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# Industrial Dynamics: from Size Distribution to Productivity Analysis

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# 1. Regularities in growth and size distributions of firms

## Aggregated Analysis

Size:

- Stationarity of size distribution
- Log-normal shape

Scaling Relation:

- Negative relation between size and growth rates variance

Growth rates:

- Unit-root nature of the growth process
- Growth rates display a Laplace shape



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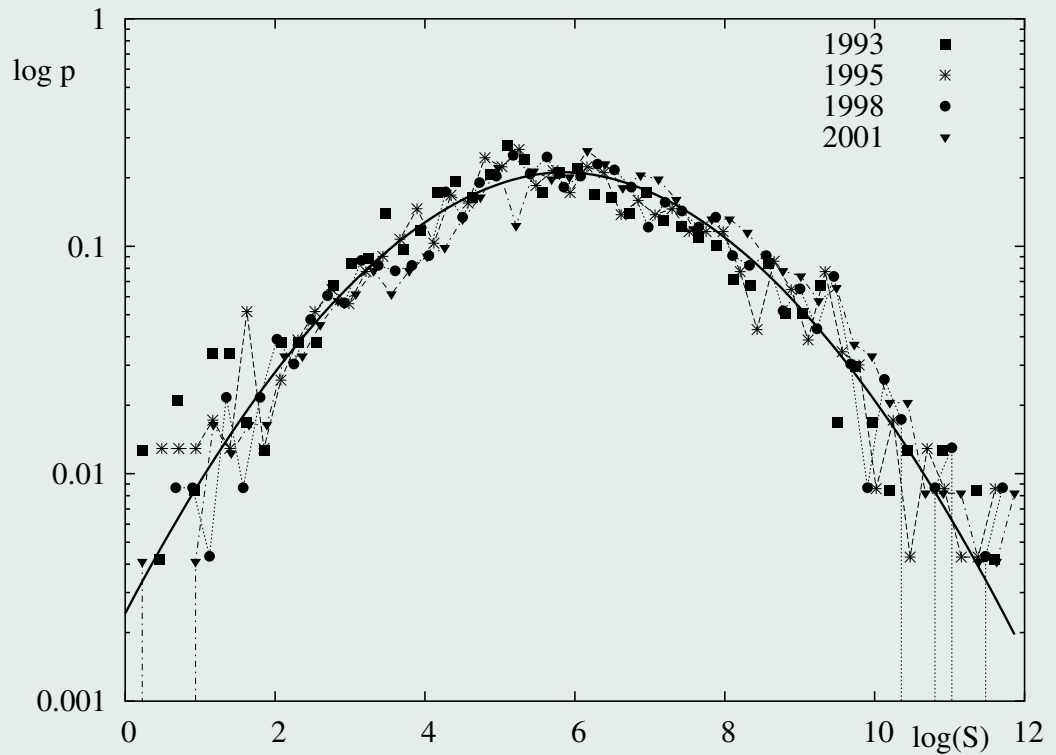


Figure 1: Empirical probability densities of (log) sales for 4 different years.

