

# Discussion of “Wildfire Insurance Availability as a Risk Signal: Evidence from Home Loan Applications”

by You, Kousky, Atreya

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12 November 2024

# Mounting concerns around insurance and climate-driven disasters

CLIMATE

## How climate change could cause a home insurance meltdown

July 22, 2023 · 6:00 AM ET

By Michael Copley, Rebecca Hersher, Nathan Rott

The New York Times

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## Why California and Florida Have Become Almost Uninsurable

July 21, 2023

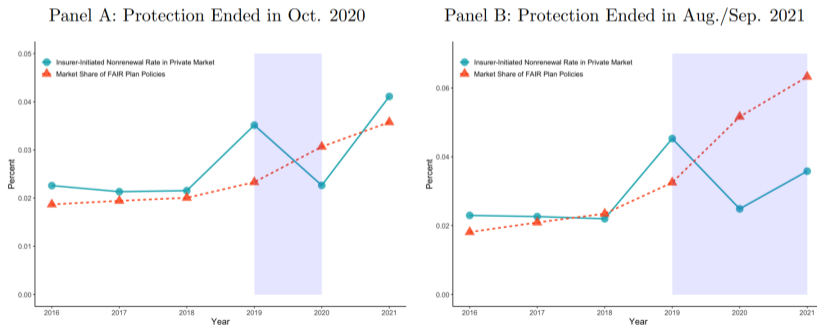
## You, Kousky, Atreya

- ▶ How does insurance availability affect housing demand in wildfire-prone areas?
- ▶ Data:
  - ▶ Home loan applications (LPA).
  - ▶ Insurance premium, parcel-level (UCD).
  - ▶ Property characteristics (CoreLogic).
  - ▶ Insurance market data (CDI).
  - ▶ Wildfire hazard (USFS WHP, Cal Fire, USGS MTBS).

# Regressions I: Intent to Move Out

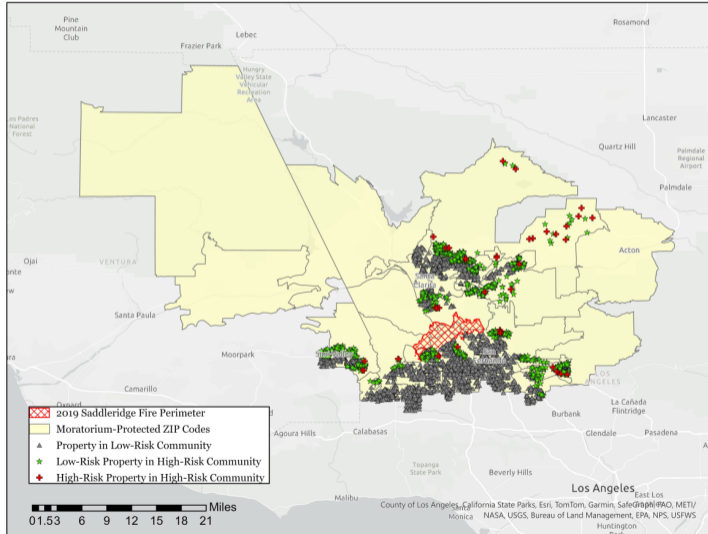
Quasi-random experiment: Timing of moratoriums on dropped policies (Taylor et al. 2024).

Figure 3: Insurance Conditions in ZIP Codes Protected by 2019 Moratoriums



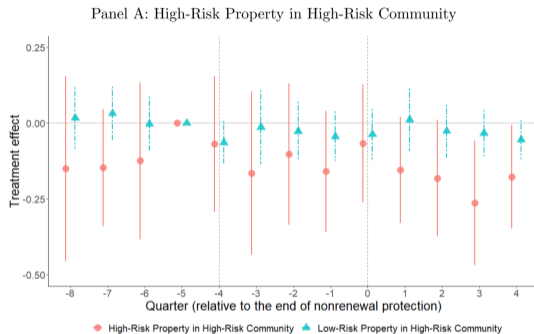
# Regressions I: Intent to Move Out

Figure 4: Example of Sample Selection, Intent-to-Move-Out Sample



# Regressions I: Intent to Move Out

Figure 5: Effect of Insurance Non-Renewals on Physical Characteristics of Subject Property



- ▶ Policy likely cancelled  $\Rightarrow \mathbb{P}(\text{Apply for high hazard parcel}) \downarrow$ .
- ▶ Placebo: Moratorium extension areas.
- ▶ Alternative explanations: Rule out income and wildfire.

## Regressions II: Intent to Move In



Trends since 2017-18 wildfires:

- ▶ ↓ Loan applications for high risk properties.
- ▶ Applicants to high-risk parcels correlate w/ low county-level climate beliefs.
- ▶ Rule out income or insurance prices as strong explanations.
- ▶ Some evidence: ↑ Mortgage denials in high-risk communities.

# Contributions



- ▶ Sub-zip code granularity, descriptive power.
- ▶ Risk perceptions + housing (Bakkensen and Barrage 2022, Bakkensen and Ma 2020, Ma et al. 2024).
- ▶ Household mobility, consumer finance, and migration (An et al. 2023, Boustan et al. 2020, Deryugina et al. 2018, McConnell et al. 2021).
- ▶ Insurance and natural disasters (Boomhower et al. 2024, Keys and Mulder 2024, Oh et al. 2022, Taylor et al. 2024, You and Kousky 2024).



