

# Do Returns to R&D Vary by Size of Firm? Evidence from Canada

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## Estimating equation (in logs) – fixed effects

$$Y_{it} = a_0 + \alpha C_{it} + \beta L_{it} + \gamma K_{it} + \varphi S_{it} + q_t + \eta_i + \omega_t + u_{it}$$

Y is value added

C is tangible capital

L is number of employees

$u$  is the error term

K is knowledge (R&D) capital

S is the spillover pool

$q$  is industry-level value added

- TFP decomposed into all-firm mean ( $a_0$ ), a firm-specific component ( $\eta_i$ ) and a time varying component ( $\omega_t$ )
- Equation includes dummies for year and for K=0
- Estimation period: 2000-12; unbalanced panel of R&D performers

## Data cleaning

- ◆ Measurement errors: removed observations for which tangible capital is negative or zero.
- ◆ Estimation constraint: removed all observations for which VA is negative or zero.
  - Eliminates firms with no sales and highly unprofitable firms
- ◆ Removed “micro-firms”
- ◆ Trimmed Y/K outliers
  - Rate of return = (estimated output elasticity)\*Y/K

## Calculation of the initial stock of R&D

- Standard approach in the literature:

$$K_{i2000} \approx \frac{\bar{I}_i}{g_i^* + \partial}$$

$\bar{I}_i, g_i^*$  are equilibrium level & growth rate of R&D

$\partial$  is the economic depreciation rate

- Our approach to estimating  $g_i^*$  (James-Stein Estimator)

$$g_i^* = \bar{g} + c_i(g_i - \bar{g})$$

$g_i$  is average annual growth in R&D spending by firm  $i$

$\bar{g}$  is the "shrinkage point"

$c_i$  is the "shrinkage factor"

## Defining the spillover pool (Jaffe 1986)

- ◆ Technological position characterized by  $F_i = [F_{i1} F_{i2} \dots F_{iK}]$  where  $F_{ik}$  is the fraction of firm  $i$ 's total research expenditure devoted to area  $k$ .
- ◆ The proximity of firm  $i$  and firm  $j$  measured as the uncentred correlation of firms' technological positions:

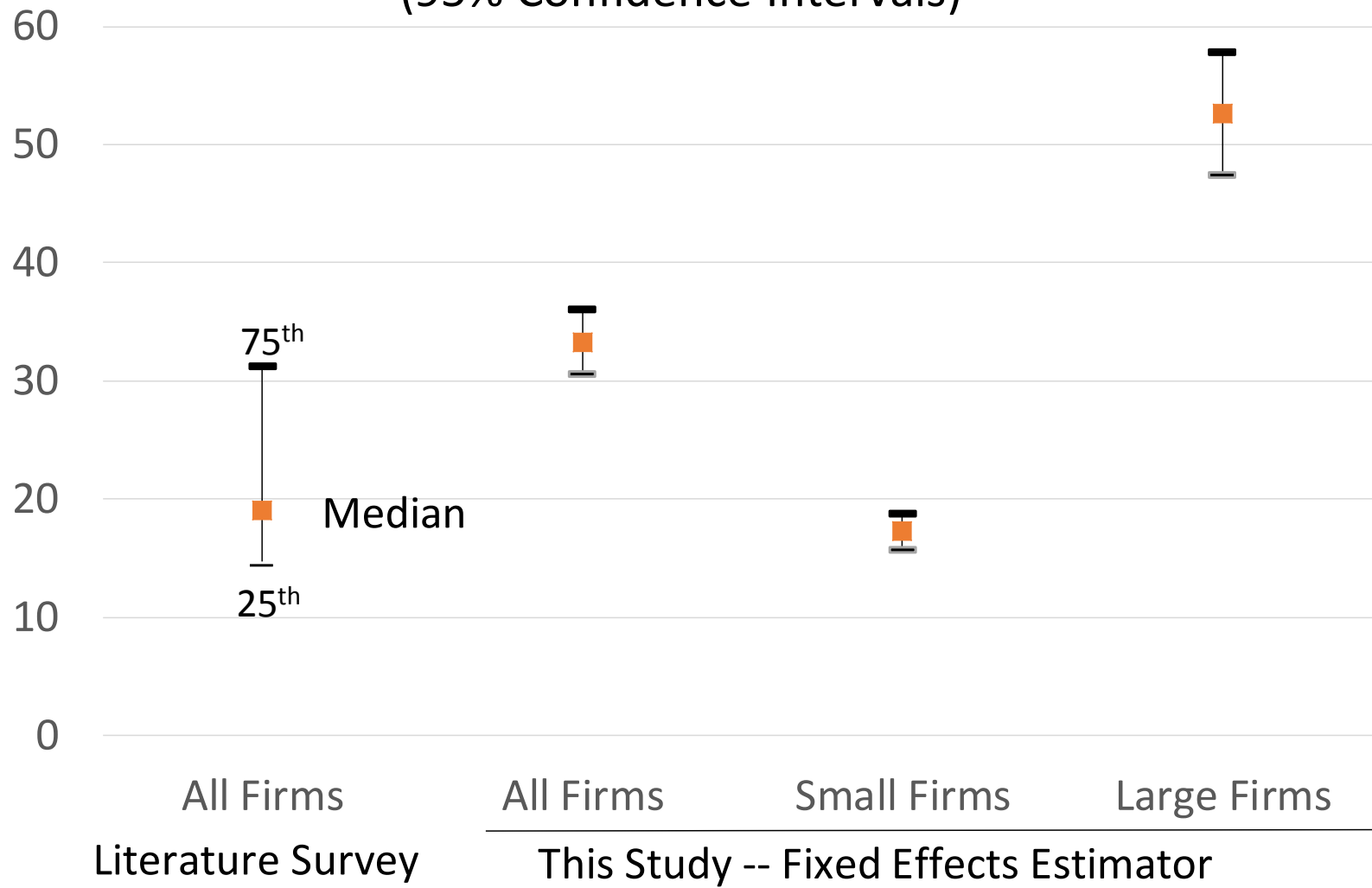
$$P_{ij} = F_i F_j' / [(F_i F_i') (F_j F_j')]^{1/2} \quad \text{where } F' \text{ is the transpose of } F.$$

