

Economics 124/PP 190-5/290-5  
Innovation and Technical  
Change

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Diffusion of innovations (2)  
Prof. Bronwyn H. Hall

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Outline

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- Introduction – the s-curve
  - Models
  - Economic determinants of diffusion
  - Factors affecting pace of diffusion
  - Example: the dynamo and the computer
- Next time: networks and standards*

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Factors affecting diffusion (1)

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- Technology continually improving, so users wait for improved versions
  - Palm pilots; cell phones
  - Software and early adoption
- Technology has to be adapted to local conditions
  - Hybrid corn - geographic specialization

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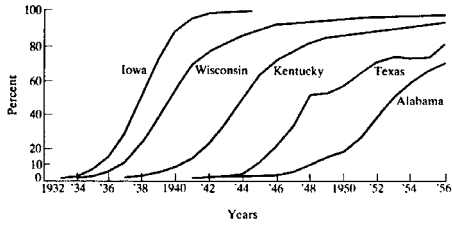
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### Percentage of total corn acreage planted with hybrid seed



Source: USDA, Agricultural Statistics, various years.  
Reprinted from Griliches, *Econometrica* (1957)

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### Factors affecting diffusion (2)

- users need to develop technical skills, which increases the costs of adoption, and may induce localization effects (learning curves)
  - E.g., learning to use a new computer or software
- development of skills in manufacturing the innovation and associated capital goods innovation takes time
  - Machine tools for manufacture of bicycles; sewing machines

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### Factors affecting diffusion (3)

- complementarities between new technology and other inputs, requiring joint adoption or reorganization
  - Railroads needed telegraph/block signaling/air brakes, etc.
  - New IT in U.S. firms required re-organization of the workplace; flattened management structure (Brynjolfsson)

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## Factors affecting diffusion (4)

- competition from old technologies, which are improving at the same time
  - E.g., wooden sailing ships in 1850-90; gas lamps in late 19th Century
- uncertainty/inability to anticipate the uses to which a new technology can be put
  - Recall examples from invention (laser, radio)
- institutional environment
  - e.g., slow diffusion of Dutch flute, speedy vessel invented in 1600s, due to piracy

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## P. A. David on the dynamo

- Historical case of the electric dynamo as component of a general purpose technology – compared to present day computer diffusion
- Idea - need investment in complementary assets, such as the entire network, layout of factory, skills of workers, to take full advantage of the innovation

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## What is an electric dynamo?

- Now called an electric generator; converts mechanical energy to electrical using magnetism
  - 1832 - invented by Michael Faraday (UK) and Joseph Henry (US) independently
  - 1879 - Edison and Swann invent electric lamp
  - 1892 - first AC generator (US)
  - 1899 - electric light in 3% of US homes; 5% of factories
  - 1902 - five-megawatt turbine for Fisk St. Station, Chicago
  - 1920 - diffused only to 50% level in over twenty years
  - 1922 - Connecticut Valley Power Exchange (CONVEX) starts, pioneering interconnection between utilities

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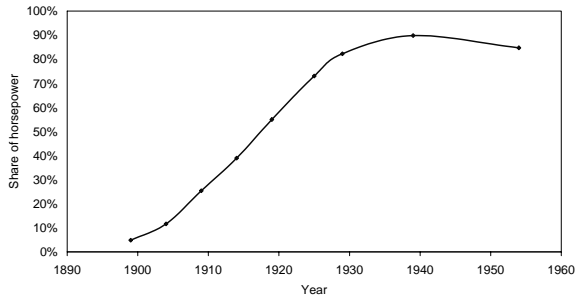
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## Diffusion of electric motors in the United States




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## The dynamo and the computer

- Nodal elements of a distribution/transmission network
- Compatibility standards required - a web of complementary technical relationships
- Extended trajectory of improvements to the technology during diffusion
- Diffusion slowed by lack of skills and by difficulty of appropriating returns to investments in improvements of the necessary capital goods (less true for computers)
- Slow diffusion and productivity slowdown
  - in US/UK during 1890-1913 (dynamo diffusion)
  - in US during 1970-1995 (computer diffusion)

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## The dynamo and the computer

- Both usher in a new techno-economic paradigm and therefore lead to productivity improvements only slowly as networks are built and factories are restructured to take advantage of the new technology
- Work by Brynjolfsson and others suggests that in the case of computer technology, a new organizational structure within the firm was also necessary to achieve the productivity benefits

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## Productivity measurement

Aggregate production function with technical progress  
 $A(t)$  and two inputs, capital  $K(t)$  and labor  $L(t)$ :

$$Q(t) = A(t) F[K(t), L(t)]$$

$Q(t)$  is aggregate output (GDP) in year  $t$   
 $K(t)$  is a capital aggregate  
 $L(t)$  is measured in person-hours or number of workers.  
 $A(t)$  is the productivity level  
 usually grows over time - more output for a given level  
 of capital and labor

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## Productivity measurement

What is the growth of output as a  
 function of the growth of labor and  
 capital?

