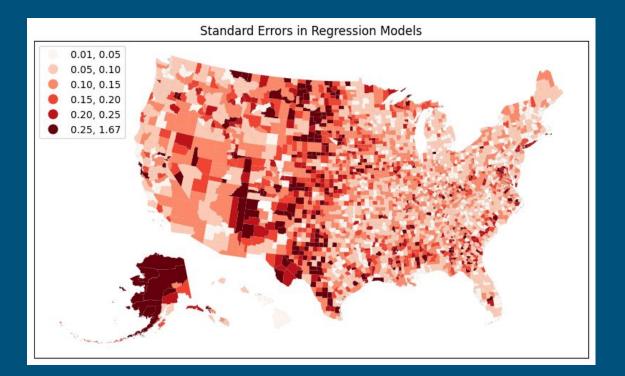
#### • Temporal support

- 5-year ACS Estimates
- 10 years: 2012 2021
- Geographic support
  - USA counties
- Internal consistency: do places exhibit linear trends in SoVI over time?
- Theoretical consistency: do variables contribute similarly to SoVI over time?

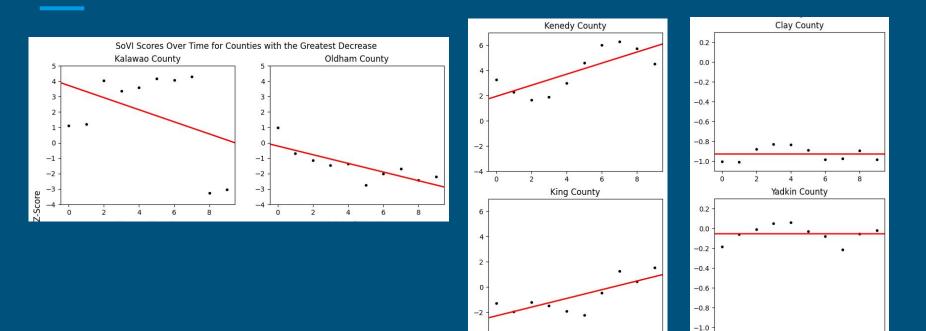
#### County SoVI Change over Time



#### County SoVI Change over Time



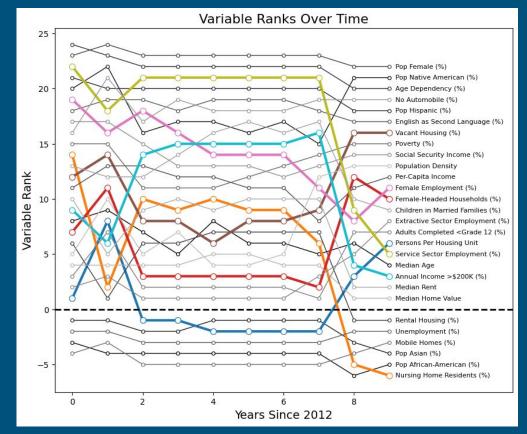
## Changes in counties with high error



-4

#### **Theoretical Consistency**

- Many variables relatively constant, especially between decennial censuses
- Substantial changes in direction and rank
- Not consistent over 10-year period



#### Conclusions

- Reproduction & replication studies assess the consistency of prior research
- Open science reduces barriers to validating and extending prior research
- Confirmed Spielman et al's finding of internal and theoretical inconsistency in SoVI over geographic extent
- Extended methods and findings to temporal extent
- Question application of SoVI to monitor change in social vulnerability over space and time

#### Acknowledgements

NSF award BCS-2049837: Transforming theory-building and STEM education through reproductions

Full study repository and reports: <u>https://osf.io/dzpe9/</u>

Reproducible research template: <u>https://osf.io/w29mg/</u>

HEGSRR.github.io