

## Transportation market analysis and procurement strategies in developing countries

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2014 Conference on Health and Humanitarian  
Logistics

Mexico City – June 5, 2014

# Transportation procurement for food aid distribution in Ethiopia

- Project in collaboration with the World Food Programme in Ethiopia (WFP)
  - Know-how in the areas of food security analyses, nutrition, food procurement and logistics (transportation and warehousing)



- Context
  - Ethiopia is the world food aid most dependant country (Devereau, 2000)
  - **Between 1988 and 2011, the WFP delivered about 896,000 MT of food aid per year on average (22,440 TL/year or 61 TL/day)**
  - Railways are inoperable and only 22% of the roadways are paved
  - **Transportation procurement and truckload operations processes similar to those of the commercial sector**

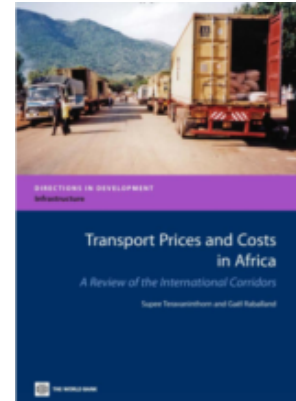
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# Transportation markets in Africa

- Africa's competitiveness suffers from high transportation costs (Thoburn, 2002)
  - Particularly for Sub-Saharan African countries, where the average freight costs are 20% higher than those of other countries (UNIDO, 1996)
  - No significant growth in trade due to major structural and policy obstacles
    - High transportation costs
    - Lack of standardized logistics processes (e.g. packaging and quality control systems) and innovation
  - Different markets across African regions
  - Data collection is largely inadequate in most African countries (Teravaninthorn and Raballand, 2010)
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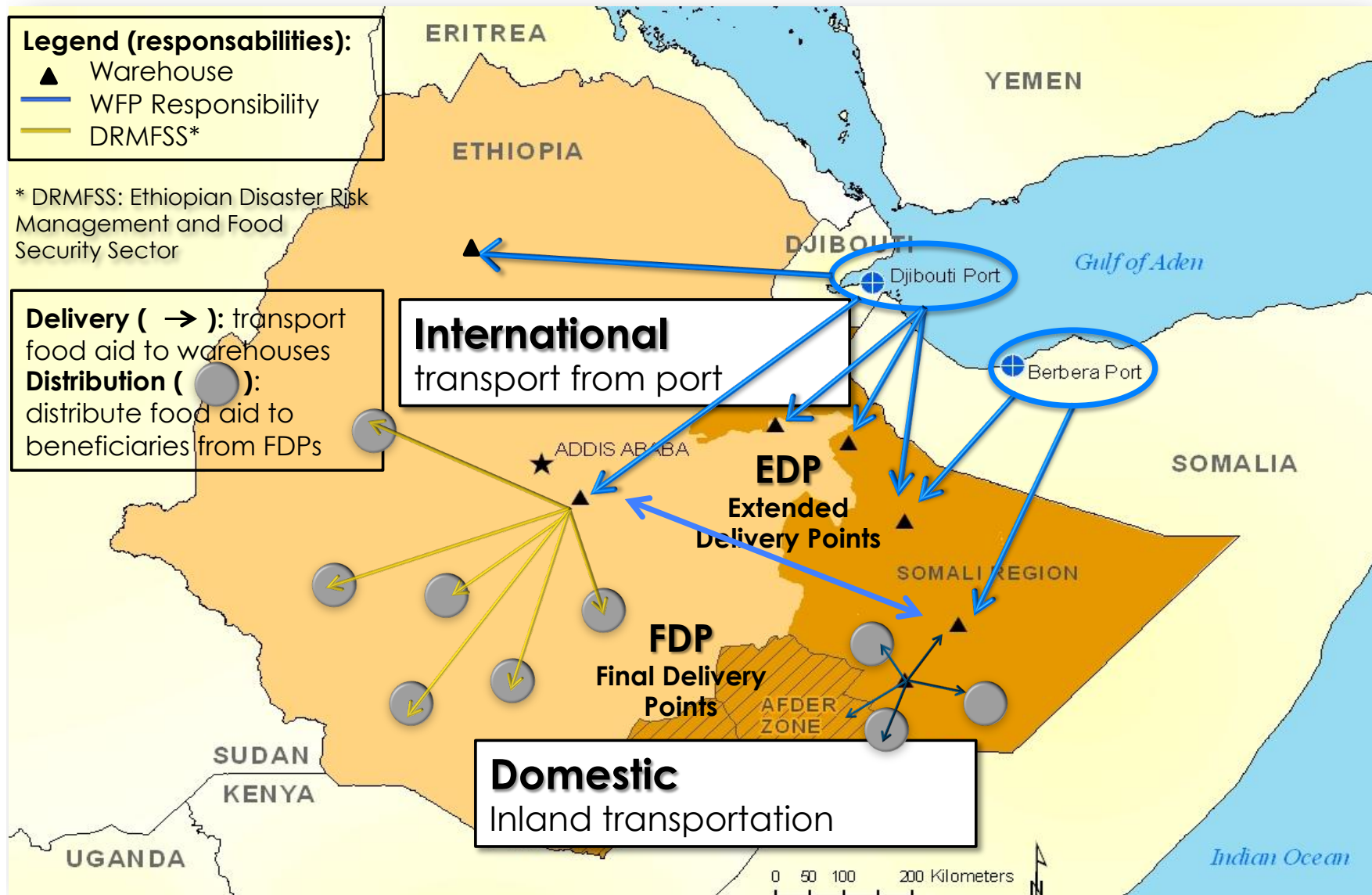
# Market analysis and transportation procurement for food aid in Ethiopia

- Transportation markets in developing countries are poorly understood
  - Lack of available data and diagnostic frameworks
  - High transportation prices?



