

# Skills, Practices, and Aspirations of Small-scale Entrepreneurs in Low-income Settings

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# Lecture Overview

## 1 PART I: Lecture

### *Business Practices and Training*

- Business Practices and Productivity
- Classical MSME Training
- Extensions of the Classical Approach
- Measuring Firm Performance
- Mechanisms
- Alternative Approaches

## 2 PART II: Paper

### *Curating Local Knowledge*

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# Business Practices and Productivity

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# Dispersion of Business Practices

## Stylized facts about firms

Large <b>country-level</b> heterogeneity in <b>productivity</b>	Large <b>country-level</b> heterogeneity in <b>mgmt quality</b>
Large <b>firm-level</b> heterogeneity in <b>productivity</b>	Large <b>firm-level</b> heterogeneity in <b>mgmt quality</b>

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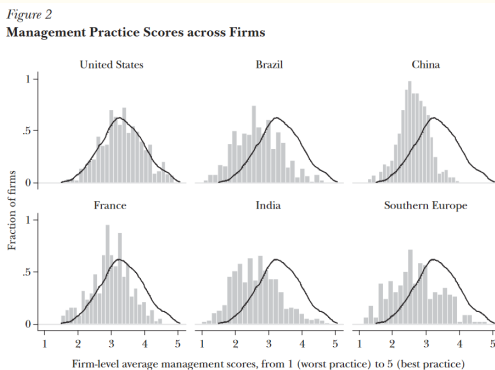
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# Dispersion of Business Practices

## Mid-sized and large companies



- Heterogeneity in mgmt practices across mid-sized and large firms (Bloom and Van Reenen, 2007; Bloom and van Reenen, 2010; Syverson, 2011)

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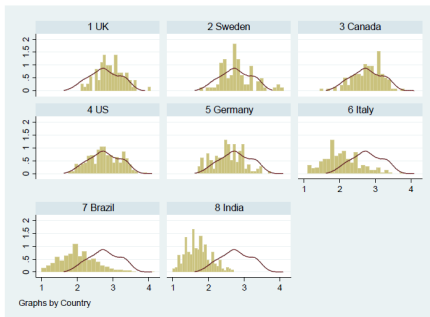
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# Dispersion of Business Practices

## Public-sector companies

FIGURE 3: MANAGEMENT WITHIN COUNTRIES



Notes: Data from 1,851 schools showing the distribution of the firm level school scores. A smoothed kernel density plot of the US data is shown on each panel for easy comparison to the US management distribution.

- Heterogeneity in mgmt practices across schools (Bloom et al., 2015) and hospitals (Bloom et al., 2020)

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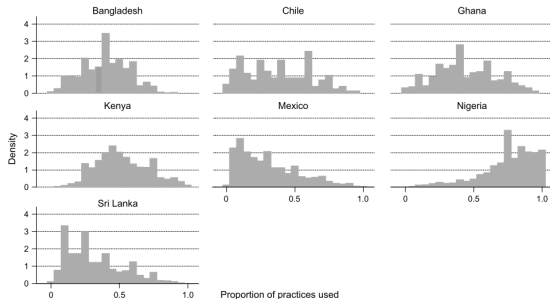
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# Dispersion of Business Practices

## Small firms

McKenzie and Woodruff: *Business Practices in Small Firms in Developing Countries*  
Management Science, 2017, vol. 63, no. 9, pp. 2967–2981, © 2016 INFORMS

Figure 1. Variation in Business Practices Within Countries



- Heterogeneity in business practices across micro and small enterprises (McKenzie and Woodruff, 2017)

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# Characterization of Business Practices

Set of general best practices for small firms

- McKenzie and Woodruff (2017) identify set of 26 business practices most closely associated with business performance
  - Validated in 7 countries in Asia, Africa, and South America
  - 4 major domains of business practices
    - 1 Book-keeping and accounting
    - 2 Financial planning
    - 3 Inventory management and stock control
    - 4 Marketing

→ Strong persistent component at one-year endline ( $r = 0.59$ )

→ How exactly should we think about business practices translating into performance gains?

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# Business Practices in the Production Decision

## Standard Production Decision

- Owner maximizes output  $Y = f(A, L, M, K)$  at given wealth  $W$ :

$$\max_{K, M, L} \{ p f(A, L, M, K) - wL - sM - rK \}$$

$$\text{s.t. } wL + sM + rK \leq \lambda W$$

- .. where  $L$  is labor,  $M$  is materials, and  $K$  is capital.
- .. where  $w$  the cost of labor,  $s$  the cost of raw materials,  $r$  cost of capital, and  $p$  is the output price
- .. where  $A$  represents a productivity factor and  $\lambda$  parameterizes borrowing constraints

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# Business Practices in the Production Decision

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.. where  $A$  represents a productivity factor and  $\lambda$  parameterizes borrowing constraints

- 2 general conceptualizations of business practices

1 As factor of production  $B$  chosen by owner at market price  $p_B$

2 As technology affecting productivity factor  $A$

(See, e.g., Bloom et al., 2016; McKenzie and Woodruff, 2017)

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# Business Practices in the Production Decision

## ■ Further specific channels of potential impact

- 1 Better **negotiation practices** may affect raw material prices  $s$
- 2 **Record-keeping** and **financial planning practices** may affect borrowing constraints  $\lambda$  through banks' willingness to lend (see, e.g. Bruhn and Zia, 2013)
- 3 **Marketing practices** may affect output price  $p$  by changing demand

→ Plausible association between business practices and revenues, profits, and business growth

→ Prices ( $p$ ,  $s$ , and  $p_B$ ) and inputs ( $K$ ,  $L$ , and  $M$ ) likely endogenous to business practices  $B$

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# Business Practices and Performance

Using panel data and a model that treats managerial capital as technology, **Bloom et al. (2016)** find differences in management practices account for about 30% of cross-country TFP differences

- Robust correlation with productivity in **mid-sized and large firms**, and in the **public sector** (**Bloom et al., 2015, 2020**)
- Robust correlation with performance and firm survival across industries and contexts in **small firms** (**McKenzie and Woodruff, 2017**)

## Open questions

- Does adoption of best practices *cause* performance to increase?
- How can adoption of practices best be encouraged?