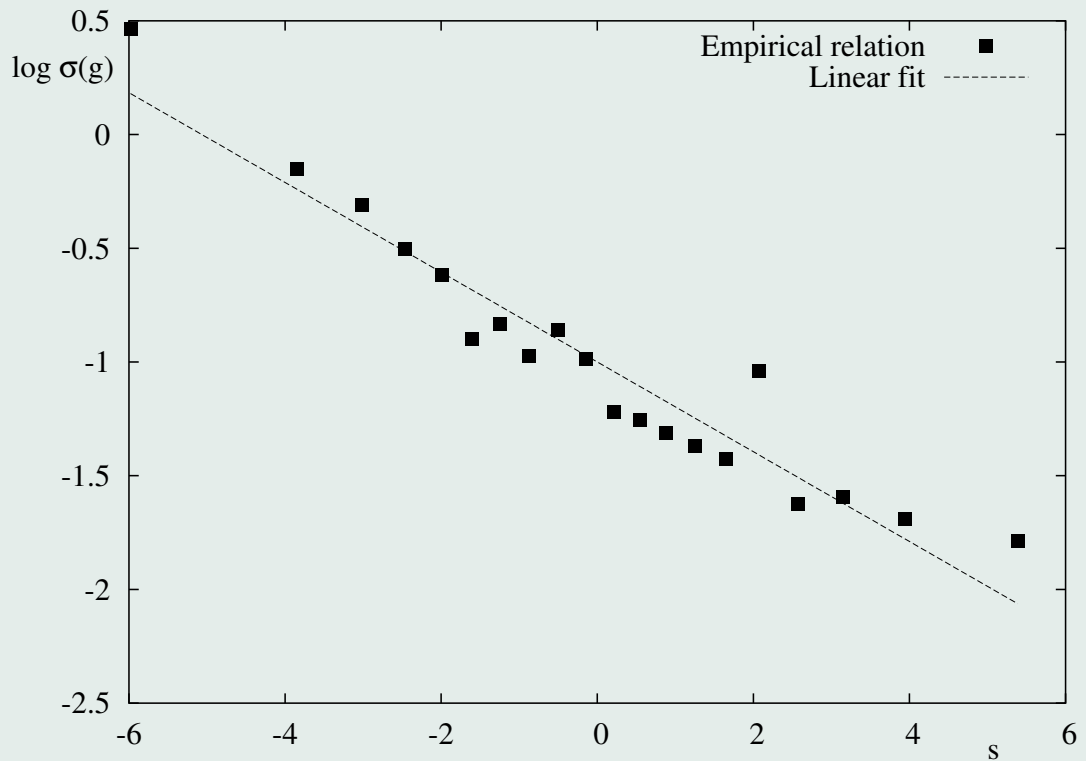


Figure 2: Log of the standard deviation of the one year growth rates as function of size.



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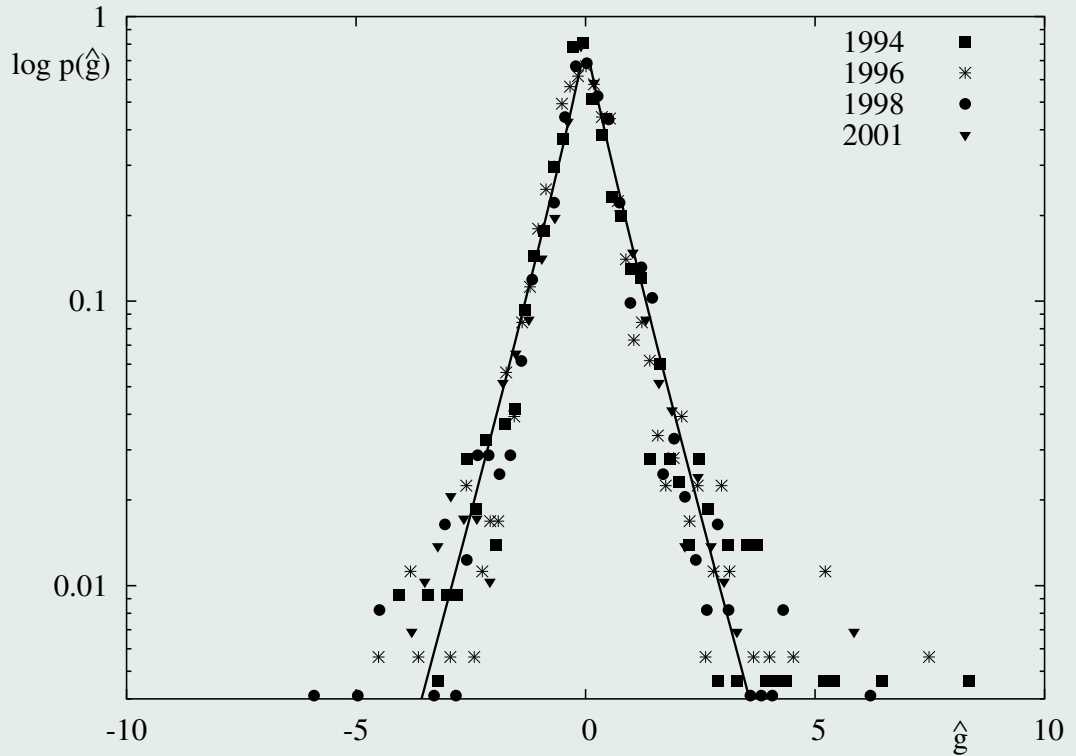


Figure 3: Log of the empirical densities of rescaled growth rates for 4 different years, together with a Laplacian fit.



