Business Training and Spatial Competition in Urban Uganda

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 - ➤ Some channels positive (e.g. knowledge diffusion, increased demand) and others negative (e.g. business stealing)
 - What is the spatial incidence of these effects? Limited evidence so far is from segregated markets
- What are the indirect effects of business training?
 - Key for policy questions regarding aggregate impact in many market contexts

This paper

- We experimentally evaluate direct <u>and</u> indirect effects of business training
- Intervention: classroom training and individual coaching and mentoring for women-owned SMEs in central Uganda
- Design aimed at power for capturing indirect effects
 - ightharpoonup Saturation design with 134 urban neighborhood clusters and \sim 1,300 firms
 - 9 rounds of detailed follow-up surveys over 4 years
- Our approach: combine tools from spatial literature with experimental variation to understand geographic exposure in an urban setting

Findings

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 - Persistent improvement in practices, finances, and other outcomes
- Both positive and negative indirect effects on nearby firms
 - Little diffusion of business practices
 - Positive demand agglomeration
 - Negative competitive pressures
- Exposure depends on distance and demand elasticity
 - Indirect effects appear to be localized in this setting

Related literature

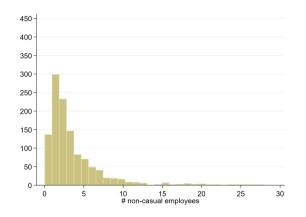
- Firm training, mentoring, & consulting, reviewed in McKenzie et al. (2021)
 - Our direct effect sizes are consistent with the literature
- Indirect effects of interventions with firms
 - ► Through firm networks: Cai & Szeidl (2018) and Hardy & McCasland (2021)
 - Within sector effects of firm subsidies (Rotemberg, 2019)
 - Market-level effects of credit (Cai & Szeidl, 2022) and business training (McKenzie & Puerto, 2021)
 - This paper: spatial dimension in urban setting without segregated markets
- Bring experimental variation to classic IO and geography literatures on agglomeration vs. competition forces driving firm location

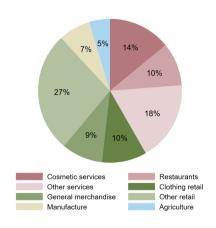
Intervention and Experimental Design

Women Mean Business program implementation

- Women Mean Business (WMB) program run by Technoserve
 - Open to established women-owned SMEs of any type in central Uganda
 - Program had classroom (finances, customer care, marketing) and personalized components (business plan development, mentoring) over 16 month period
 - Medium intensity program targeting mid-size firms relative to literature
- Broad-based recruiting for scale-up and high frequency data
 - Started with SME census in commercial areas of four cities
 - ightharpoonup Recruitment visits to \sim 5k likely eligible businesses plus blast advertising
 - Baseline survey with experimental sample of 1,297 eligible applicants and 9 follow-ups surveys over 4 years

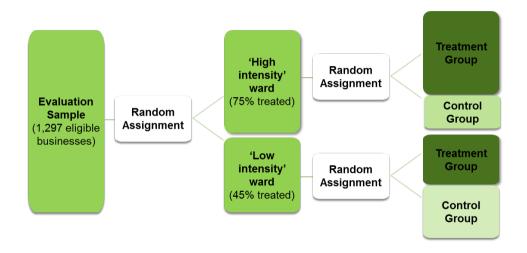
Sample firms are SMEs in consumer-facing retail and services





SUMMARY STATS AND BALANCE

Experimental design



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Takeup & participation

- Take-up moderately high, in line with literature ($\sim \frac{2}{3}$ of invited businesses)
 - Conditional on attending, participation was high on the intensive margin
- No evidence of selection by ward-level intensity of treatment
- Some positive selection in take-up
 - Participants more likely to be highly educated, speak English, etc



Empirical Strategy and Results

Use spatial variation to get firm-level exposure measures

- Expect demand-side forces to be main source of indirect effects, which depend on:
 - Firm locations
 - Consumers' cost of distance to get between firms
 - Perceived substitutability of firms

