

# Technology with unequal gains: Steamship and globalization

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# Summary

- What was the effect of steamships on development?
- Digitize shipping data using deep learning
- Unequal gains using the market access approach
- Extend trade with heterogeneous firms to understand this difference in gains

# Outline

1. **Why Steamships?**
2. **Data and Digitization**
3. **Empirical Evidence on Unequal Gains**
4. **Adoption of Steamships: Theory**
5. **Adoption of Steamships: Estimation**

# Technology and Integration

What if

- the world became more integrated?
- the technology to integrate was not available to all?

# Why unequal gains from integration?

- Generally positive gains from trade  
(Donaldson, 2015) (Redding & Venables, 2004) (Donaldson & Hornbeck, 2016) (Bernhofen et al., 2016)
- Difference in gains due to transportation  
(Pascali, 2017) (Faber, 2014) (Campante & Yanagizawa-Drott, 2018) (Okoye et al., 2019)
- How does transportation technology relate to differences in gains?
- Relates to whether technology worsens inequality  
(Reichardt, 2023) (Goldin & Katz, 1998) (Acemoglu & Autor, 2011)

# Steamships as an ideal case study

- Huge changes in the late 19th century (1880-1914)
  - The First Era of Globalization
  - The Great Divergence
  - Transition from sailing to steamships (natural experiment)
- Null average effect of trade (Pascali, 2017)
- Why?
  - Transportation technology is not adopted uniformly?
  - Possible to see who actually used steamships!

# The paper

- Digitize historical documents using deep learning
  - Shipping data to see who used steamships
  - Provide precise measurement in changes in duration
- Evidence of gains from the transportation technology
  - Large gains due to access to large consumer markets
  - Smaller gains from access to large suppliers
  - Negative effects for colonized countries
- Provides a framework to think about trade and technology
  - (Melitz, 2003)
  - Incorporate sailing and steamships
  - Show differences in welfare

# Data and Digitization



# Overview

- Country-level (Pascali, 2017)
- Port-level (Lloyd's Shipping Index)

# Country level

For 1880-1900 (Pascali, 2017)

- Country-level trade volumes (in US pounds)
- Country-level GDP, population, institution

# Port level

- Lloyd's Shipping Index

Used in (Juhász & Steinwender, 2018) (Xu, 2022)

- Comprehensive data set on global shipping from 1880
  - Weekly reports compiled by the insurance company Lloyd's
  - Ships travelling from port to port

Reg.	Ship Master	Ton.	Flag	Rig	From	For	Latest Reports
R V	E A O'Brien	Pratt(1038)	Br	bq	Manilla Apr 4	Boston	Ar Sept 10—For Buenos Ayres
R V	E B Sutton	Carter(1639)	Am	s	Honolulu Oct 13	New York	
* R	E C Mowatt	Hersey(1026)	Am	bq	Philadelphia Sept 6	Table Bay	Pd Marcus Hook Sept 6
*	E J Spence	Stronach(519)	Br	bq	Singapore July 26	Mauritius	Ar Sept 12
v	E J Spicer	Cochran(1268)	Br	s	Table Bay July 21	Nestle(NSW)	Ar Spt 2—For WSC America

# Deep Learning in Digitization

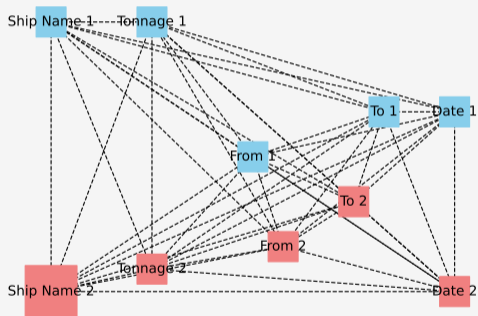
Recognize from images

- Texts (Optical Character Recognition)
  - LayoutParser (Shen et al., 2021)
- Tables (Table Structure Recognition)
  - Difficult even in contemporary documents
  - Bottleneck in other digitization efforts

R v	<i>Astral Dunham</i> (2987)	Am s	New York	Apr 15	San Francisco	Sp May 30, 17	S 38 W	—All well
*	<i>Atacama Gundersen</i>	(1113) No bq	Boston	June 13	Buenos Ayros			
G v	<i>Atalanta Stendahl</i>	(998) No bq	Launceston	May 11	Malden Is & Bluff			
*	<i>Athene Dreier</i> (2360)	Ge bq	Port Talbot	Jan 25	Iquique	Ar Apr 16	—In pt	June 27
v	<i>Atlantic Rasmussen</i>	(271) Da so	Hamburg		Sundswall	Ar	June 15	

