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Gravity without Apology: The Science of Elasticities, Distance, and Trade

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Gravity without Apology: The Science of Elasticities, Distance, and Trade

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25th Dubrovnik Economic Conference June 14, 2019

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Gravity without Apology

Introduction: Gravity and International Trade

- Gravity: The value of trade declines with distance
- One of the great successes of modern economics
- Gravity in trade is both *fact* and *theory*

- Like evolution: Gould (1981)

- Though this is not widely known by economists outside trade
- And "anti-gravity" continues to have popular appeal

Gravity in the News



the trenate camp - and by extension 'economically the origin minister - of 'treation people illiterate' the more children, capable of being up new logsymme every angle?. Her Orderne will in caming weeks publish a second paper outlining the "short-term economic abook" of a Invest, intended to bring the risks to

farmit togrowthand jobs of a licectl. But Mr Gove will highlight in a speech agree on what exactly "out" should look Smart Manay

The spectral spectral region is defined as the spectral spectra and Leave compartuming neck and we will be shown by DU then tuning as the state of the state of

increase in the number of its adjudications that are challenged, with the rise due mostly to Libor and forex rigging, and consumer credit cases... roca is

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Gravity without Apology

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Anti-Gravity





"Today, we stand on the verge of an unprecedented ability to liberate global trade for the benefit of our whole planet with technological advances dissolving away the barriers of time and distance. It is potentially the beginning of what I might call 'post geography trading world' where we are much less restricted in having to find partners who are physically close to us."

- Liam Fox, UK Minister for International Trade, Sept. 2016

This Paper

- Review the evidence for gravity
- Introduce some simple ways of understanding CES gravity
- Note some problems with CES
- Sketch some alternatives
- Background: Brexit ...
 - 1973, January 1: UK joined EEC, later the European Union (EU)
 - 2016, June 23: UK referendum: Vote to leave EU 51.89% to 48.11%
 - 2017, March 29: UK invoked Article 50 of EU Treaty, starting a two-year process of withdrawal
 - 2019, March 29: Deadline extended to October 31
 - 2019, May 29: Still unclear whether UK will remain in EU, or leave, with or without a deal

Economics of Brexit

Many studies of the trade effects of Brexit

- Predominantly using the gravity model
 - Dhingra et al. (2017), Sampson (2017)
 - Brakman, Garretsen, and Kohl (2018)
 - Mayer, Vicard, and Zignago (2019)
- We ignore work on other economic aspects of Brexit
 - Davies and Studnicka (2018): Stock-market response
 - McGrattan and Waddle (2018): Impact on foreign investment
 - Alabrese, Becker, Fetzer, and Novy (2019): Determinants of voting
 - O'Rourke (2019): Historical context

Economics of Brexit: Professional Consensus

• Professional consensus: Three Iron Laws of the Economics of Brexit

- Focusing on trade in goods ...
- ... ignoring transitional problems ...
- ... and macro policy responses
- The only good Brexit is a dead Brexit
- **2** The harder the Brexit the higher the economic costs
- Seven a hard Brexit will not have "very" large costs
 - 2% of GDP if soft, 6+% of GDP if hard
 - $\bullet\,$ Compare: UK spent 7.26% of GDP on NHS in 2016/17 $\,$

Background

CARRÈRE, C., M. MRÁZOVÁ, AND J. P. NEARY (2019): "Subconvex Gravity," in preparation.

LAWLESS, M., J. P. NEARY, AND Z. STUDNICKA (2019): "Explaining the Volume of South-North Trade in Ireland: Gravity and Firms from the Good Friday Agreement to Brexit," in preparation.

MRÁZOVÁ, M., AND J. P. NEARY (2017): "Not so Demanding: Demand Structure and Firm Behavior," *American Economic Review*, 107(12), 3835–3874.

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MRÁZOVÁ, M., AND J. P. NEARY (2019): "IO for Export(s)," Working Paper No. 868, Department of Economics, University of Oxford.

MAGGI, G., M. MRÁZOVÁ, AND J. P. NEARY (2018): "Choked by Red Tape? The Political Economy of Wasteful Trade Barriers," CEPR Discussion Paper No. 12985.

