

The Direction of Innovation in the Long-Run

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Introduction

- Technology is a key driver of modern economic growth (Klenow and Rodríguez-Clare 1997, Clark and Feenstra 2003)
- Typically,
 - Solow residual.
 - Zoom in to particular technologies.
 - Some exceptions, e.g., CHAT dataset.
- Related to sweeping changes in the sectoral composition of the economy.

Plan for the Lecture

- Review some new and old stylized facts on innovation.
- Present a framework of multi-sectoral growth model of structural change where the direction of innovation is **endogenous**.
- Discuss how to simulate the resulting economy.

Structural Change & Future of Growth



Implications of these transformations for the future of growth?

Two Views on Structural Change

- 1. Nonohomtheticity in preferences.
- 2. Differential technological progress across sectors.

Two Views on Structural Change

- 1. Nonohomtheticity in preferences.
- 2. Differential technological progress across sectors.
 - Goal: Combine two views endogenizing innovation process.
 - Endogenous direction of innovation across sectors/directed technical change.
 - Use non-homothetic demand system consistent with Engel curves not asymptoting to 1 (homotheticity).
 - Result: Long-run trends proportional to income elasticity.



Key Elements of the Lecture

Document structural transformation in innovationUse long-run evidence from patents

 Document income elasticities of US industry outputs correlated with

- Rates of growth of patenting
- Rates of growth of R&D expenditure
- Construct multisector growth model with 1. Nonhomothetic CES demand Arbitrary unmber of sectors. 2. Intersectoral knowledge spillovers. 3. Endogenous sectoral productivity growth
- Show the equilibria asymptotically predict correlation between income elasticity and innovation growth

Related Lit.: Structural Change vs Biased Technical Change

- Modern literature on biased technical change: Autor et al. (1998); Acemoglu (1998, 2002, 2007)
 - Assume aggregate production function in aggregate factor inputs
 - Study response of factor-augmenting technology to shock in relative factor inputs?

However, in LR, factor supply endogenous?

- Our approach:
 - Assume empirically grounded heterogeneity in sectoral demand
 - Study LR heterogeneity in rates of innovation and growth

Related Literature II

- Endogeneous Structural Change
 - Homothetic Preferences: Herrendorf and Valentinyi (2016), Hori et al. (2016),
 - Non-homothetic Preferences: Boppart and Weiss (2015) Foellmi, Reto and Zweimuller (2014), Foellmi and Zweimuller (2008), Matsuyama (2002), 2018)

Determinants of Sectoral R&D and Innovation

- Macro: Ngai and Samaniego (2011), Klenow (1996),...
- ► IO: Schmookler (1966), Cohen and Levin (1989),...

Outline



4. Analytic Example.

Reduced form Evidence on Role of Income Elasticity

- Do more income elastic sectors have more innovation?
- Historical Data: Universe US Patents Berkes Mestieri 2017
- Last three decades: Two proxies for innovation
 - U.S. Patents \longrightarrow Universe 1978 2014.
 - R&D expenditure \longrightarrow U.S. Census Data + Compustat.
- For Income Elasticity
 - Structural Estimates using Nonhomothetic-CES.
 - Robust to Aguiar and Bils elasticities estimates from CEX.

Historical Evidence – Berkes Mestieri (2017)

- Digitize *all* US patents, 1836 to 2016, from three sources.
- Use algorithm to identify citations pre-1940 citations (as they are in text).
 - We also have each patent geo-localized (not today).
- We identify the leading technological classes in each year of the sample as the most represented class in the top 10% patents in terms of forward citations in that year.

Data Collection

- Digitalized and OCR'ed all patents issued by USPTO into text.
- Used redundant external sources as checks.
 - USPTO digitalized patents.
 - Google Patents (and Maps).
 - Local repositories (e.g. Wyoming Inventor's Database)
 - HistPat.

UNITED STATES PATENT OFFICE.

WM. F. GOODWIN, OF NEW YORK, N. Y.

IMPROVEMENT IN MOUNTING HAND-MORTARS.

Specification forming part of Letters Patent No. 46,101, dated January 31, 1965.