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## Sectoral Analysis

Size:

- Heterogenous shapes in the size distribution
- Stationarity of size distributions

Scaling Relation:

- Negative relation between size and growth rates variance

Growth rates:

- Unit-root nature of the growth process
- Laplace distribution of growth rates



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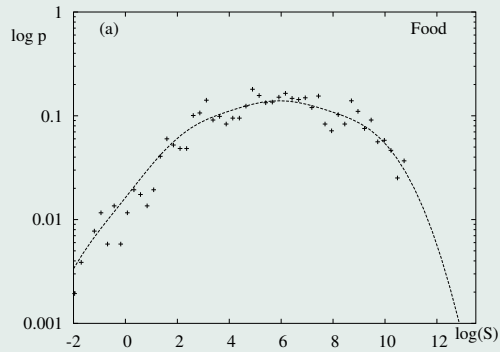


Figure 4: Log firm size in food sector.

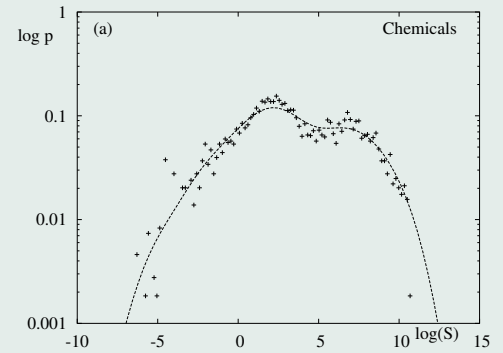


Figure 5: Log firm size in chemical sector.

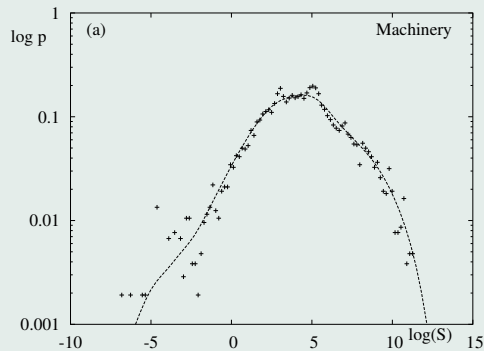
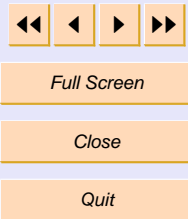


Figure 6: Log firm size in machinery sector.



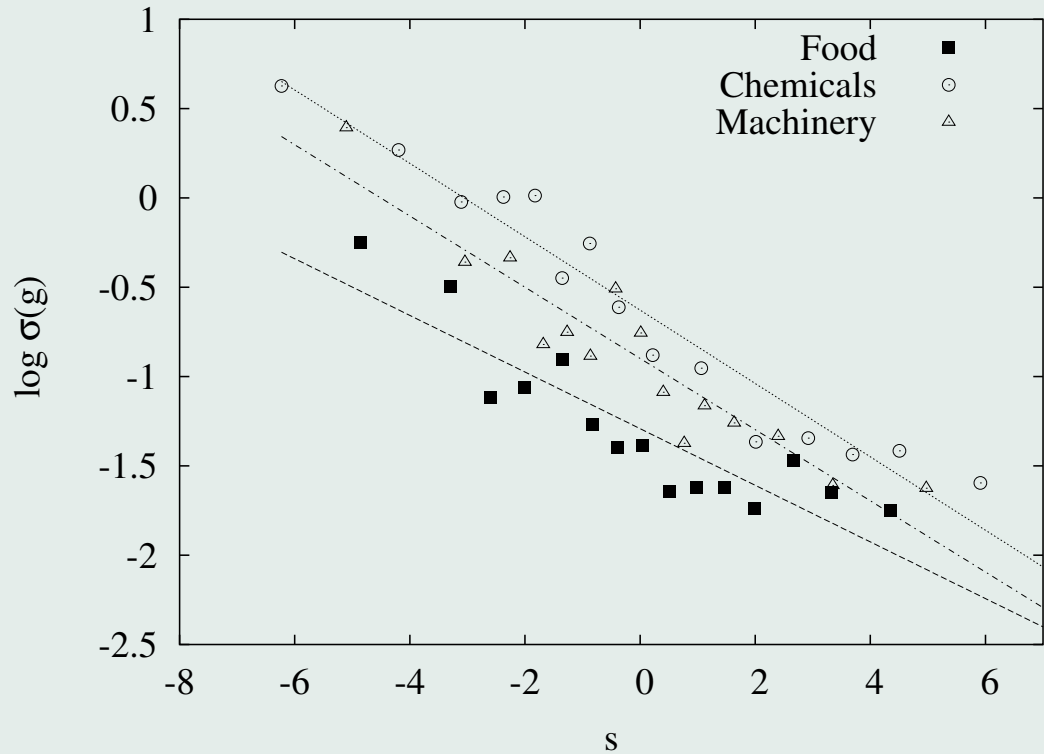


Figure 7: Log of standard deviation of the one year growth rates as function of size.



