

# The Past and Future of Economic Growth: A Semi-Endogenous Perspective

**Chad Jones** 

NBER Innovation Bootcamp July 18, 2022

#### **Outline: The Past and Future of Economic Growth**

- A simple semi-endogenous growth model
- Historical growth accounting
- Why future growth could slowdown
- Why future growth might not slow and could speed up

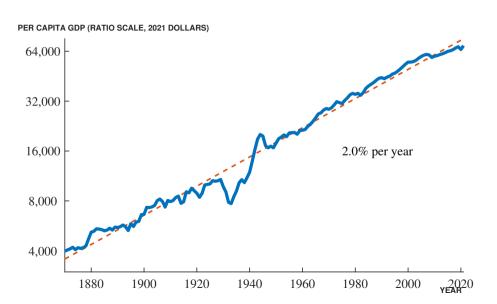
#### **Literature Review**

- Early Semi-Endogenous Growth Models
  - Arrow (1962), Phelps (1966), Nordhaus (1969), Judd (1985)
  - Jones (1995), Kortum (1997), Segerstrom (1998)
- Broader Literature: Models with IRS are SEG models!
  - Trade models: Krugman (1979), Eaton-Kortum (2002), Ramondo et al (2016)
  - Firm dynamics: Melitz (2003), Atkeson-Burstein (2019), Peters-Walsh (2021)
  - Sectoral heterogeneity: Ngai-Samaniego ('11), Bloom etc ('20), Sampson ('20)
  - Technology diffusion: Klenow-Rodriguez (2005), Buera-Oberfield (2020)
  - Economic geography: Redding-RossiHansberg (2017)



# A Simple Model of Semi-Endogenous Growth

#### **U.S. GDP per Person**



#### The "Infinite Usability" of Ideas (Paul Romer, 1990)

- Objects: Almost everything in the world
  - Examples: iphones, airplane seats, and surgeons
  - Rival: If I'm using it, you cannot at the same time
  - The fundamental scarcity at the heart of most economics
- Ideas: They are different nonrival = infinitely useable
  - Can be used by any number of people simultaneously
  - Examples: calculus, HTML, chemical formula of new drug

#### The Essence of Romer's Insight

Question: In generalizing from the neoclassical model to incorporate ideas (A), why
do we write the PF as

$$Y = AK^{\alpha}L^{1-\alpha} \tag{*}$$

instead of

$$Y = A^{\alpha} K^{\beta} L^{1-\alpha-\beta}$$

- Does A go inside the CRS or outside?
  - The "default" (\*) is sometimes used, e.g. 1960s
  - 1980s: Griliches et al. put knowledge capital inside CRS

#### The Nonrivalry of Ideas ⇒ Increasing Returns

• Familiar notation, but now let  $A_t$  denote the "stock of knowledge" or ideas:

$$Y_t = F(K_t, L_t, A_t) = A_t K_t^{\alpha} L_t^{1-\alpha}$$

Constant returns to scale in K and L holding knowledge fixed. Why?

$$F(\lambda K, \lambda L, A) = \lambda \times F(K, L, A)$$

But therefore increasing returns in K, L, and A together!

$$F(\lambda K, \lambda L, \lambda A) > F(\lambda K, \lambda L, A)$$

- $\circ$  Replication argument + Nonrivalry  $\Rightarrow$  CRS to objects
- Therefore there must be IRS to objects and ideas

Final good

$$Y_t = A_t^{\sigma} L_{yt}$$

Ideas

$$\dot{A}_t = R_t A_t^{\phi} \Rightarrow \frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta}$$

Resource constraint  $R_t + L_{yt} = L_t = L_0 e^{nt}$ 

Allocation

$$R_t = \bar{s}L_t, \quad 0 < \bar{s} < 1$$

 $\phi$  captures knowledge spillovers.

$$\beta \equiv 1 - \phi > 0$$

$$Y_t = A_t^{\sigma} L_{yt}$$

$$y_t \equiv \frac{Y_t}{I_t} = A_t^{\sigma} (1 - \bar{s})$$

Ideas

$$\dot{A}_t = R_t A_t^{\phi} \Rightarrow \frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta}$$

Resource constraint  $R_t + L_{yt} = L_t = L_0 e^{nt}$ 

Allocation

$$R_t = \bar{s}L_t, \quad 0 < \bar{s} < 1$$

 $\phi$  captures knowledge spillovers.