To all whom it may concern:

of the city, county, and State of New York, | red,) and the hammer is thrown down by the have invented a new and useful Improvement | usual spring, J, inclosed in the lock frame I, in Mortars; and I do hereby declare that the fast on one side of the sleeve B. A small holfollowing is a full, clear, and exact descrip- low cylinder, O, closed at its rear end, is fasttion thereof, which will enable others skilled | ened on the right-hand side of the lock-frame, in the art to make and use the same, reference being had to the accompanying drawings, form-tom throws a small bolt, c, outward against ing part of this specification, in which-

mortar constructed according to my invention. every pull of the chain on the trigger, the lat-Fig. 2 is a like section on a larger scale, a ter resting against the end of the bolt when part of the stake upon which the mortar is the hammer is cocked, as shown in that figin the other figures.

Similar letters of reference indicate like parts.

This invention consists, among other things, in mounting a mortar upon one end of a stake of wood or other suitable material, the other end of which is made pointed to enable one to insert it in the ground.

A is the mortar, formed with a powderchamber, K, in its bottom. A cone, d, rising from the bottom of the powder-chamber, communicates through a channel, e, with the nipple

B is a stout sleeve extending from the base of the mortar, to enable it to be attached to a stake, F, as shown in the drawings.

C is an elastic cushion, formed of rubber or equivalent material, placed at the bottom of the sleeve, so as to bear directly against the end of the stake. A slot, E, is made through the stake in that part covered by the sleeve, and it receives a pin, D, which passes through | tion, and for which I desire Letters Patent, and is secured in the sides of the sleeve, so that when the mortar is fired it may slide longitudinally upon the stake, and yet be prevented from becoming displaced or being torn from the stake. The opposite end of the stake | scribed, for the purpose of receiving the elastic is shod with a pointed metallic ferrule or shoe, G, to enable it to be placed in the ground with facility

H represents a lock, whose hammer-piece fis in outline the arc of a circle, and has a groove formed on its front side, which affords a path or channel for the passage upward of the gases which arise from the explosion of the cap, so that the lock shall not become injured

thereby. The trigger b and sere a are oper-Be it known that I, WILLIAM F. GOODWIN. ated by means of a cord or chain, (shown in the end of the trigger b, so as to restore the Figure 1 is a longitudinal axial section of a sere a to its place against the tumbler after mounted being broken away. Fig. 3 is a side ure. The bolt will be retained in the cylinview from the opposite side to that presented | der between the spring and trigger by their mutual pressure against it.

The mortar may be made of bronze or any other suitable material. The stake or other support upon which it is mounted is to be portable, so that the mortar can be easily transported and fixed in the ground, or otherwise temporarily but firmly secured in a suit able position and inclination for the proper and efficient use of the weapon after the usual manner of using mortars. The axis of the stake upon which the mortar is mounted is coincident with that of the mortar; or, if not made coincident, they are always to be in parallel planes.

I am aware of the Letters Patent No. 43,881, ranted August 16, 1864, to Ralph Graham, of Brooklyn, Kings county, New York, for a hand fire-arm adapted to projecting grenades or small bombs, and I do not claim the invention therein shown; but

What I do claim as new and of my invenis-

1. Constructing a mortar with a hollow sleeve projecting from its base, instead of trunnions or cheeks, substantially as above decushion, or any equivalent spring, and the end of a stake, as above set forth.

2. The combination of the slot E and pin D with the aforesaid mortar A, sleeve B, and spring C, as and for the purposes specified. WM. F. GOODWIN.

Witnesses:

M. M. LIVINGSTON, THEO, TUSCH.

Citations before 1947 and name.

pranes.

I am aware of the Letters Platent No. 43,881, granted August 16, 1864, to Ralph Granam, of Brooklyn, Kings county, New York, for hand fire-arm adapted to projecting grenades or small bombs, and I do not claim the invention therein shown; but

What I do claim as new and of my invention, and for which I desire Letters Patent, is-

1. Constructing a mortar with a hollow sleeve projecting from its base, instead of trunnions or checks, substantially as above described, for the purpose of receiving the elastic cushion, or any equivalent spring, and the end of a stake, as above set forth.

2. The combination of the slot E and pin D with the aforesaid mortar A, sleeve B, and spring C, as and for the purposes specified. WM. F. GOODWIN.

Witnesses:

M. M. LIVINGSTON,

THEO, TUSCH.

Names, location, dates.

UNITED STATES PATENT OFFICE.

SPENCER LEE FRASER AND WILLIAM A. BRIGHAM, OF TOLEDO, OHIO.

OYSTER-REFRIGERATOR.

SPECIFICATION forming part of Letters Patent No. 300,061, dated June 10, 1884.

