

# The Effect of Working from Home on the Agglomeration Economies of Cities: Evidence from Advertised Wages

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<sup>1</sup>The views expressed here are those of the authors and do not necessarily represent the views of the Federal Reserve Bank of Dallas or the Federal Reserve System.

## WFH and Agglomeration Effect of Cities

- ▶ Productivity and wages are higher in larger cities and dense areas than in smaller cities and rural areas—**agglomeration economies**.
  - ▶ Knowledge spillovers (**interaction**);
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- ▶ The effect of working from home (WFH) on the agglomeration economies of cities and the aggregate productivity implications.
  - ▶ **Pros:** Reduce commuting, better workers' well-being, higher productivity for some jobs, and better labor allocation (?)
  - ▶ **Cons:** Reduce workplace interactions—core building block of agglomeration economies.

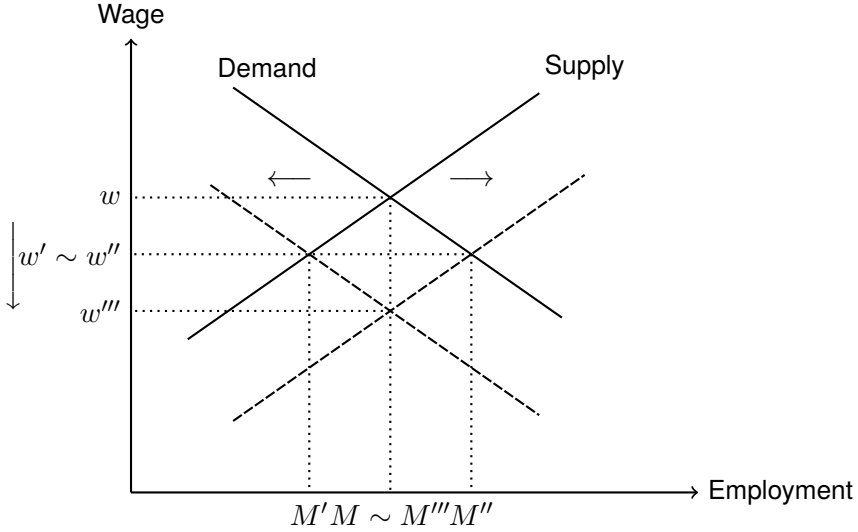
## Before and After WFH Adoption

- ▶ Before WFH:
  - ▶ Work locations and residential locations are **bundled**.
  - ▶ Key mechanisms:
    - ▶ Large cities benefit from productivity spillovers from workers' physical concentration.
    - ▶ High-productivity large cities constrained by limited housing supply (high rent).

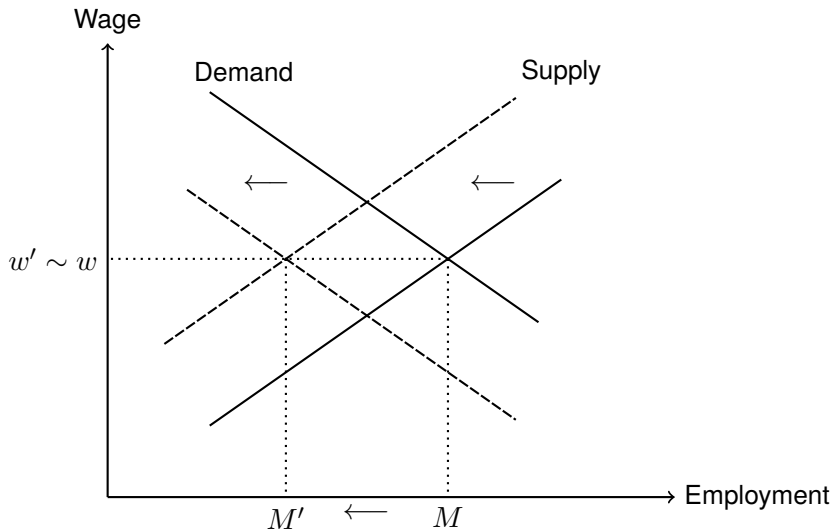
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- ▶ After WFH became widespread:
  - ▶ Work locations and residential locations are **decoupled**.
  - ▶ Key mechanisms:
    - ▶ Large cities lose productivity due to reduction of onsite workers (↓ aggregate productivity)
    - ▶ High-productivity large cities gain access to a larger labor pool beyond their local housing supply constraint (↑ aggregate productivity).