$$\beta \equiv 1 - \phi > 0$$

Final good

$$Y_t = A_t^{\sigma} L_{yt}$$

$$y_t \equiv \frac{Y_t}{L_t} = A_t^{\sigma} (1 - \bar{s})$$

Ideas

$$\dot{A}_t = R_t A_t^{\phi} \Rightarrow \frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta}$$

On BGP,  $\dot{A}/A = \text{Constant} \Rightarrow$ 

Resource constraint 
$$R_t + L_{yt} = L_t = L_0 e^{nt}$$

 $A_t^* = \text{Constant} \cdot R_t^{\frac{1}{\beta}}$ 

Allocation

$$R_t = \bar{s}L_t, \quad 0 < \bar{s} < 1$$

 $\phi$  captures knowledge spillovers.

$$\beta \equiv 1-\phi>0$$

Final good

$$Y_t = A_t^{\sigma} L_{yt}$$

Ideas

$$\dot{A}_t = R_t A_t^{\phi} \Rightarrow \frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta}$$

Resource constraint 
$$R_t + L_{yt} = L_t = L_0 e^{nt}$$

Allocation

$$R_t = \bar{s}L_t, \quad 0 < \bar{s} < 1$$

 $\phi$  captures knowledge spillovers.

$$\beta \equiv 1 - \phi > 0$$

$$y_t \equiv \frac{Y_t}{L_t} = A_t^{\sigma} (1 - \bar{s})$$

On BGP,  $\dot{A}/A = \text{Constant} \Rightarrow$ 

$$A_t^* = \operatorname{Constant} \cdot R_t^{\frac{1}{\beta}}$$

Combine these two equations...

#### **Steady State of the Simple Model**

• Level of income on the BGP (where  $\gamma \equiv \frac{\sigma}{\beta}$ )

$$y_t^* = \operatorname{Constant} \cdot R_t^{\gamma}$$

⇒ BGP growth rate:

$$g_y = \frac{\sigma n}{\beta} = \gamma n$$

#### What's the difference between these two equations?

Romer 
$$y_t = A_t^\sigma$$
  
Solow  $y_t = k_t^lpha$ 

Hint: It's not the exponent:  $\sigma=\alpha=1/3$  is possible

#### What's the difference between these two equations?

Romer 
$$y_t = A_t^\sigma$$
  
Solow  $y_t = k_t^lpha$ 

Hint: It's not the exponent:  $\sigma = \alpha = 1/3$  is possible

 $A_t$  is an aggregate, while  $k_t$  is per capita But easy to make aggregates grow: population growth!

#### Or put in words...

 Objects: Add 1 computer ⇒ make 1 worker more productive; for a million workers, need 1 million computers

Output per worker  $\sim$  # of computers per worker

- Ideas: Add 1 new idea ⇒ make unlimited # more productive or better off.
  - E.g. cure for lung cancer, drought-resistant seeds, spreadsheet

Income per person  $\sim$  the aggregate stock of knowledge, not on the number of ideas per person.

But it is easy to make aggregates grow: population growth!  $IRS \Rightarrow bigger is better.$ 

Where does growth ultimately come from?

More people  $\Rightarrow$  more ideas  $\Rightarrow$  higher income / person

That's IRS associated with the nonrivalry of ideas

#### **Evidence for Semi-Endogenous Growth (Bloom et al 2020)**

Where do ideas come from?

$$\frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta}$$

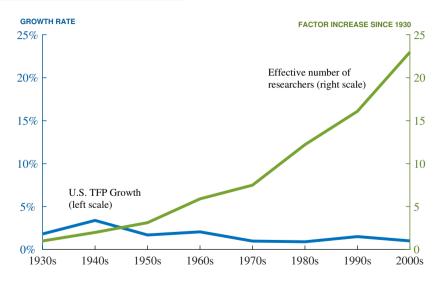
 $eta > 0 \Rightarrow$  ideas are getting harder to find (more accurately: TFP growth gets harder to achieve)

