

# Contents

<b>The Gravity Model of International Trade</b>	<b>1</b>
Core Principles . . . . .	1
The Basic Gravity Equation . . . . .	2
Theoretical Foundations . . . . .	2
Measuring Distance: From Simple to Sophisticated . . . . .	3
Estimation Methods . . . . .	4
Empirical Regularities . . . . .	5
Applications . . . . .	6
Numerical Example: US-Mexico Trade . . . . .	6
Extensions and Modern Developments . . . . .	7
Limitations and Criticisms . . . . .	7
Gravity vs Other Trade Models . . . . .	8
Key Takeaways . . . . .	8
References . . . . .	8
Problem-Solving Framework . . . . .	9

## The Gravity Model of International Trade

**Big Idea:** Bilateral trade between countries is proportional to their economic sizes (GDP) and inversely proportional to the distance between them - just like Newton's gravity law. This is one of the most robust empirical regularities in economics, explaining 60+ years of trade data.

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### Core Principles

#### Foundation

- **Empirical Workhorse:** Most successful empirical model in international economics (Leamer & Levinsohn, 1995)
- **Robust Prediction:** Explains 60-80% of variation in bilateral trade flows
- **Theoretical Grounding:** Multiple theoretical foundations (Anderson, Eaton-Kortum, Chaney, Melitz)
- **Policy Applications:** Used by WTO, World Bank, central banks for trade policy analysis
- **Universal Applicability:** Works across time periods, country pairs, and product categories

#### Historical Development

- **Tinbergen (1962):** First application of gravity to trade
- **Pöyhönen (1963):** Independent development of gravity framework
- **Anderson (1979):** First theoretical microfoundation
- **Bergstrand (1985-1989):** Monopolistic competition foundation
- **Eaton & Kortum (2002):** Ricardian foundations with technology differences
- **Anderson & van Wincoop (2003):** Structural gravity with multilateral resistance
- **Chaney (2008):** Extensive margin and firm heterogeneity
- **Helfrich & Gonchar (2025):** Time-varying distance with nightlights and population

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## The Basic Gravity Equation

### Intuitive Form

The simplest gravity equation:

$$X_{ij} = G \cdot (Y_i \cdot Y_j) / D_{ij}^\alpha$$

Where: -  $X_{ij}$  = exports from country i to country j -  $Y_i$  = GDP of exporting country i -  $Y_j$  = GDP of importing country j -  $D_{ij}$  = distance between i and j -  $\alpha$  = distance elasticity (typically 0.9 to 1.5) -  $G$  = gravitational constant (captures world trade openness)

**Analogy to Physics:** Newton's gravity:  $F = G(M_1 M_2) / D^2$  Trade gravity:  $X = G(Y_i Y_j) / D^\alpha$

### Log-Linear Estimation Form

Taking logs yields the standard estimating equation:

$$\ln(X_{ij}) = \alpha + \beta_1 \ln(Y_i) + \beta_2 \ln(Y_j) + \beta_3 \ln(D_{ij}) + \epsilon_{ij}$$

**Expected signs:** -  $\alpha > 0$  (larger exporter  $\rightarrow$  more exports) -  $\beta_2 > 0$  (larger importer  $\rightarrow$  more imports) -  $\beta_3 < 0$  (greater distance  $\rightarrow$  less trade)

### Augmented Gravity

Extended version includes additional variables:

$$\ln(X_{ij}) = \alpha + \beta_1 \ln(Y_i) + \beta_2 \ln(Y_j) + \beta_3 \ln(D_{ij}) + \beta_4 (\text{Common Border}) + \beta_5 (\text{Common Language}) + \beta_6 (\text{Colonial Ties}) + \beta_7 (\text{FTA}) + \epsilon_{ij}$$

**Trade facilitators** (positive effects): - Common border - Common language - Colonial history - Free trade agreements (FTAs) - Common currency - Legal system similarity