Use spatial variation to get firm-level exposure measures

- Expect demand-side forces to be main source of indirect effects, which depend on:
 - Firm locations
 - Consumers' cost of distance to get between firms
 - Perceived substitutability of firms
- Exploit firm location data to create a continuous, distance-weighted measure of individual exposure:

$$extstyle extstyle extstyle E_i = \sum_j rac{ extstyle T_j}{ extstyle d_{ij}^{\sigma}}$$

- Captures idea that improvements in closer neighbors matter more
 - \blacktriangleright How much more? Parameterized by σ

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Control for non-random components of spatial exposure

- ullet Treatment is randomly assigned, but distance weighting is not o depends on business location and neighborhood density
- Use Borusyak & Hull (2021) method to control for "expected exposure" μ_i
- Identification comes from differences between expected and realized random exposure to treated businesses
 - Saturation design leads to greater deviations from μ_i than under individual-level randomization

Specification captures spatial aspect of indirect effects

$$y_{it} = \alpha + \beta_1 T_i + \beta_2 E_i + \beta_3 \mu_i + \gamma_1 y_{i0} + pair_i + survey_t + \epsilon_{it}$$

- y_{it} is outcome at time t (y_{i0} at baseline), T_i is individual treatment, $pair_i$ are ward randomization pair FE and $survey_t$ are survey round FE
- β_1 is direct effect and β_2 indirect effect of business training
- Choice about distance elasticity σ
 - First show one value as an example, then explore range

WMB exposure effects: Business practices

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
	Business practices: std index (cols 2-9)	Record keeping: std index	Business planning: std index	Use of financial services: std index	Supply manage- ment: std index	Monthly advert. expenses (PPP USD)	Customer care: std index	HR training: # new methods	Formality: std index
Treatment	0.51*** (0.04)	0.21*** (0.04) [0.001]	1.06*** (0.05) [0.001]	0.04 (0.04) [0.420]	0.17*** (0.05) [0.002]	0.76* (0.41) [0.134]	0.20*** (0.05) [0.001]	0.01 (0.03) [0.781]	0.10 (0.07) [0.258]
Exposure to treated businesses	0.00 (0.02)	0.02*** (0.01) [0.013]	-0.03 (0.03) [0.381]	0.04** (0.02) [0.089]	-0.03 (0.03) [0.420]	-0.39** (0.17) [0.062]	0.01 (0.04) [0.807]	-0.04 (0.04) [0.465]	-0.00 (0.02) [0.807]
Expected exposure	-0.01 (0.02)	-0.00 (0.01)	-0.01 (0.02)	0.00 (0.01)	0.00 (0.02)	0.03 (0.05)	-0.01 (0.03)	0.02 (0.03)	-0.01 (0.01)
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	9,575 1,157 0.00 1.27	9,575 1,157 -0.22 0.96	7,435 1,157 -0.03 1.11	5,312 1,146 0.36 1.12	6,354 1,141 0.13 1.53	6,326 1,149 4.50 12.70	9,574 1,157 0.40 1.47	3,075 1,074 0.47 0.64	1,042 1,042 -0.35 0.98

WMB exposure effects: Financial outcomes

	(1) Financial outcomes: std index (cols 2-7)	(2)	(3) Monthly revenue (PPP USD)	(4) Monthly profit (PPP USD)	(5) Monthly take home (PPP USD)	(6) Business grew since 2013 (=1)	(7) Business more profitable since 2013 (=1)
		Business in operation (=1)					
Treatment	0.10** (0.04)	0.01 (0.01) [0.255]	812.21** (405.73) [0.134]	114.63* (62.05) [0.135]	35.48* (18.37) [0.134]	0.07** (0.03) [0.134]	0.08** (0.03) [0.127]
Exposure to treated businesses	0.02** (0.01)	0.00 (0.00) [0.436]	281.80** (120.59) [0.127]	16.01 (20.45) [0.475]	1.16 (7.11) [0.872]	-0.01* (0.01) [0.170]	-0.01 (0.01) [0.273]
Expected exposure	0.01 (0.01)	0.00** (0.00)	37.51 (140.74)	4.60 (18.97)	-1.19 (5.94)	0.04*** (0.01)	0.04*** (0.01)
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	17,012 1,155 -0.15 0.89	5,307 1,123 0.94 0.24	16,583 1,151 4,713.94 7.412.51	16,260 1,151 916.61 1,345.34	14,110 1,149 395.78 394.93	1,044 1,044 0.57 0.50	1,044 1,044 0.54 0.50