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# Classical MSME Training

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# History and Prevalence

- At least **USD 1 billion per year** (for ~ 4-5 million entrepreneurs; McKenzie, 2020)
- Classical training programs *precede* evidence that business practices vary and are predictive for productivity
- Examples:
  - Start and Improve Your Business (ILO)
  - Business Edge (IFC)
  - EMPRETEC Entrepreneurship Training Workshop (UNCTAD)

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# Typical Training Program

## Stylized facts on MSME trainings

- Group of 15 to 40 entrepreneurs per trainer
- **In-class** (may incl elements of active and interactive learning)
- Period of up to two weeks
- Foci of typical syllabi
  - **Encourage start-up**: Business ideas and business plans, permits, costing, pricing, and budgeting
  - **Grow existing businesses**: Record-keeping, accounting, and financial planning, marketing, human resources and hiring, stock and inventory management
- Average training program not inexpensive (USD 177 per person for ILO training; **van Lieshout and Mehta, 2017**)
  - Typical training program **highly subsidized**  
(Median contribution 10% of full price)

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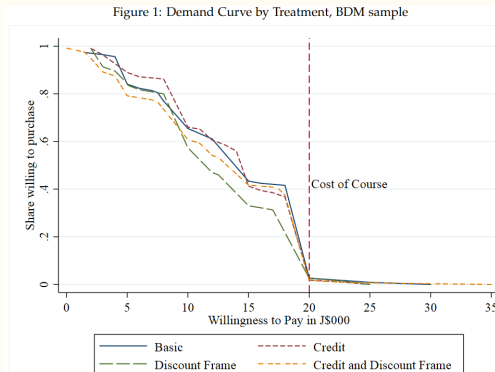
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# Typical Training Program

## Demand for business training



- Demand curve for business training in Jamaica: ~10% willing to pay full price, ~60-70% half (Maffioli et al., 2020)

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# Impact on Performance

## First wave of evaluations

- Headline result: **No impact on business performance**
  - Modest short-term adoption of practices (long-term fade-out)
  - Null-effect on business sales and profits
  - Early examples: Field et al. (2010); Karlan and Valdivia (2011); Bruhn and Zia (2013); also Giné and Mansuri (2021, WP in 2014)

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# Impact on Performance

## Econometric and implementation issues (McKenzie and Woodruff, 2014)

- Lack of statistical power with MDEs often substantially above policy-relevant levels
  - Small samples (typically  $N = 200 - 400$  per treatment cell)
  - Typical attendance between 40 and 70%
  - Often substantial rates of survey attrition (up to 24 – 28%)
  - Large heterogeneity in age, education, training delivery and costs, etc.

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# Impact on Performance

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  - Typical attendance between 40 and 70%
  - Often substantial rates of survey attrition (up to 24 – 28%)
  - Large heterogeneity in age, education, training delivery and costs, etc.
- Endline follow-ups typically short-term (typically 1-2 years out)
- Sources of selection bias by treatment status
  - Firm survival can be endogenous on treatment
  - Record-keeping likely to increase reporting accuracy
  - Clear potential for differential experimenter demand effects
- Most trainings offered at no private costs
  - Potentially lower valuation, utilization (see, Maffioli et al., 2020)

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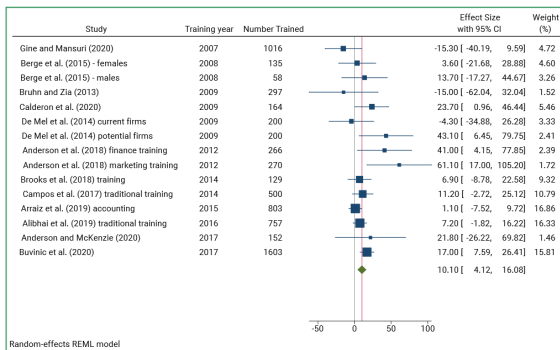
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# Impact on Performance

## Recent meta-study (McKenzie, 2020)

**Figure 2** Estimates of the impact of business training on firm profits



Source: McKenzie (2020)

- **Small positive impact** on practice adoption and performance

→ Estimated 10.1% plus in profits, and 4.7% plus in **sales**

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## Refinements of the classical model

- Targeting **specific subgroups** of the population
  - Alleviating **particularly severe constraints**  
→ Marginalized or disadvantaged groups (e.g., women, youth)
  - Maximizing **treatment impact** or cost-effectiveness  
→ Promising entrepreneurs (e.g., high-growth firms)
  - Plus: **Maximizing statistical power** through homogeneity
- Training of **specific clusters of business practices**
  - Alleviating **specific constraints**
  - Investigating mechanisms of treatment impact

# Targeted Training

## Female entrepreneurs

- Examples:
  - Gender and Enterprise Together (GET Ahead, ILO; Bulte et al., 2017; McKenzie and Puerto, 2021)
  - Start and Improve Your Business (SIYB, IFC; de Mel et al., 2014)
- Most common type of targeted training (complementary to classical microfinance model)
- Structural reasons
  - Women overrepresented in mere subsistence entrepreneurship
  - Female entrepreneurs often subject to more severe constraints (e.g., due to household-level reallocation; see Bernhardt et al., 2019; de Mel et al., 2009a)

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# Targeted Training

## Young entrepreneurs

- Typically embedded as **entrepreneurship courses in school or university** (business concepts and soft skills)
- Example: Final year university course in Tunisia (**Alaref et al., 2020**)
  - Initial positive impact on business entry  
→ **Effects taper off after 4 years** (no evidence for lasting effects)

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# Targeted Training

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## High-growth businesses ("gazelles")

- Extensive-margin prediction of future MSE growth is hard (**Fafchamps and Woodruff, 2017**)
  - Survey, ability measure, expert panel all explain unique variation
  - But: **Business training for predicted gazelles shows no impact**
- **McKenzie (2017)** finds **more encouraging results with a large-scale, high-stakes business plan competition** in Nigeria
- Small literature on business accelerators and incubators
  - See, e.g., **Cusolito et al. (2021)**; **Gonzalez-Uribe and Leatherbee (2018)**; **González-Uribe and Reyes (2021)**

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# Targeted Training

## Training of specific clusters of practices

- **Anderson et al. (2018)** assign 852 South African micro-entrepreneurs to distinct types of training:

- 1 Marketing/sales skills
- 2 Finance/accounting skills

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# Targeted Training

## Training of specific clusters of practices

- **Anderson et al. (2018)** vary **training focus** among 852 South African micro-entrepreneurs
  - 1 Marketing/sales skills
    - **"Growth focus"** on higher sales, stock investments, and hiring
    - 61% increase in profits
      - Benefits new businesses (= less market exposure)
  - 2 Finance/accounting skills

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# Targeted Training

## Training of specific clusters of practices

- **Anderson et al. (2018)** vary **training focus** among 852 South African micro-entrepreneurs

### 1 Marketing/sales skills

- **"Growth focus"** on higher sales, stock investments, and hiring
- 61% increase in profits
  - Benefits new businesses (= less market exposure)

### 2 Finance/accounting skills

- **"Efficiency focus"** on lower costs
- 41% increase in profits
  - Benefits established businesses

→ Different "pathways to profits"

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# Extensions of the Classical Approach

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# On-site Consulting

## Stylized facts on business consulting

- Three-step procedure
  - 1 Diagnosing practices
  - 2 Identifying areas of improvement
  - 3 Joint and interactive problem solving

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# On-site Consulting

## Stylized facts on business consulting

- Three-step procedure
  - 1 Diagnosing practices
  - 2 Identifying areas of improvement
  - 3 Joint and interactive problem solving
- Typically one-on-one (also group-based; see, [Iacovone et al., 2021](#))
- Sustained and intensive
  - Total of 88 to 200 hours and more ([Anderson and McKenzie, 2020](#); [Bruhn and Schoar, 2018](#))
    - Typically several months
    - Meetings monthly to twice weekly, 2-4 hours
  - Total cost between [USD 4,000 and 12,000 per firm](#) ([Anderson and McKenzie, 2020](#); [Bruhn and Schoar, 2018](#))
- Often gov't-subsidized (private contributions typically ~10%)
  - [Matching-grant programs](#)