**Trade barriers** (negative effects): - Distance - Tariffs - Non-tariff barriers - Regulatory differences - Cultural distance

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## Theoretical Foundations

### 1. Anderson (1979): CES Preferences

First rigorous microfoundation using: - **Constant Elasticity of Substitution** (CES) preferences - **Armington assumption:** Products differentiated by country of origin - **Trade costs:** Iceberg costs (fraction of goods “melts” in transit)

**Key result:** Bilateral trade proportional to: - Exporter's GDP (supply) - Importer's GDP (demand) - Inverse of bilateral trade costs

### 2. Eaton & Kortum (2002): Ricardian Model

Technology-based foundation: - **Technology differences** across countries (Ricardian) - **Fréchet distribution** of productivities - **Comparative advantage** emerges endogenously

**Trade equation:**  $X_{ij} / X_j = (T_i(c_i d_{ij})^{-\sigma}) / (\sum_k T_k(c_k d_{kj})^{-\sigma})$

Where: -  $T_i$  = technology level of country i -  $c_i$  = input costs in country i -  $d_{ij}$  = bilateral trade costs -  $\sigma$  = trade elasticity parameter

### 3. Anderson & van Wincoop (2003): Multilateral Resistance

**Major innovation:** Bilateral trade depends not just on bilateral costs, but on: - **Outward multilateral resistance (OMR):** Average trade barrier exporter faces - **Inward multilateral resistance (IMR):** Average trade barrier importer faces

**Structural gravity equation:**  $X_{ij} = (Y_i Y_j / Y^W) \cdot (t_{ij} / (\Pi_i P_j))^{1-\sigma}$

Where: -  $Y^W$  = world GDP -  $t_{ij}$  = bilateral trade cost -  $\Pi_i$  = outward multilateral resistance of i -  $P_j$  = inward multilateral resistance of j -  $\sigma$  = elasticity of substitution

**Key insight:** “Border puzzle” resolved - trade within countries is much larger than between countries because of multilateral resistance, not just bilateral barriers.

**Multilateral resistance terms:**  $\Pi_i^{1-\sigma} = \sum_j (\gamma_j / P_j^{1-\sigma}) t_{ij}^{1-\sigma} P_j^{1-\sigma} = \sum_i (\gamma_i / \Pi_i^{1-\sigma}) t_{ij}^{1-\sigma}$

Where  $\gamma_i, \gamma_j$  are GDP shares.

### 4. Chaney (2008): Extensive Margin

Adds firm heterogeneity (à la Melitz 2003): - **Intensive margin:** How much each firm exports - **Extensive margin:** How many firms export - **Selection:** Only most productive firms export to distant markets

**Result:** Distance elasticity depends on: - Firm productivity distribution - Fixed costs of exporting - Variable trade costs

## Measuring Distance: From Simple to Sophisticated

### Traditional Distance Measures

#### 1. Great Circle Distance

- Shortest path on Earth’s surface between capitals or centroids
- Formula:  $d = r \cdot \arccos(\sin \phi_i \sin \phi_j + \cos \phi_i \cos \phi_j \cos(\lambda_i - \lambda_j))$
- Simple but assumes all economic activity at single point

#### 2. Capital-to-Capital Distance

- Distance between national capitals
- Easy to compute, widely used
- **Problem:** Capitals may not represent economic centers (e.g., Australia: Canberra vs Sydney/Melbourne)

#### 3. Population-Weighted Distance

- Weights distances by population in multiple cities
- $d_{ij} = \sum_k \sum_l (pop_k / pop_i)(pop_l / pop_j) d_{kl}$
- Better captures spatial distribution of economic activity

## Helfrich & Gonchar (2025): Nightlights Innovation

**Novel Contribution:** Time-varying distance measures using satellite data

**Key Innovation:** Traditional measures are **time-invariant** - assume economic geography is fixed. But economic activity shifts over time!

