

VISITINPS

un anno dopo formazione, ricerca e innovazione

L'impatto della regolarizzazione dei Migranti sul mercato del lavoro Italiano

Relatore: Edoardo Di Porto



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Back to Black?

The Impact of Regularizing Migrant Workers

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VisitINPS Seminar 2017

Palazzo Wedekind October 31st 2017

Hot Topic: TV News

L'IMMIGRAZIONE NEI TELEGIORNALI DI PRIMA SERATA DELLE RETI RAI (TG1, TG2, TG3), MEDIASET (STUDIO APERTO, TG4 E TG5), LA7 (TGLA7), CONFRONTO PER SEMESTRE, 2005 – I SEM 2017.



Nota metodologica L'analisi dei telegiornali si svolge sulla "notiziabilità" del tema in base all'indicizzazione e alla conseguente rilevazione delle notizie che contengono un riferimento esplicito all'immigrazione e/o agli immigrati.

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Economic Policy

- The literature on migration is extensive (Borjas 2014; Card and Peri 2016):
 - Why do people migrate? Socio-demographics and geo-political determinants play a crucial role.
 - 2 The impact of immigration on host's economies
- This paper:
 - Analyzes the impact of legalization on labour market outcomes.
 - DOES NOT analyzes the impact of new immigration on labour market outcomes
 - Studies undocumented workers who exist in a legal and economic limbo (J.B.Ludis)

Legalization is not a minor issue and not only an Italian issue

 Lavoro nero, 77 miliardi di PIL sommerso l'anno La Stampa, 19th November 2016

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▶ In U.S.:

The Border Security, Economic Opportunity, and Immigration Modernization Act of 2013 (S.744)

- ...This common-sense reform would provide legal status and citizenship to the 11 million undocumented immigrants in the U.S. (A. Kugler 2013)
- Undocumented immigrants make up an estimated 10 percent of California's workforce (PEW Research Center 2017).

A specific motivation: Aging and the Pension System

- Aging makes more difficult to finance the pension system
- Immigration provides a solution to aging
- It is simpler to make an existing job formal than to create a new one ('70s literature: A. O. Hirschman 1971)

I pensionati hanno un bisogno disperato di più giovani che lavorino (...) e di immigrati regolari che versino contributi. (...) Dobbiamo concentrare l'attenzione sull'ingresso regolare e a tempo indeterminato nel nostro mercato del lavoro (Tito Boeri, 27th October 2017)

This paper

- Evaluation of Italy's largest legalization process ever: D.l. 195/2002
- ▶ Recipients: undocumented migrants and their employers
- Data: INPS archives, providing the universe of Italian workers, firms and enforcement programs
- We exploit an innovative identification strategy, based on unexpected change in the auditing policy for undeclared work: program 383/2001

This paper

- Evaluation of Italy's largest legalization process ever: D.l. 195/2002
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- We exploit an innovative identification strategy, based on unexpected change in the auditing policy for undeclared work: program 383/2001

- Two levels of analysis:
 - Firm level analysis, on employment and wages
 - Worker level analysis, on the career of regularized migrants and co-workers

Regularization + Tax Amnesty (Bossi Fini) 195/2002

- Italy's largest legalization process ever (more than 700k applications).
- Renewable 2 years work/residence permit to all undocumented migrants whose employers:
 - Declare that they had continuously employed the immigrant for at least 3 months before the legalization law was passed
 - 2 Legally hire the immigrant under a minimum one year contract
 - 3 Pay an amnesty fee (700 euros for each worker).