WMB exposure effects: Production inputs

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	Total expenses last month (PPP USD; cols 2-5)	Stock expenses last month (PPP USD)	Employee expenses last month (PPP USD)	Equipment expenses last month (PPP USD)	Other expenses last month (PPP USD)	# non-casual employees	Property replacement value (PPP USD)
Treatment	507.22** (254.56)	311.29 (216.25) [0.262]	33.24 (21.92) [0.262]	2.22 (2.28) [0.442]	129.48*** (42.33) [0.033]	0.40** (0.20) [0.195]	5,168.83* (2,982.70) [0.206]
Exposure to treated businesses	59.82 (49.89)	72.81** (33.80) [0.195]	-2.22 (9.89) [0.898]	-0.95* (0.51) [0.196]	-1.34 (14.16) [0.925]	-0.11 (0.10) [0.394]	997.34 (2,764.75) [0.863]
Expected exposure	46.31 (45.86)	24.39 (30.21)	10.20 (8.46)	-0.67 (0.54)	16.17 (19.08)	0.21** (0.10)	1,072.81 (1,669.74)
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	9,420 1,239 2,708.45 4,391.64	9,420 1,239 1,681.01 3,671.40	9,420 1,239 369.68 663.55	9,420 1,239 19.38 118.03	9,420 1,239 638.38 910.23	8,528 1,155 2.84 4.62	991 991 23,103.30 43,467.59

WMB exposure effects: Business operations

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	# daily customers	Weighted price index (log)	Weighted avg markup (log)	Weighted unit cost index (log)	Total units sold (log)	Introduced product in last 3m (=1)	Stopped offering product in last 3m (=1)
Treatment	2.45	0.03	0.01	0.02	0.11	0.00	0.00
	(1.60)	(0.05)	(0.02)	(0.06)	(0.08)	(0.01)	(0.01)
	[0.300]	[0.770]	[0.770]	[0.892]	[0.331]	[0.958]	[0.892]
Exposure to treated businesses	0.54*	-0.04*	-0.02***	-0.04***	0.08***	-0.01	0.00
	(0.30)	(0.02)	(0.01)	(0.02)	(0.02)	(0.01)	(0.00)
	[0.208]	[0.208]	[0.022]	[0.022]	[0.001]	[0.712]	[0.958]
Expected exposure	0.00	-0.02	0.02	-0.00	0.02	0.01	-0.00
	(0.16)	(0.03)	(0.01)	(0.02)	(0.02)	(0.01)	(0.00)
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	9,520	7,998	7,986	7,985	7,998	9,574	9,574
	1,155	1,143	1,143	1,143	1,143	1,157	1,157
	16.56	9.59	0.63	8.99	5.84	0.28	0.08
	33.23	1.85	0.55	1.83	1.90	0.45	0.28

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- Using only ward-level randomized saturation as measure of indirect exposure fails to capture these patterns (RESULTS)

How local are indirect effects?

- Choice of σ matters for both level and precision of estimates
 - ▶ A higher distance elasticity assigns greater weights to very local exposure
 - But captures variation from a smaller set of businesses

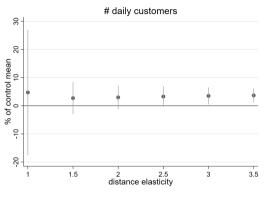
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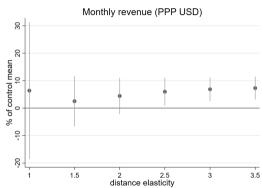
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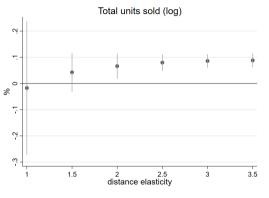
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- For now, we are agnostic about the "correct" elasticity and instead explore how different values affect our conclusions
- (In progress: plugging experiment into a framework that lets us interpret σ and estimate an internally consistent value)

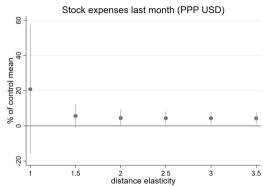
Exposure to treatment generates positive demand spillovers...