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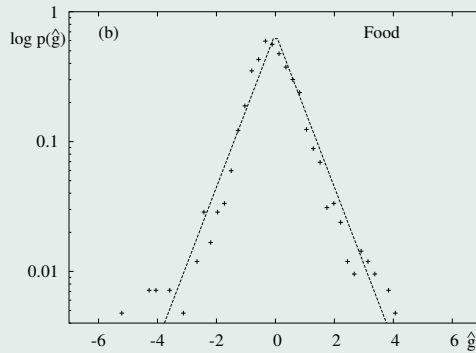


Figure 8: Rescaled growth rates for the food sector.

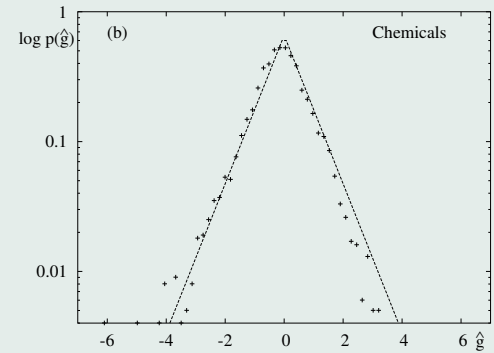


Figure 9: Rescaled growth rates for the chemicals sector.

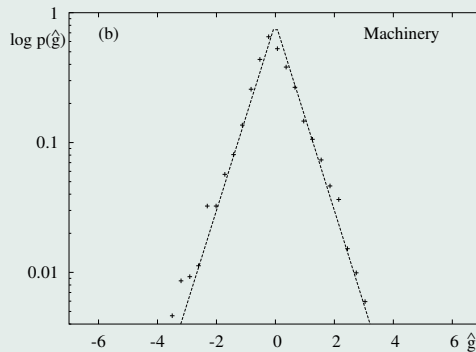
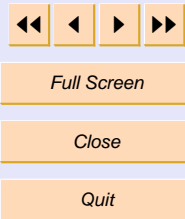


Figure 10: Rescaled growth rates for the machinery sector.





## 2. Gibrat's Law – Law of Proportionate Effect

The Expected growth rate of a firm is independent of its size.

### Gibrat's framework:

- Growth process is multiplicative.
- Firms histories are different realization of the same process.

### Stronger Form:

*The probabilities of the size changes of any specified percentage magnitudes are independent of a firm's present absolute size.*



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### Weaker Form:

*The expected percentage change in size of the totality of firms in each size stratum is independent of stratum.*

### Drawbacks:

- No competition among firms.
- Growth rates of individual firms in one period are uncorrelated with growth rates in preceding periods.



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### 3. Islands' Approach



Ijiri and Simon (1964) proposed a model consistent with what they referred to as *well-known facts*:

- Negative relationship between size and variance of growth rates.
- Different expected rate of change at firm level.
- Serial correlation in growth rates over at least short time periods.

#### The Model:

*The probability of growth in the next period is proportional to a weighted sum of past increments. Weights decrease geometrically at a rate  $\beta$ , with the lapse of time since their occurrence.*



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## Features of the model:

### Competition:

- At each time period there is one opportunity of growth to be assigned.
- Growth constraint due to pace of expansion of the economy.

### Growth process:

1. The unit is allocated to a new firm with probability  $\alpha$ . If this is the case the process stops here.
2. In determining to which existing firms to allocate the unit, the model keeps track of two factors: current size and current *growth potential* of the firm.



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## 4. Focus on growth rates distribution

- So far, much of the emphasis in the literature laid on size distribution.  
Gibrat  $\longrightarrow$  Log-N      Simon  $\longrightarrow$  Yule distribution
- Stanley et al. (1996) find tent-shape distribution in growth rates at aggregate level
- Growing interest in investigating this regularity
- Bottazzi and Secchi (2003) obtain the same result at aggregate/disaggregate level and propose a stochastic model consistent with this *stylized fact*



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## 5. Bringing Productivity into the picture



Starting Point:

- Bottazzi et al. (2002)

The dataset:

- MICRO.1 (Italian Statistical Office).
- Longitudinal data for about 8000 firms with number of employees greater than 19. Period 1989 – 1996.
- Focus on *internal growth*: “super firms” aggregating data of merging firms from the beginning.
- Balanced panel: ignoring firms that cross the 20 unit boundary.