Social Security Administrative Data - INPS Archives

- ► INPS DM10: firm social security declaration
 - Allow identifying the firms that undertake the regularization
 - Allow identifying the number of regularized workers in regularizing firms
- INPS O1M archive
 - Allow the **identification of regularized workers**: those who have been hired in regularizing firms between September and December 2002 (and being not-working in the same firm 3 months before).
 - Nationality, two sources: an INPS provided variable collected from various administrative sources, and, when missing, place of birth.
- Auditing data: INPS VG00 archive
 - auditing programs since 2000 to detect undeclared workers (and related fines), at the firm level

Regularization in Italy: a first look at INPS archives

- Around 210,000 regularized workers, in around 98,000 firms
- Around 20,000 *black* firms, that have been regularized

Legalization 195/2002: migrants in the private sector



Legalization 195/2002: undeclared work



Results in a nutshell

Firm level

- a short run employment growth, no significant effects after one year
- Ino causal impact on wages

Results in a nutshell

Firm level

- a short run employment growth, no significant effects after one year
- 2 no causal impact on wages

Worker level

- regularized migrants have an incredibly high survival rate in the economy: 80% after 5 years
- Co-workers not significantly affected by the reform: slightly increasing job separation, but no exit

Descriptive stats migrants: regularized vs other

| Entry characteristics | | | | | |
|---|--|--|--|--|--|
| | Regular | Ex Bossi Fini | After insp. | | |
| Age | 29.9 | 29.7 | 29.5 | | |
| Europe | 41.1 | 54.6 | 41.4 | | |
| Asia | 19.7 | 18.3 | 9.3 | | |
| Africa | 30.2 | 20.1 | 37.2 | | |
| North Am. | 0.4 | 0.04 | 1.0 | | |
| Central Am. | 2.0 | 0.4 | 1.4 | | |
| South Am. | 6.5 | 6.6 | 9.7 | | |
| Australia | 0.1 | 0.0 | 0.2 | | |
| Blue collar Manufacturing Constructions Sales Transports Food&Tourism Professionals Services Health | 77.9 33.2 16.2 6.0 6.5 14.3 2.5 12.4 1.7 | 97.0 27.2 38.2 8.0 5.3 9.9 0.6 6.4 0.4 | 26.8 17.7 6.5 12.0 19.8 1.3 6.8 2.6 | | |
| Obs. | 250,577 | 194,271 | 1,174 | | |

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Descriptives migrants

| Entry characteristics | | | | |
|-----------------------|---------|---------------|-------------|--|
| | Regular | Ex Bossi Fini | After insp. | |
| | | | | |
| Abruzzo | 1.4 | 1.4 | 4.7 | |
| Campania | 2.0 | 5.1 | 2.3 | |
| Emilia Romagna | 12.0 | 9.7 | 16.6 | |
| Friuli-VG | 3.6 | 1.4 | 2.8 | |
| Lazio | 7.9 | 11.8 | 4.0 | |
| Liguria | 2.1 | 2.2 | 1.9 | |
| Lombardia | 26.4 | 27.6 | 20.9 | |
| Marche | 3.7 | 2.6 | 1.0 | |
| Piemonte | 7.8 | 9.6 | 5.8 | |
| Puglia | 1.4 | 1.0 | 1.7 | |
| Toscana | 8.2 | 9.3 | 8.3 | |
| Trentino AA | 3.4 | 0.9 | 2.2 | |
| Umbria | 1.9 | 1.9 | 3.3 | |
| Veneto | 15.8 | 13.2 | 19.4 | |
| Obs. | 250,577 | 194,271 | 1,174 | |
| | | | | |

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Summary Statistics: outcomes

| | | Empl. May | Empl. Dec. | Wage May | Wage Dec. |
|--------------|--------|-----------|------------|----------|-----------|
| Controls | mean | 7.45 | 7.45 | 1493 | 1458 |
| | median | 2.00 | 2.00 | 1465 | 1431 |
| | p25 | 1.00 | 1.00 | 1128 | 1083 |
| | p.75 | 5.00 | 5.00 | 1764 | 1735 |
| | | | | | |
| Treated or | mean | 5.58 | 7.53 | 1371 | 1259 |
| Regularizing | median | 1.00 | 3.00 | 1399 | 1275 |
| | p25 | 0.00 | 2.00 | 1102 | 950 |
| | p75 | 5.00 | 7.00 | 1638 | 1514 |