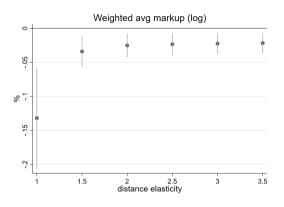


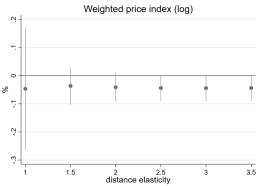
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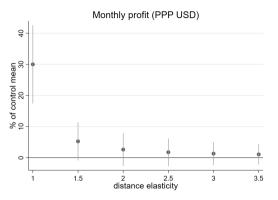


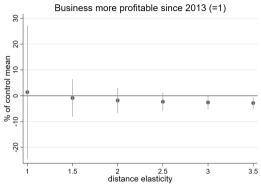
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Conclusion and next steps

- Training was good for participating SMEs, but policy makers need to know what that does to the whole market
- We bring experimental variation to old questions about spatial agglomeration and competition, in a setting with complex geography
- Evidence of both agglomeration and competition in the effects on indirectly exposed firms
 - Both forces appear to be very localized in this urban retail setting
- Next: plug into simple modeling framework to:
 - 1. Estimate and interpret internally consistent distance elasticity
 - 2. Bound aggregate implications from policymaker perspective

Thank you!!

Summary statistics and balance

	(1)	(2)	(3)	(4)	
	Business trea	ntment status	Ward-level intensity		
	Control	Treat - Control	Low	High - Low	
Completed higher education (=1)	0.47	0.00	0.49	-0.03	
		(0.02)		(0.05)	
Household assets (std index)	-0.00	0.00	0.02	-0.06	
		(0.06)		(0.06)	
Business age in 2012 (years)	7.30	0.56*	7.14	1.07***	
		(0.33)		(0.26)	
Monthly revenue (PPP USD)	5,773.30	560.98	6,007.74	61.92	
		(445.94)		(497.72)	
Monthly profit (PPP USD)	1,117.99	74.84	1,167.28	-26.79	
,,		(110.21)		(68.03)	
# bus. branches	1.16	0.01	1.18	-0.04*	
		(0.04)		(0.02)	
# non-casual employees	4.27	-0.62	4.26	-0.57	
		(0.70)		(0.46)	
Keeps records (=1)	0.83	-0.03	0.81	-0.00	
		(0.02)		(0.02)	
Applied for a loan in last year (=1)	0.29	0.02	0.26	0.07***	
		(0.03)		(0.02)	
Observations	482	779	619	642	
p-value: multivariate orthogonality test		0.357		0.000	



Takeup & participation

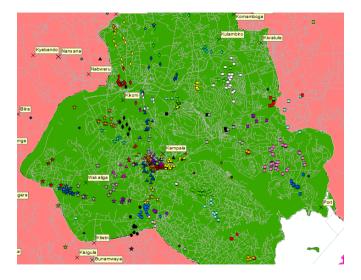
	(1)	(2)	(3)	(4)	(5)
	All	High inte	nsity ward	Higher 6	education
	treated	No	Yes	No	Yes
Participated in ≥ 1 activity (=1)	0.66	0.67	0.66	0.60	0.81***
	(0.02)	(0.03)	(0.02)	(0.02)	(0.02)
Attended \geq 1 class (=1)	0.63	0.63	0.64	0.58	0.78***
	(0.02)	(0.03)	(0.02)	(0.03)	(0.02)
# of classes attended (cond.)	4.98	4.82	5.07	4.74	5.23**
	(0.09)	(0.16)	(0.12)	(0.15)	(0.12)
Ever met with coach (=1)	0.62	0.63	0.61	0.54	0.71***
	(0.02)	(0.03)	(0.02)	(0.03)	(0.03)
# of times that met with coach (cond.)	4.93	4.80	5.00	4.77	5.11
	(0.11)	(0.19)	(0.14)	(0.17)	(0.16)
Received business plan from coach (=1; cond.)	0.88	0.85	0.89	0.86	0.90
	(0.02)	(0.03)	(0.02)	(0.03)	(0.02)
Ever met with mentor (=1)	0.51	0.50	0.51	0.45	0.59***
	(0.02)	(0.03)	(0.03)	(0.03)	(0.03)
# of times that met with mentor (cond.)	4.05	3.91	4.13	3.85	4.24
	(0.14)	(0.26)	(0.16)	(0.17)	(0.21)
Observations	810	288	522	384	358