- Determining whether a shipper pays the “right” price for transportation services is a complex task
- Explain the transportation procurement costs in Ethiopia through multiple regression analysis

# Food aid transportation in Ethiopia



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# Transportation procurement

- WFP contracts third-party transporters rather than rely on a private fleet
  - Use a Request for Quotation (RFQ) mechanism
  - Invite a core set of transporters to submit rate proposals (bids) on specific lanes every 6 months
  - Determine the transportation tariffs and winning carriers with the RFQ
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## WFP's core set of transporters

- The quality of service will mainly depend on the performance of the selected carriers
  - Importance of monitoring their carriers and updating their shortlist in order to only keep carriers that match their standards
  - At the time of data collection, their core set of transporters was composed of 75 carriers
    - 70% of the transporters registered at the Ethiopian Road Transport Authority
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# Ground transportation

## International vs domestic

- Operations: differences in quantity of goods to be transported, loading and offloading, road conditions, escorts, etc.
- Trucks: larger for international (40 MT) than for domestic (5 to 40 MT)
- Pricing scheme and business repartition

**International**



**Domestic**





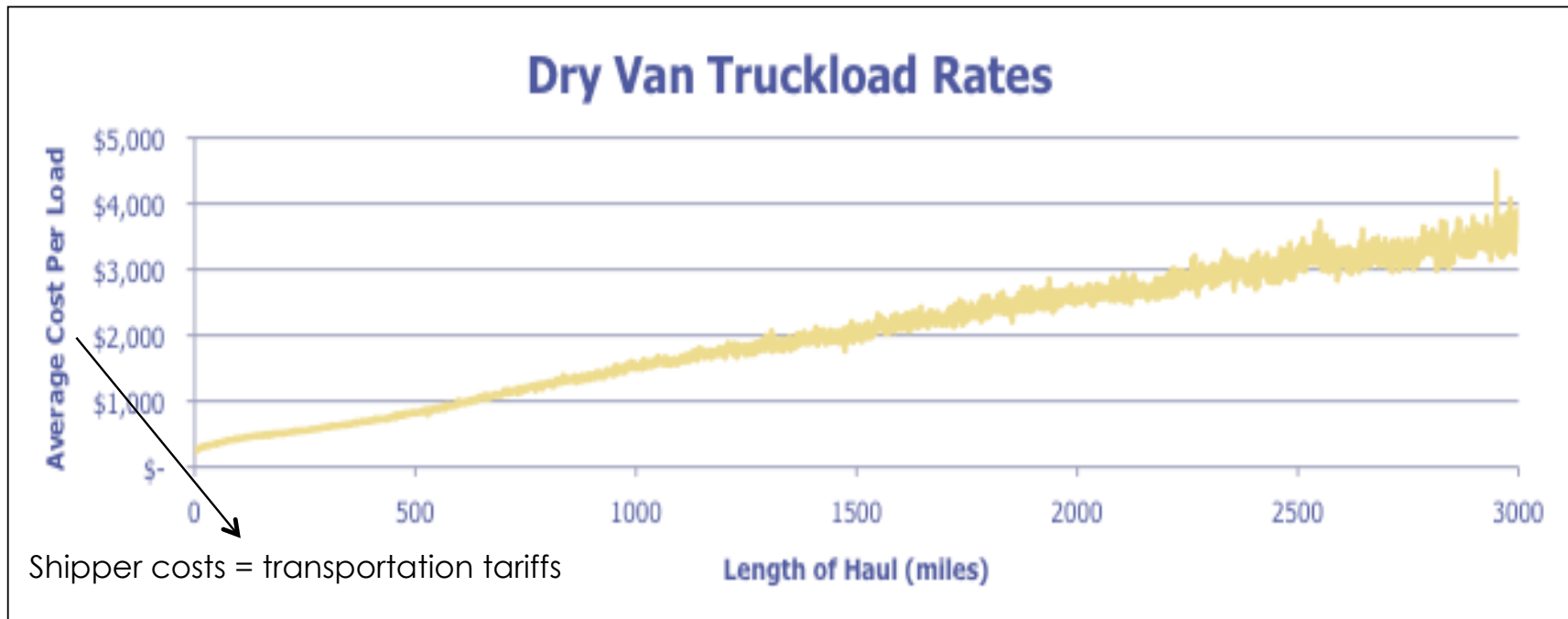
# Pricing mechanism

- Domestic: lowest bid
- International: benchmark rates with rate offers and other market prices (cement, fertilizer, ...)

## Core set of carriers

| Lane<br>(origin,<br>destination) | Distance | Estimated<br>tonnage | Transporter<br>1<br>(Birr/MT) | Transporter<br>2<br>(Birr/MT) | Transporter<br>3<br>(Birr/MT) | Transporter<br>4<br>(Birr/MT) | ... | Transporter<br>m<br>(Birr/MT) |
|----------------------------------|----------|----------------------|-------------------------------|-------------------------------|-------------------------------|-------------------------------|-----|-------------------------------|
| $(o_1, d_1)$                     | $km_1$   | $ton_1$              | $Bid_{1,1}$                   | -                             | Benchmark                     | $d_{1,4}$                     |     | $Bid_{1,m}$                   |
| $(o_1, d_2)$                     | $km_2$   | -                    | $Bid_{2,1}$                   | $Bid_{2,2}$                   | -                             | $Bid_{2,4}$                   |     | $Bid_{2,m}$                   |
| $(o_1, d_3)$                     | $km_3$   | $ton_3$              | <b>Lowest bids</b>            | $Bid_{3,2}$                   | Benchmark                     | -                             |     | $Bid_{3,m}$                   |
| ...                              |          |                      |                               |                               |                               |                               |     | ...                           |
| $(o_1, d_n)$                     | $km_n$   | $ton_n$              | $Bid_{n,1}$                   | $Bid_{n,2}$                   | Benchmark                     | $n,4$                         |     | $Bid_{n,m}$                   |

