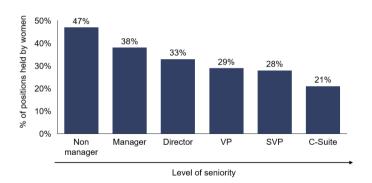
#### Peer Effects and the Gender Gap in Corporate Leadership: Evidence from MBA Students

Menaka Hampole, Northwestern University Francesca Truffa, Stanford GSB Ashley Wong, Stanford SIEPR

> January 8, 2023 2023 ASSA: Gender Gaps session

#### Women underrepresented in corporate leadership positions

Female Representation in the Corporate Pipeline



Source: LeanIn.Org and McKinsey & Company, 2020

#### Role of Social Connections

#### Social connections play key role for career outcomes

(Granovetter, 1973; Bewley, 1999; Calvo-Armengol and Jackson, 2004)

- ► One explanation for gender gap: "Old Boy's Clubs" (Cullen and Perez-Truglia, 2021)
- Women have limited access to informal networks in the workplace
- Men tend to hold more powerful positions
- → social connections with male peers valuable for women



#### Role of Social Connections



- ► However, women face different challenges than men in the workplace
- ► Female peers can provide useful information and support
  - For example, information on firms that support women's career advancement
- → social connections with female peers valuable for women

#### Role of Social Connections



- ► However, women face different challenges than men in the workplace
- Female peers can provide useful information and support
  - For example, information on firms that support women's career advancement
- → social connections with female peers valuable for women

Research question: How does gender composition of social connections affect women's advancement into leadership positions?

#### This Paper

Sample: MBA graduates from a top U.S. business school for cohorts 2000-2018

Strategy: Exposure to female peers from quasi-random assignment to sections

**Data:** School administrative data + detailed CV data with work history up to 2019 + firm-level data

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#### **Findings:**

- 1. Female MBAs 24% less likely to hold senior leadership
- 2. 1SD (4pp)  $\uparrow$  in female share  $\Rightarrow$  8.4%  $\uparrow$  in likelihood of being senior manager
- 3. Results driven by **female-friendly firms**

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Mechanisms: Qualitative interviews and quantitative analysis (in progress)

Setting

Data

Descriptive Analysis

**Empirical Strategy** 

Results

Role of Female-Friendly Firms

Mechanisms

Conclusions

#### Setting

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# Setting

#### Setting and MBA Section Assignment

- ► Full-time 2-year MBA graduates
- ► Each year MBA students quasi-randomly assigned to 8 sections of 60 students
- Students in same sections take core classes together
  - Core classes: almost 50% of MBA curriculum in first year
  - Close social ties (Yang, Chawla, and Uzzi 2019; Lerner and Malmendier 2013)



#### Share of Female Peers across Sections

**Treatment:** share of female students in section

- 1. Meaningful variation across sections within classes Female Share Variation
- 2. Distribution of female share across sections as good as random Simulation Tests

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## Data

#### Individual and Section Level Data

#### 1. School Administrative Data

- ▶ 2000-2018: Aggregate stats on number of students by section, gender, and race
  - ▶ Treatment variable share of female students per section

#### Individual and Section Level Data

#### 1. School Administrative Data

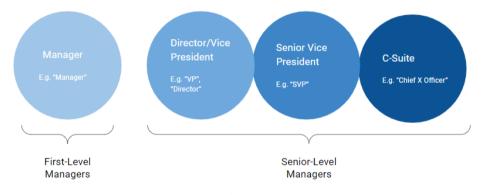
- ▶ 2000-2018: Aggregate stats on number of students by section, gender, and race
  - ▶ **Treatment variable** share of female students per section

#### 2. Public LinkedIn Profiles

- ▶ Sample: MBAs from classes of 2000-2018 currently in U.S.
- ► Public LinkedIn profiles for 77% of the full-time MBAs (Alumni Directory) (Matching Match Statistics)
- Complete self-reported education and employment history up to 2019
  - ► Employers, start and end dates, job titles, schools attended, degrees received

#### Identification of Management Positions

Based on keywords in job titles listed on CVs Job Titles Responsibilities Survey



Notes: Definitions from LeanIn.Org and McKinsey & Company, 2020

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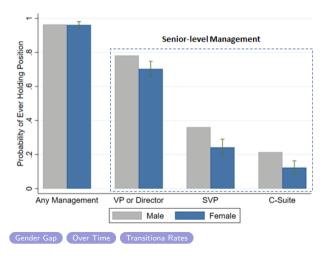
Mechanisms

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# Descriptive Analysis

#### Gender Gap in Senior Management

Probability of Ever Entering Management Positions at 15 Years Post MBA by Gender



- ▶ 96% of graduates become managers
- No gender gap in overall management positions, but gap in senior management

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# Empirical Strategy

#### **Empirical Specification**

$$y_{ikct} = \alpha_1 \overline{FemaleShare}_{-i,kc} \times Male_i + \alpha_2 \overline{FemaleShare}_{-i,kc} \times Female_i +$$

$$+ \alpha_3 Female_i + \sum_{j=0,1} (\delta_c + \phi_t + \omega_{ct}) \times I(Female_i = j) + X_{ikct} \gamma' + \epsilon_{ikct}$$
 (1)

- ightharpoonup FemaleShare $_{-i,kct}$ : share of section female peers of i
- Class FE, Year FE, Female FE, and their interactions
- ► X<sub>ikct</sub>: vector of individual and section-level controls Full List
- SE clustered at the section level



Setting

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**Empirical Strategy** 

#### Results

Role of Female-Friendly Firm

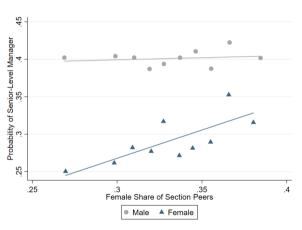
Mechanisms

Conclusion

### Results

#### Probability of Holding a Senior Management Position

Probability of Senior-Level Manager



▶ Positive effect of female peers on women but no effect on men

#### Probability of Holding a Senior Management Position

Effect on Senior Management

	(1) Senior-Level Manager
Female share $\times$ Male	0.0315 (0.115)
Female share $\times$ Female	0.822*** (0.204)
p-value Male vs. Female	0.000
Female Mean	0.391
Male Mean	0.534
$R^2$	0.173
N	51440
Class $\times$ Year $\times$ Female FE	Yes
Stratification Controls	Yes
Pre-MBA Characteristics Controls	Yes
Section-level Controls	Yes

▶ 1SD (4pp) increase in female share  $\approx 2.5$  additional women per section  $\Rightarrow$  8.4% increase in probability of becoming senior manager



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# Role of Female-Friendly Firms

#### What drives the increase in female senior managers?

#### Role of firm characteristics

- ► Data:
  - 1. Firm size and industry (Linkedin Company Profiles)
  - 2. Total and base annual compensation by gender and job title (Glassdoor)
  - 3. 18 metrics + overall rating (1-5) of firm female-friendliness (InHerSight.com)
- ► Women not moving to smaller or lower-paying firms Manager and Size Manager and Comp
- However, firms may differ along other dimensions beneficial for women's career advancement
- ► Growing literature on importance of female-friendly workplaces for women (Goldin2014; Goldin and Katz 2016; Hotz et al. 2018)



#### Results driven by female-friendly firms

Female-friendly firms: above-median overall rating on InHerSight.com Components

	Senior Manager	
	(1) Female-Friendly Firms	(2) Non Female-Friendly Firms
Female share $\times$ Female	1.243*** (0.394)	-0.468 (0.402)
Female Mean Male Mean <i>R</i> <sup>2</sup> N	0.161 0.238 0.167 28505	0.118 0.186 0.242 28505
Class $\times$ Year $\times$ Female FE	Yes	Yes

- 1. Increase in likelihood to enter female-friendly firms Entries
  - ► Effect emerges starting from 7-8 years post-MBA: when female MBA graduates have young children and gender wage gap increases Entries Descriptives Components Above Median
- 2. Increase in promotions (suggestive): *Conditional* on the type of firm, women with more female peers are more likely to be promoted in female-friendly firms Conditional

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### Mechanisms

Mechanisms: Qualitative Approach

**Method:** Qualitative interviews using an in-depth narrative approach (Bergman et al. 2019) by sociology Ph.D. student

▶ Unstructured interviews with follow-up questions on topics of interest

Goal: Identify key channels and inform larger quantitative survey in Winter 2023

Sample: 45 MBA alumnae

Content: Career trajectories, challenges, role of MBA peers and female network

#### Preliminary Evidence: 4 Key Mechanisms

- 1. Emotional Support -
- 2. Improved Academic Environment
- 3. Gender-Specific Information
  - ► Firm Benefits and Culture
  - Work-life Balance and Related Policies
- 4. Job Referrals
  - ► Female classmates more likely to work in same firm if from same section Referrals
    - Effect driven by female-friendly firms

#### Outline

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Role of Female-Friendly Firm

Mechanisms

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Conclusions

#### Conclusion

- ► Female MBAs 24% less likely to hold senior leadership position
- Female MBA peers increases women's chances of entering senior management positions
- Effect driven by female-friendly firms
- Qualitative evidence: 4 key channels
  - Emotional support
  - Improved academic environment
  - Gender-specific information
  - ► Job referrals
- ▶ Next steps: test relative importance of mechanisms in quantitative survey
- ► **Key Takeaway:** Gender composition of MBA peers can reduce gender gap in corporate leadership positions Counterfactual

#### THANK YOU

#### FEEDBACK AND COMMENTS ARE MUCH APPRECIATED:

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 ashley.wong@stanford.edu

#### Robustness

- ► Missing data Missing Data
- Placebo tests:
  - ► Random re-assignment of sections Re-assignment
  - ► Pre-MBA years Pre-MBA
- ► Alternative definitions and sample restrictions (Alternative Sample)
- Alternative specifications:
  - ► Event-study design Event Study
  - ► Clustering at the class level Class Clustering
  - ► Logistic model Logit



#### Effect Concentrated in Male-Dominated Industries

#### Results concentrated in male-dominated industries

- ► Stronger effects in settings where women underrepresented Male-Dom
- ▶ No evidence of shift across industries, higher *promotion* rates



#### Role of Female Peers in Male-Dominated Industries

Are these peer effects magnified in settings where women are underrepresented?

