



Measuring Science, Technology, and Innovation: A Review

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Overview

- **Desirable characteristics of indicators**
 - How are they to be used?
 - Data collection and quality issues
- **Framework for the STI system**
- **Existing US indicators and gaps**
- **Policy uses of indicators**



Uses of STI indicators

- Performance assessment and benchmarking
- Informing public policy decisions
- Informing private sector decisions
- Academic research
 - Micro-level information desirable
 - Matched to firm and individual data



Data collection

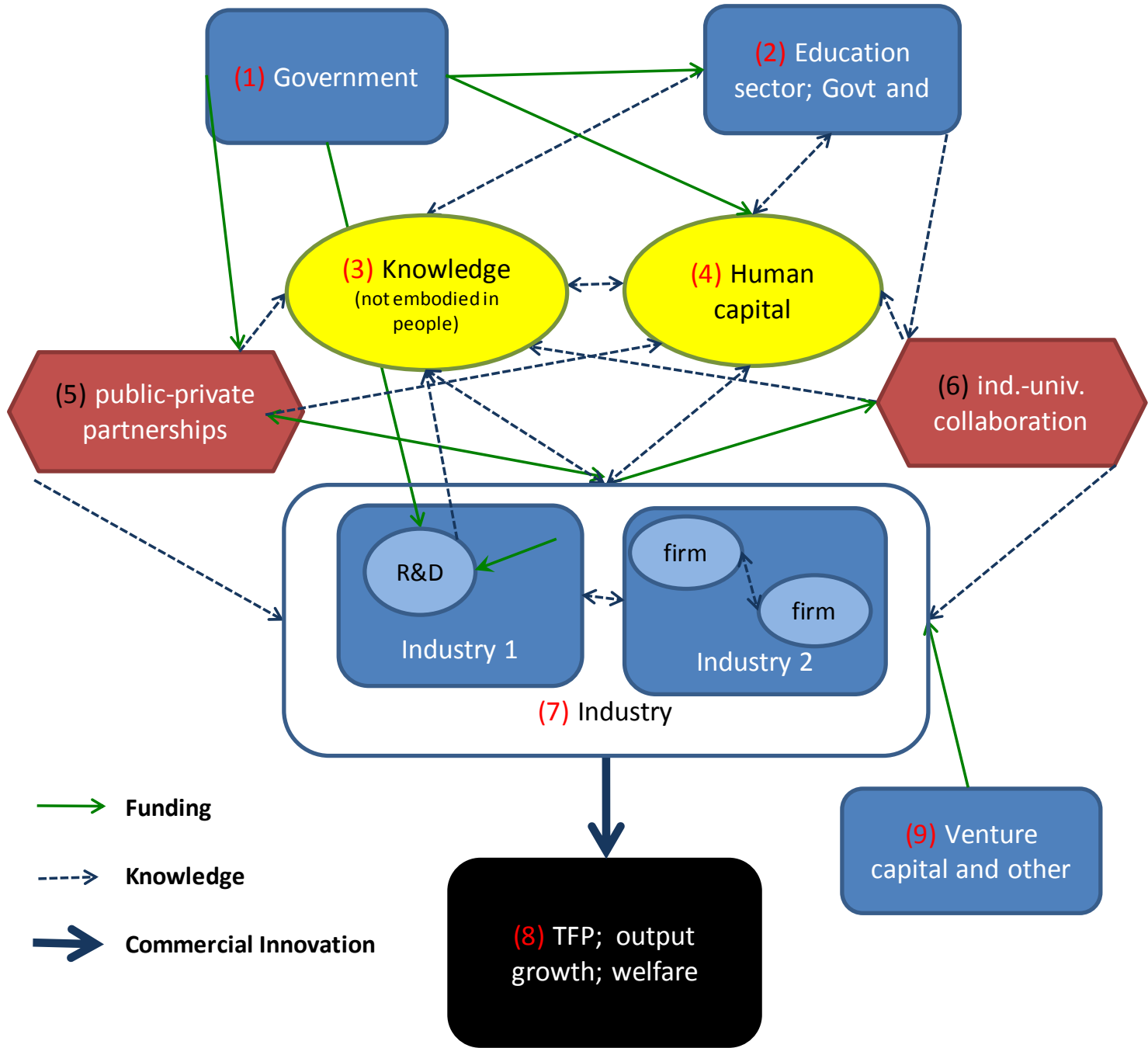
- **Passive - lower respondent burden, less gaming:**
 - As a by-product of other activities (e.g., accounting data)
 - Via public sources or web-scraping (e.g., patent data)
- **Active - higher respondent burden but possibly better targeted:**
 - Surveys – government or private



Data quality

- From Griliches (1986)
 - **Extent** – how long collected, how broad is coverage, etc.?
 - **Reliability** – signal-to-noise in the data, would it be reproducible?
 - **Validity** – relevance and representativeness
 - Added to this list by the *Capturing Change* report – **Accessibility**

Resource, knowledge and outcomes in the innovation system



Growth accounting framework

Very simplified model:

$$g_Y = \alpha g_C + \beta g_L + \gamma g_K + e$$

Y = output, C = physical capital, L = labor input

K = a measure of knowledge assets

g = growth rate

e = any output growth that cannot be explained by the inputs.

Measuring α , β , γ :

Growth accounting – assume normal returns and estimate by shares of output (the *input cost* approach)

Micro-econometric – estimate via a production function (the *output contribution* approach)



Limitations of growth accounting

- Assumes normal rates of return – is this appropriate for intangible inputs like R&D?
- Omits unpriced output (e.g., health and environmental improvements)
- A black box - obscures the function of the underlying STI system
- Linear versus feedback (chain link) model
 - Inputs are things subject to policy intervention
 - Outputs, less so, and rather unpredictable



Current US indicator coverage

- Resource flows well covered, with breakdowns into source and use of funds
 - Flows within sectors less well measured
 - Non-R&D inputs not measured
- Human capital formation and knowledge output also measured fairly well, but proxies may be distant from the underlying concept
 - E.g., counts of degrees, papers, patents, etc.
- Innovation output or success much less well measured; fewer if any indicators



Gaps in US STI indicator coverage

- Innovation, at least until recently
- Service sector
- Non-R&D inputs to innovation
- Timeliness
- Linkages (networks, licensing, JVs, etc)
- Knowledge advance in non-GDP areas
- Capital for financing innovation (angel finance, private equity?)
- Exports and imports – that is, allocation of value added



STI Indicators for policy

- Overall level of public investment in R&D
- Overall level of public investment in education and training
- Allocation of both by scientific or technological fields
- Allocation of public R&D investment by performer
- S&T policy choices beyond spending
- Immigration policy
- Indicators for universities and firms