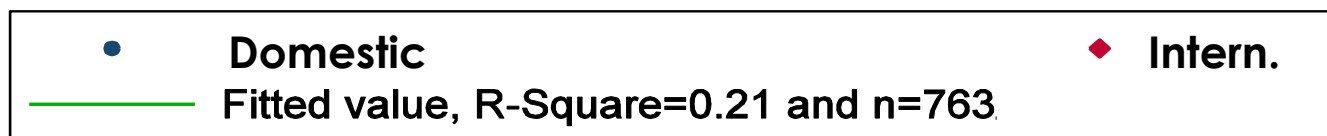
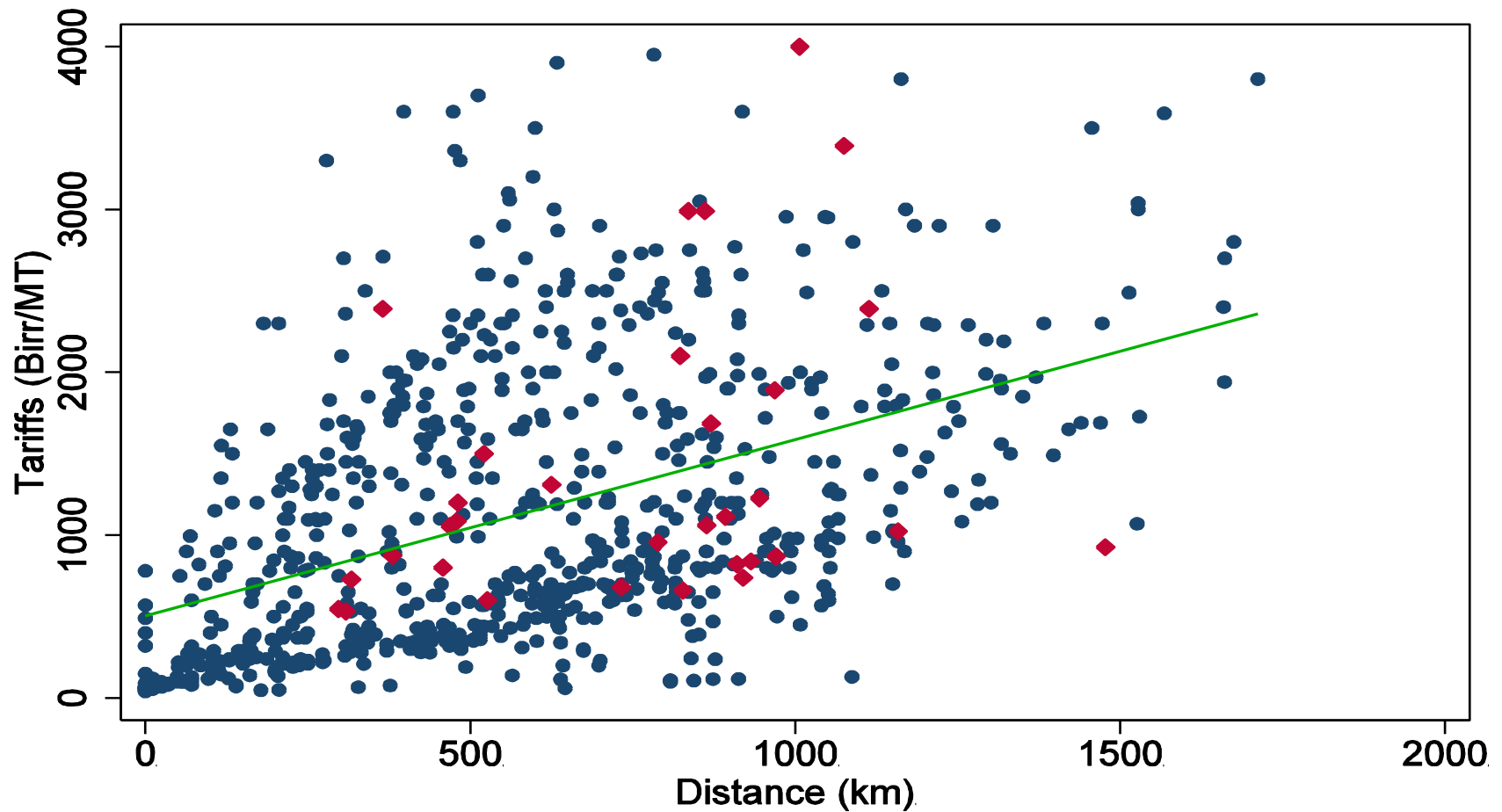
# Transportation tariffs in North America



Slide source: Chris Caplice, MIT CTL. Data source: Chainalytics LLC.

In North America, distance alone explains about 80% to 85% of the variability in prices

# Transportation tariffs in Ethiopia



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# Methodology

- Multivariate linear models to explain transportation tariffs

$$\ln(\textit{tariff}) = f(C, M, X) + \varepsilon ,$$

Where  $\varepsilon$  is the random error due to unobservable factors

- Three categories of independent variables
    - Linehaul cost drivers (C)
    - Market structure (M)
    - Socio-economic factors (E)
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# Data sources

- Data provided by the WFP (**linehaul cost drivers and market structure**)
    - An RFQ executed by the WFP in Ethiopia
    - About 11,000 observations (bids)
    - Contracts derived from this RFQ were valid from September 2010 to March 2011
  - Data published by the Central Statistical Agency (**socio-economic factors**)
    - Population
    - Agricultural production
    - Number of manufactures of the major industrial groups
    - Number of major livestock types
-

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## Linehaul cost drivers (C)

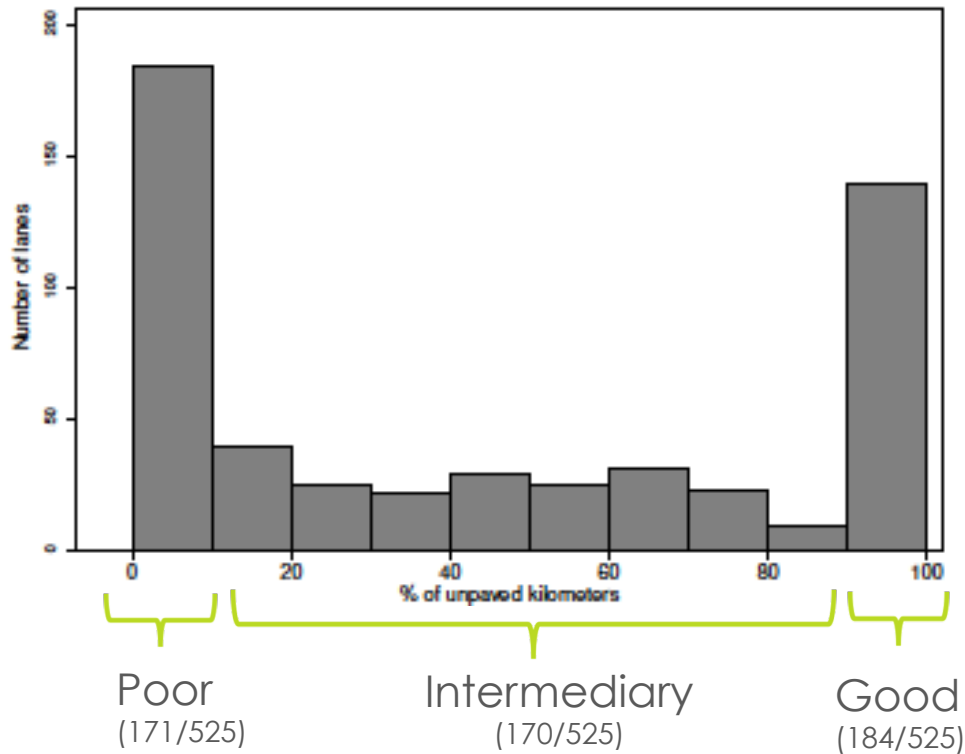
- Lane-specific variables which directly affect carrier costs
  - Distance
  - Estimated tonnage to be transported
- Variables specific to the developing country context
  - Road quality (paved and unpaved distances)
  - Risk perception (WFP categories) and indicators for transportation within the Somali region of Ethiopia