For example, male-dominated industries: finance, tech, consulting Male Dom. Industries

Women face more barriers in access to informal networks (Cullen and Perez-Truglia 2019)

▶ Female peers may represent substitutes for these networks



#### Role of Female Peers in Male-Dominated Industries

	Senior	Manager
	(1) Male Dominated Industries	(2) Female Dominated Industries
Female share $\times$ Female	0.605** (0.243)	-0.0269 (0.107)
Female Mean	0.201	0.074
Male Mean	0.344	0.072
$R^2$	0.097	0.033
N	45389	45389
Class × Year × Female FE	Yes	Yes

Notes: \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.

- ► Effects are stronger in male-dominated industries
- ► Effects driven by higher **promotion rates**, not entries Entries Conditional Industries



#### Alumni Directory Records

- ▶ Contains full name, year of graduation and current employment
- ▶ Importantly, includes MBA section identifier which allows us to assign students to peer groups
- ▶ 96% of graduates are represented in the alumni directory Coverage



## Matching

**Matching to MBAs Graduates:** 77% of the full-time MBAs to public LinkedIn profiles

- ▶ 2011-2018: matched to administrative records by administrative personnel
- ▶ 2000-2010: matched to alumni directory by researchers Alumni Directory
  - ▶ We manually matched based on the following variables:
    - Name and surname: For people who may have changed names after marriage, we searched for them online
    - Business school name listed on the social media profile
    - Employment history
- ▶ 2009 excluded because 80% of profiles are private



## Coverage Rate of Alumni Directory

#### Coverage Rate of Alumni Directory, 2000-2010 Records

	Overall			Male	Female		
	N	Non-Missing Share	N	Non-Missing Share	N	Non-Missing Share	
Admin Data	4720	1.000	3210	1.000	1503	1.000	
Alumni Directory	4532	0.960	3132	0.976	1380	0.918	

Notes: Sample includes graduating classes 2000-2010, excluding 2009.

- Overall rating (1-5) summary measure of firms' female-friendliness
- ▶ Women anonymously rate their firms on 18 topics such as flexibility, parental leave, female leadership
- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
- 4. Fair Compensation
- 5. Family Friendliness
- 6. Workplace Culture



- ▶ Overall rating (1-5) summary measure of firms' female-friendliness
- ▶ Women anonymously rate their firms on 18 topics such as flexibility, parental leave, female leadership
- 1. Gender Equal Opportunities
  - Equal Opportunities for Women and Men
  - Management Opportunities
  - Women in Leadership
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
- 4. Fair Compensation
- 5. Family Friendliness
- 6. Workplace Culture



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- ▶ Women anonymously rate their firms on 18 topics such as flexibility, parental leave, female leadership
- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
  - Paid Time Off
  - Flexible Work Hours
  - Ability to Telecommute
- 3. Professional Enrichment
- 4. Fair Compensation
- 5. Family Friendliness
- 6. Workplace Culture



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- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
  - Wellness Initiatives
  - Learning Opportunities
  - Sponsorship or Mentorship Program
  - ▶ Do you feel your growth and success are (or were) priorities for your manager(s) at this company?
  - ▶ Do you feel you receive(d) the necessary feedback to succeed at your job and achieve your goals?
- 4. Fair Compensation
- 5. Family Friendliness
- 6. Workplace Culture

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- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
- 4. Fair Compensation
  - Salary Satisfaction
  - ▶ When reflecting on your pay when you were first hired at this firm, do you feel you were paid fairly?
- 5. Family Friendliness
- 6. Workplace Culture



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- ▶ Women anonymously rate their firms on 18 topics such as flexibility, parental leave, female leadership
- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
- 4. Fair Compensation
- 5. Family Friendliness
  - Maternity and Adoptive Leave
  - ► Family Growth Support
  - Does this firm support employees caring for other members of their family other than children?
- 6. Workplace Culture



- ▶ Overall rating (1-5) summary measure of firms' female-friendliness
- ▶ Women anonymously rate their firms on 18 topics such as flexibility, parental leave, female leadership
- 1. Gender Equal Opportunities
- 2. Work Schedule Flexibility
- 3. Professional Enrichment
- 4. Fair Compensation
- 5. Family Friendliness
- 6. Workplace Culture
  - ▶ The People You Work With
  - Social Activities and Environment
  - Support for Diversity
  - Sense of Belonging
  - Employer Responsiveness



#### **Match Statistics**

Data Source	Units	Unit Match Rate	Unit-Year Observations	Unit-Year Match Rate
A. Individua	ıls – Coho	orts 2000-2008, 2010-	2018	
All 2-Year Full-Time MBAs	8509	1.000		
LinkedIn Profiles	6556	0.770	66514	1.000
LinkedIn Profiles (US Locality Only)	5098	0.599	52160	0.784
B. Firms	<ul><li>Cohorts</li></ul>	s 2000-2008, 2010-20	18	
All Firms Listed on LinkedIn Profiles	6590	1.000	52160	1.000
LinkedIn Company Profiles	4397	0.667	44742	0.858
Glassdoor	2868	0.435	35493	0.680
InHerSight	1399	0.212	28168	0.540
FairyGodBoss	434	0.066	19305	0.370
Women On Board	587	0.089	16531	0.317
C. Adminis	strative D	ata – Cohorts 2011-2	2018	
All 2-Year Full-Time MBAs	3425	1.000		
LinkedIn Profiles	2783	0.813	14875	1.000
LinkedIn Profiles (US Locality Only)	2097	0.612	10992	0.739
D. Survey Da	ata – Coh	orts 2000-2008, 2010	-2015	
Full Sample	328	1.000	4246	1.000
2-Year Full-Time MBA	160	0.488	2195	0.517

Back - Admin

Back - LinkedIn

Back - Firms

## Summary Statistics – Demographics and Pre-MBA Background (Back)

	All	Male	Female	Difference p-value in par.
A. Demographics				
Female	0.36			
	(0.48)			
Age	29.88	30.20	29.35	0.85**
	(1.98)	(2.06)	(1.73)	(0.00)
U.S. Citizen	0.65	0.62	0.70	-0.08**
	(0.48)	(0.49)	(0.46)	(0.00)
Race	. ,	. ,	. ,	. ,
White	0.65	0.69	0.59	0.11**
	(0.48)	(0.46)	(0.49)	(0.00)
Asian	0.20	0.17	0.25	-0.07**
	(0.40)	(0.38)	(0.43)	(0.00)
Black / Hispanic	0.13	0.12	0.14	-0.03*
	(0.33)	(0.32)	(0.35)	(0.06)
Other	0.02	0.01	0.02	-0.01
	(0.13)	(0.12)	(0.15)	(0.12)
GMAT	716.45	720.76	709.04	11.72**
	(35.70)	(33.84)	(37.57)	(0.00)
B. Pre-MBA Background	, ,	,	, ,	` '
Pre-MBA Years of Experience	5.00	5.10	4.80	0.30**
•	(1.95)	(1.98)	(1.87)	(0.00)
Any Management Experience	0.39	0.38	0.41	-0.02
	(0.49)	(0.49)	(0.49)	(0.13)
Any Senior-Level Management Experience	0.13	0.14	0.12	`0.02*
	(0.34)	(0.35)	(0.32)	(0.05)
Average Total Compensation (Imp.) ('000s)	123.35	132.85	106.97	25.89**
	(120.74)	(134.42)	(90.29)	(0.00)