DiD analysis and selection into treatment



$$y_{i,t} = \sum_{t=2000,1}^{t=2004,12} \beta_T \mathbb{1}(T=t) + \sum_{t=2000,1}^{t=2004,12} \beta_E \mathbb{1}(T=t) \times E_i + \eta_i + \epsilon_{i,t}$$

Standard errors clustered at firm level

 Firms self select into the amnesty/regularization program, thus it might be difficult to find a proper control group for a natural experiment

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- A policy that exogenously shocks the *belief* about enforcement affects employer decisions to undertake the amnesty/regularization.

- Firms self select into the amnesty/regularization program, thus it might be difficult to find a proper control group for a natural experiment
- The number of undocumented workers that could be regularized depends on firm characteristics and enforcement
- A policy that exogenously shocks the *belief* about enforcement affects employer decisions to undertake the amnesty/regularization.
- ► The best candidate would be an unexpected auditing program

The Natural Experiment: Auditing Program ex lege 383/2001

- Auditing Program 383/2001:
 - introduced in 2001 by a previous law for different purposes for a different target group (all irregular workers, migrants were not considered, illegal migrants were not eligible)
 - enacted around august 2002
 - I planned by different institutions in addition to INPS (provinces, ispettorato del lavoro, Agenzia delle Entrate, ministry of welfare ...)
 - with different rules with respect to the standard auditing programs

Identification Strategy

| Relevant characteristics by type of inspection | | | | | |
|--|--------|--------|--------|--------|--|
| | 2001 | 2002 | Ex 383 | Total | |
| | | | | | |
| Regular | 39.74 | 38.20 | 69.30 | 39.60 | |
| Irregular - not fined | 14.50 | 18.27 | 15.98 | 17.66 | |
| Irregular - fined | 45.76 | 43.53 | 14.72 | 42.74 | |
| Not found | (.) | 1.28 | 0.26 | 0.52 | |
| | | | | | |
| Migrants | .31 | .32 | .12 | 0.26 | |
| Fine (median) | 2,639 | 1,796 | 650 | 2,404 | |
| Fine (mean) | 20,200 | 15,783 | 3,762 | 18,681 | |
| | | | | | |
| N | 8,580 | 7,836 | 5,518 | 21,934 | |
| | | | | | |

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Focus on Lombardia

| Di Porto, | Martino, | Natice | hioni |
|-----------|----------|--------|-------|
|-----------|----------|--------|-------|

Identification Strategy

| Sector by type of inspection | | | | | |
|------------------------------|-------|-------|--------|-------|--|
| | 2001 | 2002 | Ex 383 | Total | |
| | | | | | |
| Manufacturing | 21.82 | 21.97 | 31.57 | 24.32 | |
| Constructions | 17.55 | 15.18 | 3.38 | 13.14 | |
| Sales | 19.57 | 21.20 | 30.64 | 22.94 | |
| Transports | 2.51 | 1.98 | 0.59 | 1.84 | |
| Food&Tourism | 19.68 | 16.60 | 12.82 | 16.85 | |
| Real estate | 1.39 | 1.87 | 1.02 | 1.47 | |
| Professionals | 1.59 | 2.08 | 2.05 | 1.88 | |
| Services | 3.54 | 3.75 | 2.78 | 3.42 | |
| Health | 1.44 | 0.77 | 1.13 | 1.12 | |

Focus on Lombardia - only sectors counting for $\geq 1\%$

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Motivation

Identification Strategy



Motivation

Identification Strategy



$y_{i,c,t} = \beta_0 T_{i,c,t} + \beta_1 x_{i,c,t} + \beta_2 insp_{c,t-1} + \eta_i + \sigma_S \times \delta_t + \sigma_{PROV} \times \delta_t + \varepsilon_{i,c,t}$