Ward saturation is an imprecise exposure measure

- Design intended to vary geographic exposure, but ward-level saturation is a very imprecise measure in our setting
 - Within ward, variation due to individual random assignment
 - Across ward, variation due to urban setting no segregated markets MAP
 - Wards are heterogeneous in terms of size and business density

Firms may be close to firms in other wards



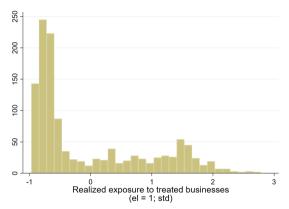


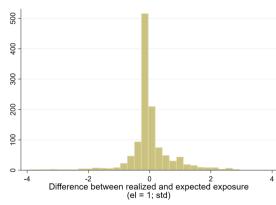
Sample spread through central Uganda





Identification from expected vs. realized random exposure







WMB effects: Business practices

(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Business practices: std index	Record keeping: std index	Business planning: std index	Use of financial services: std index	Supply manage- ment: std index	Monthly advert. expenses (PPP USD)	Customer care: std index	HR training: # new methods	Formality: std index
0.52*** (0.03)	0.21*** (0.03)	1.07*** (0.05)	0.00 (0.04)	0.19*** (0.05)	1.34*** (0.35)	0.21*** (0.05)	0.01 (0.04)	0.09 (0.07) [0.338]
-0.00 (0.05)	0.02 (0.03) [0.551]	-0.03 (0.07) [0.777]	0.13** (0.06) [0.079]	-0.05 (0.04) [0.457]	-1.57** (0.75) [0.088]	-0.03 (0.05) [0.719]	-0.00 (0.04) [0.978]	0.03 (0.04) [0.630]
9,731 1,180 -0.01	9,731 1,180 -0.23	7,558 1,180 -0.03	5,401 1,169 0.34	6,456 1,163 0.12	6,431 1,171 4.41	9,730 1,180 0.39	3,117 1,090 0.47	1,059 1,059 -0.36 0.97
	Business practices: std index 0.52*** (0.03) -0.00 (0.05) 9,731 1,180	Business practices: std index Record keeping: std index 0.52*** (0.03) (0.03) [0.001] 0.02 (0.05) (0.03) (0.551] 9,731 9,731 1,180 1,180 -0.01 -0.23 -0.23	Business practices: std index Record keeping: std index Business planning: std index 0.52*** (0.03) (0.03) (0.03) (0.03) (0.001) [0.001] [0.001] [0.001] -0.00 (0.05) (0.03) (0.07) (0.05) (0.03) (0.07) [0.551] (0.777] 9,731 9,731 7,558 1,180 1,180 1,180 -0.01 -0.23 -0.03	Business practices: std index Record keeping: std index Business planning: structions services: std index Use of financial services: std index 0.52*** 0.21*** 1.07*** 0.00 (0.03) (0.03) (0.05) (0.04) -0.00 0.02 -0.03 0.13*** (0.05) (0.03) (0.07) (0.06) (0.05) [0.551] [0.777] [0.079] 9,731 9,731 7,558 5,401 1,180 1,180 1,180 1,169 -0.01 -0.23 -0.03 0.34	Business practices: std index Record keeping: std index Business planning: std index Use of financial services: std index Supply management: std std index 0.52*** 0.21*** 1.07*** 0.00 0.19*** (0.03) (0.03) (0.05) (0.04) (0.05) -0.00 0.02 -0.03 0.13*** -0.05 (0.05) (0.04) (0.04) (0.05) (0.05) (0.03) (0.07) (0.06) (0.04) (0.05) (0.03) (0.07) (0.06) (0.04) (0.05) (0.05) [0.777] [0.079] [0.457] 9,731 9,731 7,558 5,401 6,456 1,180 1,180 1,180 1,169 1,163 -0.01 -0.23 -0.03 0.34 0.12	Business practices: std index Record keeping: std index Business planning: std index Use of financial services: std index Supply management: std advert. expenses (PPP USD) 0.52*** 0.21*** 1.07*** 0.00 0.19*** 1.34*** (0.03) (0.03) (0.05) (0.04) (0.05) (0.35) [0.001] [0.001] [0.978] [0.001] [0.001] -0.00 0.02 -0.03 0.13** -0.05 -1.57** (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) [0.551] [0.777] [0.079] [0.457] [0.088] 9,731 9,731 7,558 5,401 6,456 6,431 1,180 1,180 1,180 1,169 1,163 1,171 -0.01 -0.23 -0.03 0.34 0.12 4.41	Business practices: std index Record keeping: std index Business planning: std index Use of financial services: std index Supply manage- ment: std std index Monthly advert. expenses (PPP USD) Customer care: std index 0.52*** 0.21*** 1.07*** 0.00 0.19*** 1.34*** 0.21*** (0.03) (0.03) (0.05) (0.04) (0.05) (0.35) (0.05) [0.001] [0.001] [0.978] [0.001] [0.001] [0.001] -0.00 0.02 -0.03 0.13** -0.05 -1.57** -0.03 (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) (0.05) (0.05) [0.551] [0.777] [0.079] [0.457] [0.088] [0.719] 9,731 9,731 7,558 5,401 6,456 6,431 9,730 1,180 1,180 1,180 1,169 1,163 1,171 1,180 -0.01 -0.23 -0.03 0.34 0.12 4.41 0.39	Business practices: std index Record keeping: std index Business planning: std index Use of financial services: std index Supply manage-ment: std advert. expenses (PPP USD) Customer care: std index HR training: # raining: # new methods 0.52*** 0.21*** 1.07*** 0.00 0.19*** 1.34*** 0.21*** 0.01 (0.03) (0.03) (0.05) (0.04) (0.05) (0.35) (0.05) (0.04) (0.00) [0.001] [0.001] [0.978] [0.001] [0.001] [0.001] [0.855] -0.00 0.02 -0.03 0.13** -0.05 -1.57** -0.03 -0.00 (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) (0.05) (0.04) (0.05) (0.03) (0.07) (0.06) (0.04) (0.75) (0.05) (0.04) (0.05) (0.05) (0.04) (0.75) (0.05) (0.04) (0.05) (0.05) (0.04) (0.75) (0.05) (0.04) (0.551) [0.777] [0.0



WMB effects: Financial outcomes

	(1)	(2)	(3)	(4)	(5)	(6)	(7) Business
	Financial outcomes: std index	Business in operation (=1)	Monthly revenue (PPP USD)	Monthly profit (PPP USD)	Monthly take home (PPP USD)	Business grew since 2013 (=1)	more profitable since 2013 (=1)
Treat (T)	0.10** (0.04)	0.01 (0.01) [0.306]	731.05* (416.47) [0.202]	113.32* (61.18) [0.202]	48.30** (19.39) [0.169]	0.05 (0.04) [0.306]	0.06* (0.04) [0.202]
High Intensity (HI)	0.01 (0.03)	-0.00 (0.01) [0.903]	346.13 (270.80) [0.306]	23.60 (36.56) [0.568]	-27.12* (15.10) [0.202]	0.02 (0.02) [0.330]	0.01 (0.02) [0.568]
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	17,289 1,178 -0.16 0.89	5,390 1,143 0.93 0.25	16,857 1,174 4,636.37 7,353.36	16,530 1,174 903.46 1,334.33	14,333 1,172 391.59 392.60	1,061 1,061 0.57 0.50	1,061 1,061 0.54 0.50