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# On-site Consulting

## Example: Matching grant program for MSMEs in Mexico (Bruhn and Schoar, 2018)

- Weekly 4-hour visits over one year
- USD 12,000 per person (subsidized at 70 – 90%)
- Small positive impacts on profits and ROA after 1 year
- Using admin data, 57% higher employment after 5 years
  - Limited availability of admin data may introduce selection bias
  - Not clear if effects concentrated among few businesses

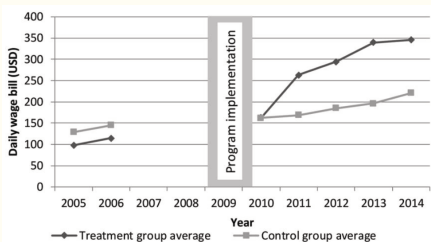


FIG. 3.—Average daily wage bill (US dollars) in the treatment and control groups over time (administrative data). Source: Administrative data from the Mexican Social Security

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# Multimedia delivery

## TV shows

- Examples: **Reality show competitions** in Tanzania (Bjorvatn et al., 2020) and Egypt (Barsoum et al., 2018)
- Differential random incentivization schemes
  - **No impact** on business knowledge and business entry
  - But: **High viewership** (conventional MDEs substantially above policy-relevant levels)

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# Multimedia delivery

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  - **No impact** on business knowledge and business entry
  - But: **High viewership** (conventional MDEs substantially above policy-relevant levels)

## Text messages

- Examples:
  - Heuristics-based business advice (Cole et al., 2018)
  - Personalized inventory recommendations (Acimovic et al., 2020)
- Small literature with generally **mixed results or null effects**
- But: **Extremely cheap** (MDEs above policy-relevant levels)
- But: **Potential complementarities** with in-person training

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# Measuring Firm Performance

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## **Measuring Firm Performance**

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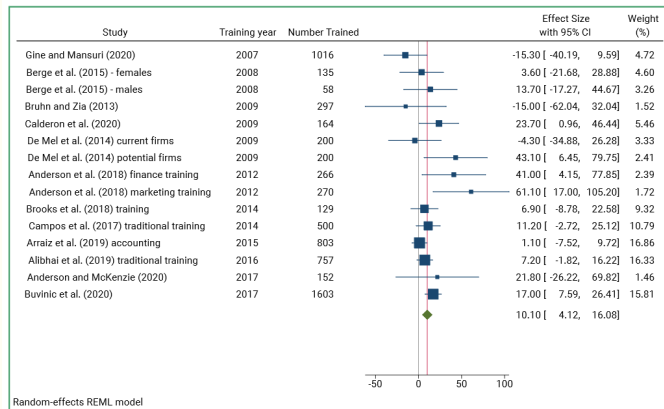
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## **PART II: Paper** *Curating Local Knowledge*

# Variation in Outcome Measures

**Figure 2** Estimates of the impact of business training on firm profits



Source: McKenzie (2020)

- Extremely wide confidence intervals on impact estimates

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# Variation in Outcome Measures

## Alternative measures of business profits (de Mel et al., 2009b)

- 15-16 unannounced visits during one month
- Random assignment of profit measure, accounting diaries, and recall span

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# Variation in Outcome Measures

## Alternative measures of business profits (de Mel et al., 2009b)

- 15-16 unannounced visits during one month
- Random assignment of profit measure, accounting diaries, and recall span

### 1 Self-reported profits most accurate measure

→ Correlation with sales-minus-expenditures only  $r = 0.3$

### 2 Accounting diaries have no effect on profits (but on sales)

### 3 With recall over 4 months vs. 1 month, entrepreneurs understate revenues by 10 – 15% due to memory loss

### 4 Entrepreneurs estimate average rival business to underreport sales by 30%

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# Variation in Outcome Measures

## Survey media and frequencies (Garlick et al., 2019)

- 12-week panel with detailed measurements of employees, assets, profits, sales, transfers, etc.
- Random assignment to different survey modes and frequencies
  - 1 Monthly in-person
  - 2 Weekly in-person
  - 3 Weekly phone

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# Variation in Outcome Measures

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- Random assignment to different survey modes and frequencies
  - 1 Monthly in-person
  - 2 Weekly in-person
  - 3 Weekly phone
- Survey medium
  - All survey modes generally result in similar statistical moments
  - Phone surveys yield higher within-firm variation  
(And may be more vulnerable to social desirability bias.)
- Survey frequency
  - Higher frequency generally does not alter statistical moments
  - No evidence for higher attrition

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# Variation in Outcome Measures

## Technological aids (Fafchamps et al., 2012)

- Random assignment to Personalized Digital Assistants (PDAs)
- Potential channels of impact
  - 1 More timely data entry
  - 2 Greater accuracy (especially by correct use of skip patterns)
  - 3 More and more complex consistency checks
- Key result: Vast majority of large changes in sales and profits genuine income volatility
  - Positive, but limited, effect of consistency checks in reducing variation in firm performance

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# Mechanisms

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# Heterogeneity of Impact

Heterogeneity of treatment effects poorly understood across different approaches

- Potential constraints are manifold, and likely context-dependent
- Some more obvious constraints:
  - Credit constraints (e.g., Berge et al., 2015; Giné and Mansuri, 2021)
  - Education and literacy constraints
  - Gender norms and constraints

→ More recent literature highlights additional behavioral constraints

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# Education and literacy

## Most MSE entrepreneurs have limited education

McKenzie and Woodruff: *Business Practices in Small Firms in Developing Countries*  
Management Science, 2017, vol. 63, no. 9, pp. 2967–2981, ©2016 INFORMS

Table 1. Summary Statistics

	Full sample		Means by country						
	Mean	SD	Bangladesh	Chile	Ghana	Kenya	Mexico	Nigeria	Sri Lanka
Male	0.23	0.42	0.99	0.09	0.78	0.00	0.00	0.85	0.47
Owner's age	41.0	12.6	41.9	36.6	39.3	35.7	45.3	30.9	37.3
Years of education	9.7	4.1	9.7	10.0	14.0	9.0	8.6	14.8	10.8
Digitspan recall	4.5	2.1	5.4	n.a.	6.5	5.0	3.3	7.5	6.4
Raven test score	5.0	2.9	n.a.	n.a.	n.a.	6.9	4.9	4.4	3.2
...	...								...
Number of observations	20,400		1,724	158	335	3,532	10,265	1,725	2,661

Notes. "n.a." denotes not asked in this data set. Business practice score is the proportion of 26 business practices used by the firm. Marketing (seven practices), buying and stock (three practices), record-keeping (eight practices), and financial planning (eight practices) are subcomponents.

- Typical micro-entrepreneur is a high-school dropout
- Test scores on digitspan and Raven's matrices about % of Western university samples (comp. )

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## Potential for heuristics and rules of thumb

- Example: Heuristics-based business training program by [Drexler et al. \(2014\)](#)
  - Discussed under [alternative approaches](#)
- See also, [Cole et al. \(2018\)](#) and [Arráiz et al. \(2019\)](#)

# Family and neighborhood

## Family commitments

- Unequal responsibilities for child care (Delecourt and Fitzpatrick, 2021)
  - Audit study with mystery shoppers among drug stores in Uganda
  - Average gender profit gap of 60%
  - Close to all women have  $\geq 1$  child, breastfeed for median 19.8 months
    - Among female entrepreneurs, those with child at work ..
      - .. are out of stock more often, and stock up less.
      - .. have 48% lower profits.