$y_{i,c,t} = \beta_0 T_{i,c,t} + \beta_1 x_{i,c,t} + \beta_2 insp_{c,t-1} + \eta_i + \sigma_S \times \delta_t + \sigma_{PROV} \times \delta_t + \varepsilon_{i,c,t}$

c = prov × sector $x_{i,c}$: age, size of c η_i : individual FE σ_S : sector FE σ_{LLM} : province FE δ_t : year FE insp_{c,t-1}: inspections in c

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$$y_{i,c,t} = \beta_0 \widetilde{\mathsf{T}_{i,c,t}} + \beta_1 x_{i,c,t} + \beta_2 \mathsf{insp}_{c,t-1} + \eta_i + \sigma_S \times \delta_t + \sigma_{\mathsf{PROV}} \times \delta_t + \varepsilon_{i,c,t}$$

 $T_{i,c,t} = \gamma_0 insp383_{i,t} + \gamma_1 x_{i,c,t} + \gamma_2 insp_{c,t-1} + \eta_i + \sigma_S \times \delta_t + \sigma_{PROV} \times \delta_t + v_{i,c,t}$

c = prov × sector $x_{i,c}$: age, size of c η_i : individual FE σ_S : sector FE σ_{LLM} : province FE δ_t : year FE insp_{c,t-1}: inspections in c

- Dependent variables: changes in employment and wages at the firm level between May 2002 (four months before the regularization) and:
 - December 2002, for a short term analysis
 - May and September 2003, for a medium run analysis

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 - December 2002, for a short term analysis
 - May and September 2003, for a medium run analysis
- Treatment variable: being a regularizing firm

- Dependent variables: changes in employment and wages at the firm level between May 2002 (four months before the regularization) and:
 - December 2002, for a short term analysis
 - May and September 2003, for a medium run analysis
- Treatment variable: being a regularizing firm
- Universe of firms at 2002, using also the year 2001 to control for unobserved heterogeneity: panel estimation
- Instrument: 383 inspections at the province and industry 2 digit level, excluding firm's own 383 inspection:

 $|\operatorname{insp383}_{i,t}|_{i \in c} = \sum_{j \in c} \operatorname{insp383}_{j,t} - \operatorname{insp383}_{i,t}$

(1)

Summary Statistics: instruments and covariates

| | | 383 inspections | Inspections in t-1 | Cell's dimension |
|----------|--------|-----------------|--------------------|------------------|
| Controls | mean | 13.2 | 40.6 | 1490 |
| | median | 2 | 13 | 707 |
| | min | 0 | 0 | 1 |
| | max | 502 | 499 | 13681 |
| | | | | |
| Treated | mean | 19.8 | 67.7 | 2101 |
| | median | 4 | 37 | 1257 |
| | min | 0 | 0 | 1 |
| | max | 502 | 499 | 13681 |

Variables at the province-industry 2digit NACE.

Employment - OLS estimates

| | May-Dec '02 | May '02-May '03 | May '02-Sep '03 |
|---------|---------------------|---------------------|-------------------|
| Treated | 1.348*** (0.011) | 1.002*** (0.017) | 474*** (0.018) |
| Obs. | 2,037,474 | 1,863,650 | 1,863,650 |
| | | | |

*** p<0.01, ** p<0.05, * p<0.1

Controls included: cells dimension, firm FE, sector×year FE, SLL×year FE, inspections in t-1 Excluding outliers (1st and 99th pctile of the outcome) and largest firms (99th pctile in terms of employment in May 2002)

Employment - IV estimates

| | May-Dec '02 | May '02-May '03 | May '02-Sep '03 |
|---------|-------------|-----------------|-----------------|
| Treated | 2.362*** | .857 | 551 |
| | (0.651) | (0.993) | (0.996) |
| Obs. | 2,037,474 | 1,875,084 | 1,863,650 |
| KP | 108.996 | 108.212 | 108.212 |

*** p<0.01, ** p<0.05, * p<0.1

Controls included: cells dimension, firm FE, sector×year FE, SLL×year FE, inspections in t-1