Application filed October 12, 1883. (No model.)

To all whom it may concern: Beit known that we, SPENCER LEE FRASER and WILLIAM A. BRIGHAM, of Toledo, in the county of Lucas and State of Ohio, have invented certain new and useful Improvements

for the receptacle B. When access is desired to the receptacle for the removal of its contents, it is only necessary to remove the cover G, the ice in the box a being thus at all times covered and not exposed to the air at any

Reference list after 1947.

material in the openings in said second block is exposed.

LAYTON R. FETTEROLF.

25

REFERENCES CITED

The following references are of record in the file of this patent:

	UNITED STATES PATENTS					
30	Number	Name	Date			
	723,258	Felton	Mar. 24, 1903			
	819,900	Martin	May 8, 1906			
35	1,088,571	Heferman	Feb. 24, 1914			
	1,154,490	Davis	Sept. 21, 1915			
	1,504,326	Cullinan	Aug. 12, 1924			
	1,664,257	McCullough	Mar. 27, 1928			
	1,943,399	Smith	Jan. 16, 1934			
	1,968,626	Young	July 31, 1934			
40	1,982,526	Lussky	Nov. 27, 1934			
40	2,046,164	Herkner	June 30, 1936			
FOREIGN PATENTS						
	Number	Country	Date			
	18,134	Great Britain	1902			
45	431,884	Great Britain	July 17, 1935			

Leading Technology Classes

• Period 1830-1876:

- 1. Agriculture; Forestry; Animal Husbandry; Hunting; Trapping; Fishing
- 2. Heating; Ranges; Ventilating

• Period 1877-1958:

1. Engineering Elements or Units; General Measures for Producing and Maintaining Effective Functioning of Machines or Installations; Thermal Insulation in General

• Period 1959-1969:

- 1. Conveying; Packing; Storing Handling Thin or Filamentary Material
- 2. Organic Chemistry

Leading Technology Classes

• Period 1976-1983:

1. Measuring; Testing

• Period 1984-1995:

- 1. Medical or Veterinary Science; Hygiene
- Period 1996-Present:
 - 1. Computing; Calculating; Counting

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- 1. Medical or Veterinary Science; Hygiene
- Period 1996-Present:
 - 1. Computing; Calculating; Counting
- Consistent with a picture where demand for different items was very different in 1830 than now.
 - Market size of agricultural products has declined, while it has increased for computing...

Leading Patent Categories					
	Most cited Category in Top 10% Patents				
	Years	PC Class	Description		
	1836-1871	F24 A01	Heating; Ranges; Ventilating Agriculture; Forestry; Animal Husbandry; Hunting; Trapping; Fishing		
	1872-75	F16	Engineering Elements or Units; General Measures for Producing and Maintaining Effective Functioning of Machines or Installations; Thermal Insulation in General		
	1876	A01	Agriculture; Forestry; Animal Husbandry; Hunting; Trapping; Fishing		
	1877-1958	F16	Engineering Elements or Units; General Measures for Producing and Maintaining Effective Functioning of Machines or Installations; Thermal Insulation in General		
	1959–65	B65	Conveying; Packing; Storing Handling Thin or Filamentary Material		
	> 1966-67	C07	Organic Chemistry		
	1968–69	B65	Conveying; Packing; Storing Handling Thin or Filamentary Material		
—.	> 1970-75	C07	Organic Chemistry		
	1976–83	G01	Measuring; Testing		
→	1984–95	A61	Medical or Veterinary Science; Hygiene		
	1996-present	G06	Computing; Calculating; Counting		

Eigenvector Centrality

• Use citations across different patent classes.



- Assign each patent category to
 - 1. Agricultur
 - 2. Manufacturing
 - 3. Services
- Plot evolution normalizing initial level to 1.







Sectoral Share of Innovation (over the 5-years period)

	Min (Year)	Average	Max (Year)
Agriculture	0.7% (2015)	4.5%	11% (1835)
≽ Industry	89% (1840, 2015)	94.1%	98% 1945
Services	<0.1% (<1950)	1.4%	10% (2015)

Reduced form Evidence on Role of Income Elasticity II

• Run the following type of regression

$$y_{it} = \alpha + \beta \varepsilon_i + \delta_t + \delta_l + \nu_{it},$$

where

- y_{it} is growth in R&D and patents in sector i,
- δ_t is time fixed effect,
- δ_l broad sector FE (SIC 1 for R&D), (NAICS 1 patents).