# Idea and Algorithm

Predict each connection of words



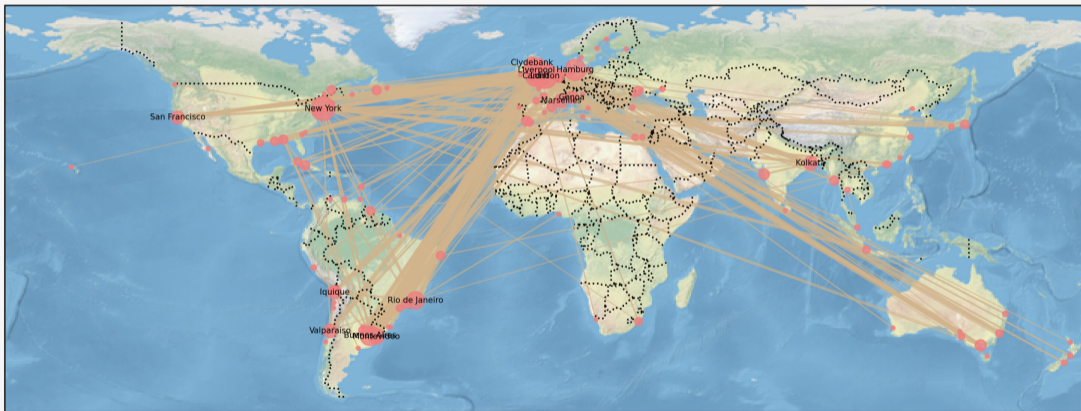
- Text information
  - Google OCR
  - BERT (Large Language Model)
- Connections
  - Graph Neural Network

# Lloyd's Shipping Index 1.0

Extract 30,000 trips across the years 1880, 1890, and 1900

- Port to port by sailing and steamships
  - Total tonnage (tons)
  - Duration (days)
- Caveat
  - Reporting bias (skewed towards ships in Europe)
  - Digitization Error (skewed towards common ship trips)