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## Market segregation

- Markets can be geographically (and socially) segregated, especially in residential areas
  - Potential demand constraints (in the spirit of Hardy and Kagy, 2020, studying women in Ghana)
  - (Scant work, but seems important.)

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# Dynamic complementarities in skill acquisition

## Complementarities in skills

- Clusters of skills may be more valuable in combination
  - Record keeping and financial planning complement each other
- Skills may build on each other
  - Profit calculation relies on record keeping
  - Advanced inventory management relies on record keeping (and profit calculation)

## Learning styles

- Exploration-exploitation trade-off
  - Not clear how much to exploit available best practice, and how much to invest in search for innovation
  - Psychological research finds interpersonal differences in [preference for information search](#) (see, e.g., [Hills et al., 2016](#); [Schulz et al., 2020](#); [Gonzalez and Dutt, 2011](#))
  - If technology has initial fixed costs, poverty *per se* may affect trade-off

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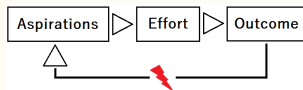
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# Aspirations

## Aspirations theory (following Dalton et al., 2016)

- Aspirations are **desired level of outcome**
- In theoretical work, aspirations are modeled as **reference-dependent preferences**
  - Agent derives utility from relative level wrt aspirations  
→ Aspirations motivate effort
  - Behavioral constraint: **Agent neglects outcomes** → aspirations



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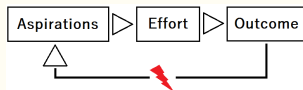
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- Consequence: Sufficiently **poor agents** with sufficiently **low aspirations** choose suboptimally low effort  
→ Potential for **behavioral poverty trap**

# Aspirations

## Evidence on aspirations in entrepreneurship

- Descriptive evidence that **micro-entrepreneurs show sizable growth aspirations** (Dalton et al., 2018)
  - Both short-term and long-term, for growth in size, labor, and sales
  - Entrepreneurs update dynamically given new information

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- **Garlick et al. (in progress)** cross-randomize role-model intervention and large UCT to study complementarity
  - **Exposure to role models increases aspirations, labor supply, expenditures, and sales**  
(Cash also increases aspirations, labor supply, expenditures, and sales.)

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  - **Exposure to role models increases aspirations, labor supply, expenditures, and sales**  
(Cash also increases aspirations, labor supply, expenditures, and sales.)
- **Aspiration interventions can backfire**
  - Goal setting intervention resulted in *lower* investment (McKenzie et al., 2021)
    - Potential of aspiration frustration if external constraints bind  
(see also, Galiani et al., 2018)

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# Alternative Approaches

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# Rules of Thumb

Core idea: Provide **simplified rules** to make training more cognitively accessible

- Example:
  - Instead of detailed accounting practices, ..
    - .. focus on **physical separation of household and business finances**
    - .. and only transfer money with an explicit **"IOU" note**
- Classical study: **Drexler et al. (2014)**
  - Comparison of heuristics-based and standard accounting training with 1,193 micro-entrepreneurs in the Dominican Republic
  - Null effect for full sample
    - Statistical power limited due to substantial missing sales data
    - **Larger gains with heuristics-based training for less educated entrepreneurs**

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# Rules of Thumb

- Arráiz et al. (2019) compare 4-hours heuristics-based finance training with standard finance and accounting program among 2,408 micro-entrepreneurs in Ecuador
  - Heuristics-based training increases daily business sales and profits by about 8% each
  - Effects driven by women and entrepreneurs with lower cognitive scores
- Points of critique
  - Limited target group of cognitively challenged
  - Limited scope (mostly confined to accounting practices)
  - So far no long-term follow-up (studies use 1-year endlines)
  - Cole et al. (2018) find more mixed evidence for text-based rule-of-thumb assistance among micro-entrepreneurs in India and The Philippines

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# Entrepreneurial mindset

Core idea: **Develop proactive mindset and increase growth aspirations**

- Examples:
  - Encourage continued search for new opportunities
  - Encourage reflection on business differentiation
  - Learning by doing and from mistakes
  - Set daily goals
- **Campos et al. (2017)** compare mindset training to standard business training among 1,500 micro-entrepreneurs in Togo
  - 36 hours classroom instruction
  - 4 monthly 3-hours one-on-one follow-ups by trainer
  - USD 750 per person
    - Initiative training improves business profits by 30% over 2.5 years  
(Standard business training improves profits by 11%)
    - Costs amortized within a year through firm profits

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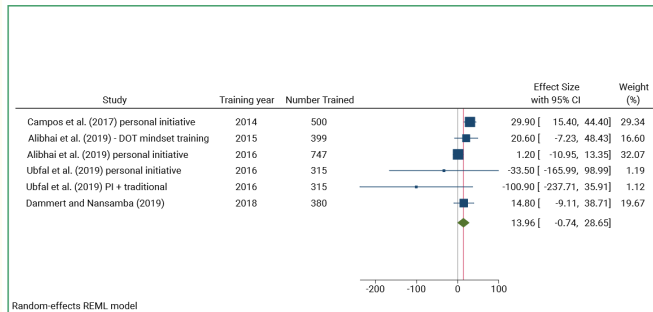
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# Entrepreneurial mindset

**Figure 3** Estimates of the impact of psychological training on firm profits



- Average increases in business profits of 14% and in sales of 10%
- Programs show **substantial heterogeneity** wrt content and focus  
→ Heterogeneous, but generally positive, results

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# Entrepreneurial mindset

## Points of critique

- Probably limited target group
- Not clear whether standard curriculum and personal initiative training are complements or substitutes
- Alibhai et al. (2019) and Ubfal et al. (2020) find mixed results with lower treatment intensity
- No work yet on whether classroom training and/or one-on-one follow-ups necessary and/or sufficient conditions for success

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# Local Knowledge and Mentoring

## Local entrepreneurs as mentors

### ■ Core ideas:

- Information may be highly localized
- Peers may know better about particular local constraints and practices
- Social learning may work better between peers
- Local mentors may be more cost effective

→ Who mentors?

→ Will mentors agree to share information?

→ How to incentivize continued mentoring?

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# Local Knowledge and Mentoring

- Successful business owners mentor smaller firms (Brooks et al., 2018)
  - Random assignment of mentors or standard business training to 372 female micro-entrepreneurs in Kenya
  - Mentorship dyads
    - Mentors local entrepreneurs from more profitable firms
    - Encouragement of weekly meetings at mentor's firm for one month
    - Many dyads continue meeting for more than one year
  - Mentored businesses show increases in profits by 20%
  - → Effect fades after one year (when dyad dissolves)
  - No effect of standard business training.
- McKenzie and Puerto (2021) find no impact of a 5-months mentoring scheme among female micro-entrepreneurs in Kenya

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# Local Knowledge and Mentoring

## Peer-to-peer learning

- Core idea: Firms may improve through mutual social learning
- Firms matched among peers (Cai and Szeidl, 2018)
  - Random assignment of peer group meetings among 2,820 SMEs in China
  - Monthly meetings with 9 peers for 10 months
  - Peer groups of different sizes and sector compositions
    - Sales increased by 8 – 10%
    - Comparable increases in material inputs, employment, and assets

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# Takeaways

- Business practices differ substantially across firms ..
  - .. and vary with productivity
- Standard business training has limited ability to change practices and firm performance in the short-term ..
  - .. while long-term evidence is scarce
- Some of that is due to measurement error (especially wrt firm profits) and lack of statistical power ..
  - .. but extensions of classical approach also show promise:
    - Personal initiative training
    - Business mentoring
    - Peer-to-peer learning

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# Questions

Any questions?