## Summary Statistics – Academic and Career Outcomes (Back)

	All	Male	Female	Difference p-value in par
A. Academic Outcomes (Person Level)				
Overall GPA	3.52	3.54	3.48	0.06**
	(0.27)	(0.28)	(0.27)	(0.00)
Fraction Finance Classes	0.15	0.17	0.12	0.05**
	(0.11)	(0.11)	(80.0)	(0.00)
B. Career Outcomes (Person-Year Level)	, ,	, ,	. ,	, ,
Any Management Role	0.75	0.75	0.75	0.00
	(0.43)	(0.43)	(0.44)	(0.47)
Senior-Level Manager	0.43	0.47	0.34	0.14**
	(0.50)	(0.50)	(0.47)	(0.00)
Employed	0.99	0.99	0.99	0.01**
	(0.09)	(0.07)	(0.12)	(0.00)
Cumulative Months of Nonemployment	0.57	0.40	0.91	-0.51**
	(3.56)	(2.77)	(4.76)	(0.00)
Base Compensation (Imp.) (000's)	133.00	141.53	117.37	24.16**
	(52.00)	(53.18)	(45.82)	(0.00)
Total Compensation (Imp.) (000's)	223.31	253.25	168.42	84.83**
	(315.35)	(371.37)	(155.85)	(0.00)
Male-Dominated Industry	0.59	0.64	0.48	0.15**
	(0.49)	(0.48)	(0.50)	(0.00)
Firm Size	5888.06	5706.69	6261.87	-555.18**
	(4453.50)	(4475.86)	(4383.98)	(0.00)
Female-Friendly Firm	0.74	0.74	0.74	0.00
	(0.44)	(0.44)	(0.44)	(0.90)
Top 100 MBA Firm	0.34	0.32	0.38	-0.06**
	(0.47)	(0.47)	(0.48)	(0.00)
P&L Role	0.60	0.60	0.60	0.00

### Definition of Managers

Identify management positions based on keywords in job titles listed on CVs

#### Senior-Level Management Roles:1:

- ► C-Suite: Executives such as CEO, CFO, COO, responsible for company operations and profitability ("Chief X Officer", "President")
  - Avg 8.6 years post grad
- ► Senior Vice Presidents: Senior leaders with significant business unit or functional oversight ("SVP", "General Manager", "Managing Director")
  - Avg 7.8 years post grad
- ▶ Vice President and Director: Leaders responsible for activities/initiatives within a sub-business unit, or who report directly to SVP ("VP", "Director", "Regional Managers")
  - Avg 5.4 years post grad

#### Low-Level Management Roles:

- Managers: Leaders responsible for teams and discrete functions or operating units ("Manager",
  - "Senior Product Manager")
    - Avg 3.8 years post grad
- Back

## Manager Responsibilities (Survey Data)

Summary Statistics by Job Title

	(1) Manager	(2) Director	(3) VP	(4) SVP	(5) C-Level
Firm Hierarchy (1=Lowest,5=Highest)	2.74	3.28	3.62	4.01	4.61
	(0.73)	(0.58)	(0.62)	(0.61)	(0.57)
Total Reports	14.40	26.77	137.78	296.06	554.73
	(42.57)	(66.08)	(355.20)	(986.17)	(1508.10)
Weekly Hours	53.43	51.93	59.31	55.87	56.04
•	(11.74)	(11.73)	(10.83)	(14.09)	(10.30)
Total Compensation	185314.86	242184.96	344097.26	392922.02	345059.71
·	(86019.66)	(96963.00)	(134468.00)	(132811.37)	(147157.58)
Observations	683	820	915	536	495

Notes: Sample includes graduating classes 2000-2015, excluding 2009.



## Explaining the Gender Differences in Senior Management

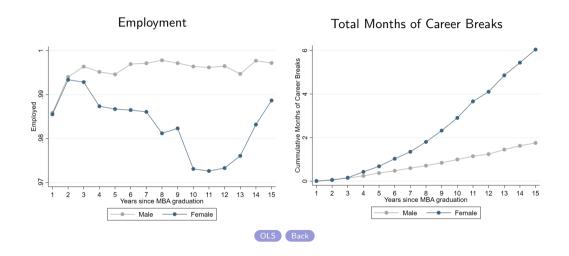
Gender Gap in Senior Management: Pooled Sample

	(1)	(2)	(3)	(4)	(5)	(6)
Female	-0.128*** (0.0138)	-0.126*** (0.0138)	-0.122*** (0.0138)	-0.120*** (0.0138)	-0.111*** (0.0136)	-0.0959*** (0.0137)
Class × Year FE	Yes	Yes	Yes	Yes	Yes	Yes
Pre-MBA Characteristics		Yes	Yes	Yes	Yes	Yes
Pre-MBA Industry FE			Yes	Yes	Yes	Yes
Cummulative Months of Career Break				Yes	Yes	Yes
Post-MBA Characteristics					Yes	Yes
Post-MBA Industry FE						Yes
Mean	0.490	0.490	0.490	0.490	0.490	0.490
Mean (Male)	0.543	0.543	0.543	0.543	0.543	0.543
$R^2$	0.219	0.224	0.229	0.230	0.251	0.272
N	27309	27309	27309	27309	27309	27309

Notes: Sample includes graduating classes 2000-2018, excluding 2009. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.

Gender Differences

## Gender Differences in Employment and Career Breaks



## Gender Differences in Firm Characteristics (Senior Managers Only)

- 4	Daal.	м.
	Dack	

	Males	Females	Difference
Female-Friendly Firm	0.70	0.73	-0.03**
	(0.46)	(0.44)	(0.00)
Male Dominated Industry	0.83	0.73	0.10**
	(0.38)	(0.44)	(0.00)
Firm Size	4903.25	4998.76	-95.51
	(4514.14)	(4465.30)	(0.17)
Total Employee Reviews	1491.55	1598.67	-107.12*
	(3596.17)	(3589.31)	(0.09)
Female Share of Employee Reviews	0.38	0.47	-0.08**
	(0.22)	(0.22)	(0.00)
Female Sr. Manager Share	0.30	0.37	-0.07**
	(0.21)	(0.23)	(0.00)
Average Firm Total Compensation (000's)	195.80	161.97	33.83
	(1785.55)	(569.85)	(0.22)
Average Firm Total Compensation for Senior Managers (000's)	961.81	321.62	640.20
	(26197.71)	(442.71)	(0.14)
Gender Gap in Firm Total Compensation (%)	0.15	0.10	0.06**
	(0.41)	(0.58)	(0.00)
Gender Gap in Firm Total Compensation for Senior Managers (%)	0.09	0.03	0.07**
	(1.20)	(0.71)	(0.00)
P&L Responsibilities	0.65	0.65	-0.00
	(0.48)	(0.48)	(1.00)
Observations	18333	6376	24709

Notes: Sample includes senior managers from graduating classes 2000-2018, excluding 2009. \* p < 0.10. \*\*\* p < 0.05, \*\*\*\* p < 0.01.

## Gender Differences in Manager Characteristics (Senior Managers Only – Survey Sample)

	Males	Females	Difference
Total Compensation	357466.80	279613.67	77853.12**
	(128130.32)	(128939.32)	(0.00)
Weekly Hours	56.99	54.02	2.98**
	(12.15)	(15.43)	(0.00)
Total Reports	164.42	35.65	128.77**
	(770.14)	(85.43)	(0.00)
Firm Size	18477.98	21300.13	-2822.14*
	(20510.81)	(19482.12)	(0.03)
P & L Responsibilties	0.53	0.29	0.25**
	(0.50)	(0.45)	(0.00)
Ambition to be CEO in 5 Years	0.45	0.12	0.34**
	(0.50)	(0.32)	(0.00)
Asked for Raise	0.43	0.44	-0.01
	(0.49)	(0.50)	(0.68)
Asked for Raise Successfully	1.00	0.93	0.07**
	(0.05)	(0.26)	(0.00)
Asked for Promotion	0.39	0.40	-0.01
	(0.49)	(0.49)	(0.77)
Asked for Promotion Successfully	0.93	0.99	-0.06**
	(0.26)	(0.09)	(0.01)
Observations	888	312	1200

Notes: Sample includes senior managers from graduating

# Gender Gap in Senior Management: Pooled Sample (Includes Additional Firm Characteristics)

	(1)	(2)	(3)	(4)	(5)	(6)
Female	-0.114***	-0.111***	-0.110***	-0.110***	-0.118***	-0.110***
	(0.0249)	(0.0246)	(0.0245)	(0.0245)	(0.0240)	(0.0239)
Class x Year FE Pre-MBA Characteristics Pre-MBA Industry FE Cummulative Months of Career Break Post-MBA Characteristics Post-MBA Industry FE	Yes	Yes Yes	Yes Yes Yes	Yes Yes Yes Yes	Yes Yes Yes Yes Yes	Yes Yes Yes Yes Yes Yes Yes
Mean	0.419	0.419	0.419	0.419	0.419	0.419
Mean (Male)	0.473	0.473	0.473	0.473	0.473	0.473
R <sup>2</sup>	0.314	0.329	0.335	0.335	0.382	0.395
N	6625	6625	6625	6625	6625	6625

Notes: Sample includes graduating classes 2000-2018, excluding 2009. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.



## Gender Gap in Senior Management: Linked Administrative Sample, 2011-2018

	(1)	(2)	(3)	(4)	(5)	(6)	
Female	-0.0932** (0.0254)	** -0.0867** (0.0255)	** -0.0747** (0.0256)	** -0.0758** (0.0257)	** -0.0571* <sup>*</sup> (0.0242)	* -0.0473* (0.0249)	-0 (0.
Class × Year FE	Yes	Yes	Yes	Yes	Yes	Yes	
Pre-MBA Characteristics		Yes	Yes	Yes	Yes	Yes	
Pre-MBA Industry FE			Yes	Yes	Yes	Yes	
Cumulative Months of Career Break				Yes	Yes	Yes	
Post-MBA Characteristics					Yes	Yes	
Post-MBA Industry FE						Yes	
GMAT, % Finance Classes, Kellogg GPA							
Mean	0.316	0.316	0.316	0.316	0.316	0.316	0
$R^2$	0.171	0.191	0.214	0.214	0.288	0.317	0
N	4669	4669	4669	4669	4669	4669	_

Notes: Sample includes graduating classes 2011-2018. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.