Outline

- **1** Gravity as Fact
- 2 Gravity as Theory
- **3** Gravity Anomalies
- **4** Subconvex Gravity
- **5** Conclusion

Outline

1 Gravity as Fact

- 2 Gravity as Theory
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The Gravity Equation: A Universal Tendency

- Overwhelming professional consensus that distance matters for trade
 - Head and Mayer (2014): review of 159 papers
 - $\bullet\,$ Average preferred estimate of distance elasticity: -1.1
 - S.D. 0.41; median -1.14
- Not just geographical distance matters:
 - Common language, legal system, colonial origins, FTA membership, etc.
- Results below for distance elasticity of 2017 UK exports in line with the literature:
 - -0.752 (0.098): OLS, simple regression, n = 181
 - -1.441 (0.023): OLS, full controls, n = 23,251
 - -0.735 (0.034): OLS, $\ln(1 + V_{jk})$ as depvar, full controls, n = 42,230
 - -0.977 (0.021): PPML, full controls, n = 42,230

Gravity: Not Just for Trade in Goods

- Distance also matters (though less so on average) for:
 - Services trade: Kimura and Lee (2006)
 - FDI: Kleinert and Toubal (2010), Keller and Yeaple (2013)
 - Equities: Portes and Rey (2005)
 - eBay: Lendle, Olarreaga, Schropp, and Vézina (2016)
 - Google: Cowgill and Dorobantu (2012)
- And the distance coefficient for goods trade has not fallen over time
 - "The Mystery of the Missing Globalization"!
 - But: Not a mystery
 - Distance is relative

[Yotov (2012)]

Data Sources, etc.

- Survey:
 - Head and Mayer (2014)
- Data: CEPII
 - http://www.cepii.fr/CEPII/en/bdd_modele/presentation.
 asp?id=8
- UK trade policy: UK Trade Policy Observatory
 - http://blogs.sussex.ac.uk/uktpo/
- EU trade agreements
 - http://ec.europa.eu/trade/policy/countries-and-regions/ negotiations-and-agreements/

UK Exports and Importer GDP, 2017



UK Exports/Importer GDP and Distance, 2017



Gravity Weighted by Exports, UK, 2017



Trade Agreements, UK, 2017



Trade Agreements and ex-Colonies, UK, 2017



Gravity, UK, 2017: -0.752 (0.098)



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Gravity, Ireland, 2017: -1.123 (0.150)



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Gravity, Czech Republic, 2017: -1.471 (0.109)



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Gravity, Switzerland, 2017: -0.642 (0.106)



Gravity, China, 2017: -0.437 (0.145)



Gravity, Croatia, 2017: -1.762 (0.178)



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Outline

Gravity as Fact

2 Gravity as Theory

- Structural Gravity
- Comparative Statics for Structural Gravity
- An Application: Brexit

3 Gravity Anomalies

Subconvex Gravity

5 Conclusion

Gravity as Theory

"[I] have explained the phenomena of the heavens and of our sea by the power of gravity, but have not yet assigned the cause of this power."

– Isaac Newton (1713)

"The intent of this paper is to provide a theoretical explanation for the gravity equation applied to commodities."

- Jim Anderson (1979)

Foundations of the Gravity Model

- A variety of different supply sides, all with CES preferences
- The gravity equation has been shown to be consistent with:
 - Armington (1969) model of pure exchange
 - Anderson (1979), Anderson and van Wincoop (2003)
 - Models of monopolistic competition such as Krugman (1980)
 - Bergstrand (1985) and Helpman (1987)
 - Heterogeneous-firms model of Melitz (2003)
 - Chaney (2008)
 - Multi-country Ricardian model
 - Eaton and Kortum (2002)
 - Synthesis: Arkolakis, Costinot, and Rodríguez-Clare (2012)
- All yield the same "structural gravity" model
 - Here: We focus on the simplest Armington-based version

Start with CES Demands

- n countries, each endowed with a unique good
- Common CES preferences: Each country consumes all goods:

$$x_{jk} = \beta_j \left(\frac{p_{jk}}{P_k}\right)^{-\sigma} \frac{E_k}{P_k} \quad \Rightarrow \quad V_{jk} = \beta_j \left(\frac{p_{jk}}{P_k}\right)^{1-\sigma} E_k$$