.. before we move on to our paper?

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# Curating Local Knowledge

Experimental Evidence from Small Retailers in  
Indonesia

Patricio S. Dalton<sup>1</sup> Julius Rüschepöhler<sup>2</sup> Burak Uras<sup>1</sup>  
and Bilal Zia<sup>3</sup>

<sup>1</sup>Tilburg University

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<sup>3</sup>The World Bank

March 04, 2021

# Paper Overview

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## 2 PART II: Paper

*Curating Local Knowledge*

- Motivation
- Our Approach
- Data and Design
- Results
- Discussion
- Conclusion

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# Motivation

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# Background

- Micro and small firms (MSEs) are typically the main **source of employment** in the developing world
- In **Indonesia**, MSEs represent ..
  - .. 99% of all firms
  - .. 94.5% of employment
- Understanding the factors fostering efficiency and growth of MSEs is an important research and policy goal

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# A Growing Focus on Management

- **Classroom Training:** McKenzie and Woodruff (2014); Karlan and Valdivia (2011); Bruhn and Zia (2013); Anderson et al. (2018); Bulte et al. (2017); Field et al. (2010)
- **Consulting:** Bruhn and Schoar (2018); Anderson and McKenzie (2020); Karlan et al. (2015)
- **Mobilizing Peer Knowledge:**
  - Brooks et al. (2018) → Local mentors (market information)
  - Cai and Szeidl (2018) → Business meetings
  - Abebe et al. (2019) → Management experience matching

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# Our Approach

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# Harnessing Cross-Firm Heterogeneity

## Some stylized facts about business practices in small firms

- Vast heterogeneity in business practices and performance across similar businesses (McKenzie and Woodruff, 2017; de Mel et al., 2009b)
- Variation in practices accounts for up to 30% of variation in TFP across plants within the same firm in the US (Bloom et al., 2019)  
→ Research has largely overlooked this heterogeneity in program design and implementation

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# Harnessing Cross-Firm Heterogeneity

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→ Research has largely overlooked this heterogeneity in program design and implementation

We make productive use of this heterogeneity in our research design:

- Use cross-firm variation to identify practices associated with business performance
- Curation of local best practices
- Test different modes of delivery, and their cost-effectiveness

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# Selecting Local Best Practices

Detailed **qualitative interviews** with local business peers

- Understand and codify their practices (record-keeping, financial planning, stocking-up, marketing, and joint decision-making)
- Identify implementation norms and beliefs regarding each practice (e.g. whether they are complicated, necessary, etc.)
- Document locally relevant tips and rule of thumbs

**Quantitative baseline survey**

- Measure practices and outcomes
- Quantitative association of business practices with profits and sales

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# Disseminating Knowledge

## Basic information intervention

- Handbook
  - **Pure information** on profitable practices, implementation advice

## Two complementary behavioral interventions

- Movie of successful peers
    - **Psychological and emotional involvement**
      - Social learning through **observing experiences of similar others**  
(see, e.g., Bernard et al., 2014; La Ferrara et al., 2012; Chong and La Ferrara, 2009; Berg and Zia, 2017)
  - On-site assistance
    - **Hands-on involvement**
      - Social learning through own **idiosyncratic experience**
    - Facilitated by local lay person
- Movie and assistance based exclusively on handbook!

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# Research Questions

## Characterization of local best practices

- Which practices are associated with high profits?
- How do successful businesses implement them?

## Adoption of best practices

- Do retailers adopt best practices once aggregated and made common knowledge?
- If so, does the type of experiential involvement matter?

## Impact on business performance

- Does adoption increase firm profits?
- If so, what are the channels?

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# Data and Design

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# Sample

- Listing of 2042 small retail businesses from 29 sub-districts ("kelurahan") in urban Jakarta
- Selection criteria for firm listing:
  - At least  $4m^2$  in size
  - At least two different product categories on offer
  - At least 30 meters distance to next business in sample → to minimize spillovers
- Random sample of 1301 from the list
- Randomization to treatment arms stratified by
  - Gender
  - Firm space ( $4-6m^2$ ,  $6-10m^2$ , 10 and above  $m^2$ )
  - Composite score of business practices above or below median
  - Sub-district

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# Experimental Design

Three types of information delivery:

- 1 **Handbook** with best practices and implementation tips
- 2 **Movie** with successful peers
- 3 **On-site assistance** with practice adoption

Five experimental groups

- 1 **Handbook** only (N=260)
- 2 **Handbook** + invitation to **movie** screening (N=260)
- 3 **Handbook** + offer of two **assistance** visits (N=260)
- 4 **Handbook** + **movie** + **assistance** (N=260)
- 5 Control (N=261)

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# Timeline

- 1 September 2015: **Qualitative** Interviews
- 2 January 2016: **Firm listing** (→ survey instrument)
- 3 Feb-Apr 2016: **Baseline** survey
- 4 Oct-Nov 2016: **Interventions**
- 5 Apr-May 2017: **Midline** survey
- 6 Apr-May 2018: **Endline** survey

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# Typical Business in the Sample



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# Typical Business in the Sample



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# Best-practices Handbook



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## Why you should try these best practices in your shop

*Evidence from a large-scale study  
on Jakarta-based retailers*



### RECORD-KEEPING

Shop owners who keep business records report 28% higher monthly sales and 26% higher monthly profits than those who do not keep business records.

Shop owners who track their customers' debts report 40% higher monthly sales and 36% higher monthly profits than those who do not track their customers' debts.



### STOCK-UP SCHEDULING

Shops that maintain stock-up schedules earn 26% more in monthly sales and 25% more in profits than those that do not maintain stock-up schedules of their primary products.

Shops that stock up daily rather than weekly earn 48% more in monthly sales and 37% more in monthly profits.