Reduced form Evidence on Role of Income Elasticity II

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where

- y_{it} is growth in R&D and patents in sector i,
- δ_t is time fixed effect,
- δ_l broad sector FE (SIC 1 for R&D), (NAICS 1 patents).
- Median growth of patents in the sample: 0.024
- P90 growth 12%, P10 -13%
- Median income elasticity in the sample: 1.05
- P90 income elasticity 1.3, P10, 0.88

Results for Patents

Yearly Patent Growth_{it} =
$$\alpha + \beta \epsilon_i + \delta_t + \delta_{NAICS1} + \nu_{it}$$

1974 - 2010

-		R	Raw Citations			Weighted Citations		
		(1)	(2)	(3)	(4)	(5)	(6)	
-	Elasticity	0.024	.024***	.016***	.025	.025***	.016***	
		(.020)	(.007)	(.007)	(.021)	(.006)	(800.)	
	Year FE	No	Yes	Yes	No	Yes	Yes	
->	Ind. FE	No	No	Yes	No	No	Yes	
_	R^2	.0004	.91	.91	.0005	.90	.90	

Obs. 3002, s.e.: robust, clustered at year and NAICS 1, respectively.

Results for R&D Expenditure – Census of Manufacturers $\frac{+\delta_{SIC1} + \nu_{it}, +\delta_{Sh}, Colleg_{i}}{+s(aprth) have}.$ Yearly R&D Growth_{it} = $\alpha + \beta \varepsilon_i$ (1)(2)(3) +... .136*** 496*** 0.001 Elasticity (.069)(.06)127 Year FE No Yes Yes Broad Ind. FE No No Yes .004 .349 R-squared .257

Number obs. is 1120. Robust standard errors in parenthesis. Weighted regression by number of obs. by industry.

• Also holds for Compustat sample (actually looks better).



Theory

Static Core of the Theory

• Demand for *i* vs. *j* goods:



Static Core of the Theory

• Demand for *i* vs. *j* goods:

\$

$$\frac{Y_i}{Y_j} = \frac{C_i}{C_j} = \mathcal{D}\left(\frac{P_i}{P_j}; \ C_{tot}\right).$$

• Relative prices given by the state of technology

$$\boxed{\frac{P_i}{P_j}} = \mathcal{T} \left(\underbrace{N_i}_{N_j} \right).$$

Static Core of the Theory



$$\frac{Y_i}{Y_j} = \frac{C_i}{C_j} = \mathcal{D}\left(\frac{P_i}{P_j} C_{tot}\right).$$

Relative prices given by the state of technology

$$\frac{P_i}{P_j} = \mathcal{T}\left(\frac{N_i}{N_j}\right)$$

- Equilibrium technology N (C_{tot}), determined by trade-off b/w
 Relative sectoral profits Π_i ⊂ C_i
 Relative costs of technological innovation η_i/η_j.
Nonhomothetic CES Preferences mcome elest # 1 ^ Price flashcity. Preferences

Define consumption aggregator C(t) over goods $\{C_i\}_{i=1}^{I}$ as

$$\mathbf{C} \cdot \sum_{i=1}^{l} \left(\frac{C_i(t)}{C^{\epsilon_i}(t)} \right)^{\frac{\sigma-1}{\sigma}} = 1; \mathbf{C}$$

with $\sigma \geq 0$, and $\epsilon_i \geq 0$.

• Multilplying by C,

$$\mathbf{\Gamma} = \sum_{i=1}^{l} \underbrace{\mathbf{C}}_{\text{Weight}(C,\epsilon_i)} \mathbf{C}_{i}^{\frac{\sigma-1}{\sigma}},$$

• $\epsilon_i = 1$ recovers standard homothetic CES.

Nonhomothetic CES Preferences Demand

- Maximize C defined by nonhomothetic CES.
- Vector of sectoral prices $\mathbf{P} = \{P_i\}_{i=1}^{I}$, total expenditure E.

 $\begin{array}{ccc} \min \sum P_i C_i & s.t \\ C_i & i \end{array} \xrightarrow{\sum_{i=1}^{n}} \left(\frac{C_i}{C^{e_i}} \right)^{\frac{n-1}{2}} = 1 \quad \leftarrow \quad \\ \sum F_i C_i \quad \leftarrow \quad \\ \sum F_i C_i \quad \leftarrow \quad \\ \end{array}$

Comin, Lashkani & Mestion Structural Change with Long-run...