Differentiate output  $Q(t)$  with respect to time  
 $t$ . Use the chain rule.

$$\frac{dQ}{dt} = \frac{dA}{dt} F[K(t), L(t)] + A(t) \frac{dF[K(t), L(t)]}{dt}$$

$$\frac{dQ}{dt} = \frac{dA}{dt} \frac{Q(t)}{A(t)} + \frac{Q(t)}{F[K, L]} \left( \frac{dF(K, L)}{dK} \frac{dK}{dt} + \frac{dF[K, L]}{dL} \frac{dL}{dt} \right)$$

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## Productivity measurement

Express this in terms of growth rates:  
 Divide by  $Q(t)$ . Multiply the second  
 term by  $K/K=1$  and the third term by  
 $L/L=1$ .

$$\frac{1}{Q} \frac{dQ}{dt} = \frac{dA}{dt} \frac{1}{A(t)} + \frac{K(t)}{F[K, L]} \frac{dF(K, L)}{dK} \frac{1}{K(t)} \frac{dK}{dt} + \frac{L(t)}{F[K, L]} \frac{dF[K, L]}{dL} \frac{1}{L(t)} \frac{dL}{dt}$$

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## Digression: Logs and Growth Rates

The growth of X over a discrete interval of time (from 0 to 1) is equal to

$$\frac{X(1)-X(0)}{X(0)} = \frac{1}{X(0)} \frac{X(1)-X(0)}{(1-0)} = \frac{1}{X} \frac{\Delta X}{\Delta t}$$

As the interval of time becomes smaller and smaller, we can write this as a growth rate:

$$\frac{1}{X} \frac{\Delta X}{\Delta t} \rightarrow \frac{1}{X} \frac{dX}{dt} = \frac{d \log X}{dt}$$

Conclusion: the growth rate of a variable is approximately equal to its logarithmic derivative.

$$g_X = \frac{d \log X}{dt} = \frac{dX / dt}{X} = \frac{\dot{X}}{X}$$

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## Productivity measurement

Substituting growth rates  $G$  for the logarithmic derivatives:

$$G_O = G_A + \frac{K(t)}{F[K,L]} \frac{dF(K,L)}{dK} G_K + \frac{L(t)}{F[K,L]} \frac{dF[K,L]}{dL} G_L$$

The quantities multiplying  $G_K$  and  $G_L$  are elasticities of output with respect to the two inputs, denoted by  $\epsilon$ :

$$G_O = G_A + \epsilon_K G_K + \epsilon_L G_L$$

Therefore output growth can be expressed as the sum of productivity growth (technical change) and the growth of inputs, weighted by their elasticities in the production function.

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## Digression: elasticities

The elasticity  $\epsilon$  of Y with respect to X is defined by

$$\epsilon_X = \frac{d \log Y}{d \log X} = \frac{X}{Y} \frac{dY}{dX} = \frac{dY/Y}{dX/X}$$

It is equal to the percent increase in Y associated with a percent increase in X, holding all other variables constant.

For example,  $\epsilon_K$  describes how output increases when capital increases, holding labor input and technical change constant.

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## Growth accounting example

Aggregate US Data 1900-1949 (Solow, using CRS assumption to identify elasticities with shares):

$$G_A = G_Q - \varepsilon_K G_K - \varepsilon_L G_L$$

$$= 2.75\% - (.35) 1.75\% - (.65) 1.00\%$$

$$= 2.75\% - 0.61\% - 0.65\%$$

$$= 1.49\%$$

Implication: slightly more than half of output growth is not explained by growth in capital and labor inputs. This quantity ( $G_A$ ) is often called the "residual" or "total factor productivity growth."

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## Growth Accounting 1960-2001

Period	Growth rate of GDP	Growth due to			Growth rate of GDP/worker
		Capital	Labor	TFP (A)	
1960-1970	4.0	0.8	1.2	1.9	2.2
1970-1980	2.7	0.9	1.5	0.2	0.4
1980-1990	3.5	1.5	1.3	0.6	1.7
1989-1995	2.5	1.2	1.0	0.3	1.5
1995-2001	4.2	2.1	1.1	1.0	2.7

Source: Jorgenson (2004)

1980-2001: Capital contribution split between IT and non-IT:

- 0.5 to 1.0 from IT capital
- 1.1 from non-IT capital

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## Productivity measurement

Diffusion of major new systems associated with

- Unmeasured quality improvement from new commodities
- Bias toward expanding goods and services not well captured by national income accounts (e.g. lighting; transportation; faster service)
- Disembodied changes in the organization of production (e.g., continuous shift work; reduced middle management)

□ Some *but not all* of this ends up in TFP

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