- $V_{jk} = p_{jk} x_{jk}$: Value of exports from j to k
- β_j : Taste parameter for country j good
- p_{jk} : Delivered price of j's export in k
 - $p_{jk} = p_j t_{jk}$: Equals home price times an "iceberg" trade cost
- P_k : Importer price index:

$$P_k = \left(\sum_h \beta_h p_{hk}^{1-\sigma}\right)^{\frac{1}{1-\sigma}}$$

- σ : Elasticity of substitution
- E_k : Country k's expenditure on all goods

From CES Demands to Structural Gravity

• Total sales by country j sum to GDP in equilibrium:

$$\sum_{k} V_{jk} = Y_j$$



• Substitute into this from CES demands:

$$Y_j = \sum_k V_{jk} = (\beta_j p_j)^{1-\sigma} \sum_k \left(\frac{t_{jk}}{P_k}\right)^{1-\sigma} E_k$$

 \bullet Use this to eliminate $(\beta_j p_j)^{1-\sigma}$ from V_{jk} and P_k

Structural Gravity

• Structural gravity:

[Anderson (1979), Anderson and van Wincoop (2003)]

$$V_{jk} = \underbrace{\left(\frac{t_{jk}}{\Pi_j P_k}\right)^{1-\sigma}}_{(1)} \underbrace{\frac{Y_j E_k}{Y_W}}_{(2)}$$

(2): Frictionless trade: Y_W is world income

(1): Trade costs relative to outward and inward "multilateral resistance":

$$(\Pi_j)^{1-\sigma} = \sum_h \left(\frac{t_{jh}}{P_h}\right)^{1-\sigma} \frac{E_h}{Y_W} \qquad (P_k)^{1-\sigma} = \sum_h \left(\frac{t_{hk}}{\Pi_h}\right)^{1-\sigma} \frac{Y_h}{Y_W}$$

- Π_j : Index of outward trade costs
- P_k : In equilibrium, price index is also an index of inward trade costs
- Dual to one another

Uses of Structural Gravity

Estimation

• Usually in log-linear form with importer and exporter fixed effects:

 $\log V_{jk} = F_j + F_k + \beta \log t_{jk} + u_{jk}, \qquad t_{jk} = \delta_{jk} \exp(\gamma' D_{jk})$

- Simulation
 - Policy analysis, e.g. Brexit
- Theoretical Analysis
 - Not possible in levels
 - What about comparative statics for local changes?

Comparative Statics for Structural Gravity

- Allen, Arkolakis, and Takahashi (2019)
 - Dekle, Eaton and Kortum (2008)
- Baqaee and Farhi (2017)
- Jones (1965)
 - Diewert and Woodland (1977), Jones and Scheinkman (1977)

The Structure of Simple Structural Gravity Models

- Comparative Statics:
 - Define GDP and expenditure shares:

$$\lambda_{jk} = \frac{V_{jk}}{Y_j} \quad \theta_{jk} = \frac{V_{jk}}{E_k}$$

• Country j small:
$$\lambda_{kj} \approx 0$$
 and $\theta_{jk} \approx 0, \ \forall \ k \neq j$

• Express changes in terms of these:

 $[\hat{x} \equiv d \log x]$

$$\begin{split} Y_j &= \sum_k V_{jk} \quad \Rightarrow \quad \hat{Y}_j = \sum_k \lambda_{jk} \hat{V}_{jk} \quad \Rightarrow \quad 0 = \sum_k \lambda_{jk} \left(\hat{\tau}_{jk} + \hat{x}_{jk} \right) \\ P_k &= \left(\sum_j p_{jk}^{1-\sigma} \right)^{\frac{1}{1-\sigma}} \quad \Rightarrow \quad \hat{P}_k = \sum_j \theta_{jk} \hat{p}_{jk} \end{split}$$

Gravity at the Margin

• Demands at the margin:

$$\hat{x}_{jk} = -\sigma \hat{p}_{jk} + (\sigma - 1)\hat{P}_k + \hat{E}_k$$

• Own and cross-price derivatives:

$$\frac{\partial \log x_{jk}}{\partial \log p_{jk}} = -\left(\sigma(1-\theta_{jk}) + \theta_{jk}\right) \qquad \frac{\partial \log x_{jk}}{\partial \log p_{hk}}\Big|_{h\neq j} = (\sigma-1)\theta_{hk}$$

