## The Dynamics of Investment Projects: Evidence from Peru

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Disclaimer: Opinions herein are those of the authors and do not necessarily reflect those of the Central Reserve Bank of Peru.

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#### What is the paper about?

- Use investment projects announcements gathered by the BCRP
- 1109 projects from 2009 to 2015-10
- Studies the dynamics of projects states: confirmed, unconfirmed, cancelations, revisions
- Studies the dynamics of projects states: delays in time to completion
- What are the main drivers of these states? What is the role of commodity prices?

#### Main findings

Commodity prices and volatility affect project decisions in all sectors

- ► Mining: ↓ prices or ↑ price volatility ⇒ ↑ probability project is unconfirmed
- ► Other sectors: ↑ price volatility ⇒ ↑ probability project is unconfirmed or revised.
- $\downarrow$  prices or  $\uparrow$  price volatility  $\Rightarrow \uparrow$  probability of delays

• 
$$\downarrow$$
 prices  $\Rightarrow \downarrow$  probability of completion

### Results in line with expert survey

Mining expert panel survey

- Central bank survey on mining experts
- Key Question: Three most important causes of delays in new mining projects

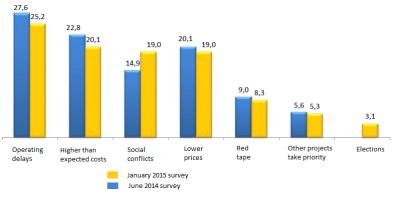


Figure: Causes of new mining project delays (in percent)

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#### Overview of investment data Monthly

- 1109 announced investment projects in all sectors of the economy from 2009 to 2015-10
- Collected by Central Bank of Peru Economics and Information Department
- Investment projects announcements: Old and new projects and their status
- Status: Confirmed, not confirmed, under revision, canceled
- Sources: Media and press releases, surveys
- Covers all sectors: Mining, hydrocarbons, electricity, industrial, agro-industry, telecom, fishing, others

#### Overview of macro data Monthly

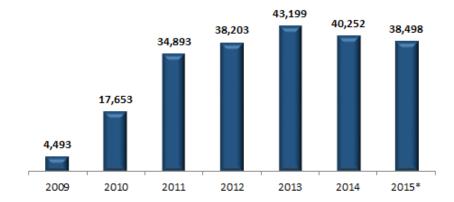
 Terms of trade, commodity prices (big four metals: copper, gold, silver, zinc), return volatility.

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- Social conflicts.
- Copper cash costs.

Confirmed investment projects: mining sector Millions of USD

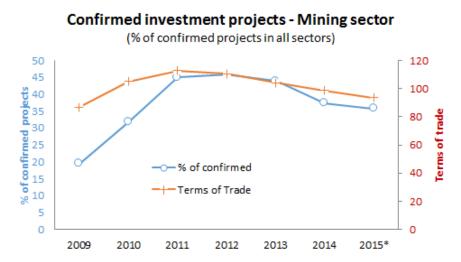
#### Confirmed investment projects - Mining sector (Million of US\$)



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#### Confirmed projects and terms of trade

Confirmed projects as percentage of confirmed projects in all sectors



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#### Project transitions: 2012

| Initial state | Transition |             |          |           |  |  |  |
|---------------|------------|-------------|----------|-----------|--|--|--|
|               | Confirmed  | Unconfirmed | Canceled | Completed |  |  |  |
| Confirmed     | 88.1       | 1.4         | 2.0      | 8.5       |  |  |  |
| Unconfirmed   | 2.0        | 93.9        | 2.0      | 2.0       |  |  |  |
| Canceled      | 0.0        | 0.0         | 100.0    | 0.0       |  |  |  |
| Completed     | 0.0        | 0.0         | 0.0      | 100.0     |  |  |  |

#### Project transitions: 2015

| Initial state | Transition |             |          |           |  |  |  |
|---------------|------------|-------------|----------|-----------|--|--|--|
|               | Confirmed  | Unconfirmed | Canceled | Completed |  |  |  |
| Confirmed     | 96.7       | 0.0         | 1.3      | 2.0       |  |  |  |
| Unconfirmed   | 0.0        | 100.0       | 0.0      | 0.0       |  |  |  |
| Canceled      | 0.0        | 0.0         | 100.0    | 0.0       |  |  |  |
| Completed     | 0.0        | 0.0         | 0.0      | 100.0     |  |  |  |