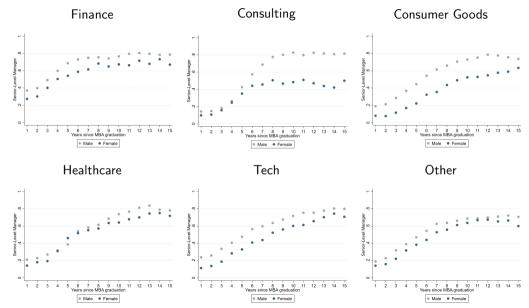
## Gender Gap in Senior Management: Pooled Sample (Survey Data)

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Female	-0.132** (0.0536)	-0.133** (0.0536)	-0.126** (0.0551)	-0.109* (0.0582)	-0.123* (0.0653)	-0.118* (0.0656)	-0.104 (0.0644)
Weekly Hours		0.000373 (0.00214)	0.000323 (0.00215)	0.000247 (0.00213)	0.000294 (0.00213)	-0.0000968 (0.00211)	-0.000150 (0.00210)
Children			0.0130 (0.0227)	0.0205 (0.0241)	0.0188 (0.0242)	0.0147 (0.0246)	0.00477 (0.0244)
Pre-School Child Care Responsibilities (%)				-0.00156 (0.00161)	-0.00184 (0.00178)	-0.00189 (0.00179)	-0.00126 (0.00174)
Employment Gap after First Child (Weeks)					0.00171 (0.00381)	0.00245 (0.00384)	0.00166 (0.00375)
Ambition to be CEO in 5 Years						0.0764 (0.0494)	0.0773 (0.0491)
Class x Year FE Experience and Industry Controls Mean $\mathbb{R}^2$ N	Yes No 0.693 0.108 3025	Yes No 0.693 0.108 3025	Yes No 0.693 0.109 3025	Yes No 0.693 0.111 3025	Yes No 0.693 0.112 3025	Yes No 0.693 0.117 3025	Yes Yes 0.693 0.144 3025

Notes: Sample includes graduating classes 2000-2015, excluding 2009. \* p < 0.10, \*\*\* p < 0.05, \*\*\* p < 0.01.

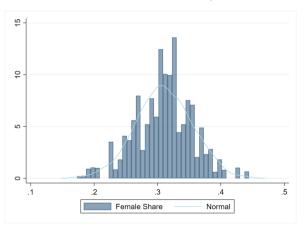


## Senior-Level Management Positions by Industry (Back)



#### Female Share Distribution

Distribution of Female Students per Section



#### List of Controls

#### We control for:

- Stratification variables
  - Attended top 20 US undergraduate university based on US News Ranking
- ▶ Individual-level characteristics that predict the probability of senior manager
  - Having any senior management experience
  - Having worked in finance
- Section-level characteristics that are correlated with female share
  - Share of section with management experience
  - ▶ Share of section with senior-level management experience
  - Share of section that worked in finance
  - Share of section that worked in consulting
  - Share of section that worked in other industries
  - ▶ Share of section that worked in a P&L role
  - Share of white students
  - Share of foreign students



#### Identification of Peer Effects

#### Three main identification challenges in estimating the causal effect of peers

(Manski 1993; Sacerdote 2001; Brock and Durlauf 2001; Moffitt 2001; de Paula 2017; Charles, Hurst, and Notowidigdo 2018; Caeyers and Fafchamps 2021):

- Selection bias: endogenous selection of peers
  - Exogenous variation in female share across MBA sections
- Unobserved correlated effects: contemporaneous shocks
  - Inclusion of class fixed effect
  - Treatment is a function of predetermined characteristics
- Reflection bias: individuals in the same peer group affect each other
  - Outcome as a function of individuals background characteristics and peers average background characteristics



### Identification Assumption and Randomization Test

- Distribution of female share across section as good as random
- ▶ Natural first test: correlation between student's gender and section female share
- Exclusion bias: systematic negative correlation between individual's characteristic and her peers
- ▶ Two randomization tests that account for this:
  - Guryan, Kroft, and Notowidigdo (2009)
  - Caeyers and Fafchamps (2021) Test

Back - Setting Back - Identification

Following Guryan, Kroft, and Notowidigdo (2009):

$$x_{ikc} = \pi_1 + \pi_2 \bar{x}_{-i,k} + \pi_3 \bar{x}_{-i,c} + \delta_c + X_{ikc} \gamma' + u_{ikc}$$
 (2)

Dependent variable: female dummy

	2000-2018			
	(1) No Controls	(2) With Controls		
Section Female Share	0.00172 (0.0155)	0.00158 (0.0155)		
Class Female Share	-278.0*** (2.750)	-278.0*** (2.752)		
R <sup>2</sup> N Class FE	.9868657 5087 Yes	.986868 5087 Yes		

Notes: \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.

### Randomization Test Back - Setting Back - Identification Additional

- ▶ No bias correction term in the estimating equation as in Guryan, Kroft, and Notowidigdo (2009)
- ▶ Caeyers and Fafchamps (2021) net out the asymptotic exclusion bias

$$\tilde{\mathbf{x}}_{ikc} = \phi_1 + \phi_2 \bar{\mathbf{x}}_{-ikc} + \delta_c + u_{ikc} \tag{3}$$

- $\tilde{x}_{ikc} = x_{ikc} \rho \bar{x}_{-ikc}$
- ightharpoonup 
  ho is the asymptotic limit of the bias

(1) No Controls -0.866	(2) With Controls -0.931
	-0.931
(0.635)	(0.655)
0.0188	0.00756
5087	4367
Yes	Yes
	5087

### Randomization Test Back - Setting Back - Identification

▶ Caeyers and Fafchamps (2021) net out the asymptotic exclusion bias

$$\tilde{\mathbf{x}}_{ikc} = \phi_1 + \phi_2 \bar{\mathbf{x}}_{-ikc} + \delta_c + \mathbf{u}_{ikc} \tag{4}$$

- $\tilde{x}_{ikc} = x_{ikc} \rho \bar{x}_{-ikc}$
- ightharpoonup 
  ho is the asymptotic limit of the bias

	_ (1)	(2)	(3)
	Female Top 20 Undergrad	Female Senior Manager	Female Finance
Female share	0.211 (0.236)	0.142 (0.132)	-0.333 (0.282)
$R^2$	0.0297	0.0124	0.0157
N	1758	1640	1546
Class FE	Yes	Yes	Yes

## Joint F-Test (Back - Setting) (Back - Identification)

	(1) Female Share
Female	-0.00169 (0.0104)
Female & Attended Top-20 Undergrad	0.000905 (0.00250)
Female & Worked as Senior Manager	0.00118 (0.00276)
Female & Worked in Finance	-0.00321 (0.00224)
R <sup>2</sup> N F-test Class FE	0.519 4365 0.559 Yes

### Randomization Test Back

Following Guryan, Kroft, and Notowidigdo (2009):

$$x_{ikc} = \pi_1 + \pi_2 \bar{x}_{-i,k} + \pi_3 \bar{x}_{-i,c} + \delta_c + X_{ikc} \gamma' + u_{ikc}$$
 (5)

Dependent variable: female dummy

	200	0-2018	2011-2018		
	(1)	(2)	(3)	(4)	
	No Controls	With Controls	No Controls	With Controls	
Average(X), Section Peers	-0.554	-0.556	-0.385	-0.382	
	(0.420)	(0.420)	(0.693)	(0.694)	
Average(X), Class Peers	1.130***	1.098***	0.897*	0.864*	
	(0.288)	(0.294)	(0.461)	(0.455)	
R <sup>2</sup>	.0072721	.008816	.0046117	.0071015	
N	5087	5087	2090	2090	
Class FE	Yes	Yes	Yes	Yes	

### Randomization Test Back

- ▶ No bias correction term in the estimating equation as in Guryan, Kroft, and Notowidigdo (2009)
- ► Caeyers and Fafchamps (2021) net out the asymptotic exclusion bias

$$\tilde{x}_{ikc} = \phi_1 + \phi_2 \bar{x}_{-ikc} + \delta_c + u_{ikc} \tag{6}$$

- $\tilde{x}_{ikc} = x_{ikc} \rho \bar{x}_{-ikc}$
- $\triangleright \rho$  is the asymptotic limit of the bias

	2000-2018		201	1-2018
	(1)	(2)	(3)	(4)
	No Controls	With Controls	No Controls	With Controls
Female share	-0.866	-0.931	-0.574	-0.587
	(0.635)	(0.655)	(0.917)	(0.875)
R <sup>2</sup>	0.0188	0.00756	0.0145	0.00359
N	5087	4367	2090	1989
Class FE	Yes	Yes	Yes	Yes