• Gross substitutes:
$$-\frac{\partial \log x_{jk}}{\partial \log p_{jk}} > \frac{\partial \log x_{jk}}{\partial \log p_{hk}} > 0$$

• Add:

• Trade costs:
$$p_{jk} = p_j t_{jk} \implies \hat{p}_{jk} = \hat{p}_j + \hat{t}_{jk}$$

• Balanced trade:
$$E_j = \kappa_j Y_j \quad \Rightarrow \quad \hat{E}_j = \hat{Y}_j$$

• Supply side:
$$\left\{\begin{array}{cc} Y_j = p_j Q_j \\ w_j = p_j \end{array}\right\} \quad \Rightarrow \quad \hat{Y}_j = \hat{w}_j = \hat{p}_j$$

An Application: Brexit

- Specialize to 3 countries: A, B, and E
 - A and E large
 - Take country A's good as numéraire, so $p_A = 1$
 - Equilibrium: Market-clearing conditions for outputs of B and E ...
 - ... determine equilibrium wages: $w_B = p_B$ and $w_E = p_E$


• Illustrate equilibrium in $\{p_E, p_B\}$, i.e., $\{w_E, w_B\}$ space



- Initial equilibrium at S.
- Goods-market-equilibrium locus for good B?



- Goods-market-equilibrium locus for good *B*:
 - Higher w_B , i.e. p_B , leads to excess supply, lower to excess demand



- Goods-market-equilibrium locus for good *B*:
 - Higher w_B , i.e. p_B , leads to excess supply, lower to excess demand
 - Conversely for w_E , though effect is weaker
 - Gross substitutes in each market, and so in all



- Goods-market-equilibrium locus for good B:
 - Higher w_B , i.e. p_B , leads to excess supply, lower to excess demand
 - Conversely for w_E , though effect is weaker
 - Gross substitutes in each market, and so in all
 - Uniformly higher w_B and w_E leads to excess supply



- Goods-market-equilibrium locus for good B:
 - Higher w_B , i.e. p_B , leads to excess supply, lower to excess demand
 - Conversely for w_E , though effect is weaker
 - Gross substitutes in each market, and so in all
 - Uniformly higher w_B and w_E leads to excess supply
 - So market-clearing locus is upward-sloping as shown



- Similarly for good E
 - Close to vertical if B is small



• Intersection of the two determines equilibrium wages w_B and w_E

Trade Cost Scenarios

Decompose trade costs:

[Maggi, Mrázová, and Neary (2018)]

$$t_{jk} = \delta_{jk} au_{jk}$$

 $\begin{cases} \delta_{jk} : & \text{``natural''} \\ au_{jk} : & \text{policy-induced} \end{cases}$

Possible scenarios:

Scenario	δ_{BE}	$ au_{BE}$	δ_{BA}	$ au_{BA}$
Status quo	low	low	high	high
"Cake and Eat"	low	low	high	low
"Global Britain"	low	high	high	low

(1) All assumed to be bilaterally symmetric.

(2) Revenue from policy costs ignored.

"Cake and Eat"



• Lower τ_{BA} : ambiguous effect on demand for Y_B ; assume for now it raises it

$$\frac{\partial \log X_B}{\partial \log \tau_{BA}} = -(\sigma - 1)(\underbrace{\lambda_{BA}(1 - \theta_{BA})}_{(1)>0} \underbrace{-\lambda_{BB}\theta_{AB}}_{(2)<0})$$

Lower trade cost B → A: raises export demand for good B
 Lower trade cost A → B: lowers home demand for good B

"Cake and Eat"



• Lower τ_{BA} also lowers demand for Y_E , though not by much if B is small

$$\frac{\partial \log X_E}{\partial \log \tau_{BA}} = (\sigma - 1)(\lambda_{EA} \theta_{BA} + \lambda_{EB} \theta_{AB})$$

"Cake and Eat"



- Net effect: Rise in w_B , ambiguous change in w_E
 - $w_B \uparrow \Leftrightarrow \hat{w}_B > \hat{w}_A$: Because A is bigger

"Cake and Eat": Wages in *B* May Fall



• What if lower τ_{BA} reduces demand for Y_B ?