# Dealing with an incomplete data set

- Some information was not given or specified on certain lanes
- In order to limit the number of observations to discard, we have created categorical variables
  - Road quality based on paved and unpaved distances (only for the domestic market)
  - Estimated tonnage
  - WFP's risk perception
    - None in Somali region (Domestic)
    - Low in Somali region (Domestic)
    - High in Somali region (International and Domestic)
    - Not specified in Somali region (International and Domestic)
    - Not specified for other regions than Somali (International and Domestic)\*

\* Category of reference

# Road quality



## Domestic

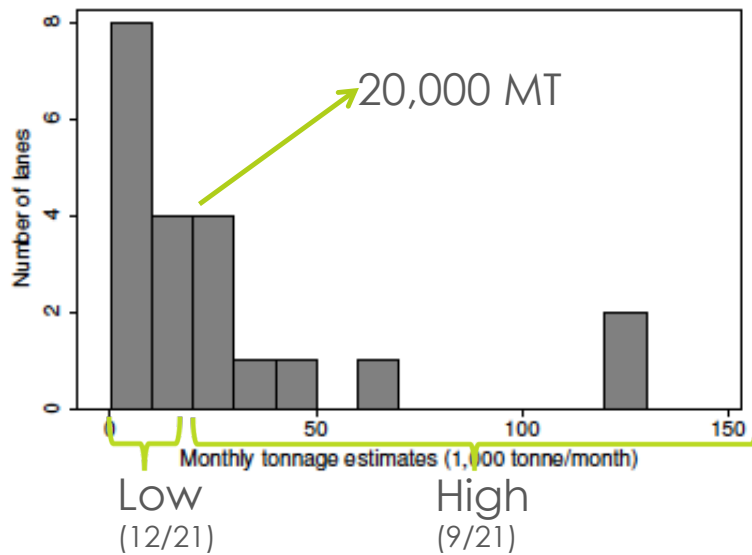
- Categorical variable
  - Good (184/731)
  - Intermediate (170/731)
  - Poor (171/731)
  - Unknown (262/731)



# Tonnage estimates

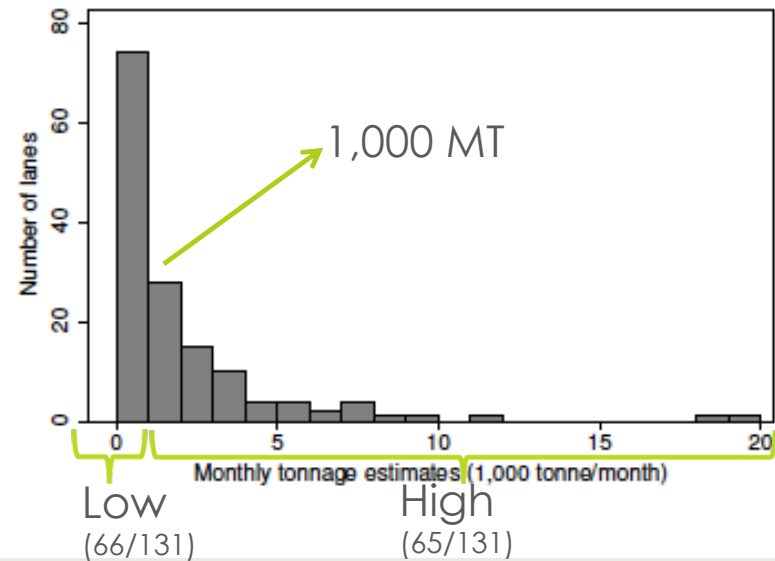
## International

- Low (12/32) ; High (9/32) ; Not specified (11/32)



## Domestic

- Low (66/731) ; High (65/731) ; Not specified (600/731)



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## Market structure (M)

- The truckload transportation market in Ethiopia is not mature, which could lead to large markups
  - Considering variables to measure the impact of the market structure
    1. Competition intensity
    2. Market dispersion
    3. Market concentration
-

# Market structure (M)

- Information from the bid distribution used as a proxy to measure the impact of market structure on transportation tariffs

| Lane<br>(origin,<br>destination) | Tariff<br>(Birr/MT) | Distance      | Estimated<br>tonnage | Transporter<br>1<br>(Birr/MT) | Transporter<br>2<br>(Birr/MT) | Transporter<br>3<br>(Birr/MT) | Transporter<br>4<br>(Birr/MT) | ... | Transporter<br>m<br>(Birr/MT) |
|----------------------------------|---------------------|---------------|----------------------|-------------------------------|-------------------------------|-------------------------------|-------------------------------|-----|-------------------------------|
| $(o_1, d_1)$                     | $\text{tariff}_1$   | $\text{km}_1$ | $\text{ton}_1$       | $\text{Bid}_{1,1}$            | -                             | $\text{Bid}_{1,3}$            | $\text{Bid}_{1,4}$            |     | $\text{Bid}_{1,m}$            |
| $(o_1, d_2)$                     | $\text{tariff}_2$   | $\text{km}_2$ | -                    | $\text{Bid}_{2,1}$            | $\text{Bid}_{2,2}$            | -                             | $\text{Bid}_{2,4}$            |     | $\text{Bid}_{2,m}$            |
| $(o_1, d_3)$                     | $\text{tariff}_3$   | $\text{km}_3$ | $\text{ton}_3$       | -                             | $\text{Bid}_{3,2}$            | $\text{Bid}_{3,3}$            | -                             |     | $\text{Bid}_{3,m}$            |
| ...                              |                     |               |                      |                               |                               |                               |                               |     | ...                           |
| $(o_1, d_n)$                     | $\text{tariff}_4$   | $\text{km}_n$ | $\text{ton}_n$       | $\text{Bid}_{n,1}$            | $\text{Bid}_{n,2}$            | -                             | $\text{Bid}_{n,4}$            |     | $\text{Bid}_{n,m}$            |