# Probability of Holding a Senior Management Position (Back)

Effect of Female Peers on Senior Management: Pooled Sample

	(1) Senior-Level Manager	(2) Senior-Level Manager	(3) Senior-Level Manager	(4) Senior-Level Manager
Female share $\times$ Male	0.0315 (0.115)	-0.0885 (0.0916)	-0.0903 (0.0917)	-0.102 (0.0937)
Female share $ imes$ Female	0.822*** (0.204)	0.674*** (0.182)	0.673*** (0.182)	0.681*** (0.183)
p-value Male vs. Female	0.000	0.000	0.000	0.000
Female Mean	0.391	0.391	0.391	0.391
Male Mean	0.534	0.534	0.534	0.534
$R^2$	0.173	0.166	0.166	0.172
N	51440	51440	51440	51440
Class x Year x Female FE	Yes	Yes	Yes	Yes
Stratification Controls	Yes	No	Yes	Yes
Pre-MBA Characteristics Controls	Yes	No	No	Yes
Section-level Controls	Yes	No	No	No

# Section-Level Characteristics Correlated with Proportion of Female Peers

	(1)	(2) Mean for Above Median Female Share	(3) Mean for Below Median Female Share	(4)	(5)
Section Characteristics	Full Sample	Sections	Sections	Coefficient	<i>p</i> -value
Share of Section with					
Pre-MBA Years of Experience	5.024	5.062	4.982	0.001	0.975
Any Management Experience	0.405	0.413	0.396	0.114	0.015**
Any Senior-Level Management Experience	0.131	0.135	0.126	0.196	0.021**
Entrepreneur	0.024	0.024	0.024	-0.199	0.275
Finance	0.338	0.318	0.361	-0.145	0.021**
Consulting	0.173	0.178	0.168	-0.128	0.043**
Consumer Goods	0.117	0.125	0.109	0.141	0.063*
Healthcare	0.056	0.051	0.061	-0.062	0.582
Tech	0.201	0.193	0.209	-0.031	0.551
Other Industries	0.374	0.388	0.360	0.120	0.027**
Less than 200 Employees	0.223	0.220	0.226	-0.038	0.508
200-4,999 Employees	0.220	0.217	0.223	0.064	0.292
5000+ Employees	0.727	0.728	0.726	-0.108	0.062*
Worked in Female-Friendly Firm	0.746	0.736	0.757	-0.025	0.631
Worked in a P&L Role	0.429	0.446	0.410	0.148	0.003**
US Locality	0.772	0.775	0.770	0.157	0.034**
Top 20 Undergrad	0.249	0.251	0.247	0.098	0.227
White	0.433	0.439	0.427	0.267	0.007**
Foreign	0.308	0.295	0.321	-0.486	0.000***
Observations	148	77	71	148	148

## Number of Years in Senior Management Positions (Back)

Effect of Female Peers on Number of Years in Senior Management Positions

	4.3
	(1) Total Number of Years as Senior Manager Positions
Female share × Female	10.84***
remaie snare x remaie	(2.880)
Female Mean	4.968
Male Mean	7.040
$R^2$	0.306
N	52094
Class $\times$ Year $\times$ Female FE	Yes

# Number of Years to First Senior Management Position (Back)

Effect of Female Peers on Years to First Senior Management Position

	(1) Years to First	(2)
	Senior Manager Position	Total Positions as Senior Manager
Female share $\times$ Female	-8.375***	1.362*
	(2.871)	(0.766)
Female Mean	4.940	1.126
Male Mean	4.359	1.562
$R^2$	0.088	0.314
N	3313	5087
Class $\times$ Year $\times$ Female FE	Yes	Yes

### Effect of Female Peers on External vs Internal Promotions (Back)

Effect of Female Peers on External vs Internal Promotions

	Senior Manager		
	(1) External Promotion	(2) Internal Promotion	
Female share $\times$ Female	0.591*** (0.153)	0.303** (0.152)	
Female Mean Male Mean	0.269 0.343	0.132 0.197	
$R^2$ N Class x Year x Female FE	0.212 50506 Yes	0.037 50506 Yes	

# Probability of Becoming a Senior Manager - One Knot Linear Spline

$$y_{ikct} = \beta_0 + \beta_1 \overline{FemaleShare}_{-i,kct} + \beta_2 \overline{FemaleShare}_{-i,kct} \times I(\overline{FemaleShare}_{-i,kct} > Median)$$

$$+ + \sum_{i=0,1} (\delta_c + \phi_t + \omega_{ct}) \times I(Female_i = j) + X_{ikct} \gamma' + \epsilon_{ikct}$$
(7)

	(1) Senior-Level Manager
Female Share Below Median	0.939*** (0.284)
Female Share Above Median	0.603 (0.375)
p-value Below Median vs. Above Median	0.514
Female Mean	0.391
Male Mean	0.534
N	51440
Class x Year x Female FE	Yes

## Probability of Becoming a Senior Manager - One Knot Linear Spline [Box]

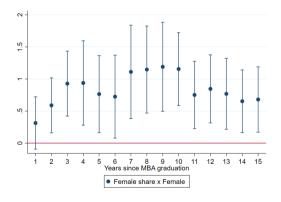
$$y_{ikct} = \beta_0 + \beta_1 \overline{FemaleShare}_{-i,kct} + \beta_2 \overline{FemaleShare}_{-i,kct} \times I(\overline{FemaleShare}_{-i,kct} > Cutoff)$$

$$+ + \sum_{i} (\delta_c + \phi_t + \omega_{ct}) \times I(Female_i = j) + X_{ikct} \gamma' + \epsilon_{ikct}$$
(8)

	(1) Senior-Level Manager (Cutoff: 25th)	(2) Senior-Level Manager (Cutoff: Median)	(3) Senior-Level Manager (Cutoff: 75th)
Female Share Below Cutoff	0.913*** (0.317)	0.938*** (0.285)	0.926*** (0.256)
Female Share Above Cutoff	0.781** (0.310)	0.608 (0.374)	0.348 (0.495)
p-value Below Cutoff vs. Above Cutoff	0.779	0.520	0.341
Female Mean	0.391	0.391	0.391
Male Mean	0.534	0.534	0.534
N	51440	51440	51440
Class x Year x Female FE	Yes	Yes	Yes

# Probability of Ever Becoming a Senior Manager by Year Since Graduation

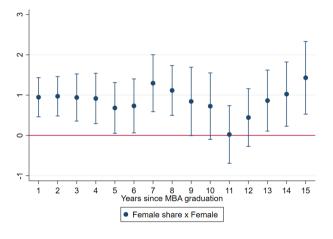
Effect of Female Peers on Ever Holding Senior-Level Management Positions





# Probability of Holding a Director or VP Position by Year Since Graduation

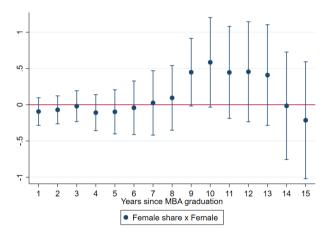
Effect of Female Peers on Holding Director and VP Positions





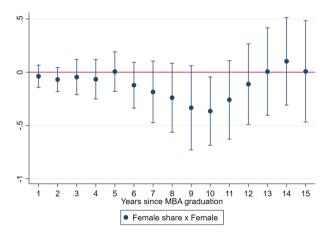
# Probability of Holding an SVP Position by Year Since Graduation

#### Effect of Female Peers on Holding SVP Positions



## Probability of Holding an C-level Position by Year Since Graduation

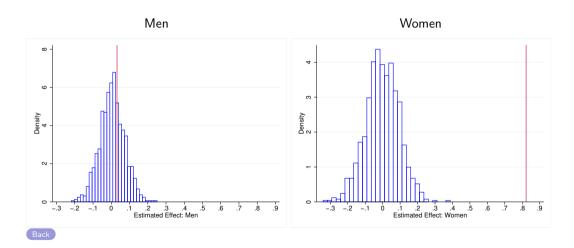
Effect of Female Peers on Holding C-level Positions



### Missing Data

	(1)	(2) Matched to	(3)	(4) Matched to	(5)	(6)	(7)
	Matched to LinkedIn Profile 2000-2010	LinkedIn Profile (US Sample Only) 2000-2010	Matched to LinkedIn Profile 2011-2018	LinkedIn Profile (US Sample Only) 2011-2018	Matched to LinkedIn Company Profile	Matched to Glassdoor	Matched to InHerSight
Female share × Female	-0.166 (0.227)	0.0976 (0.344)	-0.171 (0.128)	-0.0644 (0.109)	-0.135 (0.0937)	-0.126 (0.135)	-0.215 (0.162)
$R^2$	0.0228	0.0104	0.553	0.342	0.256	0.121	0.0936
N	4512	4512	2888	2888	55984	55984	55984
Class FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Year FE	No	No	No	No	Yes	Yes	Yes
Class x Year x Female FE	No	No	No	No	Yes	Yes	Yes
Level of Observations	Person	Person	Person	Person	Person-Year	Person-Year	Person-Yea