- ▶ Recall
- $\bullet\,$ This is because θ_{AB} is large enough that home demand for B falls
- But in this case the price level also falls a lot
- When B is small these effects exactly cancel, so effect of higher exports dominates: real wage in B definitely rises
- This result holds for any number of countries

"Global Britain": Symmetric Benchmark



- $\bullet \ \mbox{Complete symmetry between } A \ \mbox{and} \ E: \ \mbox{No net effect}$
 - $au_{BE}\uparrow$ exactly offsets the effect of $au_{BA}\downarrow$

"Global Britain": Departures from Symmetry

- Depth of integration
 - Single market is a deeper trade agreement: $\tau_{BE}\Big|_{S} < \tau_{BA}\Big|_{CB}$
- Size
 - What matters is not absolute size, but size in initial UK trade
 - $\bullet\,$ EU27 accounts for 40% of 2017 UK trade; but countries with EU trade agreements add another 15%
- Asymmetries between increases in low policy costs and decreases in high ones
 - This matters for discrete changes
 - Cost of 10%-point increase in τ_{BE} is greater than the gain from a 10%-point decrease in τ_{BA}
- Distance a fixed cost

$$t_{jk} = \delta_{jk} + \tau_{jk} \quad \Rightarrow \quad \hat{t}_{jk} = (1 - \omega_{jk})\hat{\tau}_{jk}, \quad \omega_{jk} \equiv \frac{\delta_{jk}}{t_{jk}}$$

c

"Global Britain": Reality Bites



- Net effect: Higher trade costs with E dominate
 - More than offset the (only slightly) lower trade costs with A

Outline

1 Gravity as Fact

2 Gravity as Theory

3 Gravity Anomalies

- Gravity Anomalies: Markups and Pass-Through
- Gravity Anomalies: Bilateral Trade Balances

Subconvex Gravity

5 Conclusion

Gravity Anomalies

- Counter-factual implications of CES preferences:
 - Firm-level markups and pass-through
 - $\bullet~$ CES demands imply constant markups and 100% pass-through
 - But: Mounting firm-level empirical evidence to the contrary
 - Empirics: De Loecker et al.(2016); theory: Mrázová and Neary (2017)
 - 2 Elasticities of import demand across markets
 - Evidence that they vary by market size and distance: Novy (2013)
 - Bilateral trade balances
 - CES gravity imposes very strong counter-factual restrictions



Firm-Level Evidence Against CES



CES Demands

- In general, both ε and ρ vary with sales
- Exception: CES/iso-elastic case:

•
$$p = \beta x^{-1/\sigma}$$

• $\Rightarrow \quad \varepsilon = \sigma, \quad \rho = \frac{\sigma+1}{\sigma} > 1$
• $\Rightarrow \quad \varepsilon = \frac{1}{\rho-1}$



CES Demands

- In general, both ε and ρ vary with sales
- Exception: CES/iso-elastic case:

•
$$p = \beta x^{-1/\sigma}$$

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• $\Rightarrow \quad \varepsilon = \frac{1}{\rho-1}$

 6
 CES

 3.0

 2.0

 0.0

 -

• Cobb-Douglas: $\varepsilon = 1, \rho = 2$

Sub- and Superconvexity

p(x) is subconvex at x^0 IFF:

- $\log p(x)$ is concave in $\log x$
- p(x) is less convex than a CES demand function with the same elasticity: $\rho < \frac{\varepsilon+1}{\varepsilon}$



Sub- and Superconvexity



- Subconvexity confirmed empirically, and theoretically plausible:
 - Introspection: "Marshall's 2nd Law of Demand"
 - Dixit and Stiglitz (1977), Krugman (1979), etc.