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# Movie with Successful Peers



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# Implementation Assistance for Business Practices



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# Summary Statistics

	(1)	(2)	(3)	(4)	(5)
	Control	HB only	HB & MOV	HB & HELP	HB & MOV & HELP
	N = 261	N = 260	N = 260	N = 260	N = 260
<b>Firm Owner Characteristics</b>					
Gender (Male=1)	0.28	0.3	0.29	0.3	0.28
Age	45.22	45.27	45.28	45.16	45.38
Education (Years)	9.1	9.52	9.36	9.42	9.55
Risk Preference (0 - 10 "Perfectly Risk-Seeking")	3.74	3.76	3.88	3.6	3.68
Time Preference (0 - 10 "Perfect Patience")	5.19	5.07	5.21	5.25	5.2
<b>Firm Characteristics</b>					
Firm Age (Years)	12.76	13.77	14.03	13.98	13.47
Family Member Is Business Partner	0.56	0.6	0.63	0.59	0.62
Total Number of Workers	2.03	2.05	1.9	1.99	2.04
Business Has Tax ID	0.2	0.21	0.2	0.15	0.18
Total Sales Last Month (USD PPP)	4454.37	4730.64	4840.55	4761.4	5139
Total Profits Last Month (USD PPP)	889.58	961.1	926.78	825.25	934.66
Applied for Bus Loan in Last 12 Months	0.2	0.17	0.15	0.22	0.17
Obtained Bus Loan in Last 12 Months	0.18	0.15	0.14	0.18	0.14
<b>Business Practices</b>					
Management Practices Aggregate Score	0.37	0.36	0.37	0.35	0.37
Marketing Subscore	0.23	0.23	0.25	0.23	0.24
Stocking-up Subscore	0.45	0.47	0.47	0.47	0.46
Record-keeping Subscore	0.33	0.28	0.3	0.29	0.3
Financial-planning Subscore	0.51	0.47	0.47	0.43	0.47

Test of joint orthogonality from multinomial logit (p-value): 0.857

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# Movie: Take Up and Assessment

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	(1)	(2)
	HB & MOV (A)	HB & MOV & HELP (B)
	N=260	N=260
<b>Attendance</b>		
Business Owner or Partner Attended Film Screening	0.52	0.49
<b>Evaluation (1-4 Scale):</b>		
Has Learned Something New	3.34	3.21
Feels Inspired	3.31	3.30
Feels Hopeful	3.60	3.42
Feels Bored	0.83	0.97



# Assistance: Take Up and Assessment

	(1)	(2)
	HB & HELP (A)	HB & MOV, & HELP (B)
	N=260	N=260
<b>Attendance</b>		
Business Owner or Partner Attended 1st Session	0.77	0.78
Business Owner or Partner Attended 2nd Session	0.68	0.68
<b>Evaluation (1-4 Scale)</b>		
Has Learned Something New	2.88	2.89
Feels Inspired	2.76	2.83
Feels Hopeful	2.88	2.97
Feels Bored	0.59	0.43

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# Impact on Business Practices

## Aggregate Scores

	Record Keeping (1)	Planning (2)	Stocking-up (3)	Marketing (4)	Joint Decision-making (5)
Assigned Handbook	0.025 (0.209)	0.027 (0.273)	-0.007 (0.694)	-0.011 (0.694)	0.011 (0.694)
Assigned Handbook & Movie	0.057*** (0.009)	0.043 (0.107)	0.038 (0.117)	0.040 (0.166)	0.040 (0.217)
Assigned Handbook & Assistance	0.065*** (0.004)	0.034 (0.166)	0.011 (0.664)	0.039 (0.166)	0.037 (0.239)
Assigned All Three	0.054*** (0.009)	0.068*** (0.009)	0.053** (0.020)	0.061** (0.032)	0.059* (0.094)
R-squared	0.204	0.192	0.187	0.150	0.120
Sample Size	2205	2204	2205	2205	2205
Dependent Variable Mean of Control	0.196	0.402	0.471	0.250	0.269
Dependent Variable SD of Control	0.252	0.310	0.270	0.320	0.420
F-tests (p-value):					
Book = Book & Mov	0.069	0.487	0.014	0.028	0.300
Book = Book & Assistance	0.025	0.754	0.304	0.030	0.348
Book = All Three	0.096	0.073	0.001	0.002	0.082

Multiple hypothesis testing corrected p-values in parentheses

- “All Three” improvement of 28 % in record-keeping, 17 % in planning, 11 % in stocking, 24 % in marketing and 22 % in joint decision making.

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# Business Profits

	(1)	(2)
	Profits last month (win 5%) (1)	Profits last month (IHS) (2)
Assigned Handbook	-91.307 (78.400)	-0.067 (0.088)
Assigned Handbook & Movie	110.378 (86.841)	0.055 (0.092)
Assigned Handbook & Assistance	310.455*** (89.488)	0.261*** (0.096)
Assigned All Three	191.088** (84.662)	0.199** (0.094)
R-squared	0.179	0.211
Sample Size	2172	2172
Dependent Variable Mean in Control Group	894.544	6.817
Dependent Variable SD in Control Group	1127.783	1.348
F-tests (p-value):		
Book = Book & Mov	0.020	0.167
Book = Book & Assistance	0.000	0.000
Book = All Three	0.001	0.003

- Intention to treat (ITT): Profits increase by 35% (about 0.28 sd.)

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# Business Sales

	(1)	(2)
	ITT Sales last month (win 5%) (1)	TOT Sales last month (win 5%) (2)
Assigned Handbook	-396.976 (314.252)	-417.198 (-397.174)
Assigned Handbook & Movie	335.489 (337.881)	601.221 (606.634)
Assigned Handbook & Assistance	836.755** (372.924)	1031.692** (457.015)
Assigned All Three	807.462** (358.384)	1558.326** (696.317)
R-squared	0.492	0.483
Sample Size	2197	2197
Dependent Variable Mean in Control Group	4998.923	4998.923
Dependent Variable SD in Control Group	5623.257	5623.257
F-tests (p-value):		
Book = Book & Mov	0.020	0.047
Book = Book & Assistance	0.000	0.000
Book = All Three	0.000	0.001

- Intention to treat (ITT): Sales increase by 16% (about 0.15 sd.)

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# Other Outcomes

No significant impacts on:

- Business expenses
- Business size
- Number of employees
- Number of customers
- Business credit

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# Efficiency Gains?

Impact on business practices → **efficiency practices:**

- Adjust stocks based on product profitability
- Negotiate lower prices with suppliers
- Consult with former customers
- Offer discounts
- Make joint decisions
- Review performance to identify ways to improve
- Make anticipated budget for upcoming costs

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# Efficiency Gains?

Impact on business practices → **efficiency practices**:

- Adjust stocks based on product profitability
- Negotiate lower prices with suppliers
- Consult with former customers
- Offer discounts
- Make joint decisions
- Review performance to identify ways to improve
- Make anticipated budget for upcoming costs
  - **Non-record-keeping practices**
  - Causal mediation analysis: **Stocking up and marketing practices** drive performance impact
  - Variance in profits among treated firms does not converge
  - **Efficiency gains**

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# Business Knowledge or Aspirations?

Impact on practice adoption and business performance may work through ..

- .. acquisition of **business knowledge** and/or
- .. strengthening of **growth aspirations**

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# Business Knowledge or Aspirations?

Impact on practice adoption and business performance may work through ..

- .. acquisition of **business knowledge** and/or
- .. strengthening of **growth aspirations**

We directly measure **business aspirations** ..

- .. at baseline, midline, and endline
- .. for short (one year) and long ("ideal business") time horizons
- .. for various dimensions of potential business expansion
  - Sales on a normal day
  - Physical size
  - Customers on a normal day
  - Employees

→ **No impact on aspirations**

→ Performance likely driven by increase in **business knowledge**

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# Business Stealing?

Do treated businesses improve performance at the expense of the control?