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#### Related literature

- Uncertainty and investment: Dixit and Pindyck (1994)
  - Bromander & Åtland (2012): An Empirical Study of Sequential Investments with Time-To-Build.
  - Kaldahl & Ingebrigtsen, (2014): Sequential investment in gas fired power plants: A real options analysis.
  - Marmer & Slade (2013): Investment and uncertainty with time to build: Evidence from US copper mining.
  - Bloom (2009): The impact of uncertainty shocks
  - Byun & Jo (2015): Heterogeneity in the dynamic effects of uncertainty on investment.

Aggregate investment effects of commodity price shocks

- Fornero et al (2015): Terms of Trade Shocks and Investment in Commodity-Exporting Economies
- Dungey et al (2014). Chinese resource demand and the natural resource supplier
- Carrière-Swallow & Céspedes (2013): The impact of uncertainty shocks in emerging economies.

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#### Empirical strategy and results

Probability of unconfirmed projects

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- Delayed projects
- Competing risks

#### First overview

Dependent variable: Proportion of unconfirmed mining projects

|                    | (1)      | (2)      | (3)      | (4)      | (5)      | (6)      |
|--------------------|----------|----------|----------|----------|----------|----------|
| lag_y              | 0.894*** | 0.894*** | 0.886*** | 0.872*** | 0.884*** | 0.884*** |
|                    | (0.054)  | (0.067)  | (0.059)  | (0.058)  | (0.069)  | (0.069)  |
| Conflicts          | -0.032   |          |          | -0.005   |          |          |
|                    | (0.042)  |          |          | (0.041)  |          |          |
| Env. conflicts     |          | 0.009    |          |          | -0.017   | -0.017   |
|                    |          | (0.066)  |          |          | (0.054)  | (0.054)  |
| Conflict ratio     |          |          | 0.032    |          |          |          |
|                    |          |          | (0.061)  |          |          |          |
| Margin             | 0.012*   | 0.011    | 0.013*   |          |          |          |
|                    | (0.006)  | (0.008)  | (0.007)  |          |          |          |
| Log terms of trade |          |          |          | 0.095*   | 0.087    | 0.087    |
|                    |          |          |          | (0.051)  | (0.058)  | (0.058)  |
| Constant           | 0.212    | -0.002   | 0.024    | -0.328   | -0.243   | -0.243   |
|                    | (0.234)  | (0.314)  | (0.046)  | (0.331)  | (0.430)  | (0.430)  |

# Marginal effects on the probability of unconfirmed projects in all sectors of the economy

| Prob (confirmed)       | Marginal effects |   |              |   |             |   |
|------------------------|------------------|---|--------------|---|-------------|---|
|                        | Mining           |   | Other sector |   | All sectors |   |
| Comm price growth      | -0.0169          | * | -0.0019      |   | -0.0109     | * |
| Comm price volatility  | 0.0407           | * | 0.0112       | * | 0.0482      | * |
| Foreign ownership      | -6.69e-06        | * | -1.87e-06    | * | -8.53e-06   | * |
| Total financing (size) | 0.0009           | * | 0.0003       |   | 0.0010      | * |
| Conflict               | -0.0066          | * | -0.0005      |   | -0.0032     | * |

\* denotes that the coefficient is statistically significant at the 5 percent level.

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## Delayed projects

Logit regression

$$delay_{it} = \alpha_{0i} + \alpha_1 growth_{it} + \alpha_2 volat_{it} + \alpha_3 X_{it}$$
(1)

- ▶ growth<sub>it</sub>: year on year percentage price change
- volat<sub>it</sub>: standard deviation of the last 12 months.
- $X_{it}$ : control variables
  - conflict<sub>it</sub>: number of social conflicts.
  - *financ<sub>it</sub>*: amount of financial funding for the investment project.
  - $fdi_{it}$ : amount of funding that comes from foreign investors.
  - volatn<sub>it</sub>: volatility of commodity prices in periods of a downward trend in these prices.