# 1. Competition intensity

- Intensity of competition on a lane is measured using the **number of bids**, i.e.  $\ln(\# \text{ bids})$

| Lane<br>(origin,<br>destination) | Tariff<br>(Birr/MT) | Distance      | Estimated<br>tonnage | Transporter<br>1<br>(Birr/MT) | Transporter<br>2<br>(Birr/MT) | Transporter<br>3<br>(Birr/MT) | Transporter<br>4<br>(Birr/MT) | ... | Transporter<br>m<br>(Birr/MT) |
|----------------------------------|---------------------|---------------|----------------------|-------------------------------|-------------------------------|-------------------------------|-------------------------------|-----|-------------------------------|
| $(o_1, d_1)$                     | $\text{tariff}_1$   | $\text{km}_1$ | $\text{ton}_1$       | $\text{Bid}_{1,1}$            | -                             | $\text{Bid}_{1,3}$            | $\text{Bid}_{1,4}$            |     | $\text{Bid}_{1,m}$            |
| $(o_1, d_2)$                     | $\text{tariff}_2$   | $\text{km}_2$ | -                    | $\text{Bid}_{2,1}$            | $\text{Bid}_{2,2}$            | -                             | $\text{Bid}_{2,4}$            |     | $\text{Bid}_{2,m}$            |
| $(o_1, d_3)$                     | $\text{tariff}_3$   | $\text{km}_3$ | $\text{ton}_3$       | -                             | $\text{Bid}_{3,2}$            | $\text{Bid}_{3,3}$            | -                             |     | $\text{Bid}_{3,m}$            |
| ...                              |                     |               |                      |                               |                               |                               |                               |     | ...                           |
| $(o_1, d_n)$                     | $\text{tariff}_4$   | $\text{km}_n$ | $\text{ton}_n$       | $\text{Bid}_{n,1}$            | $\text{Bid}_{n,2}$            | -                             | $\text{Bid}_{n,4}$            |     | $\text{Bid}_{n,m}$            |

## 2. Market dispersion

- To measure for the market dispersion (information transparency) in the market, we compute a **standardized bid range** on each lane

| Lane         | Tariff            | Distance      | Estimated tonnage | Transporter 1 (birr/MT) | Transporter 2 (birr/MT) | ... | Transporter m (birr/MT) |
|--------------|-------------------|---------------|-------------------|-------------------------|-------------------------|-----|-------------------------|
| $(o_1, d_1)$ | $\text{tariff}_1$ | $\text{km}_1$ | $\text{ton}_1$    | $\text{Bid}_{1,1}$      | -                       |     | $\text{Bid}_{1,m}$      |
| $(o_1, d_2)$ | $\text{tariff}_2$ | $\text{km}_2$ | -                 | $\text{Bid}_{2,1}$      | $\text{Bid}_{2,2}$      |     | $\text{Bid}_{2,m}$      |
| $(o_1, d_3)$ | $\text{tariff}_3$ | $\text{km}_3$ | $\text{ton}_3$    | -                       | $\text{Bid}_{3,2}$      |     | $\text{Bid}_{3,m}$      |
| ...          |                   |               |                   |                         |                         |     | ...                     |
| $(o_1, d_n)$ | $\text{Tariff}_4$ | $\text{km}_n$ | $\text{ton}_n$    | $\text{Bid}_{n,1}$      | $\text{Bid}_{n,2}$      |     | $\text{Bid}_{n,m}$      |

$$\frac{3^{\text{rd}} \text{ quartile} - 1^{\text{st}} \text{ quartile}}{\text{median}}$$

### 3. Market concentration

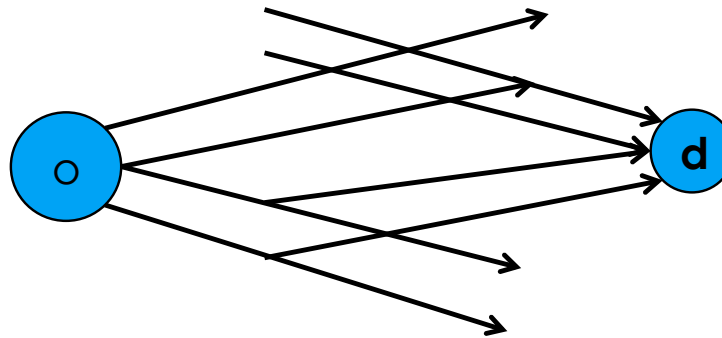
- To reflect the market concentration, the **number of active transporters** have been computed at the shipping origins and destinations

$o\_carrier :$

$\sum_d$  number of distinct bidding carriers

$d\_carrier :$

$\sum_o$  number of distinct bidding carriers



# Network descriptive statistics

| Market                                   | International market   |          |                    | Domestic market   |         |                    |
|--|--|----------|--------------------|---|---------|--------------------|
| Network                                  | 2 origins (ports)<br>24 destinations (EDPs)<br>32 lanes<br>46 carriers |          |                    | 33 origins (EDPs)<br>98 destinations (FDPs)<br>731 lanes<br>59 carriers |         |                    |
| Descriptive statistics                   | <i>n</i>   | mean     | standard deviation | <i>n</i>  | mean    | standard deviation |
| Distance (km)                            | 32   | 756.1    | 289.7              | 731   | 589.8   | 356.3              |
| Estimated tonnage per lane (tonne/month) | 21   | 27,426.9 | 36,969.3           | 131   | 2,055.4 | 3,028.2            |
| Number of bids per lane                  | 32   | 17.9     | 7.3                | 731   | 14.9    | 10.3               |
| Number of bids per carrier               | 46   | 14.4     | 5.5                | 59  | 212.3   | 190.5              |
| Per cent of winning bids per carrier     | 46   | 39.0     | 37.6               | 59  | 8.4     | 12.1               |
| Tariff per km (Birr/tonne·km)            | 32   | 2.0      | 1.2                | 731   | 2.4     | 2.1                |

# International market

Best model obtained with a backward regression:

$$\ln(\text{tarrif}) = f(C, M)$$

Distance alone explain less than 9% of the variability in tariffs:

$$\ln(\text{tarrif}) = \beta_1 \text{ distance} + \beta_0$$

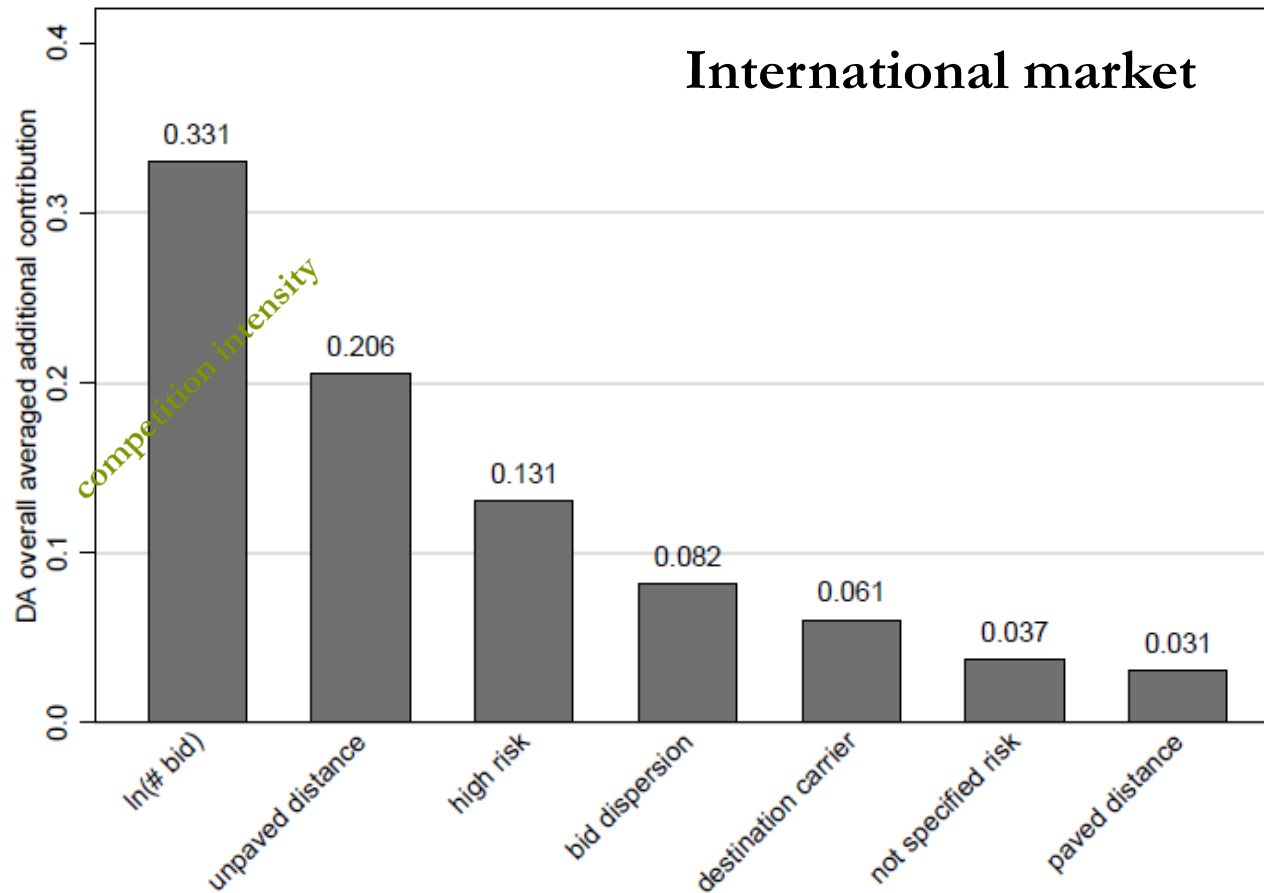
|                            | Paved & unpaved          | Competition               | Cost & Market            |
|----------------------------|--------------------------|---------------------------|--------------------------|
| <b>Cost driven</b>         |                          |                           |                          |
| Road conditions            |                          |                           |                          |
| <i>paved</i> (km)          | 0.000137<br>(0.000335)   | 0.000580***<br>(0.000180) | 0.000497**<br>(0.000194) |
| <i>unpaved</i> (km)        | 0.00160***<br>(0.000408) | 0.00103**<br>(0.000389)   | 0.00116***<br>(0.000318) |
| Risk perception            |                          |                           |                          |
| <i>high</i>                |                          |                           | 0.607***<br>(0.161)      |
| <i>not specified</i>       |                          |                           | 0.0604<br>(0.119)        |
| Tonnage estimates          |                          |                           |                          |
| <i>low</i>                 |                          |                           |                          |
| <i>high</i>                |                          |                           |                          |
| <b>Market structure</b>    |                          |                           |                          |
| Competition intensity      |                          |                           |                          |
| $\ln(\#bids)$              |                          | -0.823***<br>(0.0863)     | -0.888***<br>(0.105)     |
| Market dispersion          |                          |                           |                          |
| <i>bid dispersion</i>      |                          |                           | -1.510***<br>(0.282)     |
| Market concentration       |                          |                           |                          |
| <i>carrier destination</i> |                          |                           | -0.00525*<br>(0.00272)   |
| Constant                   | 6.618***<br>(0.250)      | 8.829***<br>(0.328)       | 9.561***<br>(0.453)      |
| <i>n</i>                   | 32                       | 32                        | 32                       |
| <i>R-squared</i>           | 0.442                    | 0.728                     | 0.878                    |
| <i>Adj. R-squared</i>      | 0.404                    | 0.710                     | 0.842                    |
| <i>Max. VIF value</i>      | 1.19                     | 1.53                      | 3.31                     |

Robust standard errors in parentheses, \*\*\* p<0.01, \*\* p<0.05 and \* p<0.1



# Dominance analysis

Proposed by Azen and Budescu (2003)



# Domestic market

Best model obtained with a backward regression:

$$\ln(\text{tarrif}) = f(C, M)$$

Distance alone explain less than 27% of the variability in tariff:

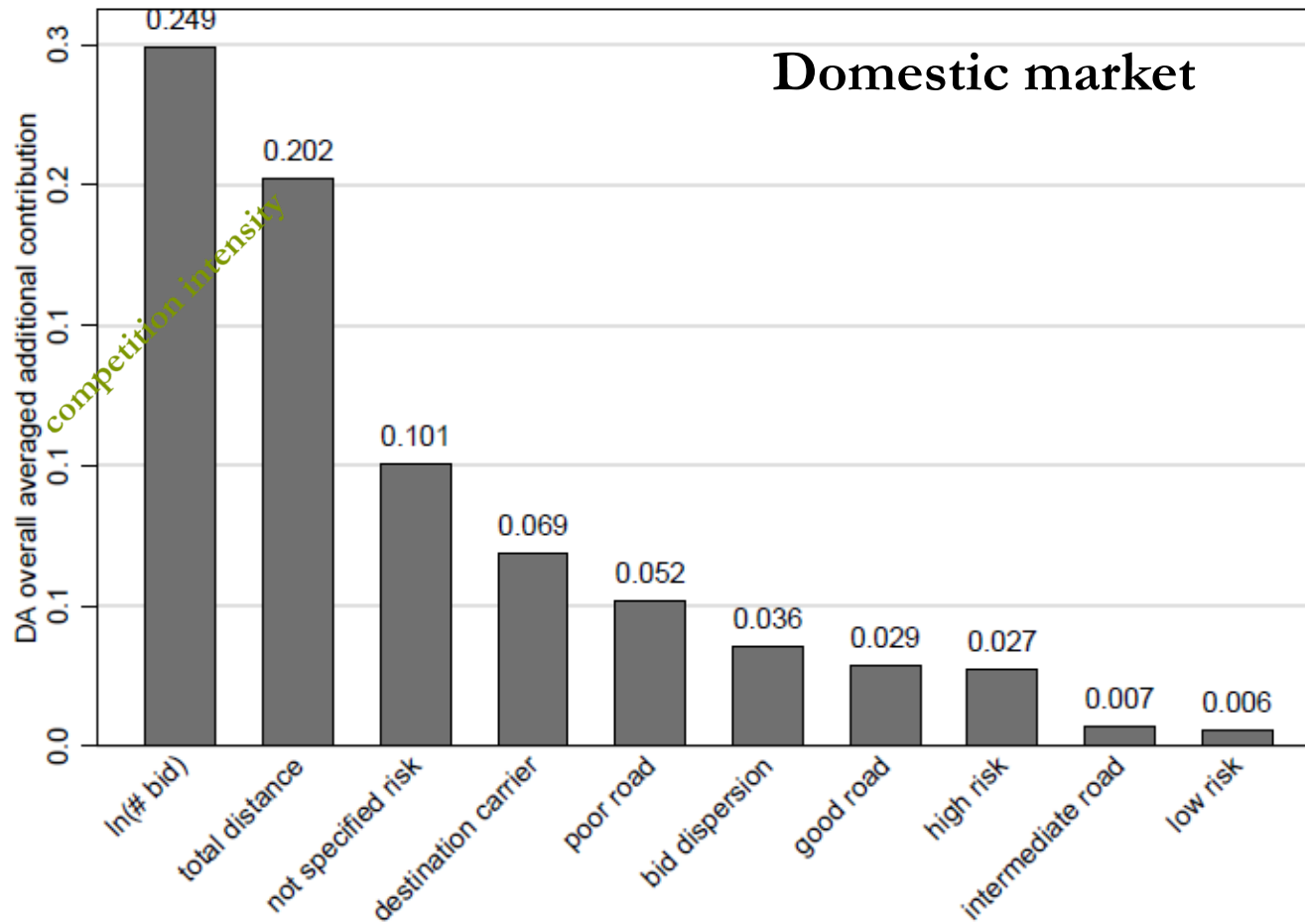
$$\ln(\text{tarrif}) = \beta_1 \text{ distance} + \beta_0$$

|                              | Paved & unpaved          | Competition              | Cost & Market            |
|------------------------------|--------------------------|--------------------------|--------------------------|
| <b>Cost driven</b>           |                          |                          |                          |
| <i>distance</i> (km)         | 0.00164***<br>(7.32e-05) | 0.00123***<br>(6.42e-05) | 0.00112***<br>(6.14e-05) |
| <b>Road conditions</b>       |                          |                          |                          |
| <i>poor</i>                  | 1.102***<br>(0.0685)     | 0.258***<br>(0.0687)     | 0.204***<br>(0.0604)     |
| <i>intermediate</i>          | 0.310***<br>(0.0701)     | -0.0573<br>(0.0583)      | -0.0838<br>(0.0535)      |
| <i>good</i>                  | -0.325***<br>(0.0634)    | -0.256***<br>(0.0517)    | -0.149***<br>(0.0495)    |
| <b>Risk perception</b>       |                          |                          |                          |
| <i>none</i>                  |                          |                          | -0.145<br>(0.0999)       |
| <i>low</i>                   |                          |                          | 0.431***<br>(0.0771)     |
| <i>high</i>                  |                          |                          | 0.644***<br>(0.0701)     |
| <i>not specified</i>         |                          |                          | 0.232***<br>(0.0527)     |
| <b>Tonnage estimates</b>     |                          |                          |                          |
| <i>low</i>                   |                          |                          |                          |
| <i>high</i>                  |                          |                          |                          |
| <b>Market structure</b>      |                          |                          |                          |
| <b>Competition intensity</b> |                          |                          |                          |
| <i>ln(#bids)</i>             |                          | -0.717***<br>(0.0359)    | -0.564***<br>(0.0402)    |
| <b>Market dispersion</b>     |                          |                          |                          |
| <i>bid dispersion</i>        |                          |                          | -0.718***<br>(0.0891)    |
| <b>Market concentration</b>  |                          |                          |                          |
| <i>carrier origin</i>        |                          |                          |                          |
| <i>carrier destination</i>   |                          |                          | -0.00557***<br>(0.00107) |
| Constant                     | 5.471***<br>(0.0716)     | 7.737***<br>(0.120)      | 7.806***<br>(0.140)      |
| n                            | 731                      | 731                      | 731                      |
| R-squared                    | 0.061                    | 0.125                    | 0.175                    |
| Adj. R-squared               | 0.561                    | 0.725                    | 0.775                    |
| Max. VIF value               | 1.88                     | 2.28                     | 3.97                     |

Robust standard errors in parentheses, \*\*\* p<0.01, \*\* p<0.05 and \* p<0.1

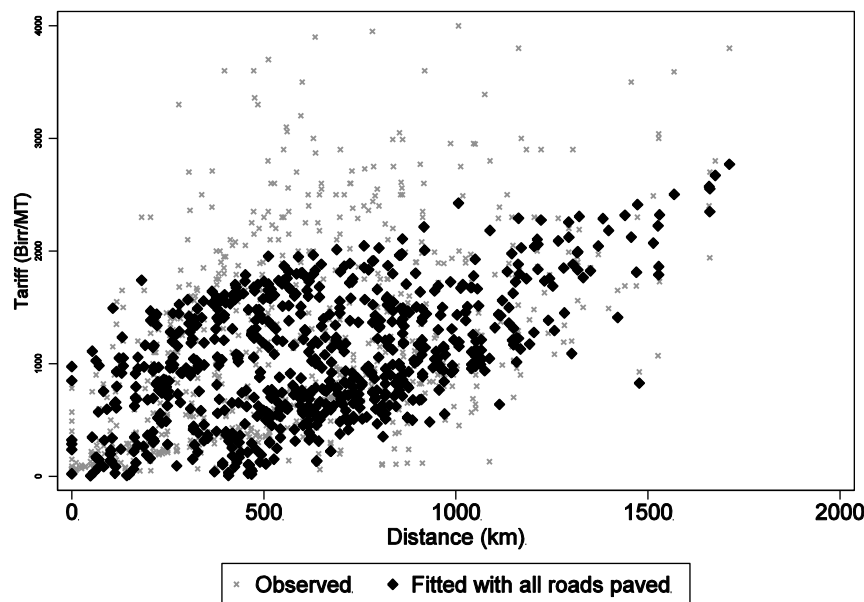
# Dominance analysis

Proposed by Azen and Budescu (2003)