Nonhomothetic CES Preferences Demand

1

- Maximize C defined by nonhomothetic CES.
- Vector of sectoral prices $\mathbf{P} = \{P_i\}_{i=1}^{I}$, total expenditure E.
- Demand given by $\underbrace{C_i}_{C} = \underbrace{\left(\frac{P_i}{P}\right)^{-\sigma}}_{C} \underbrace{C^{(1-\sigma)(\epsilon_i-1)}}_{FO},$ where the price index is given by Non-Hornorh.

$$P = P(C; \mathbf{P}) = \left(\sum_{i} \left(\sum_{i=1}^{e_{i}-1} P_{i}\right)^{1-\sigma}\right)^{\frac{1}{1-\sigma}},$$

and $E = P \cdot C.$
$$P \in C.$$

$$P \in C.$$

Model of Multi-sector Endogenous Growth

- Preferences: _ Unitary Household
 Intertemporal preferences:

Total Utility =
$$\int_0^\infty e^{-\rho t} \frac{\mathcal{C}(t)^{1-\theta} - 1}{1-\theta} dt$$
,

• C(t): nonhomothetic CES aggregator with $(\sigma; \{\epsilon_i\}_{i=1}^{l})$.

Model of Multi-sector Endogenous Growth

- Preferences:
 - Intertemporal preferences:

$$\int_0^\infty e^{-\rho t} \frac{C(t)^{1-\theta}-1}{1-\theta} dt$$

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- Romer-model with multi-sector production:
 - Production: competitive sectoral producers combine sectoral intermediate goods.
 - ▶ Innovation: sectoral R&D firms employing $Z_i(t)$ in sector *i*.

Model of Multi-sector Endogenous Growth

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- Romer-model with multi-sector production:
 - Production: competitive sectoral producers combine sectoral intermediate goods.
 - ▶ Innovation: sectoral R&D firms employing $Z_i(t)$ in sector *i*.
- Labor the single factor of production:

$$H = \underbrace{Z(t)}_{\text{R\&D workers}} + \underbrace{L(t)}_{\text{Production workers}}$$

Production

• Competitive producers of sectoral goods:

$$(\int_{0}^{N_{i}} X_{iv}(t) \overset{\zeta}{=} dv)^{\frac{\zeta+1}{\zeta}}$$

• Monopolist producers of sectoral intermediate inputs:

$$X_{iv}(t) = \psi_{iv}(t),$$

• Constant marginal cost normalized $\psi = \frac{\zeta}{1+\zeta}$

Production

Dema

• Competitive producers of sectoral goods:

$$Y_{i}(t) = \left(\int_{0}^{N_{i}} X_{iv}(t)^{\frac{\zeta}{\zeta+1}} dv\right)^{\frac{\zeta+1}{\zeta}}$$

• Monopolist producers of sectoral intermediate inputs:

Market Size and Profits of Monopolists



• Relative profits of monopolists in two sectors *i* and *j*:

$$\begin{array}{ccc}
\overleftarrow{\boldsymbol{k}} & \overleftarrow{\boldsymbol{\gamma}} \\
\overleftarrow{\boldsymbol{\gamma}} & \overleftarrow{\boldsymbol{\gamma}} & \overleftarrow{\boldsymbol{\Pi}}_{j\nu'}(t) \\
\overleftarrow{\boldsymbol{\gamma}} & \overleftarrow{\boldsymbol{\gamma}} & \overleftarrow{\boldsymbol{\Pi}}_{j\nu'}(t) \\
\end{array} = \underbrace{\left(\frac{N_j(t)}{N_i(t)}\right)^{1+\frac{1-\sigma}{\zeta}}}_{\text{Technology effect}} \underbrace{C(t)^{(1-\sigma)(\epsilon_i-\epsilon_j)}}_{\text{Income effect}},$$

Innovation and Technology Push

×

• R&D firms in sector *i* hire $Z_i(t)$ workers to create new intermediate good varieties.

$$\frac{dN_{i}}{dt} = \dot{N}_{i}(t) = \left(\frac{1}{\eta_{i}}\right)S_{i}(t) \cdot Z_{i}(t)$$

• $S_i(t)$: Relevant knowledge sector *i* from past innovations

$$S_i(t) = S_i(N_1(t), \cdots, N_I(t))$$

Determines costs of innovation in sector i

Assumptions on Innovation Technology

$$\dot{N}_{i}(t) = rac{1}{\eta_{i}}S_{i}\left(\mathbf{N}\left(t
ight)\right)Z_{i}\left(t
ight),$$

• $\partial S_i / \partial N_j \ge 0$ for all *i* and *j*.