# Marginal effects: Probability of delay in investment projects in all sectors of the economy

| Variable               | Marginal effects |   |               |   |             |   |
|------------------------|------------------|---|---------------|---|-------------|---|
|                        | Mining           |   | Other sectors |   | All sectors |   |
| Comm price growth      | -0.0266          | * | -0.0052       |   | -0.0439     | * |
| Comm price volatility  | -0.0864          | * | 0.1362        | * | 0.0156      |   |
| Comm price volatility  | 0.0664           | * | -0.0045       |   | 0.0154      |   |
| (downward)             |                  |   |               |   |             |   |
| Foreign ownership      | 2.73e-06         | * | 7.70e-07      |   | 1.30e-06    | * |
| Total financing (size) | -0.0003          | * | 0.0001        |   | -0.0001     |   |
| Conflict               | -0.0094          | * | -0.0167       | * | -0.0145     | * |

\* denotes that the coefficient is statistically significant at the 5 percent level.

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## Marginal effects: Probability of delay in investment projects in the mining sector

| Variable               | Marginal | effects |
|------------------------|----------|---------|
|                        | Mining   |         |
| Comm price growth      | -0.0138  | **      |
| Comm price volatility  | -0.0469  | **      |
| Comm price volatility  | 0.0466   | *       |
| (downward)             |          |         |
| Foreign ownership      | 1.78e-06 | **      |
| Total financing (size) | -0.0002  | **      |
| Conflict               | 0.0032   | *       |

\* denotes that the coefficient is statistically significant at the 5 percent level, \*\* denotes that the coefficient is statistically significant at the 10 percent level.

## Marginal effects: Probability of delay in other sectors

| Variable               | Variable Marginal effects |   |             |   |                |   |
|------------------------|---------------------------|---|-------------|---|----------------|---|
|                        | Hydrocarbons              |   | Electricity |   | Infrastructure |   |
| Comm price growth      | -0.0127                   |   | -0.0097     |   | -0.0043        |   |
| Comm price volatility  | 0.1807                    | * | -0.0886     |   | 0.0362         | * |
| Comm price volatility  | -0.0127                   |   | -0.0023     |   | -0.0004        |   |
| (downward)             |                           |   |             |   |                |   |
| Foreign ownership      | -0.00001                  | * | 9.02e-06    | * | 3.06e-07       |   |
| Total financing (size) | 0.0010                    | * | -0.0001     |   | 0.0001         | * |
| Conflict               | -0.0351                   | * | -0.0218     | * | 0.0106         | * |

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NOTE: \* denotes that the coefficient is significant to 5 percent.

# Determinants of announced delays in investment in the mining sector

Announced delay (in number of months)

|                         | (1)     |   | (2)     |    | (3)     |   | (4)     |   |
|-------------------------|---------|---|---------|----|---------|---|---------|---|
| Comm price growth       | -0.4688 | * | -0.1102 | ** | 0.0163  |   | -0.0008 |   |
| Comm price volatility   | 0.7692  | * | 0.0227  |    | -1.0252 |   | -1.0262 | * |
| Comm price volatility   |         |   | 1.3147  | *  | 1.2381  | * | 1.3020  | * |
| (downward)              |         |   |         |    |         |   |         |   |
| Foreign ownership       | 0.0396  | * | 0.0385  | *  | 0.0284  | * | 0.0294  | * |
| Total financing (size)  | 0.0015  | * | 0.0014  |    | 0.0009  | * | 0.0011  | * |
| Conflict (total)        | -0.0477 |   | -0.0335 |    | _       |   |         |   |
| Mining conflicts        |         |   |         |    | 0.0444  | * |         |   |
| Environmental conflicts | —       |   | —       |    | —       |   | 0.0144  | * |

NOTE: \* and \*\* denote that the coefficient is significant to 5 and 10 percent, respectively.