IV: Inspections ex lege 383 in the cell

Excluding outliers (1st and 99th pctile of the outcome) and largest firms (99th pctile in terms

of employment in May 2002)

Wage Per Capita - OLS estimates

| | May-Dec '02 | May '02-May '03 | May '02-Sep '03 |
|---------|-----------------------|-----------------------|----------------------|
| Treated | -31.355*** (1.476) | -35.995*** (2.077) | 15.120*** (1.763) |
| Obs. | 1,752,462 | 1,698,412 | 1,653,532 |
| | | | |

*** p<0.01, ** p<0.05, * p<0.1

Controls included: cells dimension, firm FE, sector×year FE, SLL×year FE, inspections in t-1 Excluding outliers (1st and 99th pctile of the outcome) and largest firms (99th pctile in terms of employment in May 2002)

Wage Per Capita - IV estimates

| | May-Dec '02 | May '02-May '03 | May '02-Sep '03 |
|---------|-------------|-----------------|-----------------|
| Treated | -118.124 | -55.679 | -127.972 |
| | (105.922) | (168.980) | (157.205) |
| Obs. | 1,752,462 | 1,698,412 | 1,653,532 |
| KP | 83.69 | 85.69 | 86.00 |

Controls included: cell's dimension, firm FE, sector×year FE, SLL×year FE, inspections in t-1

IV: Inspections ex lege 383 in the cell, and interacted with north

Excluding outliers (1st and 99th pctile of the outcome) and largest firms (99th pctile in terms

of employment in May 2002)

Legalized Migrants Survival rate



Migrants: legalized vs others



Controlling for citizenship, age, sector and province of entry

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Co-Worker level Analysis: the Econometric Model

 $y_{w,i,t} = \beta_0 \widehat{T_{i,t}} + \beta_1 x_{w,i,t} + \beta_2 insp_{c,t-1} + \eta_w + \sigma_S \times \delta_t + \sigma_{PROV} \times \delta_t + \varepsilon_{w,i,c,t}$ $T_{i,c,t} = \gamma_0 insp383_{i,t} + \gamma_1 x_{w,i,t} + \gamma_2 insp_{c,t-1} + \eta_w + \sigma_S \times \delta_t + \sigma_{PROV} \times \delta_t + v_{i,c,t}$

c = prov × sector $x_{w,i}$: age, qualification, no. employees η_w : individual FE σ_S : sector FE σ_{PROV} : province FE δ_t : year FE insp_{c.t-1}: inspections in c

- Universe of workers employed in 2002.
- Treatment group: coworkers of regularized immigrants in Sept-Dec 2002.
- **Control group**: workers in non regularizing firms.
- **Dependent variables**: job separation, probability of exit.
- Instrument: 383 inspections at the province and industry 2 digit level, excluding firm's own 383 inspection:

Summary Statistics: workers

| | | Exit | Job Separation | Wages(m) | % Blue Collar |
|----------|--------|------|----------------|----------|---------------|
| Controls | mean | 0.09 | 0.13 | 1692 | 0.59 |
| | median | 0 | 0 | 1591 | 1 |
| | p25 | 0 | 0 | 1226 | 0 |
| | p75 | 0 | 0 | 1963 | 1 |
| | | | | | |
| Treated | mean | 0.11 | 0.26 | 1443 | 0.78 |
| | median | 0 | 0 | 1430 | 1 |
| | p25 | 0 | 0 | 1037 | 1 |
| | p75 | 0 | 1 | 1738 | 1 |

Sample: we exclude all workers active less than 2 months between Jan-Sep 2002 and out of the 2-98 pct of the monthly earnings distribution

Individual level analysis, firms below 15 workers

| | FE below 15 | | | | | |
|------------|---------------------|---------------------|--|--|--|--|
| | Job separation | Unempl. Jan-Aug '03 | | | | |
| Treated | 0.173 (.448) | -0.130 (1.036) | | | | |
| Obs. KP | 6,108,878 20.628 | 5,507,492 18.626 | | | | |