From Demand Functions to Demand Manifolds

- Represent demand functions in $\{\varepsilon, \rho\}$ space by their Demand Manifold
 - Definition: A curve in $\{\varepsilon,\rho\}$ space corresponding to the demand function p(x)
 - Existence: A smooth manifold corresponds to every demand function
 - Except for CES: Manifold is a point
 - Invariance: $\varepsilon(x,\phi)$ and $\rho(x,\phi) \Rightarrow \rho(\varepsilon)$?
 - Necessary and sufficient condition in Mrázová-Neary (2017)
 - Holds for most widely-used demand functions

Manifolds for Some Common Demand Functions



• All manifold-invariant

Evidence Rejects CES



- Mrázová and Neary (2017) show that ε and ρ can be inferred from estimates of pass-through and markups (as in de Loecker et al. (2016))
- CES lies outside the implied confidence regions

Gravity Anomalies 3: Bilateral Trade Balances

- Structural gravity predicts bilateral trade flows V_{jk}
- So it also predicts their ratios: bilateral trade balances V_{jk}/V_{kj}
 - Precedent for this: *Products* of trade flows widely used to infer trade costs and elasticity of trade
 - Head and Ries (2001), Jacks, Meissner, and Novy (2008), Caliendo and Parro (2015)
 - Precursors:
 - Davis and Weinstein (2002): "Mystery of the Excess Trade (Balances)"
 - Badinger and Fichet de Clairfontaine (2018), Cunat and Zymek (2018), Felbermayr and Yotov (2019)

Bilateral Trade Balances: The Simplest Case

- Assume (for now) symmetric bilateral trade costs and balanced trade:
 - Divide bilateral trades:

$$\frac{V_{jk}}{V_{kj}} = \left(\frac{\Pi_j}{P_j}\right)^{\sigma-1} / \left(\frac{\Pi_k}{P_k}\right)^{\sigma-1}$$

- But: With symmetric bilateral trade costs, $P_j = \lambda \Pi_j$
 - Anderson and van Wincoop (2003)
 - They go further and set $\lambda = 1$: "an implicit normalization"
 - a.k.a. a choice of numéraire
 - Not advisable if another numéraire has already been chosen!

[Baldwin and Taglioni (2007)]

• So: All trade balances are zero!

Bilateral Trade Balances: Robustness

In logs:

$$v_{jk} - v_{kj} = \rho_j - \rho_k$$

• This continues to hold with unbalanced trade:

$$\Rightarrow \quad \rho_j = \log\left(\frac{\Pi_j}{P_j}\right)^{\sigma-1} + \log\left(\frac{I_j}{E_j}\right)$$

• And with *quasi*-symmetric bilateral trade costs:

$$t_{jk} = t_j^X \bar{t}_{jk} t_k^M, \quad \bar{t}_{jk} = \bar{t}_{kj}$$

- Eaton and Kortum (2002), Allen and Arkolakis (2016)
- Allows for home bias and border effects: Head and Ries (2001)

$$\Rightarrow \quad \rho_j = \log\left(\frac{\Pi_j}{P_j}\right)^{\sigma-1} + \log\left(\frac{I_j}{E_j}\right) + \log\left(\frac{t_j^X}{t_j^M}\right)^{1-\sigma}$$

• i.e., relative multilateral resistance, adjusted for both overall trade surplus and border effects

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Bilateral Trade Balances: Recap

So:

$$v_{jk} - v_{kj} = \rho_j - \rho_k$$

- $\frac{1}{2}n(n-1)$ terms, $v_{jk}-v_{kj},$ determined by n relative multilateral resistance terms ρ_j
- Conclusion:
 - With unbalanced trade and quasi-symmetric trade costs, the bilateral trade balances between any country *j* and all other countries are independent of *j*, except for a factor of proportionality.

Implications

- Yet another elegant implication of CES?
- Or: Yet another implausible prediction of CES?!
- To test it:

$$\log V_{jk} - \log V_{kj} = \sum_{h=1}^{n-1} \beta_h D_h(j,k), \quad D_h(j,k) = \begin{cases} 1 & \text{when } h = j \\ -1 & \text{when } h = k \\ 0 & \text{when } h \neq j,k \end{cases}$$

- Same n = 182 countries, 2017
- All $n \ D_h(j,k)$ are perfectly collinear, so drop D_{US}
- Total number of observations: 182.181/2= 16,471
- Country pairs with any zero dropped, leaving 9,314
- Results:
 - $R^2 = 0.340$
 - Hypothesis $\{H_0: \ \beta_h=0\}$ is rejected at 5% for 70% of the β_h
 - But: A very poor fit for the trade balances in levels

Predicted versus Actual Trade Balances, 2017



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Beyond Gravity Anomalies: Subconvex Gravity