- ◆ The stock of external knowledge available to firm  $i$  is:

$$S_{it} = \sum_{j \neq i}^J P_{ij} K_{jt}$$

# Private Rate of Return on R&D

(95% Confidence Intervals)



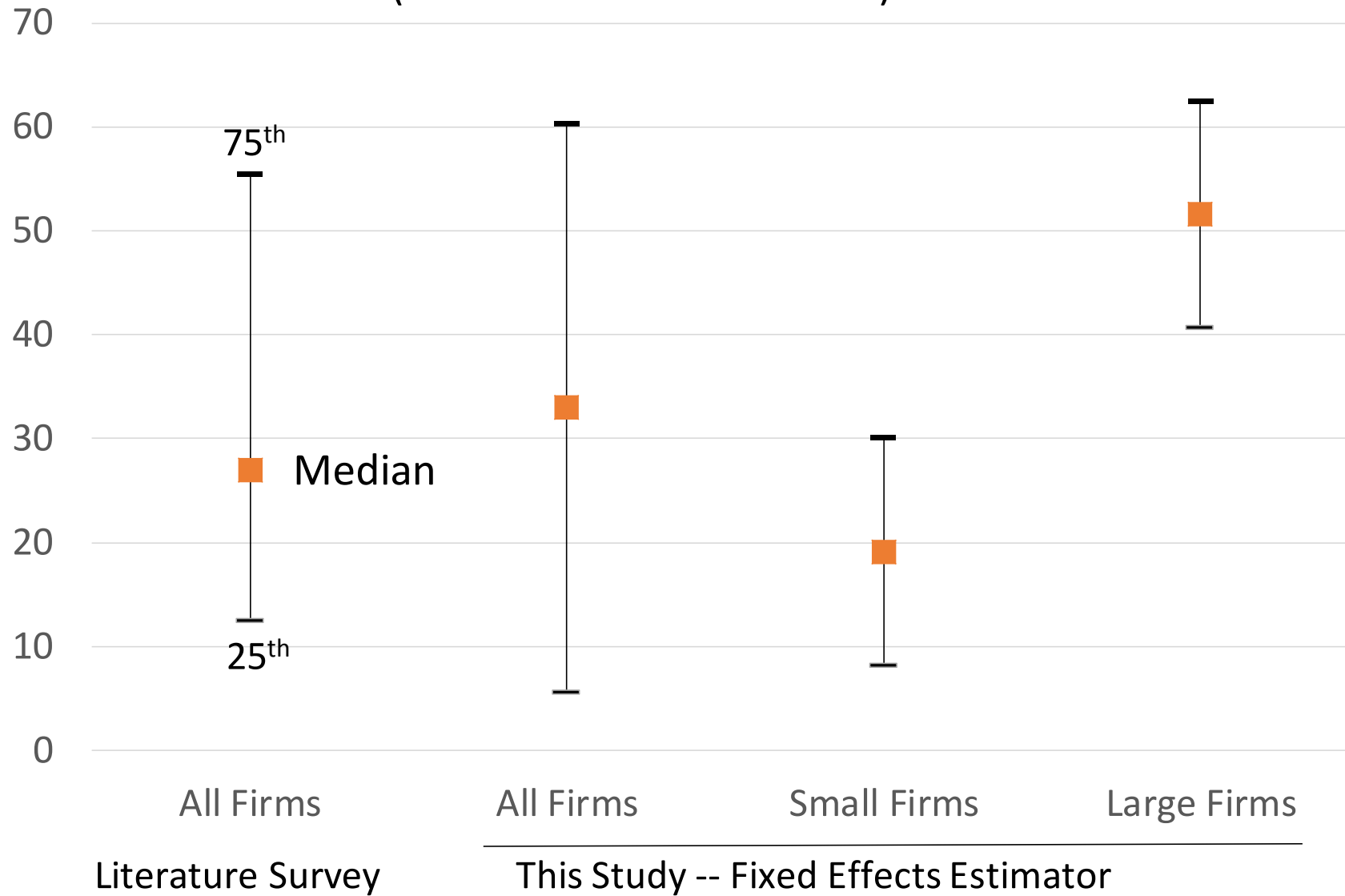
## Subsidies lower the hurdle rate for investment in R&D

<b>Federal and Provincial SR&amp;ED Investment Tax Credit Rates</b> (2010-12 in percentage)			
	Federal	Provincial <sup>1</sup>	Combined <sup>2</sup>
Small firms	35.0	13.3	43.6
Large firms	20.0	6.3	25.0
Small less large	15.0	7.0	18.6

1. Expenditure-weighted sum of provincial statutory rates.
2. The base for the federal credit is reduced by the amount of provincial assistance provided.



# External Rate of Return on R&D-- Mahalanobis Spillover Pool (95% Confidence Intervals)



## Future research

Database will be made available to other researchers

- ◆ Do spillovers vary by:
  - Type of research?
  - Size of research budget?
  - Country of control?
  - Source of funding?
  - Share of scientists and engineers?
  - Collaborative research?
- ◆ Do spillovers decline with distance?
- ◆ Does creative destruction substantially offset knowledge spillovers?