# Cities the place of women: local labor markets and the gender wage gap

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Introduction

#### Introduction

- There is a wage premium from living in a large labor market [citations here].
- But little attention has been paid as to how this premium varies by gender.
  - In this paper I document three facts that link the gender wage-gap with the urban wage premium:

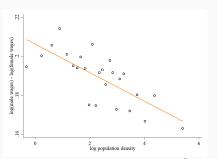
    - 2. Women relative gain from being in a denser labor market has increased since 1970  $\implies$  the gender gap-density elasticity went from 0.04 to -0.01.
    - 3. sth about possible channels here

#### Literature

- Gender gap literature
- Decline in the urban wage premium
- Urban literature.

### Today the gender gap is narrower in denser labor markets

**Figure 1:** Gender wage gap and population density in 2020



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Each point represents about 25 CZ. Year fixed effects are absorbed. Figure generated on 10 Nov 2020 at 18:18:41. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

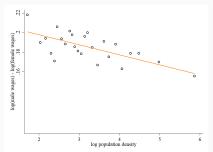
The negative gradient is robust to:

- Limiting to the largest CZ
- Weighting scheme
- Controlling for individual characteristics Residualized wages

### The negative correlation is robust

#### Limiting to the largest CZ

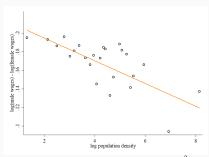
# **Figure 2:** Gender wage gap and population density in the largest CZ



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Each point represents about 13 CZ. Figure generated on 10 Nov 2020 at 18:18:42. Figure generated using the dofile 2-analysis/code-files/write\_regression\_coefplots.do.

#### Weighting by population

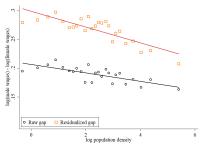
Figure 3: Gender wage gap and population density in 2020 (population weighted)



Note: figure restricts to CZ with more than 1 people per km $^2$ . Each point represents about 4 percent of the working age population. Figure generated on 10 Nov 2020 at 18:18-42. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots\_do.

### It is robust to accounting for individual characteristics

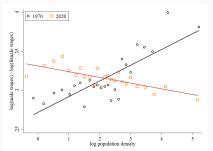
**Figure 4:** Gender wage gap and population density in 2020 (population weighted)



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Each point represents about 4 percent of the working age population. Figure generated on 10 Nov 2020 at 18:18:43. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

### The gender-gap density gradient has declined since 1970

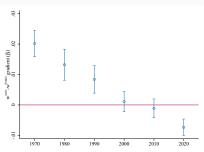
**Figure 5:** Gender wage gap and population density



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Each point represents about 25 CZ. Year fixed effects are absorbed. Figure generated on 8 Nov 2020 at 14:00:23. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

Graph without absorb

**Figure 6:** Coefficient on population density  $\beta_t$ 



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:51. Figure generated using the dofile 2.analysis/code.files/write\_regression\_coefplots.do.

With individual controls

#### Robustness

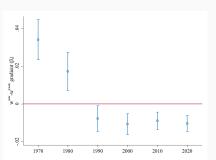
The change in the gradient is robust to:

- Limiting regressions to the biggest CZ biggest CZ.
- Using weighting schemes commonly used in the literature (estimates become much more imprecise)
- Using only within-region / within-state variation
- Adjusting wages by: age, education, foreign born dummy, and education residualizing wages.
- Using log of CZ population as independent variable

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#### Robustness

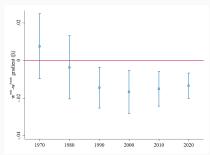
Figure 7: Coefficient on population density  $\beta_t$  for largest CZ



Note: figure restricts to more than 2 people per km<sup>2</sup> in 1950. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:52. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

With individual controls

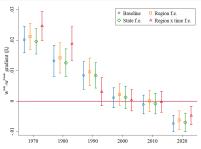
**Figure 8:** Coefficient on population density  $\beta_t$  (population weighted)



Note: figure restricts to more than 1 people per km<sup>2</sup> in 1950. Regressions weighted by the CZ population in 1970. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:52. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

#### Robustness

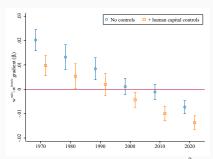
**Figure 9:** Coefficient on population density  $\beta_t$  adding fixed effects



Note: figure restricts to more than 1 people per km<sup>2</sup> in 1950. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:53. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

With individual controls

**Figure 10:** Coefficient on population density  $\beta_t$  controlling for worker characteristics



Note: figure restricts to CZ with more than 1 people per km². The regressions are done on data aggregated at the CZ level. Bars show 95% robust confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:53. Figure generated using the dofile 2\_analysis/code\_files/write\_regression.coefplots.do.