• Assume additively separable demands:

$$u'(x_{jk}) = \lambda_k p_{jk} \quad \Rightarrow \quad x_{jk} = f(\lambda_k p_j t_{jk})$$

$$\rightarrow \quad \hat{V}_{jk} = -(\sigma_{jk} - 1)\hat{p}_j - \sigma_{jk}\hat{\lambda}_k - (\sigma_{jk} - 1)\hat{t}_{jk}$$

• Subconvexity: $\sigma_{jk} \equiv \sigma \left(x_{jk} \right)$, decreasing in x_{jk}

• To estimate this, we use quantile regression:

- Order data by V_{jk}
- Estimate for each quantile q:

$$\log V_{q,jk} = F_{q,j} + F_{q,k} + \beta_q \log t_{jk} + u_{q,jk}$$

- Estimation and bootstrapped confidence intervals:
 - Baltagi and Egger (2016), Machado and Santos Silva (2019)

▶ Recall CES

Quantile Regression: Estimated Distance Coefficient



Quantile Regression Results: Compared to OLS


Quantile Regression Results: Tests

Significance Tests for Differences Between Quantile and OLS Estimates of Distance Coefficient

	β_{OLS}	β_{Q10}	β_{Q20}	β_{Q30}	β_{Q40}	β_{Q50}	β_{Q60}	β_{Q70}	β_{Q80}	β_{Q90}
β_{Q10}	*	0								
β_{Q20}	n.s.	n.s.	0							
β_{Q30}	n.s.	n.s.	n.s.	0						
β_{Q40}	n.s.	*	n.s.	n.s.	0					
β_{Q50}	n.s.	*	n.s.	n.s.	n.s.	0				
β_{Q60}	n.s.	*	*	n.s.	n.s.	n.s.	0			
β_{Q70}	n.s.	*	*	*	n.s.	n.s.	n.s.	0		
β_{Q80}	n.s.	*	*	*	*	n.s.	n.s.	n.s.	0	
β_{Q90}	*	*	*	*	*	*	*	n.s.	n.s.	0

Significantly different at 5% level

n.s. Not significant

Robustness: Interactive Dummies

- Robustness check in the spirit of Novy (2013):
 - Quantile dummies for intercept and interacted with all OLS coefficients
 - Quantile dummies computed on the predicted value of trade

• i.e.,
$$\log \widehat{V_{jk}} = F_j + F_k + \hat{\beta} \log t_{jk}$$

• Estimated distance coefficient is not the same as in the QR case as different fixed effects are used: $F_j + F_k + F_q$ instead of $F_j + F_k$

$$\log V_{jk} = F_j + F_k + F_q + \beta_q F_q \log t_{jk} + u_{jk}$$

Robustness: Interactive Dummies Regression



Subconvex Gravity: Evidence and Implications

- Persuasive Evidence for Subconvexity
 - Distance coefficient significantly decreasing (in absolute value) in trade
 - Replication needed ...
 - Chernozhukov, Fernandez-Val, and Weidner (2018) find the opposite with 1986 data
- Implications for the Trade Balances Puzzle?
 - Bilateral balances now depend on distance
 - Provisional evidence confirming this
- Implications for Brexit?
 - With subconvexity, elasticities are higher in smaller markets
 - Implications for estimated effects of Brexit unlikely to be major

Outline

- **1** Gravity as Fact
- 2 Gravity as Theory
- **3** Gravity Anomalies
- **4** Subconvex Gravity
- **5** Conclusion

Conclusion

- Gravity as Fact
 - Overwhelming evidence that trade tends to fall with distance
- Gravity as Theory
 - A simple general equilibrium system
 - New analytic tools for understanding it
- Gravity Anomalies
 - Constant Elasticity of Trade not the whole story
- Subconvex gravity a promising direction
 - Unlikely to change the Three Iron Laws of the Economics of Brexit

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Thank you for listening. Comments welcome!