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## Productivity

Productivity is defined as value added over number of employees:

$$\Pi_t(t) = \frac{VA_i(t)}{L_i(t)}$$

Findings:

- Quite weak relations between productivity and firm growth.
- Negative relation between productivity and increase in productivity



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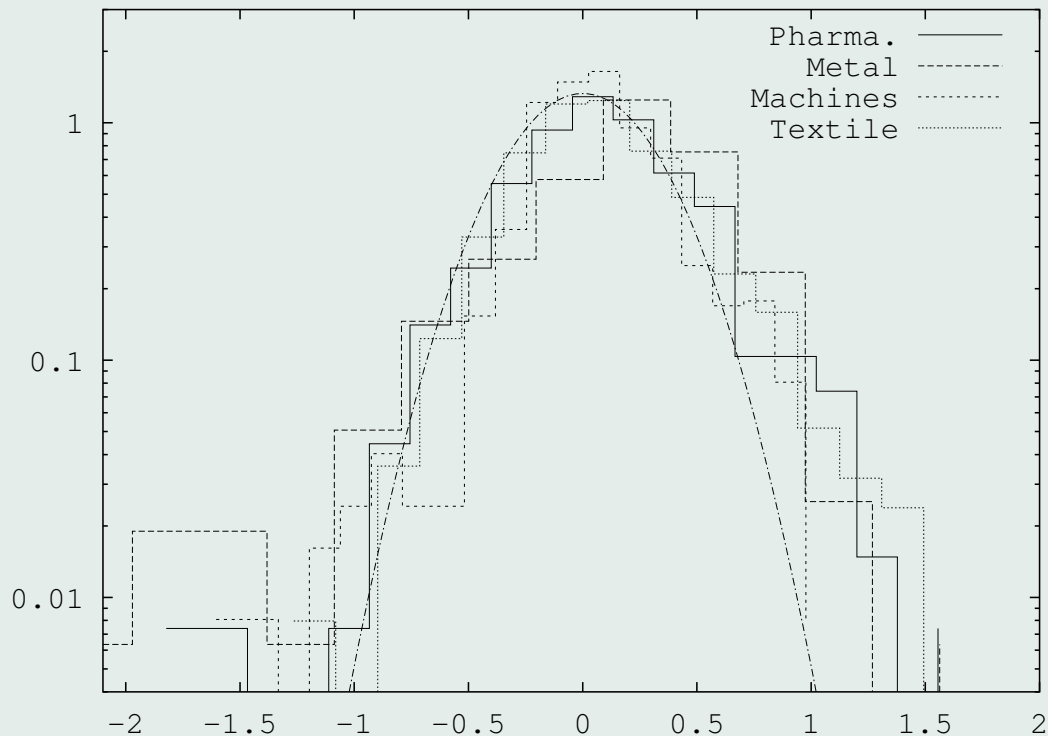


Figure 11: Probability densities of the productivity for four sectors (the normal distribution is plotted as guide for the eyes).