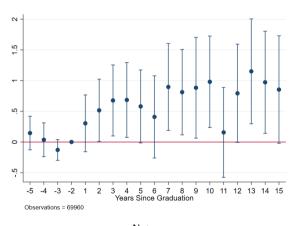




Effect of Female Peers on Senior Management: Robustness

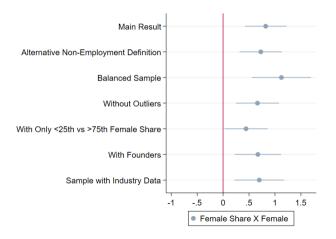
	(1) Year -4	(2) Year -3	(3) Year -2
Female share $\times$ Female	0.0616 (0.102)	-0.0902 (0.0831)	0.0218 (0.0855)
Female Mean	0.075	0.095	0.106
Male Mean	0.083	0.110	0.123
$R^2$	0.572	0.764	0.868
N	4669	4710	4716

#### Probability of Senior-Level Manager: Event Study



Notes:

#### Effect of Female Peers on Senior Management: Robustness



#### Effect of Female Peers on Senior Management: Robustness

		Senior Manager						
	(1)	(2) Alternative	(3)	(4)	(5) With Only	(6)	(7)	(8) Sample with
	Main	Non-Employment	Balanced	Without	$\leq 25^{th}$ vs $\geq 75^{th}$	With	Sample with	Female-Friend
	Result	Definition	Sample	Outliers	Female Share	Founders	Industry Data	Firm Data
Female share $\times$ Female	0.822***	0.728***	1.125***	0.663**	0.443*	0.671***	0.698***	0.535*
	(0.204)	(0.208)	(0.292)	(0.260)	(0.244)	(0.228)	(0.244)	(0.295)
Female Mean	0.391	0.382	0.462	0.393	0.380	0.391	0.394	0.350
Male Mean	0.534	0.531	0.606	0.535	0.505	0.534	0.533	0.488
$R^2$ N Class x Year x Female FE	0.173	0.169	0.129	0.173	0.184	0.189	0.193	0.247
	51440	52083	24340	50400	26054	51440	45389	28093
	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes





Effect of Female Peers on Senior Management: Clustering at Alternative Levels

		Senior Manager					
	(1) Clustered at Section Level (Main Result)	(2) Clustered at Class Level	(3) Two Way Clustering at Individual and Year Level				
Female share $\times$ Female	0.822***	0.822***	0.822***				
	(0.204)	(0.195)	(0.254)				
Female Mean Male Mean  R <sup>2</sup> N Class × Year × Female FE	0.391	0.391	0.391				
	0.534	0.534	0.534				
	0.173	0.173	0.173				
	51440	51440	51440				
	Yes	Yes	Yes				

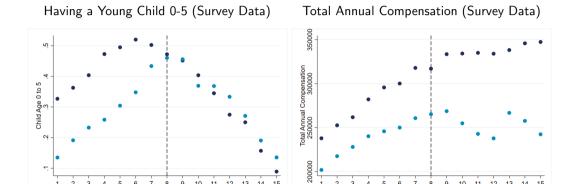
Effect of Female Peers on Senior Management: Logit

	(1) Senior-Level Manager (Linear)	(2) Senior-Level Manager (Logit)
Female share $\times$ Male	0.0315 (0.115)	0.831 (1.408)
Female share $\times$ Female	0.822*** (0.204)	5.328** (2.504)
<i>p</i> -value Male vs. Female Female Mean	0.000 0.391	0.088 0.391
Male Female	0.534	0.534
R <sup>2</sup> N	0.173 51440	51429
Class x Year x Female FE	Yes	Yes

## Role of Female Peers in Female-Friendly Firms

Years since graduation

Male
 Female



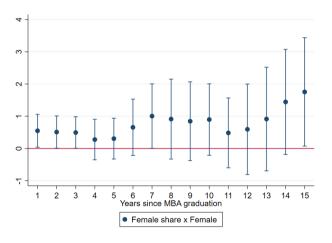
Years since graduation

Female



## Role of Female Peers in Female-Friendly Firms

Being a Senior Manager in a Female Friendly Firm



### MBA Academic Performance and Finance Classes

Effect of Female Peers on GPA during MBA

	(1) Overall GPA	(2) Fraction Finance Classes
Female share $\times$ Female	-0.103 (0.112)	-0.0246 (0.0443)
Mean SD R <sup>2</sup> N	3.519 0.273 0.0666 3425	0.154 0.105 0.156 3425

Notes: Sample includes graduating classes 2011-2018. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.



## **Elective Classes**

	(1) Accounting	(2) Finance	(3) Management	(4) Marketing	(5) Operations	(6) Strategy
Female share $\times$ Female	-0.0146 (0.0192)	-0.0519 (0.0561)	0.0410 (0.0431)	0.0539 (0.0521)	-0.0682 (0.0473)	-0.0263 (0.0236)
Female Mean	0.033	0.129	0.057	0.198	0.053	0.041
Male Mean	0.044	0.203	0.070	0.142	0.061	0.032
$R^2$	0.096	0.182	0.335	0.133	0.047	0.532
N	3425	3425	3425	3425	3425	3425
Class $\times$ Year $\times$ Female FE	Yes	Yes	Yes	Yes	Yes	Yes



## Senior Managers and Labor Market Attachment

#### Senior Managers and Labor Force

	(1)	(2) Cumulative Months In Non-Employment	(3) Senior-Level Manager (Unconditional)	(4) Senior-Level Manager (Conditional)
Female share $\times$ Female	-0.0154 (0.0487)	4.502 (4.795)	0.822*** (0.204)	0.841*** (0.206)
Female Mean	0.985	1.707	0.391	0.403
Male Mean	0.995	0.633	0.534	0.542
$R^2$	0.025	0.077	0.173	0.183
N	49991	51482	51440	50428
Class x Year x Female FE	Yes	Yes	Yes	Yes

## Entrepreneurship

Effect of Female Peers on Entrepreneurship

	(1) Entrepreneurs
Female share $\times$ Female	-0.184 (0.111)
Female Mean Male Mean <i>R</i> <sup>2</sup> N	0.035 0.040 0.019 51451
Class x Year x Female FE	Yes



## Senior Managers and Any Manager

#### Senior Managers and Any Manager

	(1) Any-Level Manager
Female share $\times$ Female	0.229 (0.182)
Female Mean	0.744
Male Mean	0.767
$R^2$	0.058
N	51440
Class x Year x Female FE	Yes



### Senior Manager and Firm Size

Effect of Female Peers on Senior Manager and Firm Size

		Senior Manager				
	(1)	(2)	(3)			
	Firm with	Firm with	Firm with			
	Less than 200	200 to 4,999	More than 5,000			
	Employees	Employees	Employees			
Female share $\times$ Female	0.171*	0.0258	0.495**			
	(0.0878)	(0.161)	(0.219)			
Female Mean	0.064	0.089	0.240			
Male Mean	0.106	0.115	0.313			
$R^2$	0.035	0.037	0.089			
N	45169	45169	45169			
Class × Year × Female FE	Yes	Yes	Yes			



### Firm Size

Effect of Female Peers on Firm Size

	(1) Number of Employees	(2) Less than 200 Employees	(3) 200 to 4,999 Employees	(4) More than 5,000 Employees
Female share $\times$ Female	-1673.1 (2178.0)	-0.0449 (0.164)	-0.0246 (0.176)	0.0589 (0.246)
Female Mean	5975.751	0.158	0.147	0.678
Male Mean	5484.606	0.183	0.171	0.641
$R^2$	0.051	0.024	0.023	0.043
N	44759	45171	45171	45171
Class x Year x Female FE	Yes	Yes	Yes	Yes



## Senior Manager and Firm Compensation

Effect of Female Peers on Senior Manager and Firm Compensation

	Senior Manager						
	(1)	(2)	(3) Firm with	(4) Firm with			
	Firm with Total Compensation Above Median	Firm with Total Compensation Below Median	Senior Total Compensation Above Median	Senior Total Compensatio Below Median			
Female share $\times$ Female	0.541 (0.494)	0.244 (0.286)	0.454 (0.442)	0.331* (0.195)			
Female Mean	0.178	0.061	0.189	0.049			
Male Mean	0.309	0.081	0.334	0.057			
$R^2$	0.239	0.127	0.276	0.083			
N	34459	34459	27582	27582			
Class × Year × Female FE	Yes	Yes	Yes	Yes			

### Firm Compensation

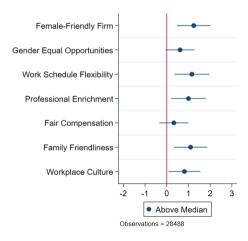
#### Effect of Female Peers on Firm Compensation

	(1)	(2)	(3)	(4)	(5)	(6) Gender Gap in
	Base Annual Compensation	Senior Manager Base Annual Compensation	Total Annual Compensation	Senior Manager Total Annual Compensation	Gender Gap in Total Annual Compensation	Senior Manager Total Annual Compensation
Female share × Female	941.2	-38378.5	-609965.6	-8728249.4	0.0226	-0.868
	(13616.8)	(33415.0)	(417954.9)	(5688277.1)	(0.133)	(0.694)
Mean	99202.9	178602.9	229065.3	1129945.9	0.152	0.0619
SD	32366.5	47720.9	6779868.3	43643042.0	0.426	1.324
R <sup>2</sup>	0.600	0.407	0.0146	0.0153	0.179	0.0498
N	34457	27584	34457	27584	28091	23074
Class x Year x Female FE Industry FE	Yes	Yes	Yes	Yes	Yes	Yes