#### Red Queen Interpretation of SEG:

Maintaining constant TFP growth requires exponential growth in research effort

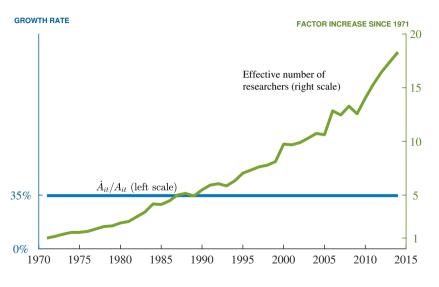
You run faster and faster just to maintain 2% growth

#### **Evidence: Aggregate U.S. Economy**



Bloom, Jones, Van Reenen, and Webb (2020)

#### **Evidence: Moore's Law**



Bloom, Jones, Van Reenen, and Webb (2020)

#### **Transition Dynamics in the Simple Model**

• How many years does it take for growth to move half-way to steady state?

$$t_{1/2}^* = \frac{1}{\beta g_A^*} \ln \left( \frac{g_{A0} + g_A^*}{g_{A0}} \right)$$

$\beta$	$g_{A0} = 2\%$	$g_{A0}=4\%$
0.2	203	112
1	41	22
3	14	7
5	8	4

Assumes  $g_A^* = 1\%$ 

• Potentially long transitions...

#### Breakthrough Patents from Kelly, Papanikolaou, Seru, Taddy (2021)





### **Historical Growth Accounting**

In LR, all growth from population growth. But historically...?

#### **Extended Model**

Include physical capital K, human capital per person h, and misallocation M

$$Y_t = K_t^{\alpha} (Z_t h_t L_{Yt})^{1-\alpha}$$

$$Z_t \equiv A_t M_t$$

$$A_t^* = R_t^{\gamma} = (s_t L_t)^{\gamma}$$

Write in terms of output per person and rearrange:

$$y_t = \left(\frac{K_t}{Y_t}\right)^{\frac{\alpha}{1-\alpha}} A_t M_t h_t \ell_t (1-s_t)$$

In LR, all growth from population growth. But historically...?

#### **Growth Accounting Equations**

$$\frac{d \log y_t}{\text{GDP per person}} = \underbrace{\frac{\alpha}{1-\alpha} d \log \frac{K_t}{Y_t}}_{\text{Capital-Output ratio}} + \underbrace{\frac{d \log h_t}{\text{Educational att. Emp-Pop ratio}}}_{\text{Educational att. Emp-Pop ratio}} + \underbrace{\frac{d \log \ell_t}{\text{Goods intensity}}}_{\text{TFP growth}}$$

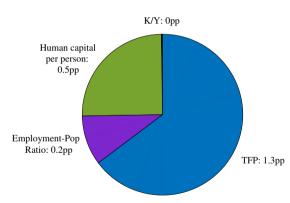
where

$$\text{TFP growth} \equiv \underbrace{d \log M_t}_{\text{Misallocation}} + \underbrace{d \log A_t}_{\text{Ideas}} = \underbrace{d \log M_t}_{\text{Misallocation}} + \underbrace{\gamma d \log s_t}_{\text{Research intensity}} + \underbrace{\gamma d \log L_t}_{\text{LF growth}}$$

All terms are zero in the long run, other than  $\gamma n$ . Assume  $\gamma = 1/3$ 

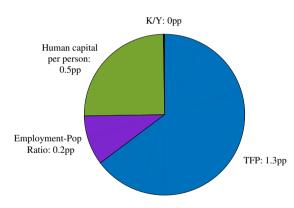
#### Historical Growth Accounting in the U.S., 1950s to Today

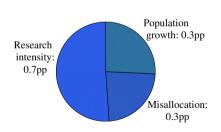
# Components of 2% Growth in GDP per Person



#### Historical Growth Accounting in the U.S., 1950s to Today

## Components of 2% Growth in GDP per Person





Components of 1.3% TFP Growth

#### **Summary of Growth Accounting**

- Even in a semi-endogenous growth framework where all LR growth is  $\gamma n$ ,
  - Other factors explain more than 80% of historical growth
- Transitory factors have been very important, but all must end:
  - rising educational attainment
  - rising LF participation
  - declining misallocation
  - increasing research intensity
- Implication: Unless something changes, growth must slow down!
  - $\circ~$  The long-run growth rate is  $\approx$  0.3%, not 2%

