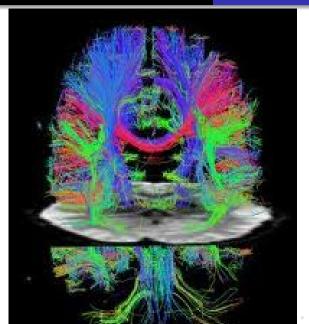
#### Taking a few moments for CAED

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April 26, 2012







# What import research questions can be answered with CAED?

- Once you start thinking about productivity...
  - it's hard to think about anything else.
- Analyse enterprise data to:
  - understand mechanisms
  - measure effects, responses
  - evaluate policy
- 'Comparative' cross-country analysis aids identification

#### Current CAED research

- Trade, FDI
- Wages, workers
- Investment frictions
- Reallocation, Misallocation
- IO, Competition
- Regional, Urban
- Innovation, Growth

#### Current CAED research

- Some topics missing from this year's CAED
  - Energy
  - Environment
  - Management practices

#### Current CAED research

- Firm-level data, official statistics
- Linked registers, surveys
- Proprietary firm-level (Orbis)
- Not much cross-country comparison

## Cross-Country Research

- Confidential Firm-level data from multiple countries cannot be combined
  - Instead, researchers use data such as Orbis
  - Or, replicate a study in multiple countries
- Other possibility: collect moments to merge into cross-country industry data
  - Cross-country projects sponsored by OECD, WB, and recently Eurostat
  - Analysis of moments provided some key insights into firm dynamics

## **Analysing Cross-country moments**

- Job creation and destruction
- Entry and Exit rates
- Firm survival
- Productivity decompositions
- Productivity dispersion
- Covariance productivity-size (OP cross-term)
- Joint moments across surveys (eg ICT and Innovation)
- 'Industry' data aggregated using firm-characterisitics (other than industry)

## Shortcoming of previous work

- Unclear what the theoretical basis is of given moments
  - Is an increase in entry/exit a good thing?
- Unclear with what metric to make comparisons
  - What is optimal size-productivity relationship

## Example: variance of productivity

- In Hopenhayn (1992) model there is an endogenous productivity cut-off
- Given an exogenous process of shocks to firm-level productivity, the observed productivity dispersion in operating firms will differ.
- For example, in recent work on exit costs and productivity, a 2-sector matching model gives the relationship between observed productivity dispersion and ex-ante dispersion:

$$\widehat{\sigma}^{2} = \frac{\lambda}{\delta + \lambda} \left( \int_{x_{d}}^{\infty} z^{2} dF(z) - \frac{\lambda}{\delta + \lambda} \left( \int_{x_{d}}^{\infty} z dF(z) \right)^{2} \right).$$



## Example: OP Cross-term

- While the OP cross-term has a nice intuitive interpretation as the difference between average productivity and weighted average productivity, its relation to aggregate productivity and welfare is model specific
- In recent work, the co-movement of the OP cross-term and welfare in response to changes in economic environment is shown through simulation of a calibrated model
- The OP gap responds 'better' to changes in policy than productivity dispersion, using a more realistic model.

## Comparative of analysis of cross-country moments

- Reduce marginal costs of building/tweaking/simulating heterogeneous firm models
  - use 'object oriented' open source code to build a laboratory for heterogeneous firm models
- Reduce marginal costs of collecting cross-country moments from linked register-survey data
  - Eurostat project
  - Data Without Boundaries
  - New proposal for Micro-moment Retrievel Facility

## Heterogeneous Firm Models

- Elemental models: Ericson and Pakes (1995) Markov Perfect Equilibrium. Computationally feasible with a few incumbents
  - Allows rich dynamic decisions in oligopoly setting
  - Widely used in IO: e.g. Berry, Doraszelski
- Aggregate models: Hopenhayn (1992) where industry state is stationary. Single firm is infinitesimal
  - Allows many extensions
  - Used in trade (Melitz), innovation (Klette-Kortum), finance (Cooley-Quadrini; Midrigan and Xu), Distortions (Rogerson-Restuccia)

#### Heterogeneous Agent Models

- Weintraub, Benkard and Van Roy: stationary eq of aggregate in asymptotically large market approaches MPE if stationary eq (SE) of state obeys a 'light tail' condition
- Oblivious Equilibrium: each firm's strategy a function of its own state and long-run industry state: ignore competitors' states.
- OE of dynamic heterogeneous agents with imperfect competition are readily solved

## OE laboratory in Python

- OE solver in C++ available by Jeziorski-W-B-VR
- To improve ease of replication and extensions, I am guiding a project to create a flexible, object oriented heterogeneous firm 'laboratory'
- Various generic classes have been written
  - Markov chains
  - Production Functions
  - Transitions
  - Profits
  - OE Solvers

#### **OE** laboratory

- Using the software, we can take models to data
  - Calibration
  - Simulations
  - Indirect Inference
- Marginal cost of modelling will be greatly reduced
- But, need for relevant (cross-country) data moments

#### Cross-country analysis of firm-level data

- Eurostat ESSLimit project (session on Friday morning)
  - Common code sent to 15 EU countries to run on linked surveys (BusReg-ProdSurv-ECommerce-CIS)
  - Micro-aggregated country/industry/time database to be made available to researchers
- Data Without Borders (DWB, see Stefan Bender)
- Micro-moment retrieval system
  - A 'remote execution' system, where customized data moments can be generated in multiple countries
  - Because of confidentiality, output quantity limited

#### Does macro matter?

- While long-run productivity is everything, individuals worry about business cycles.
- Firms worry about uncertain future profits

Big Questions Productivity

- Aggregate demand, idiosyncratic demand (taste), and productivity affect profit
- Standard deviation of firm-level distribution of output growth (.37), employment growth (.30), or productivity growth (.46) is very large
- Even mean of 3rd minus 2nd quartile of firm-level growth distribution is large (dq=.10; de=.07; dtfp=.16)
- Bernanke-Gertler wonder how small shocks can create big cycles
- I wonder why firms facing big shocks worry about 'small' cycles
  - maybe financial constraints matter?



Model moments Better moments Suggestive moments