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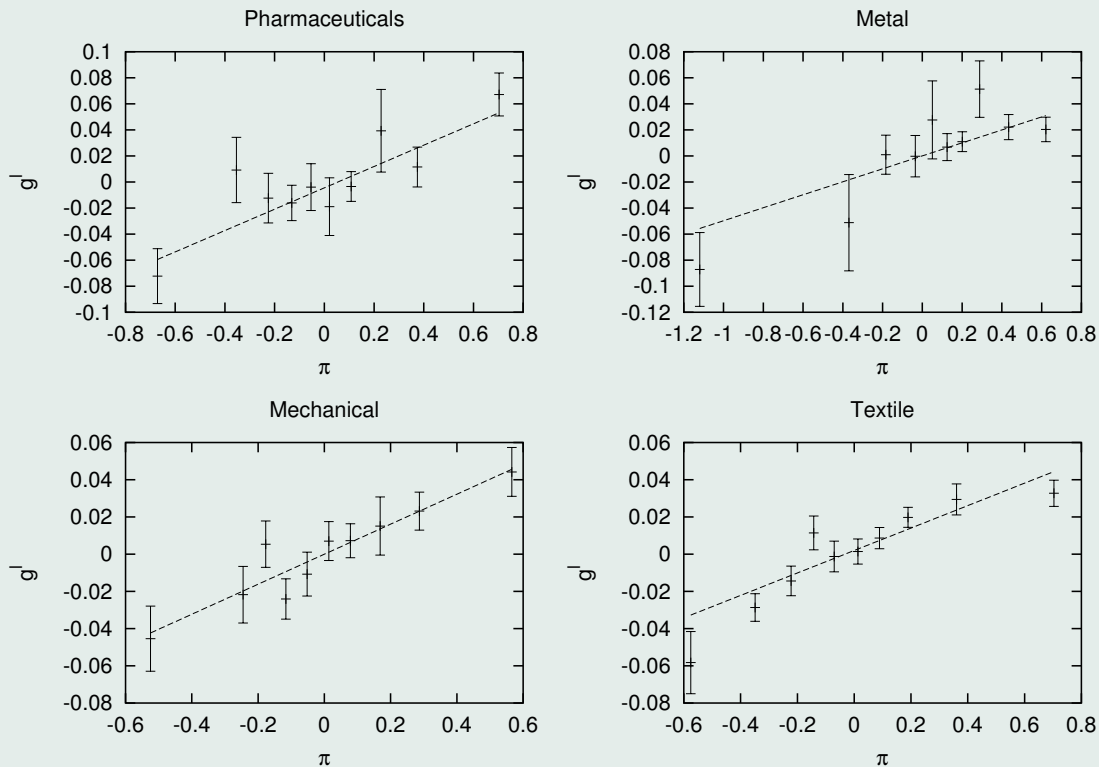


Figure 12: Regression of the employees growth  $g^l$  against productivity.



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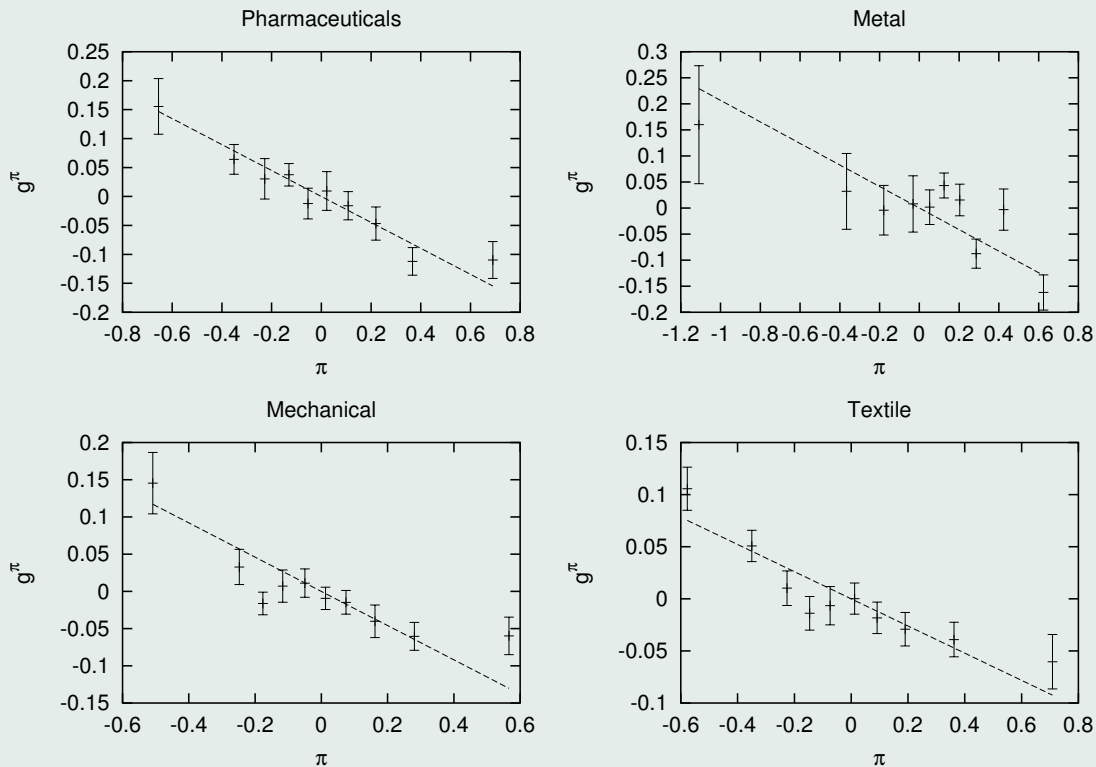


Figure 13: Regression of productivity growth  $g^\pi$  on the average productivity.



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## Essential References



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