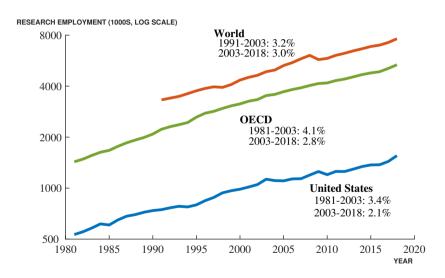


Why Future Growth might be Slower

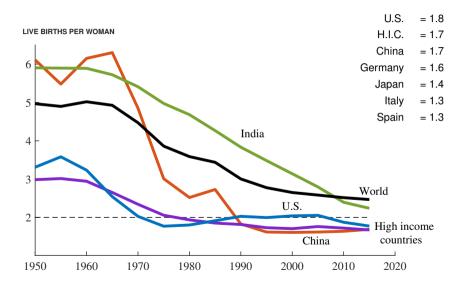
#### Why Future Growth might be Slower

- Growth accounting exercise just presented:  $\gamma n \approx 0.3\%$
- Slowdown in the growth rate of research
- Slowing population growth

#### Research Employment in the U.S., OECD, and World



#### The Total Fertility Rate (Live Births per Woman)



#### What happens if future population growth is negative?

- Suppose population *declines* exponentially at rate  $\eta$ :  $R_t = R_0 e^{-\eta t}$
- Production of ideas

$$\frac{\dot{A}_t}{A_t} = R_t A_t^{-\beta} = R_0 A_t^{-\beta} e^{-\eta t}$$

• Integrating reveals that *A*<sup>t</sup> asymptotes to a constant!

$$A^* = \begin{cases} A_0 \left( 1 + \frac{\beta g_{A0}}{\eta} \right)^{1/\beta} & \text{if } \beta > 0 \\ A_0 \exp\left( \frac{g_{A0}}{\eta} \right) & \text{if } \beta = 0 \end{cases}$$

#### **The Empty Planet Result**

- Fertility has trended down: 5, 4, 3, 2, and less in rich countries
  - For a family, nothing special about "above 2" vs "below 2"
  - But macroeconomics makes this distinction critical!
- Standard result shown earlier:  $n > 0 \Rightarrow$  **Expanding Cosmos** 
  - Exponential growth in income and population
- Negative population growth ⇒ much more pessimistic Empty Planet
  - Stagnating living standards for a population that vanishes
  - Could this be our future?



### Why Future Growth might be Faster?

(Or at least not as slow as the preceding section implies!)

- 1. Finding Lost Einsteins
- 2. Automation and artificial intelligence

#### **Finding Lost Einsteins**

- How many Edisons and Doudnas have we missed out on historically?
  - The rise of China, India, and other emerging countries
    - China and India each have as many people as U.S.+Europe+Japan
  - Brouillette (2021): Only 3% of inventors were women in 1976; only 12% in 2016
  - Bell et al (2019): Poor people missing opportunities
- Increase global research by a factor of 3 or 7?
  - $\circ$  For  $\gamma=1/3$ : Increase incomes by  $3^{\gamma}-1=40\%$  and  $7^{\gamma}-1=90\%$
  - Could easily raise growth by 0.2pp to 0.4pp for a century

#### Automation and A.I.

• Suppose research involves many tasks  $X_i$  that can be done by people or by machines

$$\dot{A}_t = A_t^{1-\beta} X_1^{\alpha_1} X_2^{\alpha_2} \cdot \dots \cdot X_n^{\alpha_n}, \quad \sum \alpha_i = 1$$
$$= A_t^{1-\beta} K_t^{\alpha} R_t^{1-\alpha}$$

 $\alpha$  is the fraction of research tasks that have been automated

Long-run growth rate:

$$g_A = \frac{n}{\beta - \alpha}$$

- Rising automation could raise economic growth
  - Singularity if  $\alpha = \beta$  (or at least all possible ideas get discovered quickly)
  - Labs, computers, WWW: recent automation has not offset slowing growth



## Conclusion: Key Outstanding Questions

#### **Important Questions for Future Research**

- How large is the degree of IRS associated with ideas,  $\gamma$ ?
- What is the social rate of return to research?
  - Are we underinvesting in basic research?

- Better growth accounting: contributions from DARPA, NIH, migration of European scientists during WWII, migration more generally
- Automation ongoing for 150 years, but growth slowing not rising: why?