# Shipping Network

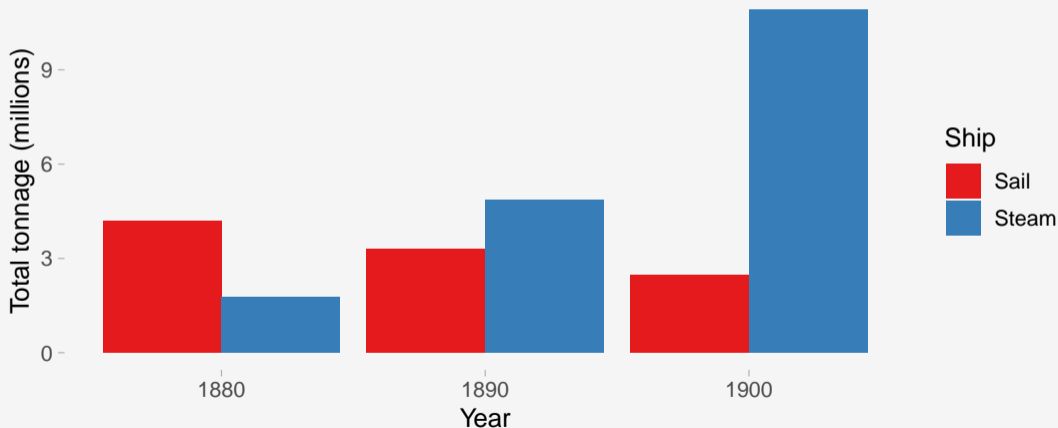


# Empirical Evidence



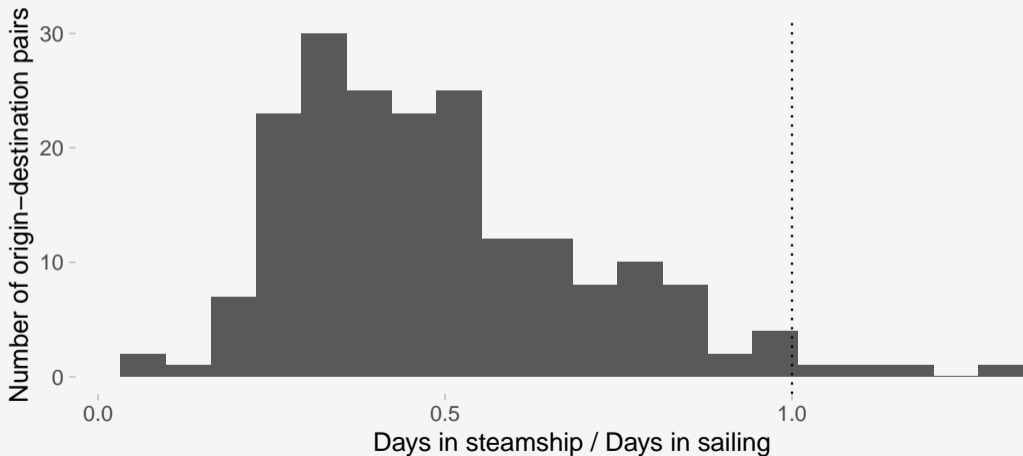
# Steamships vs Sailing

The adoption of steamships in the late 19th century



# Faster

Change in duration by origin-destination pair  $\frac{\text{duration}_{ij}^{\text{steam}}}{\text{duration}_{ij}^{\text{sail}}}$



# Empirical framework

$$\Delta GDP \text{ Per Capita}_c = \beta_0 + \beta_1 \Delta Market \text{ Access}_c + \beta_2 \Delta Supplier \text{ Access}_c + \nu_c \quad (1)$$

$$Market \text{ Access}_{i,t} = \sum_j duration_{ij,t}^{-1} population_{j,t} \quad (2)$$

$$Supplier \text{ Access}_{i,t} = \sum_j duration_{ji,t}^{-1} population_{j,t} \quad (3)$$

- 1880 ... Duration of sailing ships
- 1890 ... Weighted duration of sailing and steamships
- 1900 ... Duration of steamships

# Average positive effect of steamships

Dependent Variable:	$\Delta GDP_{percapita}$		
Model:	(1)	(2)	(3)
<i>Variables</i>			
$\Delta MarketAccess$	0.061*** (0.012)		0.103*** (0.024)
$\Delta SupplierAccess$		0.064*** (0.023)	-0.066* (0.035)
<i>Fixed-effects</i>			
Year	Yes	Yes	Yes
<i>Fit statistics</i>			
R <sup>2</sup>	0.465	0.236	0.448
Observations	59	59	58

*Clustered (Country) standard-errors in parentheses*

*Signif. Codes: \*\*\*: 0.01, \*\*: 0.05, \*: 0.1*

- Export market increases wage
- Import market increases real wage
- Import market increases competition

# Negative effect on colonized countries

Dependent Variable:	$\Delta GDP_{percapita}$	
Model:	(1)	(2)
<i>Variables</i>		
$\Delta MarketAccess$	0.062*** (0.015)	
Colony	-0.122*** (0.037)	-0.097*** (0.028)
$\Delta MarketAccess \times Colony$	-0.087*** (0.030)	
$\Delta SupplierAccess$		0.091*** (0.028)
$\Delta SupplierAccess \times Colony$		-0.123*** (0.036)
<i>Fixed-effects</i>		
Year	Yes	Yes
<i>Fit statistics</i>		
R <sup>2</sup>	0.528	0.404
Observations	59	59

# Low steamships adoption at the port level

Dependent Variables: Model:	Only sailing (1)	Only steam (2)	Share steam (3)
<i>Variables</i>			
Constant	0.649*** (0.025)	0.067*** (0.021)	0.177*** (0.021)
Year 1900	-0.379*** (0.032)	0.279*** (0.028)	0.424*** (0.027)
Year 1880 × Colony	0.050 (0.052)	0.010 (0.045)	-0.030 (0.043)
Year 1900 × Colony	0.173*** (0.044)	-0.082** (0.038)	-0.133*** (0.037)
<i>Fit statistics</i>			
R <sup>2</sup>	0.135	0.097	0.217
Observations	1,096	1,096	1,096

*IID standard-errors in parentheses*

*Signif. Codes: \*\*\*: 0.01, \*\*: 0.05, \*: 0.1*

# Steamships increasing inequality

- Steamships provided faster transportation
- This increased integration did not benefit colonized countries
- The low adoption of steamships as a possible explanation

# Adoption of Steamships: Theory



# Motivation

Can standard trade theory explain this?