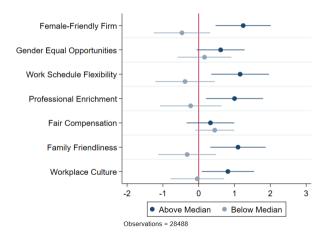
## Role of Female Peers in Female-Friendly Firms

#### InHerSight Components

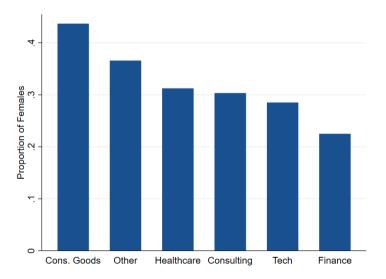


# Role of Female Peers in Female-Friendly Firms

#### InHerSight Components



# Female Representation by Industry





### Role of Female Peers in Male-Dominated Industries

Effect of Female Peers on Probability of Senior Management in Male and Female Dominated Industries

	Senior		
	(1) Male Dominated Industries	(2) Female Dominated Industries	(3) Male Dominated Industries
Female share $\times$ Female	0.605** (0.243)	-0.0269 (0.107)	0.243 (0.260)
Female Mean	0.201	0.074	0.483
Male Mean	0.344	0.072	0.626
$R^2$	0.097	0.033	0.037
N	45389	45389	45391
Class $\times$ Year $\times$ Female FE	Yes	Yes	Yes

Notes: Sample includes graduating classes 2000-2018, excluding 2009. \* p < 0.10, \*\* p < 0.05, \*\*\* p < 0.01.

► Effects driven by higher **promotion rates**, not entries ®ack

#### Role of Female Peers in Male-Dominated Industries

Effect of Female Peers on Probability of Senior Management in Male and Female Dominated Industries

	Senior Manager		
	(1) Restricted to Male Dominated Industries	(2) Restricted to Female Dominated Industries	
Female share $ imes$ Female	0.821** (0.373)	0.0821 (0.371)	
Female Mean Male Mean $R^2$ N Class x Year x Female FE	0.415 0.549 0.219 26339 Yes	0.303 0.476 0.248 8199 Yes	



# Heterogeneity by Male-Dominated Industries

#### Industries

	(1)	(2)	(3)	(4)	(5)	(6)
	Finance	Consulting	Consumer Goods	Healthcare	Technology	Other
Female share $\times$ Female	0.285 (0.208)	-0.215 (0.159)	-0.120 (0.191)	0.329** (0.146)	0.0555 (0.261)	-0.175 (0.254)
Female Mean	0.162	0.125	0.192	0.077	0.208	0.273
Male Mean	0.276	0.136	0.117	0.078	0.247	0.223
$R^2$	0.062	0.057	0.025	0.016	0.027	0.021
N	45391	45391	45391	45391	45391	45391
Class x Year x Female FE	Yes	Yes	Yes	Yes	Yes	Yes



### Role of Female Peers in Female-Friendly Firms

Effect of Female Peers on Probability of Senior Management in Female-Friendly Firms

	Senior Manager		
	(1) Female-Friendly Firms	(2) Non Female-Friendly Firms	
Female share $\times$ Female	1.190*** (0.418)	-0.418 (0.831)	
Female Mean Male Mean  R <sup>2</sup> N Class × Year × Female FE	0.303 0.439 0.314 20893 Yes	0.252 0.407 0.504 7612 Yes	

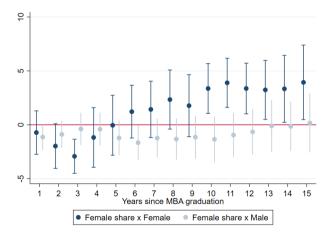


# Female-Friendly Firms and Male-Dominated Industries (Back)

	Senior Manager (Restricted to Male Dominated Industries)		
	(1) Female-Friendly Firms	(2) Non Female-Friendly Firms	
Female share $\times$ Female	1.407** (0.562)	0.0990 (0.405)	
Female Mean	0.239	0.089	
Male Mean <i>R</i> <sup>2</sup>	0.294 0.205	0.136 0.248	
N	16887	16887	
Class x Year x Female FE	Yes	Yes	

# Role of Female Peers in Female-Friendly Firms

Working in a Female Friendly Firm (Restricted to Male Dominated Industries)





# Effect of Female Peers on Compensation

Imputed individual compensation using Glassdoor average compensation by firm, gender, and management level (senior manager, first-level manager, non-manager)

Effect of Female Peers on Compensation

	(1)	(2)	(3)
	Total Annual	Base Annual	Non-Base Annual
	Compensation (Imp.)	Compensation (Imp.)	Compensation (Imp.)
Female share $\times$ Female	75.26	-11.32	86.57**
	(69.89)	(33.10)	(42.66)
Female Mean	117.482	90.861	26.621
Male Mean	178.865	117.206	61.658
<i>R</i> <sup>2</sup>	0.173	0.263	0.105
N	26567	26567	26567
Class $\times$ Year $\times$ Female FE	Yes	Yes	Yes



# Female-Friendly Firms: Examples Female-Friendly



It is a company with a culture and benefits that fully support women [...] From industry leading family support benefits, strong women in leadership, [...] flexible culture.

- ► InHerSight.com overall rating: 3.8
- ▶ Maternity leave policy: 4.1
- ► Flexible work schedule: 3.8

### Non Female-Friendly



Benefits and perks are decent. Culture is strange. [...] the 'good old boys' club with lots of ancient technology and attitudes prevails in some areas.

- InHerSight.com overall rating: 3
- ▶ Maternity leave policy: 3.4
- ► Flexible work schedule: 2.4

### First Post-MBA Placement

First Post-MBA Placement

	(1) Senior-Level Manager	(2) Male Dominated Industries	(3) Female-Friendly Firms	(4) Number of Employees	(5) Total Annula Compensation
Female share $\times$ Female	0.300 (0.211)	-0.132 (0.257)	0.458 (0.810)	38.34 (3580.8)	-12191.2 (136151.1)
Female Mean	0.137	0.522	0.500	7018.639	154070
Male Mean	0.228	0.671	0.587	6398.706	163300
$R^2$	0.065	0.045	0.137	0.034	0.033
N	4972	4538	3239	4443	3580
Class x Year x Female FE	Yes	Yes	Yes	Yes	Yes

#### Job Referrals and Information Transmission

 Literature on importance of job referrals and private career information for career outcomes

(Granovetter 1973; Calvo-Armengol and Jackson 2004; Bolte, Immorlica, and Jackson 2021)

- Women may benefit from gender-specific private information
- ► Female peers can help women (esp. later in their careers):
  - ▶ identify and enter firms that support women in their career advancement
  - learn how to take advantage of female-friendly policies
    - ▶ i.e., maternity leave and flexible work schedules



### Suggestive Evidence of Job Referrals and Information Transmission

#### Probability of Working in Same Firm

- ▶ Female classmates more likely to work in same firm if from same section
  - Not true for men
- ► Effect driven by female-friendly firms Female-Friendly Firms

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#### (Preliminary) Survey Descriptive Evidence

- ▶ Female MBAs with children are significantly more likely to respond
  - "Obtained top management position due to MBA peers"
  - "Secured jobs and promotions" through their MBA network

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  - "Secured jobs and promotions" through their MBA network

# Results suggest that female MBAs rely on their MBA peer network to identify firms and attain promotions

Suggestive of search and information frictions for female-friendly firms



#### Referrals and Information Transmission

- ▶ Likelihood of working in same firm of a same-gender same-section classmate (Bayer et al. (2005), Schmutte (2015), Zimmerman (2019))
- ▶ Matched all MBAs to all classmates (same graduating year)

$$\begin{aligned} y_{i,j} &= \alpha_1 Same Section_{i,j} \times Both Males_{i,j} + \alpha_2 Same Section_{i,j} \times Both Females_{i,j} \\ &+ \alpha_3 Same Section_{i,j} + \alpha_4 Both Males_{i,j} + \alpha_5 Both Females_{i,j} + \delta_c + \phi_f + u_{i,j} \end{aligned}$$

- $\triangleright$   $y_{i,j}$  takes value 1 if i and j in same firm
- SameSection takes value 1 if i and j in same section
- ▶ BothMales (BothFemales) takes value 1 if i and j are both men (women)
- $ightharpoonup \delta_c$  class FE
- $ightharpoonup \gamma_f$  firm FE



#### Referrals and Information Transmission

#### Probability of Entering Same Firm

	(1)
Same Section	0.000071 (0.000264)
Same Section $\times$ Both Males	-0.000092 (0.000333)
Same Section $\times$ Both Females	0.001260** (0.000640)
p-value Both Male vs. Both Female Female Mean Male Mean $R^2$ N Class x Year FE Firm FE	.034460 .006549 .006420 .040879 11,991,054 Yes Yes

- ► Female classmates more likely to work in same firm if from same section
- ► Effect driven by family-friendly firms Female-Friendly Firms Back

## Referrals and Information Transmission (Back)

#### Probability of Entering Same Firm

	(1)
Same Section $ imes$ Both Males	0.000059 (0.000473)
Same Section $\times$ Both Males $\times$ Female-Friendly Firm	-0.000215 (0.000660)
Same Section $ imes$ Mixed Gender	-0.000644 (0.000487)
Same Section $\times$ Mixed Gender $\times$ Female-Friendly Firm	0.000428 (0.000707)
Same Section $ imes$ Both Females	-0.000118 (0.000946)
Same Section $\times$ Both Females $\times$ Female-Friendly Firm	0.002810** (0.001430)
p-value Both Male vs. Both Female Female Mean Male Mean $R^2$ N Class x Year FE Firm FE	.055300 .006549 .006420 .050743 7,623,733 Yes

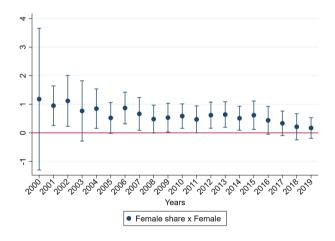
### How Should We Allocate Female Students?