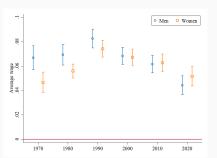
Graph without absorb

### The gradient decline in perspective: several benchmarks

- Translate coefficients in terms of gap from small vs densest CZ
- Coefficients are percent of gender gap sd.
- Change in coefficients in terms of urban wage premium.

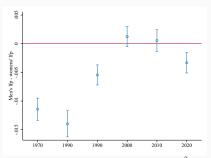
# A tale of women's success and male decline in denser labor markets

Figure 11: Coefficient on population density  $\beta_t$ 



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 8 Nov 2020 at 14:00:12. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

**Figure 12:** Coefficient on population density  $\beta_t$ 

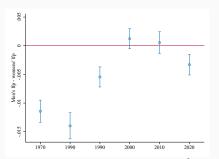


Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 8 Nov 2020 at 14:00:13. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

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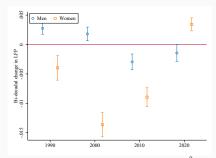
# A tale of women's success and male decline in denser labor markets

Figure 13: Coefficient on population density  $\beta_t$ 



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 8 Nov 2020 at 13:34:16. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

**Figure 14:** Coefficient on population density  $\beta_t$ 



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 8 Nov 2020 at 14:00:13. Figure generated using the dofile 2\_analysis/code\_files/write\_regression.coefplots.do.

## What can explain the decline in the gradient?

- Increased sorting of high-skill women in the densest CZ.
- Rise of women college education
- CZ industrial structure.

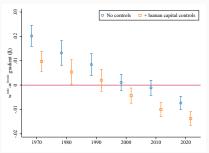
#### Industrial structure

- Increased sorting of high-skill women in the densest CZ.
- Rise of women college education
- CZ industrial structure.

### Not readily explained by sorting on human-capital variables

- If high-skill women increasingly sort into into denser labor markets (relative to men) ⇒ gender gaps in denser CZ will decrease faster over time.
  - Decrease in the gradient should disappear once education is taken into account.
  - Not supported by the data.

Figure 15: Coefficient on population density  $\beta_t$  controlling for worker characteristics

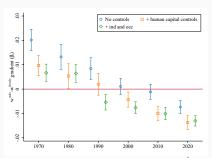


**Note:** figure restricts to CZ with more than 1 people per km<sup>2</sup>. The regressions are done on data aggregated at the CZ level. Bars show 95% robust confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:53. Figure generated using the dofile 2.analysis/code.files/write.regression.coefplots.do.

Change in the gender gap gradient is concentrated in workers without a college degree

#### The role of industries

Figure 16: Coefficient on population density  $\beta_t$  controlling for worker characteristics



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. The regressions are done on data aggregated at the CZ level. Bars show 95% robust confidence intervals. Standard errors clustered at the CZ level. Figure generated on 11 Nov 2020 at 19:32:54. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

Is it polarization of the occupational structure?

# Not explained by increase in inequality

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# Fact 1: there are persistent differences in <u>the level</u> of the gender gap across CZ

Table 1: CZ-level gender gap statistics

	Census year								
Statistic	1970	1980	1990	2000	2010	2020			
Average gap	0.44	0.41	0.33	0.26	0.21	0.19			
Standard deviation	0.07	0.08	0.06	0.05	0.05	0.05			
Distribution									
p90	0.53	0.51	0.40	0.32	0.26	0.25			
p75	0.49	0.47	0.37	0.29	0.24	0.22			
Median	0.44	0.41	0.33	0.26	0.21	0.19			
p25	0.40	0.36	0.29	0.23	0.17	0.16			
p10	0.35	0.32	0.26	0.20	0.15	0.13			

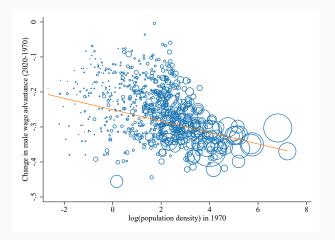
**Persistence:** 20-year auto-correlation coefficient > 50%.