- Each S_i is homogenous of degree 1 in its arguments
- The following limit exists and satisfies

$$\lim_{\mathbf{N}_i\to\infty}\frac{S_i\left(\mathbf{N}\right)}{N_i}>0,$$

• The matrix $[\Sigma_{ij}] \equiv \left[\frac{\partial \log S_i}{\partial \log N_j}\right]_{ij}$ is positive definite.

I

Example of S_i

Nested CES

$$S_{i}(\mathbf{N}) \equiv \frac{1}{\eta_{i}} \left[\delta_{i}^{1-\psi_{i}} N_{i}^{\psi_{i}} + (1-\delta_{i})^{1-\psi_{i}} \underbrace{\tilde{S}_{i}(\mathbf{N})^{\psi_{i}}}_{\tilde{S}_{i}} \right]^{\frac{1}{\psi_{i}}},$$

$$\tilde{S}_{i}(\mathbf{N}) \equiv \left(\sum_{j \neq i} \vartheta_{ij}^{1-\varsigma_{i}} N_{j}^{\varsigma_{i}} \right)^{\frac{1}{\varsigma_{i}}},$$

 $\tilde{S}(t)$: an economy-wide, general purpose stock of knowledge

R&D Market Free Entry Condition

• $V_i(t)$: value of owning intermediate input firm in sector *i*:

$$R(t) V_i(t) - \dot{V}_i(t) = \Pi_i(t)$$

• Free entry condition:

wage = 1 =
$$\underbrace{\frac{S_{i}(t)}{\eta_{i}}}_{innovative productivity of labor} \times V_{i}(t)$$

innovative productivity of labor

Rewrite as:

$$\underbrace{N_{i}(t) V_{i}(t)}_{\text{total assets in }i} = \underbrace{\eta_{i} \frac{N_{i}(t)}{S_{i}(t)}}_{\text{cost of growth }i} = \frac{Z_{i}(t)}{\dot{N}_{i}(t) / N_{i}(t)}$$

R&D Market Free Entry Condition

• V_i(t): value of owning intermediate input firm in sector i:

$$R(t) V_{i}(t) - \dot{V}_{i}(t) = \Pi_{i}(t)$$

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• Rewrite as:
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• Define Sectoral Share of Total Corporate Assets:

$$\Lambda_{i}(t) \equiv \frac{N_{i}(t) V_{i}(t)}{\sum_{j} N_{j}(t) V_{j}(t)}$$

Market Equilibrium

Definition

An allocation $(C, \Omega, N, S, Z, L, \Pi, V)_{t \ge 0}$ is a market equilibrium if there exists time paths of prices $(R, P, \mathbf{P})_{t>0}$ such that prices and technologies satisfy $P_i(t) = N_i(t)^{1/\zeta}$, aggregate price index and aggregate consumption satisfy eqs. on slide 10, (3) sectoral shares of consumption expenditure $\Omega_{i}(t) \equiv P_{i}(t) C_{i}(t) / E(t)$ satisfy $\Omega_{i}(t) = \Xi_{i} \left(\frac{P_{i}(t)}{P(t)}\right)^{1-\sigma} C(t)^{(1-\sigma)(\epsilon_{i}-1)} = \frac{L_{i}(t)}{L(t)}$, (4) total consumption expenditure satisfies $E(t) = P(t) C(t) = (1 + \zeta) L(t) / \zeta H$, (5) corporate profits and (6) value of company stocks satisfy evolution eqns in slide 17, (7) sectoral spillovers satisfy assumptions in slide 14 (8) and labor markets clear, (H = L(t) + Z(t), etc.).

Dynamics of the Direction of Innovation*

- Given state of technology at time t:
 - $\Omega_i(t)$: Production (consumption) shares given from demand
 - $\Lambda_i(t)$: Corporate asset shares given from costs of innovation
- Technological growth tech demand shares $\begin{pmatrix} N_{I} \\ \vdots \\ N_{L} \end{pmatrix} = \hat{n} = \Sigma^{-1} \left(\frac{L}{\zeta} \left(\frac{\Omega}{\Lambda} \right) - r1 \right).$ • Closed form solution in the example.