- **Difference in fixed cost of adoption**
  - Port investment
- Shipping sector in the trade cost
- Outside trade (e.g. institutions)

# Overview

- Trade with heterogeneous firms (Melitz, 2003)
- Include differences in shipping technology
  - duration
  - adoption cost
- Welfare difference between countries differing in adoption rate

# Set up

- Set of countries  $S$
- Exogenous measure  $L_i$  of workers in  $i \in S$  supply unit labour at wage  $w_i$
- Representative consumer has CES preferences over varieties from all firms

$$U_j = \left( \sum_{i \in S} \int_{\Omega_{ij}} (q_{ij}(\omega))^{\frac{\sigma}{\sigma-1}} d\omega \right)^{\frac{\sigma-1}{\sigma}}$$

- Demand of good  $\omega \in \Omega$

$$q_{ij}(\omega) = p_{ij}(\omega)^{-\sigma} Y_j P_j^{\sigma-1}$$

$$P_j = \left( \sum_{i \in S} \int_{\Omega_i} p_{ij}(\omega)^{1-\sigma} d\omega \right)^{\frac{1}{1-\sigma}}$$

$Y_j$  ... income of country  $j$

# Firm's decision

- Every firm in the world produces a distinct variety  $\omega \in \Omega$
- A firm uses  $\frac{1}{\varphi}$  unit of labour to produce a unit of its variety, drawn from  $G_i(\varphi)$ .
- Conditional on selling to  $j$ , subject to iceberg trade cost  $\{\tau_{ij}\}_{i,j \in S}$

$$p_{ij}(\varphi) = \frac{\sigma}{\sigma - 1} \frac{w_i}{\varphi} \tau_{ij}$$
$$x_{ij}(\varphi) = \left( \frac{\sigma}{\sigma - 1} \frac{w_i}{\varphi} \tau_{ij} \right)^{1-\sigma} Y_j P_j^{\sigma-1}$$

# Which firm uses steamships?

- A ship type  $s \in \{sail, steam\}$  has different  $\tau_{ij}^s$  and  $f_{ij}^s$ , fixed cost to export to  $j$
- The profit of a firm with productivity  $\varphi$  using ship  $s$  is

$$\pi_{ij}^s(\varphi) = \frac{1}{\sigma} \left( \frac{\sigma}{\sigma-1} \frac{w_i}{\varphi} \tau_{ij}^s \right)^{1-\sigma} Y_j P_j^{\sigma-1} - f_{ij}^s$$

- Cutoff productivity for exporting using sailing or steamships

$$\varphi_{ij,sail}^* = \left( \frac{\sigma f_{ij}^{sail} \left( \frac{\sigma}{\sigma-1} w_i \tau_{ij}^{sail} \right)^{\sigma-1}}{Y_j P_j^{\sigma-1}} \right)^{\frac{1}{\sigma-1}}$$

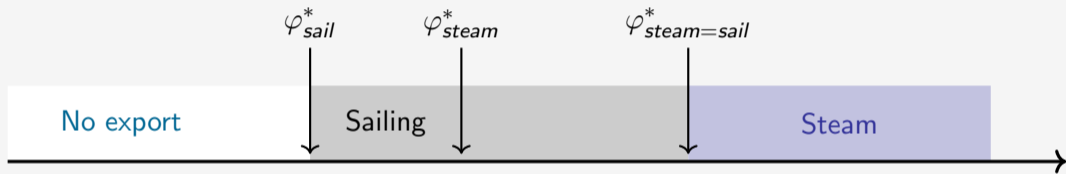
$$\varphi_{ij,steam}^* = \varphi_{ij,sail}^* \left( \left( \frac{f_{ij}^{steam}}{f_{ij}^{sail}} \right) \left( \frac{\tau_{ij}^{steam}}{\tau_{ij}^{sail}} \right)^{\sigma-1} \right)^{\frac{1}{\sigma-1}}$$

$$\varphi_{ij,steam=sail}^* = \varphi_{ij,sail}^* \left( \frac{\left( \frac{f_{ij}^{steam}}{f_{ij}^{sail}} \right) - 1}{\left( \frac{\tau_{ij}^{steam}}{\tau_{ij}^{sail}} \right)^{1-\sigma} - 1} \right)^{\frac{1}{\sigma-1}}$$

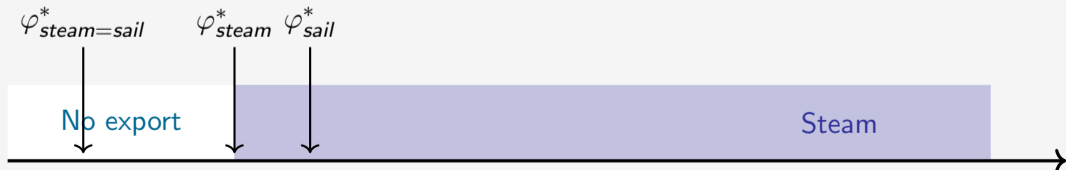
# Difference in adoption

When using steamship is harder to export:  $\varphi_{sail}^* \leq \varphi_{steam}^*$