**Their Approach:** 1. **Nighttime lights data:** Satellite images showing light intensity - Proxy for economic activity (factories, cities, commercial areas) - Annual data from 1992-present - High spatial resolution (0.5-1 km grid)

2. **Population rasters:** Gridded population data

- Annual updates of population distribution
- Captures urbanization, migration, regional development

3. **Dynamic centroids:** Calculate weighted centers each year

- Nightlights-weighted centroid: Center of economic production
- Population-weighted centroid: Center of consumption/demand
- Directional measures: Different centroids for exports vs imports

**Formula:**  $\text{Centroid}_i^t = (\sum_{\text{pixels}} \text{weights}_{\text{pixel}}^t \cdot \text{coordinates}_{\text{pixel}}) / (\sum_{\text{pixels}} \text{weights}_{\text{pixel}}^t)$

Where weights are nightlights intensity or population

**Advantages:** - **Captures structural transformation:** As countries develop, economic centers shift - **China example:** Coastal development → centroid moved east over time - **Time-varying:** Reflects actual changes in economic geography - **Directional:** Different origins for exports (production) vs imports (consumption) - **Improved predictions:** Better fit to actual trade data than static measures

**Empirical Results** (Helfrich & Gonchar 2025): - Nightlights-based distance improves gravity model  $R^2$  by 3-5% - Particularly important for: - Large countries with dispersed economic activity - Developing countries with rapid urbanization - Long time series (captures structural change)

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## Estimation Methods

### 1. OLS with Logs

**Traditional approach:**  $\ln(X_{ij}) = \alpha + \ln(Y_i) + \ln(Y_j) + \ln(D_{ij}) + \text{controls} + \epsilon_{ij}$

**Problems:** - **Zero trade flows:**  $\ln(0)$  undefined - drops many observations - **Heteroskedasticity:** Error variance related to trade volume - **Selection bias:** Zeros are not random - **Jensen's inequality:**  $E[\ln X] \leq \ln E[X]$

### 2. Poisson Pseudo-Maximum Likelihood (PPML)

**Modern standard** (Santos Silva & Tenreyro 2006):

**Specification:**  $X_{ij} = \exp(\alpha + \ln(Y_i) + \ln(Y_j) + \ln(D_{ij}) + \text{controls}) \cdot \epsilon_{ij}$

**Advantages:** - Handles zeros naturally - Consistent under heteroskedasticity - Preserves adding-up constraints - Unbiased estimates even with log-normal errors

**Estimation:** Maximize Poisson likelihood  $L = \sum_{ij} [X_{ij} \cdot \ln(\lambda_{ij}) - \lambda_{ij} - \ln(X_{ij}!)]$

Where  $\lambda_{ij} = E[X_{ij}] = \exp(\beta_0 + \beta_i + \beta_j + \beta'Z_{ij})$

### 3. Structural Gravity with Fixed Effects

**Anderson & van Wincoop implementation:**

**Specification:**  $X_{ij} = \exp(\beta_0 + \beta_i + \beta_j + \beta'Z_{ij}) \cdot \lambda_{ij}$

Where: -  $\beta_i$  = exporter fixed effect (captures  $Y_i/\Pi_i$ ) -  $\beta_j$  = importer fixed effect (captures  $Y_j/P_j$ ) -  $Z_{ij}$  = bilateral variables (distance, FTA, etc.)

**Key advantage:** Fixed effects automatically control for multilateral resistance!

**No need to compute**  $\Pi_i$  and  $P_j$  explicitly - absorbed by FEs.

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## Empirical Regularities

### Typical Parameter Estimates

From meta-analysis of 1000+ studies:

Variable	Typical Estimate	Range
$\ln(\text{GDP}_{\text{exporter}})$	+1.0	[0.8, 1.2]
$\ln(\text{GDP}_{\text{importer}})$	+1.0	[0.8, 1.2]
$\ln(\text{Distance})$	-1.0	[-0.7, -1.5]
Common border	+0.5	[0.2, 0.8]
Common language	+0.4	[0.2, 0.7]
Colonial ties	+0.9	[0.5, 1.5]
FTA	+0.4	[0.2, 1.0]
Common currency	+0.6	[0.3, 1.2]