Dynamics of the Direction of Innovation*

- Given state of technology at time *t*:
 - $\Omega_i(t)$: Production (consumption) shares given from demand
 - $\Lambda_i(t)$: Corporate asset shares given from costs of innovation
- Technological growth

$$\dot{\mathbf{n}} = \mathbf{\Sigma}^{-1} \left(\frac{L}{\zeta} \left(\frac{\mathbf{\Omega}}{\mathbf{\Lambda}} \right) - r \mathbf{1}
ight).$$

• Closed form solution in the example.

$$\frac{\dot{N}_{i}(t)}{N_{i}(t)} = \gamma(t) + \frac{1+\zeta}{\zeta^{2}\delta} \left(\frac{\Omega_{i}(t)}{\Lambda_{i}(t)}\right) \frac{L(t)}{H},$$

where $\gamma(t)$ an economy-wide index of growth:

$$\gamma(t) \equiv \frac{Z(t) - \frac{1+\zeta}{\zeta^2 \delta} L(t)}{H}$$

Equilibrium Dynamics*

- Allocations fully characterized through aggregate consumption C(t) and state of technology $\mathbf{N}(t) = (N_1(t), \cdots, N_l(t))$
 - Economy starts from initial technological state $\mathbf{N}(0) = (N_1(0), \cdots, N_l(0))$
 - Equilibrium path fully characterized with the choice of initial level of consumption C (0)
- Evolution of the economy:

$$\begin{array}{ll} \displaystyle \frac{\dot{C}\left(t\right)}{C\left(t\right)} & = & \mathcal{F}\left(C\left(t\right), \mathbf{N}\left(t\right)\right), \\ \displaystyle \frac{\dot{N}_{i}\left(t\right)}{N_{i}\left(t\right)} & = & \mathcal{G}_{i}\left(C\left(t\right), \mathbf{N}\left(t\right)\right), \end{array} \quad \text{for } 1 \leq i \leq l, \end{array}$$

Constant Growth Path and Structural Change

- Equilibrium such that aggregate consumption C(t) and sectoral technologies asymptotically grow at constant rates.
- There exist values $(g_C^*, g_{N_1}^*, \cdots, g_{N_i}^*)$ such that: $\int_{t \to \infty} \frac{d}{dt} \log C(t) = g^*,$ $\lim_{t \to \infty} \frac{d}{dt} \log N_i(t) = \gamma_i g^*, \quad \text{for } 1 \le i \le I.$

Constant Growth Path and Structural Change

- Equilibrium such that aggregate consumption C(t) and sectoral technologies asymptotically grow at constant rates.
- There exist values $\left(g_{\mathcal{C}}^{*},g_{\mathcal{N}_{1}}^{*},\cdots,g_{\mathcal{N}_{l}}^{*}\right)$ such that:

$$\lim_{t \to \infty} \frac{d}{dt} \log C(t) = g^*,$$
$$\lim_{t \to \infty} \frac{d}{dt} \log N_i(t) = \gamma_i g^*, \quad \text{for } 1 \le i \le I.$$

• Sectoral consumption expenditure (also employment) and total production employment converges to a constant,

$$\lim_{t \to \infty} \Omega_i(t) = \Omega_i^*,$$
$$\lim_{t \to \infty} L(t) = L^* > 0.$$
Value of assets converges to $\Lambda_i^* = \eta_i \delta_i^{\frac{\psi_i - 1}{\psi_i}}$ in the example.

Characterization for $0 < \sigma < 1$

Sectoral Innovation Growth

• The asymptotic growth rates in \mathcal{I}^\ast is



Sketch of Proof

Consistent with the "reduced" form regressions.

Characterization for $0 < \sigma < 1$

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Sketch of Proof

- Consistent with the "reduced" form regressions.
- Sectoral Innovation Growth near CGP with example spillovers

 $\gamma_i = \xi \epsilon_i.$

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$$\gamma_{i} = \xi \epsilon_{i} \left(1 + \underbrace{\frac{\xi_{i}}{\xi_{i} + 1 - \sigma} \left(\underbrace{\frac{\epsilon_{max}}{\epsilon_{i}}}_{i} - 1 \right)}_{i} \right),$$

where $\xi_i \equiv \xi$ if $\psi_i > 0$ and $\xi_i \equiv \xi (1 - \delta_i)$ if $\psi_i \rightarrow 0$. Details

 Vanishing sector has higher productivity growth (services vs. manufacturing).