## My assessment



- ▶ Lots of interesting results.
- ▶ Convinced by moratorium regressions and  $\Downarrow$  loan applications regressions.
- ▶ Very clever identification.
- ▶ Well-written, pleasure to read.

## Major comment 1: Interpretation of results as risk signal about wildfire



- ▶ The authors work hard to sell results as evidence of risk signal.
- ▶ Plausible alternative: Dropped insurees experienced a costly and salient shock, do not want to deal with this cost again in the future.
- ▶ Could attribute results to rational inattention about insurance, not the risk itself.
- ▶ Authors rule out *heterogeneity* by income. But it does not rule out that effects are due to high expected transactions costs common to all income groups.

# Major comment 1: Interpretation of results as risk signal about wildfire



- ▶ Anecdota: Five UC professors (Berkeley: 2, Davis: 1, Santa Barbara: 2).
  - ▶ High-risk houses, had insurance issues.
  - ▶ Moved by transactions costs, not risk.
  - ▶ One professor: *“We know our house is going to burn down but we just need space for the dogs.”*
- ▶ Main evidence for beliefs in You et al. (2024): Yale Climate Opinion Survey.
  - ▶ Issue: Ecological fallacy.
  - ▶ Robust to other variables in Yale Climate Opinion survey?
  - ▶ Do “high climate believers” look similar to “low climate believers” on observables?

## Major comment 2: Fitted homeowners insurance premium

Authors use LPA data to regress:

$$y_{jpkt} = \text{stuff}_{jpkt} + \beta \widehat{\text{HOPPremium}}_{pkt} + \varepsilon_{jpkt}, \quad (1)$$

where  $\widehat{\text{HOPPremium}}_{pkt}$  estimated using UCD data:

$$\text{HOPPremium}_{pk}^{\tau} = \alpha \text{other\_stuff}_{pk}^{\tau} + \mu_{pk}^{\tau}. \quad (2)$$

Standard errors: If using a fitted value on the RHS, need to block bootstrap at a zip code level to preserve variation from first stage (Cameron and Miller 2015, Wooldridge 2015).

## Major comment 2: Fitted homeowners insurance premium

Attenuation bias?

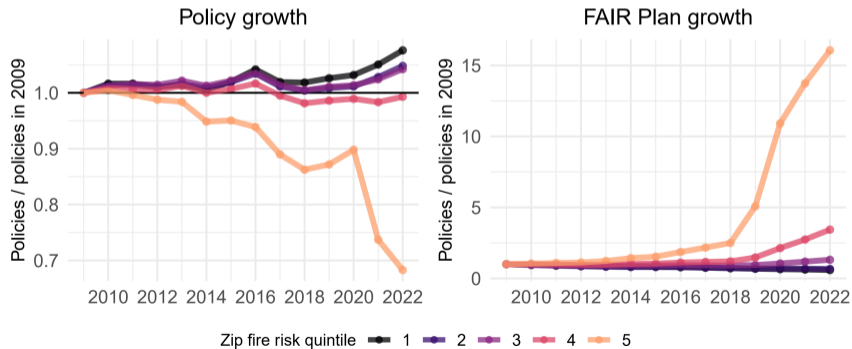
- ▶ Reassure that measurement error in  $\widehat{HOP}_{\text{premium}}_{pkt}$  not an issue (Pischke 2007).
- ▶ Adjusted  $R^2$  from first stage is about 0.40.
- ▶ Out-of-sample performance?

What goes in the first stage?

- ▶ Other predictors: State Farm “location rating factors”; homeowner characteristics (age, marital status, employment); Census block groups; public protection class.
- ▶ Reconstruction cost rather than assessed value (issues with Prop 13 in California).
- ▶ Machine learning appropriate for prediction exercises.

## Minor comment 1: Using 2018 as reference year

- ▶ Intent to Move In regressions interpret trends relative to 2018.
- ▶ But trends began prior to 2017-18 (Boomhower et al. 2024).
- ▶ Could elevate discussion of the losses regressions in Appendix B.



## Minor comments 2: Where are people coming from and going to?



- ▶ Where is migration happening? How far? In/out of state? (Boustan et al. 2020.)
- ▶ Origin and destination fixed effects?
- ▶ How does wildfire hazard magnitude compare to other migration reasons (labor market, family considerations)?
- ▶ Sorting model: Data seem perfect for discrete choice setting w/ structural welfare parameters (Bakkensen and Ma 2020, Hamilton and Phaneuf 2015).

## Minor comments 3: Data and empirics



### Empirics:

- ▶ Issues with  $\log(1+y)$  (Bellemare and Wichman 2020, Wooldridge 2012).
- ▶ Suggest extensive margin  $\mathbb{1}\{\text{any applications}\}$ , intensive margin  $\log(\text{applications})$ .
- ▶ Or, Poisson model.

### Data:

- ▶ Cal Fire FRAP instead of USGS MTBS wildfire perimeters.
- ▶ 30 m resolution WHP instead of 270 m resolution WHP.
- ▶ USFS Risk to Potential Structures (RPS): Can infer \$AAL (Boomhower et al. 2024).



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