**Interpretation of log coefficients:** - Distance -1.0: Doubling distance reduces trade by 50% - FTA +0.4: FTA increases trade by 49% ( $e^{0.4} - 1 \approx 0.49$ )

### The Distance Puzzle

**Puzzle:** Distance coefficient has not decreased over time despite: - Falling transport costs - Communication revolution - Trade liberalization

**Explanations** (Disdier & Head 2008): 1. **Composition shift:** More differentiated goods traded (higher distance sensitivity) 2. **Increased trade in intermediates:** Multiple border crossings multiply distance effects 3. **Quality upgrading:** Distant partners trade higher-quality goods (less price-sensitive) 4. **Time costs:** Time in transit increasingly important (perishable, JIT production)

## Applications

### 1. Trade Policy Analysis

**Question:** What is the effect of a Free Trade Agreement (FTA)?

**Method:** Compare actual trade with counterfactual (no FTA)

**Steps:** 1. Estimate gravity equation with FTA dummy 2. Predicted trade with FTA:  $X_{ij}^{FTA} = \exp(\beta'Z_{ij} + \gamma \cdot FTA)$  3. Predicted trade without FTA:  $X_{ij}^{No FTA} = \exp(\beta'Z_{ij})$  4.

**Trade creation:**  $X_{ij}^{FTA} - X_{ij}^{No FTA}$

**Example:** NAFTA increased US-Mexico trade by ~50% (controlling for other factors)

### 2. Brexit Impact Assessment

**Scenario:** UK leaves EU single market

**Gravity prediction:** - EU-UK trade faces new barriers (tariffs, customs, regulations) - Barrier equivalent to distance increase or losing FTA benefit - Gravity coefficient on FTA  $\approx 0.5 \rightarrow$  trade falls by ~40%

**Actual outcome** (post-2021): UK-EU trade fell 20-25%, consistent with gravity predictions

### 3. Gains from Trade Liberalization

**General Equilibrium** (Arkolakis, Costinot, Rodríguez-Clare 2012):

**Welfare gains from trade:**  $\Delta W/W = (\alpha_{domestic})^{1/\sigma}$

Where: -  $\alpha_{domestic}$  = share of domestic spending on domestic goods -  $\sigma$  = trade elasticity (typically 4-8)

**Gravity role:** Estimate  $\sigma$  from distance coefficient!

**Result:** Countries with high trade share (low  $\alpha_{domestic}$ ) gain most from openness

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### Numerical Example: US-Mexico Trade

**Data (2023):** -  $Y_{US} = \$27$  trillion -  $Y_{Mexico} = \$1.8$  trillion - Distance (DC to Mexico City) = 1,887 km - Common border: Yes - FTA (USMCA): Yes - Common language: No

**Gravity prediction:**

$$\ln(X_{US \rightarrow MX}) = 10 + 1.0 \cdot \ln(27000) + 1.0 \cdot \ln(1800) - 1.0 \cdot \ln(1887) + 0.5 \cdot (\text{Border}) + 0.4 \cdot (\text{FTA})$$

$$= 10 + 10.20 + 7.50 - 7.54 + 0.5 + 0.4 = 21.06$$

**Predicted exports:**  $X_{US \rightarrow MX} = \exp(21.06) = \$1.44$  billion (scaled)

**Actual US exports to Mexico (2023):** ~\$320 billion

**With proper scaling constant:** Gravity explains observed magnitude

**Counterfactual - No USMCA:**  $\ln(X) = 21.06 - 0.4 = 20.66$   $X = \exp(20.66) = \$1.06$  billion (scaled)

**Trade creation from USMCA:**  $(1.44 - 1.06)/1.06 = 36\%$  increase

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## Extensions and Modern Developments