- ► Non-linear effect of female peers Non-Linearity
- ▶ Back-of-the-envelope counterfactual exercise
  - Assuming no change in share of female students in MBA program in 2000-2018
  - ▶ Students reallocation: female students in sections with at least 34% women
    - $\Rightarrow$  2 to 5 additional female senior managers per graduating class (3.6% to 8.4%  $\uparrow$ )



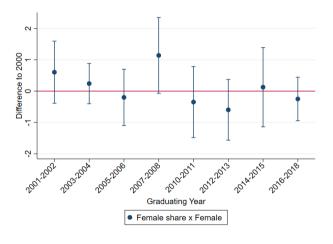
# Probability of Holding a Senior Manager Position by Year

Effect of Female Peers on Holding Senior-Level Management Positions



# Probability of Holding a Senior Manager Position by Cohort

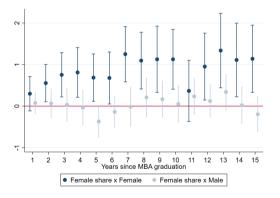
Effect of Female Peers on Holding Senior-Level Management Positions





# Probability of Holding a Senior Manager Position by Year Since Graduation

Effect of Female Peers on Holding Senior-Level Management Positions



- ▶ 1SD (4pp)  $\uparrow$  in female share  $\Rightarrow$  7.7% increase in probability of becoming senior manager 15 years post graduation
- ► No effect on men Back

# Heterogeneity on Pre-Characteristics (Back)

Standardized Index: 3 pre-MBA characteristics that predict senior manager position

- ► Attended top 20 US undergraduate university based on US News Ranking
- ▶ Having any senior management experience
- ► Having worked in finance

#### Probability to Become Senior Manager

	Senior Manager
Female share $\times$ Female	0.587*** (0.209)
Female share $\times$ Female $\times$ Quality Index Above Median	1.164** (0.543)
Mean SD R <sup>2</sup> N Class x Year x Female FE	0.488 0.500 0.0806 51440 Yes

# Female Share and Gender of the Faculty

#### Gender of the Faculty

	(1) Female Faculty	(2) Any Female Faculty
Female share $\times$ Female	0.111 (0.225)	0.450 (0.871)
R <sup>2</sup> N Class FE	0.402 48 Yes	0.226 48 Yes

Notes: Sample includes graduating classes 2011-2018. \* p < 0.10, \*\*\* p < 0.05, \*\*\*\* p < 0.01.



#### Identification of Peer Effects

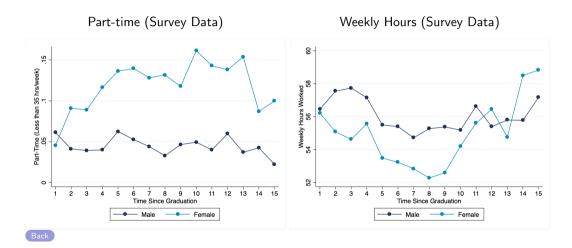
#### Two main identification challenges in estimating causal effect of peers

(Manski 1993; Sacerdote 2001; Brock and Durlauf 2001; Moffitt 2001; de Paula 2017; Charles, Hurst, and Notowidigdo 2018; Caeyers and Fafchamps 2021):

- ► Endogenous selection of peers:
  - ► Exogenous variation in female share across MBA sections Female Share Randomization
- Contemporaneous shocks:
  - Treatment is a function of predetermined characteristics Faculty

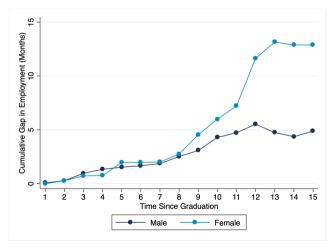


# Role of Female Peers in Female-Friendly Firms



# Role of Female Peers in Female-Friendly Firms





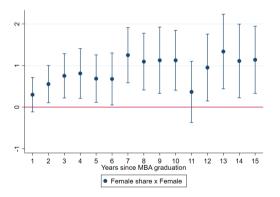
# Female-Friendly Firms

"If you are working at businesses that are more "female-friendly," it probably [...] allows more flexibility in the workforce, meaning, I have to leave every day at four to pick up my kid because that's my job at home, but I'll get back on. And the more that's normalized and celebrated, the more [women] can kind of lean in and not drop down [...] when they have kids." (MBA 2015)

Back

# Probability of Holding a Senior Manager Position by Year Since Graduation

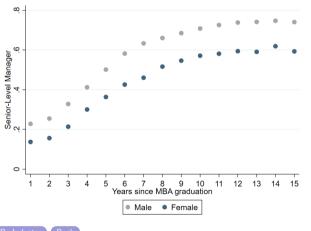
Effect of Female Peers on Holding Senior-Level Management Positions



▶ 1SD (4pp)  $\uparrow$  in female share  $\Rightarrow$  7.7% increase in probability of becoming senior manager 15 years post graduation

# Gender Gap in Senior Management Over Time Since Graduation

#### Probability of Holding Senior Management Position

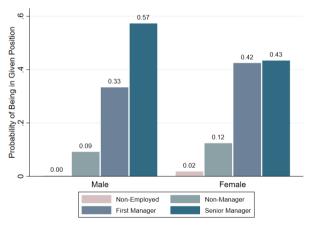


 Gender gap emerges immediately post MBA and persists over time

By Industry | Back

# Gender Gap in Promotion into Senior Management

#### 5-Year Transition Probabilities for First-Level Managers

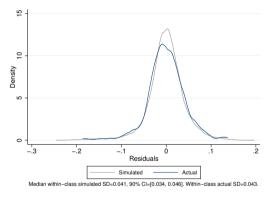


#### Female first-level managers:

- ► 26% less likely to transition into senior management
- ► 56% more likely to transition into non-employment or non-management



### Share of Female Students



No significantly different distribution of residualized actual and simulated female share (Bietenbeck 2020)



### 1. Emotional Support

"I think we band together with other females. We create like this organic community and being able to share stories"

"There's [a] shared lived experience... We are women in industry who are finding the same challenges and factors that are influencing our advancement, regardless of industry[...] We can understand those things and how we navigate them make sense to me."

Back

### 2. Improved Academic Environment

#### In the data:

► No empirical evidence of an effect on MBA academic performance and finance classes GPA and Finance

#### In the interviews:

Ambition and self-confidence:

"I feel like having a good group of women with whom you could be in small groups just makes it **less intimidating** [to ask questions]. I think that it's just a safer environment, and so I think if you have that, from the beginning, like in your study groups [...], it would just be a skill that you would learn in life."



### 3. Gender-Specific Information

#### ► Firm Benefits and Culture

"If I receive an offer, I'm comfortable talking to a [female] friend [...] I'd ask how maternity leave works or generally what the female community looks like and what the support is. I probably wouldn't ask those questions [to a hiring manager] in the off chance the person uses this as a red flag."



### 3. Gender-Specific Information

Firm Benefits and Culture

#### Work-life Balance and Related Policies

"I was one of the first people at an earlier stage company [...] to actually have kids [...] and so they had no idea what parental leave looks like [...]. I had to write up a document that scopes who to contact and how to leave my projects to other people. I talked to several females from the [MBA] community who had already gone through this cycle, just to learn exactly how they left things."



#### 4. Job Referrals

#### In the data:

▶ Female classmates more likely to work in same firm if from same section



Effect driven by female-friendly firms

#### In the interviews:

- "I received this opportunity through a recruiter, but was referred to me by a [MBA] friend."
- ► "Early on getting out of school, one of my first good jobs out of business school I got through a classmate...in the first [few] years, there was a lot more leaning on classmates in the network to find potential hires"



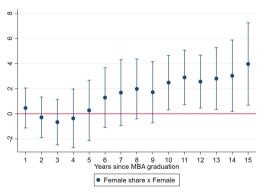
### Students' Assignment Process

- 1. Students assigned to sections from 1 to 8 in alphabetical order
- 2. Check whether share of male students, white students, and students from a given university within set boundaries
- 3. If not, students randomly re-assigned to hit target



### Role of Female Peers in Female-Friendly Firms

#### Working in a Female Friendly Firm



- ► Women shift towards more female-friendly firms
- ► Effect concentrated when female MBA graduates have young children and gender wage gap increases

# Share of Female Peers per Section

Within-Class Variation in Female Peers