- Sales and profits of **control businesses do not decrease** from baseline to endline (roughly equal)
- Sales and profits of control businesses **closer to treated shops do not decrease by more** than those further away
  - **No evidence for business stealing**

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# Cost-Effectiveness

## Small costs (per firm):

- Cost Handbook alone: USD 100
- Cost Handbook & Movie: USD 125
- Cost Handbook & Assistance: USD 125
- Cost Handbook & Movie & Assistance: USD 150

## Substantial Benefits

- Up to USD 330 per month in profits
- Adoption of top practices by retailers

Research design likely **scalable and portable**

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# Takeaways

- Curating local knowledge has value for business growth
- Information alone does not have impact, only combined with behavioral interventions
- Mechanism likely knowledge-based, not aspirations-based
- Behavioral interventions are inexpensive and scalable
  - Attractive for policy

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# Questions

Any questions?

.. happy to stay on for a little while!

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# References I

- Abebe, G., M. Fafchamps, M. Koelle, and S. Quinn (2019). Learning Management Through Matching: A Field Experiment Using Mechanism Design. *NBER Working Paper Series No. 26035*, 1–45.
- Acimovic, J., C. Parker, D. F. Drake, and K. Balasubramanian (2020). Show or Tell? Improving Inventory Support for Agent-Based Businesses at the Base of the Pyramid. *Mimeo*, 1–39.
- Alaref, J., S. Brodmann, and P. Premand (2020). The Medium-term Impact of Entrepreneurship Education on Labor Market Outcomes: Experimental Evidence from University Graduates in Tunisia. *Labour Economics* 62, 101787.
- Alibhai, S., N. Buehren, M. Frese, M. Goldstein, S. Papineni, and K. Wolf (2019). Full Esteem Ahead? Mindset-Oriented Business Training in Ethiopia. *World Bank Policy Research Working Paper Series No. 8892*, 1–45.
- Anderson, S. J., R. Chandy, and B. H. Zia (2018). Pathways to Profits: The Impact of Marketing vs. Finance Skills on Business Performance. *Management Science* 64(12), 5559–5583.



# References II

- Anderson, S. J. and D. McKenzie (2020). Improving Business Practices and the Boundary of the Entrepreneur: A Randomized Experiment Comparing Training, consulting, insourcing and outsourcing. *World Bank Policy Research Working Paper Series No. 9502*, 1–84.
- Arráiz, I., S. P. Bhanot, and C. Calero (2019). Less is More: Experimental Evidence on Heuristic-Based Business Training in Ecuador. *IDB Invest Working Paper Series TN No. 18*, 1–37.
- Barsoum, G., B. Crépon, D. Gardiner, B. Michel, and W. Parienté (2018). Evaluating the Impact of Entrepreneurship Edutainment in Egypt: An Experimental Approach with Peer Effects. *Mimeo*, 1–55.
- Berg, G. and B. H. Zia (2017). Harnessing Emotional Connections to Improve Financial Decisions: Evaluating the Impact of Financial Education in Mainstream Media. *Journal of the European Economic Association* 15(5), 1025–1055.

# References III

- Berge, L. I. O., K. Bjorvatn, and B. Tungodden (2015). Development : Evidence from a Field and Lab Experiment Human and Financial Capital for Microenterprise Development : Evidence from a Field and Lab Experiment. *Management Science* 61(4), 707–722.
- Bernard, T., S. Dercon, K. Orkin, and A. S. Taffesse (2014). The Future in Mind: Aspirations and Forward-looking Behaviour in Rural Ethiopia. *CEPR Discussion Paper No. 10224*.
- Bernhardt, B. A., E. Field, R. Pande, and N. Rigol (2019). Household Matters: Revisiting the Returns to Capital among Female Microentrepreneurs. *American Economic Review: Insights* 1(2), 141–160.
- Bjorvatn, K., A. W. Cappelen, L. H. Sekei, E. Sørensen, and B. Tungodden (2020). Teaching Through Television: Experimental Evidence on Entrepreneurship Education in Tanzania. *Management Science* 66(6), 2308–2325.
- Bloom, N., E. Brynjolfsson, L. Foster, R. Jarmin, M. Patnaik, I. Saporta-Eksten, and J. van Reenen (2019). What Drives Differences in Management Practices? *American Economic Review* 109(5), 1648–1683.

# References IV

- Bloom, N., R. Lemos, R. Sadun, and J. van Reenen (2015). Does Management Matter in Schools? *The Economic Journal* 125(584), 647–674.
- Bloom, N., R. Lemos, R. Sadun, and J. van Reenen (2020). Healthy Business? Managerial Education and Management in Health Care. *Review of Economics and Statistics* 102(3), 506–517.
- Bloom, N., R. Sadun, and J. van Reenen (2016). Management as Technology. *Mimeo*, 1–41.
- Bloom, N. and J. Van Reenen (2007). Measuring and Explaining Management Practices Across Firms and Countries. *Quarterly Journal of Economics* 122(4), 1351–1408.
- Bloom, N. and J. van Reenen (2010). Why Do Management Practices Differ Across Firms and Countries? *Journal of Economic Perspectives* 24(1), 203–224.
- Brooks, W., K. Donovan, and T. R. Johnson (2018). Mentors or Teachers? Microenterprise Training in Kenya. *American Economic Journal: Applied Economics* 10(4), 196–221.

References

Appendix

# References V

- Bruhn, M. and A. Schoar (2018). The Impact of Consulting Services on Small and Medium Enterprises Evidence from a Randomized Trial in Mexico. *Journal of Political Economy* 126(2), 635–685.
- Bruhn, M. and B. Zia (2013). Stimulating Managerial Capital in Emerging Markets: The Impact of Business Training for Young Entrepreneurs. *Journal of Development Effectiveness* 5(2), 232–266.
- Bulte, E., R. Lensink, and N. Vu (2017). Do Gender and Business Trainings Affect Business Outcomes? Experimental Evidence from Vietnam. *Management Science* 63(9), 2885–2902.
- Cai, J. and A. Szeidl (2018). Interfirm Relationships and Business Performance. *Quarterly Journal of Economics* 133(3), 1229–1282.
- Campos, F., M. Frese, M. Goldstein, L. Iacovone, H. C. Johnson, D. McKenzie, and M. Mensmann (2017). Teaching Personal Initiative Beats Traditional Training in Boosting Small Business in West Africa. *Science* 357(6357), 1287–1290.
- Chong, A. and E. La Ferrara (2009). Television and Divorce: Evidence from Brazilian Novelas. *Journal of the European Economic Association* 7(2-3), 458–468.

# References VI

- Cole, S., M. Joshi, and A. Schoar (2018). "Heuristics on Call": The Impact of Mobile-phone Based Financial Management Advice. Technical report, IDEAS42.
- Cusolito, A. P., E. Dautovic, and D. McKenzie (2021). Can Government Intervention Make Firms More Investment-ready? A Randomized Experiment in the Western Balkans. *Review of Economics and Statistics*, 1–45.
- Dalton, P. S., S. Ghosal, and A. Mani (2016). Poverty and Aspirations Failure. *Economic Journal* 126(590), 165–188.
- Dalton, P. S., J. Rüschenpöhler, and B. H. Zia (2018). Determinants and Dynamics of Business Aspirations: Evidence from Small-scale Entrepreneurs in an Emerging Market. *CentER Discussion Paper Series 2018-009*, 1–39.
- de Mel, S., D. McKenzie, and C. Woodruff (2009a). Are Women More Credit Constrained? Experimental Evidence on Gender and Microenterprise Returns. *American Economic Journal: Applied Economics* 1(3), 1–32.