### 1. Sectoral Gravity

Different sectors have different distance sensitivities: - **Agricultural products:** High distance elasticity (perishable) - **Manufactured goods:** Medium distance elasticity - **Services:** Mixed (tourism: high; digital: low)

### 2. Firm-Level Gravity

Incorporating Melitz (2003) heterogeneous firms: - **Extensive margin:** Number of exporting firms - **Intensive margin:** Exports per firm - **Selection:** Only productive firms export to distant markets

### 3. Global Value Chains

Trade in tasks, not just goods: - **Value-added trade:** Tracking domestic content in exports - **Forward/backward linkages:** Position in supply chains - **Distance effects amplified:** Multiple border crossings

### 4. Digital Trade and Services

New challenges: - **Zero distance for some services:** Software, consulting - **Regulatory distance:** Data localization, privacy laws - **Platform effects:** Amazon, Alibaba reduce trade costs

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## Limitations and Criticisms

### Theoretical Critiques

1. **Black box:** Multiple theories generate same gravity equation
2. **Structural parameters:** Hard to identify deep parameters (preferences, technology)
3. **General equilibrium:** Partial equilibrium nature misses feedback effects

### Empirical Challenges

1. **Omitted variables:** Unobserved bilateral factors
2. **Reverse causality:** Trade affects GDP (simultaneity bias)
3. **Measurement error:** GDP, distance, trade data quality
4. **Missing data:** Informal trade, transfer pricing

### Policy Limitations

1. **Extrapolation:** Predictions for large policy changes uncertain
2. **Dynamic effects:** Gravity is static; ignores investment, growth effects

### 3. Heterogeneity: Average effects may not apply to specific country pairs

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#### Gravity vs Other Trade Models

Feature	Gravity	Ricardian	HO	New Trade
<b>Focus</b>	Bilateral volumes	Comparative advantage	Factor endowments	Firm heterogeneity
<b>Empirical success</b>	Excellent	Moderate	Mixed	Good
<b>Policy applications</b>	Extensive	Limited	Moderate	Growing
<b>Data requirements</b>	Moderate	Low	High	Very high
<b>Microfoundations</b>	Multiple	Clear	Clear	Clear
<b>Predictive power</b>	High	Medium	Medium	High

**Complementarity:** Gravity predicts *volumes*; other models predict *composition*

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#### Key Takeaways

1. **Empirical Workhorse:** Gravity explains 60-80% of bilateral trade variation
  2. **Simple but Powerful:** GDP and distance are primary determinants
  3. **Theoretical Grounding:** Multiple theories converge to gravity equation
  4. **Policy Tool:** Essential for trade agreement analysis, Brexit assessments
  5. **Evolving Measures:** Helpfrich-Gonchar nightlights innovation improves accuracy
  6. **Estimation Matters:** PPML with fixed effects is modern best practice
  7. **Multilateral Resistance:** Bilateral trade depends on all trading partners
  8. **Robust Over Time:** Distance effects persist despite falling transport costs
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## Problem-Solving Framework

### Predicting Bilateral Trade

1. Collect data:  $Y_i$ ,  $Y_j$ ,  $D_{ij}$ , other bilateral variables
2. Choose specification: Basic or augmented gravity
3. Estimate using PPML with fixed effects
4. Interpret coefficients (elasticities)
5. Predict trade:  $X_{ij} = \exp('Z_{ij})$

### Evaluating Trade Policies

1. Estimate baseline gravity with policy dummy
2. Compute counterfactual (set policy = 0)
3. Calculate trade creation/diversion
4. Welfare analysis (if general equilibrium model)

### Improving Predictions

1. Use time-varying distance (Helfrich-Gonchar approach)
2. Include sector-specific effects
3. Control for multilateral resistance (fixed effects)

4. Handle zeros properly (PPML)
5. Check for heterogeneity across country pairs

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**Last Updated:** January 2026 **Status:** Comprehensive reference including latest research (Helfrich & Gonchar 2025)