Standard errors in parentheses

Controls included: qualification, firm size, 2 dgt sector FE, province FE, Year FE

IV: Inspections ex lege 383 in the cell

Errors clustered at firm's level

Individual level analysis, firms below 15 workers

| | | | Unempl. | spell |
|---------|----------------|-----------|-----------|-----------|
| | Job separation | Exit | 2003 | 2003-04 |
| | | | | |
| Treated | 0.206* | -0.086 | -0.520 | -0.341 |
| | (.084) | (.703) | (0.561) | (0.863) |
| Obs | 3,925,982 | 3.925.982 | 3,455,570 | 3.140.005 |
| KP | 40.744 | 40.744 | 40.162 | 40.165 |

Standard errors in parentheses

Controls included: age, qualification, migrant, female, firm size, 2 dgt sector FE, province FE

IV: Inspections ex lege 383 in the cell

Results

Firm Level Analysis:

- Short run causal impact on employment: positive
- Short run causal impact on wages: not significant
- Medium/long run causal impacts: not significant
- Worker level analysis:
 - Legalized migrants do not go Back to Black!
 - Legalized migrants are attached to the labor market, more than other migrants
 - Coworkers: We have causal evidence on separation (positive in cross section) and exit (negative in cross section) but the overall effect seems not significant (i.e. panel).

Possible Mechanisms at work

Excess of demand?

- No impact on wages and co-worker careers
- · Immigrants have a very high geographical mobility
- They remain attached to the labour market
- Migrants, now documented, move to fill vacancies in other local market and in specific sectors.
- What about regularizing firms?

GRAZIE

Appendix with Additional Results

in the following slides some additional results

Hirings and Separations-IV Estimates

| | Hiring Nat. | Hiring Mig. | Sep. Nat. | Sep. Mig. |
|---------|-------------|-------------|-----------|-----------|
| Treated | 0.824 | 0.925* | 0.673 | 0.321 |
| | (0.798) | (0.379) | (0.899) | (0.319) |
| Obs | 2,037,474 | 2,037,474 | 2,037,474 | 2,037,474 |
| KP | 108.99 | 108.99 | 108.99 | 108.99 |

Note: the variables are computed yearly, cluster standard errors at firm's level;

 hirings natives mean: 0.98 - hirings migrants mean: 0.21 separations natives mean: 1.09 - separations migrants mean: 0.12, these variables are very skewed

Robustness checks-IV Short Run

| | May-Dec '02 | May-Dec '02 | May-Dec '02 |
|---------|-------------|------------------------|--------------|
| | Baseline | Excl.383/01 recipients | Empl. native |
| Treated | 2.362*** | 2.590*** | 0.665 |
| | (0.651) | (0.650) | (0.583) |
| | | | |
| Obs. | 2,037,474 | 2,021,410 | 2,037,474 |
| KP | 108.996 | 109.800 | 108.996 |

*** p<0.01, ** p<0.05, * p<0.1

Controls included: cells dimension, firm FE, sector×year FE, SLL×year FE, inspections in t-1

IV: Inspections ex lege 383 in the cell

Excluding outliers (1st and 99th pctile of the outcome) and largest firms (99th pctile in terms

of employment in May 2002)

Robustness checks-IV Short Run

| | CS-Empl. | CS-Wage pc | FE-Empl LLM | FE-Wage pc LLM |
|---------|-----------|------------|-------------|----------------|
| Treated | 3.213*** | -89.808 | 3.090*** | -101.7126 |
| | (0.527) | (81.328) | (0.619) | (97.739) |
| Obs | 1,178,349 | 1,026,439 | 2,033,278 | 1,748,794 |
| KP | 93.559 | 69.00 | 113.052 | 99.478 |