Results for the Particular Specification of Spillovers*

• Recall Nested CES Structure

$$\begin{array}{ll} & S_{i}\left(\mathbf{N}\right) & \equiv & \displaystyle\frac{1}{\eta_{i}}\left[\delta_{i}^{1-\psi_{i}}N_{i}^{\psi_{i}}+(1-\delta_{i})^{1-\psi_{i}}\tilde{S}_{i}\left(\mathbf{N}\right)^{\psi_{i}}\right]^{\frac{1}{\psi_{i}}}, \\ & \tilde{S}_{i}\left(\mathbf{N}\right) & \equiv & \displaystyle\left(\sum_{j\neq i}\vartheta_{ij}^{1-\varsigma_{i}}N_{j}^{\varsigma_{i}}\right)^{\frac{1}{\varsigma_{i}}}, \end{array}$$

Non-vanishing set of Sectors \mathcal{I}^*

Set of sectors that asymptotically constitute a nonvanishing share of economic activity \mathcal{I}^* consists of 1. Any sector *i* with $\varsigma_i > 0$ and $\psi_i < 0$ or $\varsigma_i < 0$ and $\psi_i > 0$ 2. Any sector *i* with $\varsigma_i < 0$ and $\psi_i < 0$ if $\epsilon_i \le \epsilon_{i'}$ for all *i'*, 3. Any sector *i* with $\varsigma_i > 0$ and $\psi_i \ge 0$ if $\epsilon_i > \epsilon_{i'}$ for all *i'*.

Characterization for $0 < \sigma < 1$

• The asymptotic growth rates of technologies in different sectors

$$\underbrace{\xi}_{i} = \min_{i} \left\{ \begin{array}{c} \gamma_{i} \\ \overline{\epsilon_{i}} \end{array} \right\} = \frac{\overline{\gamma}^{*}}{\overline{\epsilon}^{*}}, \qquad (1)$$

 $\overline{\gamma}^*$ and $\overline{\epsilon}^*$ denote average rates under distribution $\{\Omega_i^*\}_i$.

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Let *I*^{*} denote the set of industries that achieve minimum in (4). The production shares for *i* ∉ *I*^{*} declines at

$$\lim_{t\to\infty}\dot{\omega}_i(t) = (1-\sigma)\left(\epsilon_i - \frac{\gamma_i}{\xi}\right)g^* \leq 0.$$

 \rightarrow disappearing sectors have $\xi_i > \xi$.

Characterization Innovation Side

- Economy converges to a stationary distribution {Λ^{*}_i}.
- Sector i's share of R&D emp. and Λ_i fall at a rate

$$\lim_{t\to\infty}\dot{z}_i\left(t\right)=\lim_{t\to\infty}\dot{\lambda}_i\left(t\right)=\left(\gamma_i-\gamma_i^{\mathcal{S}}\right)g^*\leq 0,$$

where asymptotic rate of growth of innovation spillovers to sector *i* defined as $\gamma_i^S g^*$. Along CGP,

$$\gamma_i^{\mathcal{S}} \equiv \lim_{t \to \infty} rac{\dot{s}_i(t)}{g^*} = \sum_j \Sigma_{ij}^* \gamma_j \geq \gamma_i,$$

- Let \mathcal{I}^{\dagger} the set of sectors that satisfy with equality.
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$$\gamma = (1 - \sigma) \left[\left(1 + \frac{1 - \sigma}{\zeta} \right) \mathbf{I} - \mathbf{\Sigma}^* \right]^{-1} \epsilon.$$

Characterization (ct'd)

- Remark: $\mathcal{I}^* = \mathcal{I}^{\dagger}$.
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Results for the Particular Specification of Spillovers* (ct'd)

• First Order Approx. Growth near CGP:

$$\gamma_i = \xi \epsilon_i \left(1 + \frac{\xi_i}{\xi_i + 1 - \sigma} \left(\frac{\epsilon_{max}}{\epsilon_i} - 1 \right) \right), \tag{2}$$

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•

Conclusion

FACTS Sweeping in sectoral unavation FACTS Growth rak amov @ con 1/mc. elast. Provided endogenous theory of directed technical change at the sectoral level.

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- Way ahead: quantitative version of the model to assess "demand pull" vs. "technology push."
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