# Labor Market in Large Cities: High WFH Adoption During COVID-19



## Labor Market in Large Cities: Low WFH Adoption During COVID-19



# Data

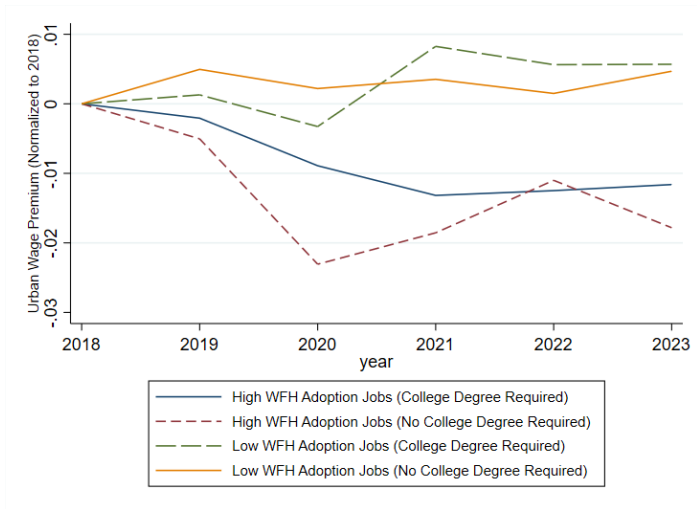
- ▶ Burning Glass Technologies (now called [Lightcast](#)).
  - ▶ Jobs posted on online job boards.
  - ▶ Subsample contains wage information.
  - ▶ Date, geography (county), employers, NAICS, SOC.
  - ▶ Detailed skill requirements.
- ▶ Quarterly Census of Employment and Wages (QCEW): Number of jobs by industry based on firms' locations.

Industry Share Validation with QCEW

- ▶ Measuring WFH prevalence:
  - ▶ American Community Survey (ACS)
  - ▶ O\*NET [Imputation Within-Sample Validation](#)
  - ▶ American Time Use Survey (ATUS)



## Empirical Evidence: ↓ Urban Wage Premium for High-WFH Jobs



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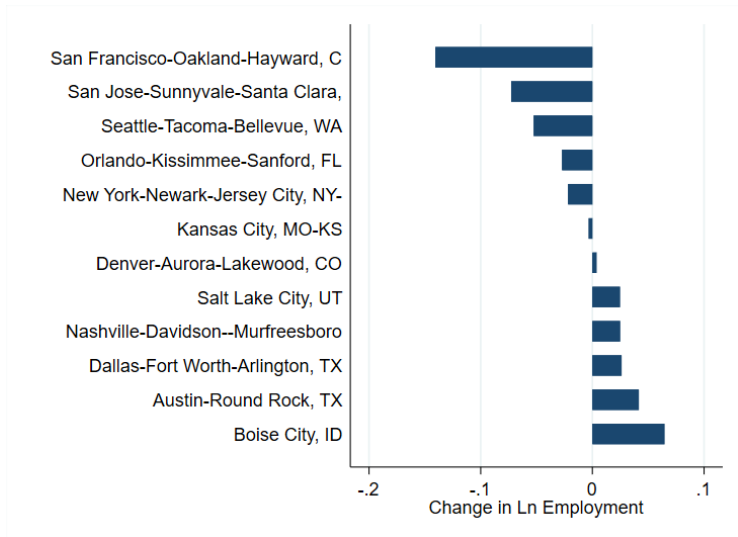
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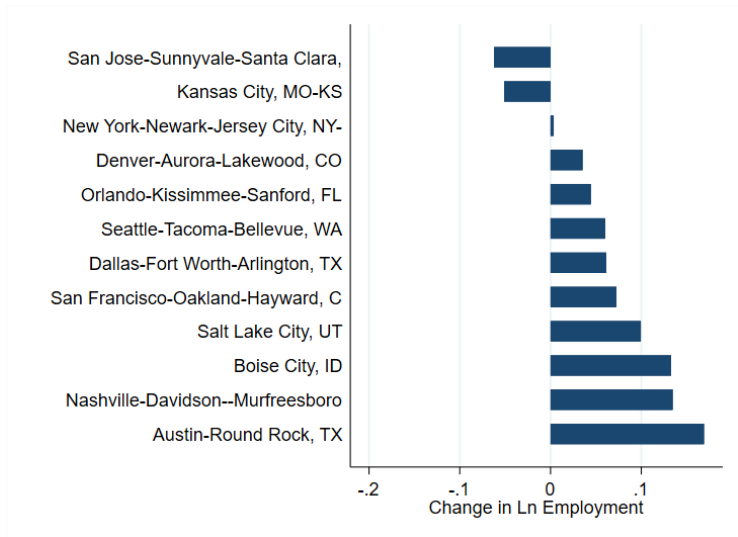
## Robustness to Alternative Explanations