WMB effects: Production inputs

	(1) Total expenses last month (PPP USD)	(2) Stock expenses last month (PPP USD)	(3) Employee expenses last month (PPP USD)	(4) Equipment expenses last month (PPP USD)	(5) Other expenses last month (PPP USD)	(6) # non-casual employees	(7) Property replace- ment value (PPP USD)
Treat (T)	463.80* (250.12)	245.44 (206.72) [0.356]	36.30 (22.88) [0.277]	2.58 (2.46) [0.388]	145.92*** (43.90) [0.014]	0.39* (0.21) [0.223]	4,096.89 (2,984.55) [0.296]
High Intensity (HI)	208.02 (146.78)	267.05* (148.35) [0.223]	-15.19 (15.32) [0.388]	-0.29 (2.87) [0.920]	-35.83 (25.79) [0.296]	-0.03 (0.18) [0.920]	3,431.29* (1,896.14) [0.223]
Observations Unique businesses Follow-up mean (C-LI) Follow-up SD (C-LI)	9,814 1,293 2,569.45 4,307.16	9,814 1,293 1,594.35 3,586.10	9,814 1,293 350.95 649.89	9,814 1,293 18.34 114.78	9,814 1,293 605.81 895.07	8,667 1,178 2.81 4.58	1,008 1,008 22,796.22 43,071.41



WMB effects: Business operations

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	# daily customers	Weighted price index (log)	Weighted avg markup (log)	Weighted unit cost index (log)	Total units sold (log)	Introduced product in last 3m (=1)	Stopped offering product in last 3m (=1)
Treat (T)	1.86	0.05	0.02	0.03	0.12	0.00	0.00
	(1.75)	(0.06)	(0.02)	(0.06)	(0.09)	(0.01)	(0.01)
	[0.964]	[0.964]	[0.964]	[0.964]	[0.964]	[0.964]	[0.964]
High Intensity (HI)	2.40*	0.01	-0.02	0.03	-0.03	-0.00	-0.00
	(1.26)	(0.07)	(0.03)	(0.07)	(0.05)	(0.02)	(0.01)
	[0.836]	[0.964]	[0.964]	[0.964]	[0.964]	[0.964]	[0.964]
Observations	9,674	8,132	8,120	8,119	8,132	9,730	9,730
Unique businesses	1,178	1,166	1,166	1,166	1,166	1,180	1,180
Follow-up mean (C-LI)	16.37	9.58	0.63	8.98	5.82	0.28	0.08
Follow-up SD (C-LI)	32.94	1.85	0.55	1.84	1.90	0.45	0.28



Indexes of business practices

Outcome	Components
Record keeping	Keeps records Showed records to surveyor How often records sales and purchases (1-3; higher = more often) Separates personal and business expenses
Financial services	Binary indicators for use of financial services: bill payment, insurance, loans, mobile money, money transfer, saving services
Supply mgmt	Uses/sells imported materials/inputs Negotiated with supplier in last three months How often out of product when requested (1-5; higher = less often) Compared alternative supplier in last three months
Business planning	Has written business plan Has written budget for business
Marketing	Amount spent on advertisement (trimmed)

Indexes of business practices (cont.)

Outcome	Components
Customer care	Ask customers for feedback Has made changes based on customer feedback Binary indicators for customer care strategies: after sale services, customer relations, discounts/gifts, low prices, new products, good quality, special terms, updates
Human resources	Binary indicators for methods for employee training: formal training, external professional, other employee, respondent, similar business Binary indicators for methods for finding applicants: advertise at business hire family/friends, advertise at radio/newspapers, advertise at other businesses, recruit from other businesses, referrals, walk-in applicants
Formality	Has trading license Has other sector-specific licenses Has Tax ID Registered in Registry of Companies