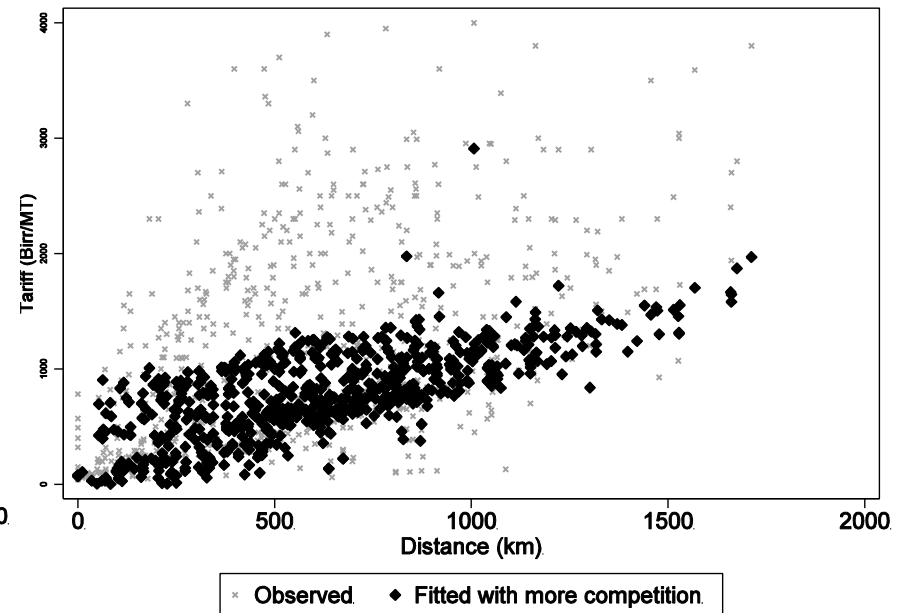


# Illustrations of the counterfactual costs “What if” scenarios

“Paved roads”



“More competition”



## International corridors:

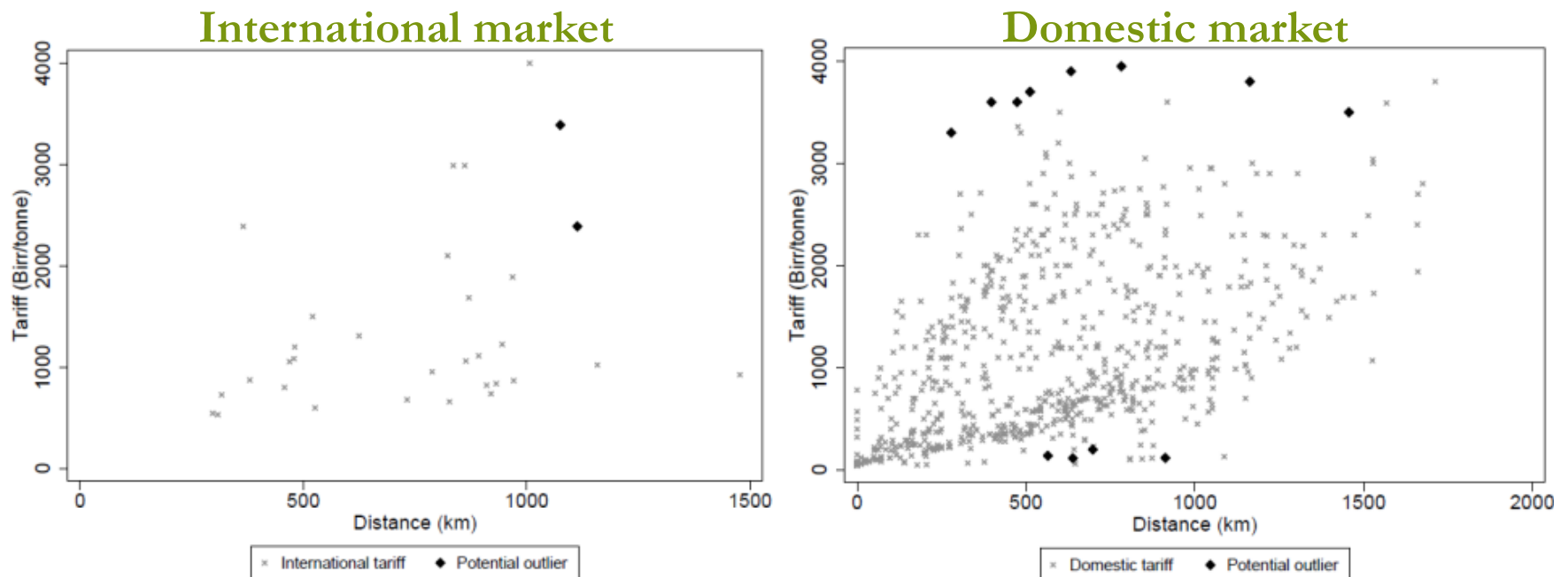
- Better road conditions should reduce shipping costs by 18% and increase competition by up to 44%.

## Domestic lanes:

- Better road conditions should reduce shipping costs by 12% and increase competition by up to 39%.

# Decision support tool

- Accurate cost estimates to improve supply chain decisions
- Improve contracting process: potential outliers identified with a Bonferroni test



# Similar analysis with socio-economic factors (S)

## International

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- Same significant variables, but high tonnage and not specified risk
- Adj. R-Square: 62.5%
- Compare with the market structure model: 84.2%

## Domestics

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- Same significant variables, but high tonnage
- Adj. R-Square: 68.3%
- Compare with the market structure model: 77.5%

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# Contributions

- First such study in the humanitarian sector
  - The main determinants of tariffs are the road quality and competition intensity
  - The low level of competition explains high transportation prices
  - The statistical tariff models help identify lanes that may require managerial intervention
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# Discussions

- How can transportation procurement processes be facilitated for organisations operating in Africa?
  - What can be done to increase competition in African transportation markets?
  - What policies should be implemented to reduce transportation tariffs?
  - Can humanitarian organisations, like the WFP, have an influence on such policies?
  - Would it be useful to create an African Logistics Cluster assembling all involved stakeholders (governmental authorities, logistics service providers and shippers)? Would it be feasible?
-