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- ▶  $\downarrow$  Commuting time in large cities  $\rightarrow$   $\downarrow$  Compensating differentials?

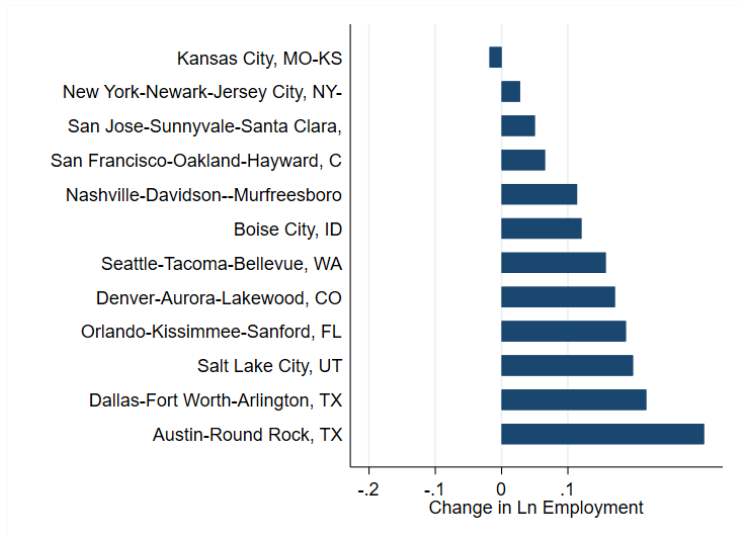
## Empirical Evidence: Employment Growth (2019-2022) (Food Services)



## Empirical Evidence: Employment Growth (2019-2022) (Finance and Information)



## Empirical Evidence: Employment Growth (2019-2022) (Prof and Business)





## Additional Evidence: Decompose the ↓ UWP

- ▶ Decline in wage premium in large cities (urban wage premium) among the high-WFH jobs:
  - ▶ The returns to *some* skills likely declined in large cities relative to small cities
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- ▶ Skills conducive to **interactive** activities (e.g., building relationship, marketing, and customer support) ↓ UWP
  - Less occurrence of productive interactive activities in larger cities
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- ▶ Skills complementing **remote technologies** (e.g., information technology) ↓ UWP
  - Influx of labor supply to large-city firms.

## Top Drivers of the ↓ of UWP (2019 to 2022/2023)

	2022–2023
Skill	$\pi$
Communications	22.5%
Information Technology	22.2%
Customer and Client Support	21.4%
Building Relationship	16.1%
Administration	15.9%
Marketing and Public Relations	14.1%
Business Management	11.6%
Maintenance, Repair, and Installation	6.6%
Physical Abilities	4.6%
Human Resources	3.1%
Creativity	2.9%
Engineering	2.3%
Decision Making	2.2%
Personal Care and Services	2.1%
Education and Training	1.8%
Media and Writing	0.8%
Design	0.6%
Public Safety and National Security	0.5%
Agriculture	0.2%
Economics, Policy, and Social Studies	0.1%
Energy and Utilities	0.0%

# Takeaways

- ▶ WFH weakened agglomeration economies of large cities
- ▶ WFH also expands labor pool to more productive cities
- ▶ The weakening of agglomeration effect outweighs the effect of labor pool expansion over 2020-2022
  - ▶ May be the reverse over the long run with hybrid models
- ▶ Caveats:
  - ▶ Hybrid model
  - ▶ Robust and spontaneous person-to-person interactions made feasible on virtual platforms.