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Details: Goods-Market Equilibrium

• Equilibrium in market for Y_B :

$$\hat{X}_B = \varepsilon_{BB}\hat{p}_B + \varepsilon_{BE}\hat{p}_E + \varepsilon_{Bt_E}\hat{t}_{BE} + \varepsilon_{Bt_A}\hat{t}_{BA} = 0$$

• where the elasticities of excess demand for Y_B are:

$$\begin{array}{l} \varepsilon_{BB}: \ -(\sigma-1)\lambda_{BB}(1-\theta_{BB}) - \lambda_{BE}\{\sigma(1-\theta_{BE}) + \theta_{BE}\} - \lambda_{BA}\{\sigma(1-\theta_{BA}) + \theta_{BA}\}\\ \varepsilon_{BE}: \ (\sigma-1)\lambda_{BB}\theta_{EB} + \lambda_{BE}\{(\sigma-1)\theta_{EE} + 1\} + (\sigma-1)\lambda_{BA}\theta_{EA}\\ \varepsilon_{Bt_E}: \ -(\sigma-1)\{\lambda_{BE}(1-\theta_{BE}) - \lambda_{BB}\theta_{EB}\}\\ \varepsilon_{Bt_A}: \ -(\sigma-1)\{\lambda_{BA}(1-\theta_{BA}) - \lambda_{BB}\theta_{AB}\}\end{array}$$

• Similarly in the market for Y_E:

$$\hat{X}_E = \varepsilon_{EB}\hat{p}_B + \varepsilon_{EE}\hat{p}_E + \varepsilon_{Et_E}\hat{t}_{BE} = 0$$

$$\begin{array}{l} \varepsilon_{EB}: \ (\sigma-1)\lambda_{BB}\theta_{EB} + \lambda_{BE}\{(\sigma-1)\theta_{EE} + 1\} + (\sigma-1)\lambda_{BA}\theta_{EA} \\ \varepsilon_{EE}: \ -(\sigma-1)\lambda_{BB}(1-\theta_{BB}) - \lambda_{BE}\{\sigma(1-\theta_{BE}) + \theta_{BE}\} - \lambda_{BA}\{\sigma(1-\theta_{BA}) + \theta_{BA}\} \\ \varepsilon_{Et_E}: \ -(\sigma-1)\{\lambda_{BE}(1-\theta_{BE}) - \lambda_{BB}\theta_{EB}\} \\ \varepsilon_{Et_A}: \ 0 \end{array}$$

Gravity Anomalies: Micro Evidence



• Markups and pass-through in general:

$$rac{p-c}{c} = rac{1}{arepsilon - 1} \quad ext{and} \quad rac{d\log p}{d\log c} = rac{arepsilon - 1}{arepsilon} rac{1}{2-
ho}$$

• CES demands imply constant markups and 100% pass-through:

$$\frac{p-c}{c} = \frac{1}{\sigma - 1} \quad \text{and} \quad \frac{d\log p}{d\log c} = 1$$

- But: Mounting empirical evidence to the contrary
- Mark-ups differ a lot across firms, even in narrowly-defined industries.

Empirical Evidence on Markups I



From: de Loecker, Goldberg, Khandelwal and Pavcnik (2016)

Empirical Evidence on Markups II



From: Lamorgese, Linarello and Warzynski (2014)

Gravity Anomalies: Cross-Market Heterogeneity



- CES-based models predict the same elasticity of import demand in all markets.
 - Macro elasticity, not micro elasticity facing firms
- By contrast, Novy (2013) finds that elasticities are systematically lower in larger and closer markets.

An Implication of Constant-Trade-Elasticity Gravity

- Inferring trade costs from trade volumes: [Head and Ries (2001), Jacks, Meissner, and Novy (2008)]
 - Multiply bilateral trades and divide by domestic trades:

$$\frac{V_{jk}V_{kj}}{V_{jj}V_{kk}} = \left(\frac{t_{jk}t_{kj}}{t_{jj}t_{kk}}\right)^{1-\sigma}$$

• Invert to solve for trade costs in terms of observables:

$$\left(\frac{t_{jk}t_{kj}}{t_{jj}t_{kk}}\right)^{\frac{1}{2}} = \left(\frac{V_{jk}V_{kj}}{V_{jj}V_{kk}}\right)^{\frac{1}{2(1-\sigma)}}$$

• Even simpler with symmetric bilateral and zero internal trade costs:

$$t_{jk} = \left(\frac{V_{jk}V_{kj}}{V_{jj}V_{kk}}\right)^{\frac{1}{2(1-\sigma)}}$$



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