Figure: Export and ship used when cost of using steamship is high



When using steamship is easier to export:  $\varphi_{sail}^* > \varphi_{steam}^*$



# Welfare

- Entry cost to the domestic market (Cutoff productivity  $\varphi^*$  for producing)
- Expected profits must be equal to the fixed cost of entry
- Set wage as the numeraire
- Welfare is described by the price index

## Fixed cost and Welfare

Under the assumptions of (1) symmetric countries and (2) productivity is Pareto distributed with shape parameter  $\theta > \sigma - 1$ , welfare monotonically increases as the fixed cost of using steamships decreases

# **Adoption of Steamships: Estimation**



# Are facts consistent with theory?

- The relative fixed cost of using steamships crucial for differences in gains
- Do colonized countries have a higher fixed cost of adoption ( $f_{ij}^{steam} / f_{ij}^{sail}$ )?

# Estimating adoption costs by port-pairs

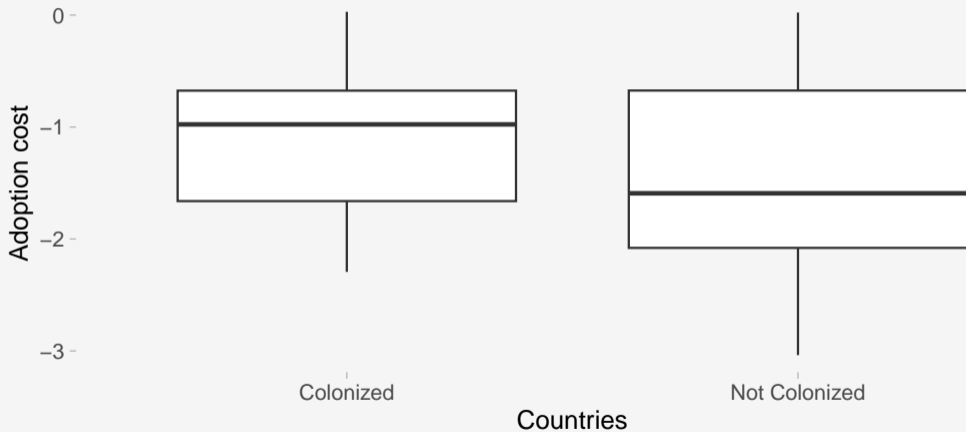
Fixed cost using ports with both sailing and steamships

$$\mu_{ij} = \frac{\int_{\varphi_{steam=sail}^*}^{\infty} q_{ij}(\varphi) dG(\varphi)}{\int_{\varphi_{sail}^*}^{\infty} q_{ij}(\varphi) dG(\varphi)} = \frac{\tau_{ij}^{steam} / \tau_{ij}^{sail}}{1 - \left( \frac{f_{ij}^{steam} / f_{ij}^{sail} - 1}{(\tau_{ij}^{steam} / \tau_{ij}^{sail})^{1-\sigma} - 1} \right)^{\frac{1}{1-\sigma}}}$$

Fixed cost using ports that transitioned to full steamships

$$\log x_{ij,t+1} - \log x_{ij,t} = \alpha_i + \alpha_j - \theta_i \log(\tau_{ij}^{steam} / \tau_{ij}^{sail}) + \frac{\sigma - \theta_i}{\sigma - 1} \log(f_{ij}^{steam} / f_{ij}^{sail})$$

# Difference between colonized or not



# More questions (Preliminary)

Close the model

- Port investment
- Institution

# Introducing Port Investment

Decompose fix cost into rents for both ports:  $f_{ij}^s = r_i^s r_j^s$

- Competitive market of landlords
  - firms pay the "marginal cost" of using the port
  - Port productivity depends on fundamental and past sailing ship usage
$$A_i^s = \bar{A}_i^s X_{i,t-1}^\lambda$$
- Dynamic problem
  - invest in ports if the expected sum of profits is higher than not
  - endogenous rent seems difficult

# Conclusion

# Summary of work so far

- Digitized valuable historical shipping data
- Provided preliminary evidence on unequal benefits from steamships
- Incorporated shipping technology into a canonical trade model to illustrate biased technology upgrade

# Take away

- Digitization of historical documents is an active field
- Evidence of transportation technology and its distributive effect is relatively unknown
- Standard trade model may provide insights into inequality and the effect of integration



comments, questions, advice, critiques etc.  
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