Robustness checks-IV Short Run

| | Ctrl. migr | ants in t-1 | Ctrl. other | insp. 2002 |
|---------|------------|-------------|-------------|------------|
| | Empl. | Wage pc | Empl. | Wage pc |
| Treated | 2.457*** | -125.426 | 2.397*** | -107.592 |
| | (0.635) | (104.797) | (0.551) | (88.645) |
| Obs | 2,023,626 | 1,737,954 | 2,023,626 | 1,737,954 |
| KP | 113.160 | 86.403 | 146.658 | 114.607 |

Robustness checks-IV Cross Sections

| | CS-May-Dec '02 | CS-May'02-Dec'04 | CS-Mig. Sep.'03 | CS-Mig. Sep.'04 |
|---------|----------------|------------------|-----------------|-----------------|
| Treated | 3.310*** | 0.019 | 2.090*** | 1.816*** |
| | (0.533) | (1.003) | (0.322) | (0.342) |
| Obs | 1,162,401 | 969,760 | 1,049,455 | 969,760 |
| KP | 91,150 | 84,560 | 90.970 | 84,560 |

Note: cluster standard errors at firm's level

• Regressions on migrant hirings are significant:

Robustness checks-IV Cross Sections

| | CS-May-Dec '02 | CS-May'02-Dec'04 | CS-Mig. Sep.'03 | CS-Mig. Sep.'04 |
|---------|----------------|------------------|-----------------|-----------------|
| Treated | 3.310*** | 0.019 | 2.090*** | 1.816*** |
| | (0.533) | (1.003) | (0.322) | (0.342) |
| Obs | 1,162,401 | 969,760 | 1,049,455 | 969,760 |
| KP | 91.150 | 84.560 | 90.970 | 84.560 |

Note: cluster standard errors at firm's level

- Regressions on migrant hirings are significant:
 - CS-Mig. Hirings '03: 1.50***; CS-Mig. Hirings '04 : 0.84**.

Additional evidence - Future inspections

| | Insp. 2004 | Insp. 2003-04 |
|-----------|----------------------|---------------------|
| Treated | -0.155*** (0.046) | -0.096 (0.081) |
| Obs KP | 1,461,791 44.827 | 1,461,791 44.827 |

Note: cluster standard errors at firm's level

Identification Strategy



Identification Strategy



Distribution of inspections by region



Distribution of inspections by industry



First stages

The Table shows that the instrument at the individual level works just for medium-small firms, thus we consider only firms below 15 employees. Around 90% of Italian firms declares less than 15 employees

| | | below 13 | below 15 | below 50 | overall |
|---------------|------|----------|----------|----------|---------|
| Cross section | KP | 40 | 41 | 22 | 2 |
| | Obs. | 3,607K | 3,925K | 5,902K | 10,511K |
| Panel | KP | 12 | 19 | 17 | 4 |
| | Obs. | 4,988K | 5,507K | 8,872K | 17,591K |

Errors clustered at firm's level

Controls included: age, qualification, migrant, firm size, 2 dgt sector FE, province FE

IV: Inspections ex lege 383 in the cell

Firm level

First stages

The Table shows that the instrument at the individual level works just for medium-small firms, thus we consider only firms below 15 employees. Around 90% of Italian firms declares less than 15 employees

| | | below 13 | below 15 | below 50 | overall |
|---------------|------|----------|----------|----------|---------|
| Cross section | KP | 80 | 82 | 94 | 94 |
| | Obs. | 1,091k | 1,110k | 1,166k | 1,170K |
| Panel | KP | 98 | 102 | 110 | 111 |
| | Obs. | 1,852k | 1,893k | 2,015k | 2,024K |

Errors clustered at firm's level

Controls included: age, qualification, migrant, firm size, 2 dgt sector FE, province FE

IV: Inspections ex lege 383 in the cell

Cross Section First stages

| | below 13 | below 15 | below 50 | overall |
|------|----------|----------|----------|---------|
| KP | 40 | 41 | 22 | 2 |
| Obs. | 3,607K | 3,925K | 5,902K | 10,511K |

Controls included: age, qualification, migrant, firm size, 2 dgt sector FE, province FE

IV: Inspections ex lege 383 in the cell