Geographical pattern

Fact 2: there is wide variation in the  $\underline{\text{change}}$  of gender wage gap across CZ

# Fact 3: decline of the gender gap was faster in denser CZ

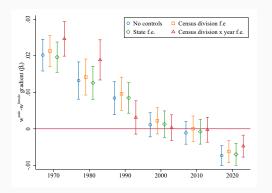
Figure 17: Change in male wage advantage in US CZ



## Fact 4: the gender gap - density gradient has inverted

**Regression specification:**  $w_{rt}^{men} - w_{rt}^{women} = \alpha_{rt} + \beta_t \ln(density)_{rt} + \dots$ 

**Figure 18:** Coefficient on population density  $\beta_t$ 



Note: figure restricts to CZ with more than 1 people per km<sup>2</sup>. Bars show 95% confidence intervals. Standard errors clustered at the CZ level. Figure generated on 19 Oct 2020 at 19:41:25. Figure generated using the dofile 2\_analysis/code\_files/write\_regression\_coefplots.do.

# The change in the gender-gap gradient is big

- Men vs women urban wage premium

#### This change in the gradient:

- is not driven permanent regional differences across the US [graph adding the fixed effects].
- is not driven any single CZ [1970 vs 2020 graph].
- is not present when looking at race race graphs.
- is also present when I zoom in on the 240 most dense labor markets
  [limit to the 40% most dense labor markets]
- also appears when including part-time workers in the sample

On coefficient size

Distribution illustration

Within-group graphs

# What is driving these pattern? A mix of women's progress and men decline

#### There are two distinct periods:

- 1970-1990: both sexes gain in denser CZ, but women's gains are larger.
- 1990-2010: changes in the gradient are driven by men's decline in denser labor markets.

# How big are these coefficients?

Table 2: Male advantange changes implied by estimated elasticities

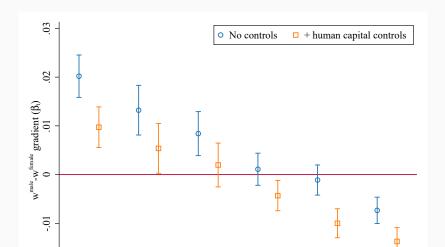
	1970	1980	1990	2000	2010	2020
Density elasticity $(\beta)$ s.d. wage gap $\beta/sd$	0.020	0.013	0.008	0.001	-0.001	-0.007
	0.073	0.077	0.060	0.049	0.049	0.050
	0.278	0.173	0.141	0.022	-0.023	-0.146
IC range	0.029	0.019	0.013	0.002	-0.002	-0.012
(% mean gap)	0.065	0.047	0.040	0.007	-0.009	-0.064
90 - 10 pctile range	0.061	0.040	0.027	0.004	-0.004	-0.025
(% mean gap)	0.137	0.097	0.082	0.014	-0.018	-0.133

Note: changes based on unweighted estimated elasticities. Sample restricted to full-time year-round workers. Table generated on 28 Sep 2020 at 15:15:18.

#### What can account for the change in the density-gradient?

**Regression specification:**  $w_{rt}^{men} - w_{rt}^{women} = \alpha_{rt} + \beta_t \ln(density)_t$ 

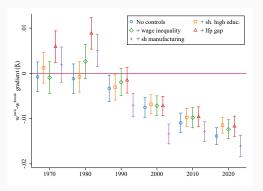
Figure 19: Coefficient on population density  $\beta_t$  controlling for worker characteristics



### Adding czone-level variables

Regression specification:  $w_{rt}^{men} - w_{rt}^{women} = \alpha_{rt} + \beta_t \ln(density)_t + X_{rt}\gamma_t$ 

**Figure 20:** Coefficient on population density  $\beta_t$  controlling for worker characteristics



Note: figure restricts to CZ with more than 1 people per km $^2$ . Regression includes census division  $\times$  year fixed-effects. Additional controls include number of children, marital status and being a female head of household. The regressions are done on data aggregated at the CZ level. Bars show 95% robust confidence intervals. Standard errors clustered at the CZ level. Figure generated on 19 Oct 2020 at 19:41:29.