# References VII

- de Mel, S., D. McKenzie, and C. Woodruff (2014). Business Training and Female Enterprise Start-up, Growth, and Dynamics: Experimental Evidence from Sri Lanka. *Journal of Development Economics* 106, 199–210.
- de Mel, S., D. J. McKenzie, and C. Woodruff (2009b). Measuring Microenterprise Profits: Must We Ask How the Sausage is Made? *Journal of Development Economics* 88(1), 19–31.
- Delecourt, S. and A. Fitzpatrick (2021). Childcare Matters: Female Business Owners and the Baby-Profit Gap. *Management Science*.
- Drexler, A., G. Fischer, and A. Schoar (2014). Keeping it Simple: Financial Literacy and Rules of Thumb. *American Economic Journal: Applied Economics* 6(2), 1–31.
- Fafchamps, M., D. McKenzie, S. Quinn, and C. Woodruff (2012). Using PDA Consistency Checks to Increase the Precision of Profits and Sales Measurement in Panels. *Journal of Development Economics* 98(1), 51–57.
- Fafchamps, M. and C. Woodruff (2017). Identifying Gazelles: Expert Panels vs. Surveys as a Means to Identify Firms with Rapid Growth Potential. *World Bank Economic Review* 31(3), 670–686.

# References VIII

- Field, E., S. Jayachandran, and R. Pande (2010). Do Traditional Institutions Constrain Female Entrepreneurship? A Field Experiment on Business Training in India. *American Economic Review* 100(2), 125–129.
- Galiani, S., P. J. Gertler, and R. Undurraga (2018). Aspiration Adaptation in Resource-Constrained Environments. *NBER Working Paper Series No. 24264*, 1–57.
- Garlick, R., K. Orkin, and S. Quinn (2019). Call Me Maybe: Experimental Evidence on Frequency and Medium Effects in Microenterprise Surveys. *World Bank Economic Review* 34(2), 418–443.
- Giné, X. and G. Mansuri (2021). Money or Management ? A Field Experiment on Constraints to Entrepreneurship in Rural Pakistan. *Economic Development and Cultural Change*, 1–96.
- Gonzalez, C. and V. Dutt (2011). Instance-Based Learning: Integrating Sampling and Repeated Decisions From Experience. *Psychological Review* 118(4), 523–551.

# References IX

- Gonzalez-Uribe, J. and M. Leatherbee (2018). The effects of business accelerators on venture performance: Evidence from start-Up Chile. *Review of Financial Studies* 31(4), 1566–1603.
- González-Uribe, J. and S. Reyes (2021). Identifying and Boosting “Gazelles”: Evidence from Business Accelerators. *Journal of Financial Economics* 139(1), 260–287.
- Hardy, M. and G. Kagy (2020). It’s Getting Crowded in Here: Experimental Evidence of Demand Constraints in the Gender Profit Gap. *The Economic Journal* 130, 2272–2290.
- Hills, T. T., P. M. Todd, D. Lazer, A. D. Redish, I. D. Couzin, and t. C. S. R. Group (2016). Exploration Versus Exploitation in Space, Mind, and Society. *Trends in Cognitive Sciences* 19(1), 46–54.
- Iacovone, L., W. F. Maloney, and D. McKenzie (2021). Improving Management with Individual and Group-Based Consulting: Results from a Randomized Experiment in Colombia. *Review of Economic Studies*.



# References X

- Karlan, D., R. Knight, and C. Udry (2015). Consulting and Capital Experiments with Microenterprise Tailors in Ghana. *Journal of Economic Behavior and Organization* 118, 281–302.
- Karlan, D. and M. Valdivia (2011). Teaching Entrepreneurship: Impact of Business Training on Microfinance Clients and Institutions. *Review of Economics and Statistics* 93(2), 510–527.
- La Ferrara, E., A. Chong, and S. Duryea (2012). Soap Operas and Fertility: Evidence from Brazil. *American Economic Journal: Applied Economics* 4(4), 1–31.
- Maffioli, A., D. McKenzie, and D. Ubfal (2020). Estimating the Demand for Business Training: Evidence from Jamaica. *World Bank Policy Research Working Paper Series No. 9415*, 1–51.
- McKenzie, D. (2017). Identifying and Spurring High-Growth Entrepreneurship: Experimental Evidence from a Business Plan Competition. *American Economic Review* 107(8), 2278–2307.

# References XI

- McKenzie, D. (2020). Small Business Training to Improve Management Practices in Developing Countries: Reassessing the Evidence for "Training Doesn't Work". *World Bank Policy Research Working Paper Series No. 9408*, 1–40.
- McKenzie, D., A. Mohpal, and D. Yang (2021). Aspirations and Financial Decisions: Experimental Evidence from the Philippines. *Mimeo*, 1–38.
- McKenzie, D. and S. Puerto (2021). Growing Markets Through Business Training for Female Entrepreneurs: A Market-level Randomized Experiment in Kenya. *American Economic Journal: Applied Economics*, 1–55.
- McKenzie, D. and C. Woodruff (2014). What Are We Learning From Business Training and Entrepreneurship Evaluations Around the Developing World? *World Bank Research Observer* 29(1), 48–82.
- McKenzie, D. and C. Woodruff (2017). Business Practices in Small Firms in Developing Countries. *Management Science* 63(9), 2967–2981.
- Schulz, L., M. Rollwage, R. J. Dolan, and S. M. Fleming (2020). Dogmatism Manifests in Lowered Information Search under Uncertainty. *Proceedings of the National Academy of Sciences* 117(49), 31527–31534.

# References XII

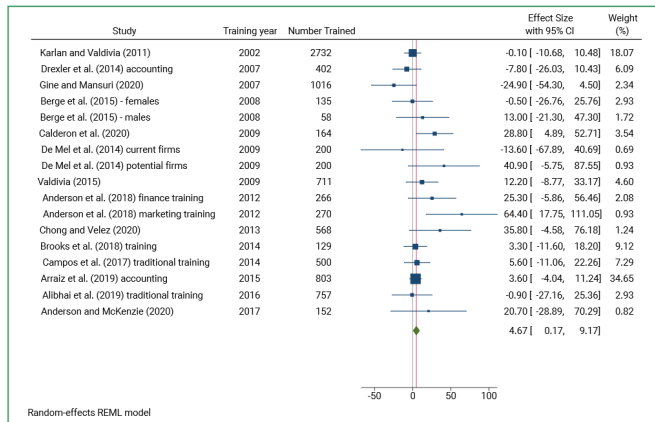
References

Appendix

- Syverson, C. (2011). What Determines Productivity? *Journal of Economic Literature* 49(2), 326–365.
- Ubfal, D., I. Arraiz, D. Beuermann, M. Frese, A. Maffioli, and D. Verch (2020). The Impact of Soft-Skills Training for Entrepreneurs in Jamaica. *Mimeo*.
- van Lieshout, S. and P. Mehta (2017). The Next 15 Million: Start and Improve your Business Global Tracer Study, 2011-15. Technical report, International Labour Organization, Geneva.

# Evidence of Impact

**Figure 1** Estimates of the impact of business training on firm sales



Source: McKenzie (2020)

- Small positive impact on sales (back to ► profits)

References

Appendix