# Marginal effects: Probability of delay. Differentiated effects between large and small projects

|                                      | All sectors |   | Mining   |    | Other    |   |
|--------------------------------------|-------------|---|----------|----|----------|---|
| Comm price growth                    | -0.0787     | * | -0.0911  | *  | -0.0091  |   |
| Comm price growth (big projects)     | 0.0461      | * | 0.0806   | *  | 0.0029   |   |
| Comm price volatility                | 0.0502      | * | -0.0661  | *  | 0.1467   | * |
| Comm price volatility (big projects) | -0.0636     | * | -0.0291  |    | -0.0206  |   |
| Comm price volatility (downward)     | -0.034      | * | -0.0364  | ** | 0.0131   |   |
| Comm price volatility                | 0.0718      | * | 0.1326   | *  | -0.0325  |   |
| (downward, big projects)             |             |   |          |    |          |   |
| Foreign ownership                    | 1.26e-06    |   | 2.90e-06 | *  | 6.90e-07 |   |
| Total financing (size)               | -0.0001     |   | -0.0003  | *  | 0.0001   |   |
| Conflict                             | -0.0144     | * | -0.0090  | *  | -0.0174  | * |

NOTE: \* and \*\* denote that the coefficient is significant to 5 and 10 percent, respectively.

## Competing risks: Number of projects according to status

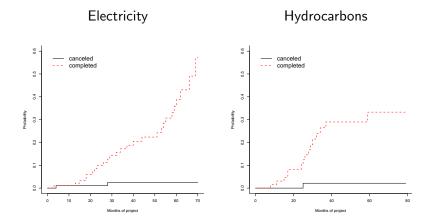
|   | Sector         | Censored | Canceled | Completed |
|---|----------------|----------|----------|-----------|
| 1 | Agro-industry  | 40       | 0        | 3         |
| 2 | Electricity    | 73       | 2        | 26        |
| 3 | Hydrocarbon    | 54       | 1        | 15        |
| 4 | Industry       | 88       | 2        | 18        |
| 5 | Infrastructure | 56       | 3        | 18        |
| 6 | Mining         | 86       | 3        | 18        |
| 7 | Other          | 483      | 2        | 75        |
| 8 | Fishing        | 10       | 0        | 4         |
| 9 | Telecom        | 27       | 0        | 2         |

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## Competing risks: Average time of projects according to status

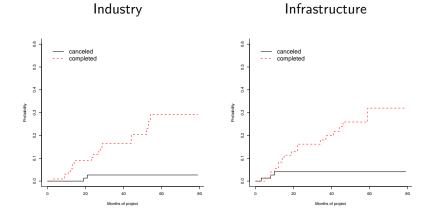
| Sectors        | Censored | Canceled | Completed |
|----------------|----------|----------|-----------|
| Agro-industry  | 34.3     |          | 15.3      |
| Electricity    | 36.3     | 16.0     | 38.1      |
| Hydrocarbon    | 39.6     | 25.0     | 26.1      |
| Industry       | 34.8     | 20.0     | 25.7      |
| Infrastructure | 43.7     | 7.0      | 25.9      |
| Mining         | 45.4     | 38.3     | 26.1      |
| Other          | 32.5     | 25.0     | 16.2      |
| Fishing        | 35.2     |          | 16.3      |
| Telecom        | 36.0     |          | 37.0      |

### Competing risks: Cumulative incidence function by sector



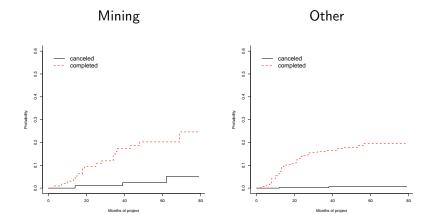
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### Competing risks: Cumulative incidence function by sector



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### Competing risks: Cumulative incidence function by sector



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## Competing risks: Predicted CIFs under base and counterfactual case

Cancelation Completion 0.07 0.06 5 0.05 counterfactua 8 0.04 Probability Probability 0.03 0.2 0.02 5 0.01 0.0 8 10 20 Months of project Months of project

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#### Next steps

- Use commodity futures for regressions on delays.
- Endogeneity of social conflicts to commodity price fluctutations.
- Robustness checks
  - Eliminate unconfirmed projects from the sample
  - Regroup good (confirmed, completed) vs bad outcomes (unconfirmed, under revision, canceled)

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Multistate models and competing risks