

Agricultural trade data processing

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Raw trade data

FAO receives data on trade flows from [United Nations Statistical Division](#). The division runs [Commodity Trade Statistics Database UN Comtrade](#) “It stores standardised official annual trade statistics reported by countries and reflecting international merchandise flows detailed by commodity and partner country with coverage reaching up to 99 percent of world merchandise trade¹”.

One can freely download this standardised statistics from the [open data base](#). Statistical Division of FAO gets unstandardised data.

Table 1: Random sample of import trade flows of 2011 year, reported by the US

year	reporter	partner	hs	flow	weight	qty	qunit	value
2011	842	764	8542320060	1	-	245787	5	442266
2011	842	158	8483103010	1	4652	4124	5	146089
2011	842	528	3213900000	1	-	1173850	5	1965069
2011	842	158	9801001075	1	-	-	1	85834795
2011	842	380	9801001049	1	-	-	1	2223007
2011	842	166	4012903000	1	49	49	8	312
2011	842	124	2001902500	1	404	404	8	2030

¹http://unstats.un.org/unsd/comtrade_announcement.htm Comtrade Announcement

year	reporter	partner	hs	flow	weight	qty	qunit	value
2011	842	36	6104442010	1	364	162	11	89541
2011	842	586	6207998520	1	364	15	11	3495
2011	842	410	2903592000	1	100	100	8	6495

This is an example of unstandardised data on trade inflows in 2011, reported by the United States. Reporters and trade partners are represented with three-digit numerical codes used by the Statistics Division of the United Nations. Trade commodities are classified with extended Harmonized Commodity Description and Coding System (HS)² maintained by the World Customs Organization³.

Weight is measured in kilograms and value in US dollars. Quantity (qty column) is an optional alternative for weight. It could be measured in different units (qunit column). See full list of possible units and their descriptions in Annex I of Quantity and Weight Data in UN Comtrade⁴.

Country-specific HS commodity codes

Harmonized system classification is declared by WCO up to 6 digits. A country may extend HS to more detailed level to better respond to local circumstances. Let's compare differences in codes under subheading 0202 Meat of bovine animals, frozen between the US and Brazil⁵.

Table 2: Extension of HS codes by the US

hs	Description
02	CHAPTER 2 MEAT AND EDIBLE MEAT OFFAL
0202	Meat of bovine animals, frozen:
0202.10	- Carcases and half-carcases:
0202.10.05	- - Described in general note 15 of the tariff schedule ...:
0202.10.05.10	- - - Veal
0202.10.05.90	- - - Other
0202.10.10	- - Described in additional U.S. note 3 to this chapter ...:
0202.10.10.10	- - - Veal
0202.10.10.90	- - - Other
0202.10.50	- - Other:
0202.10.50.10	- - - Veal
0202.10.50.90	- - - Other
0202.20	- Other cuts with bone in:
	- - Described in general note 15 of the tariff schedule ...:
	- - - Processed:
0202.20.02	- - - - High-quality beef cuts
0202.20.04	- - - - Other
0202.20.06	- - - Other
	- - Described in additional U.S. note 3 to this chapter ...:
	- - - Processed:
0202.20.10	- - - - High-quality beef cuts
0202.20.30	- - - - Other
0202.20.50	- - - Other

²<http://www.wcoomd.org/en/topics/nomenclature/overview/what-is-the-harmonized-system.aspx> What is the Harmonized System (HS)?

³<http://www.wcoomd.org/en.aspx> World Customs Organization

⁴<http://unstats.un.org/unsd/tradekb/Knowledgebase/Quantity-and-Weight-Data-in-UN-Comtrade> Quantity and Weight Data in UN Comtrade

⁵<http://madb.europa.eu> Descriptions of country-specific HS-codes are provided by Market Access Database and copyrighted by Mendel Verlag, Germany.

hs	Description
0202.20.80	- - Other
0202.30	- Boneless:
	- - Described in general note 15 of the tariff schedule ...:
	- - - Processed:
0202.30.02	- - - - High-quality beef cuts
0202.30.04	- - - - Other
0202.30.06	- - - Other
	- - Described in additional U.S. note 3 to this chapter ...:
	- - - Processed:
0202.30.10	- - - - High-quality beef cuts
0202.30.30	- - - - Other
0202.30.50	- - - Other
0202.30.80	- - Other

Table 3: Extension of HS codes by Brazil

hs	Description
02	CHAPTER 2 MEAT AND EDIBLE MEAT OFFAL
0202	Meat of bovine animals, frozen:
0202.10	- Carcases and half-carcases
0202.20	- Other cuts with bone in:
0202.20.10	- - Forequarters
0202.20.20	- - Hindquarters
0202.20.90	- - Other
0202.30	- Boneless

The set of HS-codes from the US is wider, than Brazilian one. For boneless meat Brazil doesn't extend standard code 0202.30, when the US use here seven additional codes.

Country codes

Codes of reporters

Area codes of reporters are standardized by the Statistical Department. The SD follows *in general* the United Nations Standard Country or Area Codes for Statistical Use⁶. The code scheme used by the SD⁷ is slightly modified from the official one⁸. For example the official scheme offers code 840 for the US, when the modified version uses 842.

Codes of partners

Partners' codes in Tariffline data are not standardised and presented as they were reported by countries. Reporters can use as standard version of codes, so the version of the Statistical Department. For example, in Tariffline data there are 27 country codes which are not presented in official scheme and 40 codes not covered by the modified version.⁹

⁶<http://comtrade.un.org/pb/> The United Nations Statistics Division (2015). The 2014 International Trade Statistics Yearbook, Volume I - Trade by Country, xix.

⁷<http://comtrade.un.org/data/doc/api/> The UN Comtrade data extraction API

⁸<http://unstats.un.org/unsd/methods/m49/m49alpha.htm> Countries or areas, codes and abbreviations

⁹<http://rpubs.com/malexan/m49> Matrunich A. (2015). M49 country codes in Tariffline

Initial validation of trade data

At prevalidation step we are to make a decision should we accept data from a specific country for the further processing or not. A country could provide data of good quality for one part of commodities and inadequate level of quality for another part. We want to estimate quality differences between commodities of a country.

Quality of data is estimated by following indicators:

- Share per cent of missing quantities
- Share per cent of unit value outliers

Self-trade

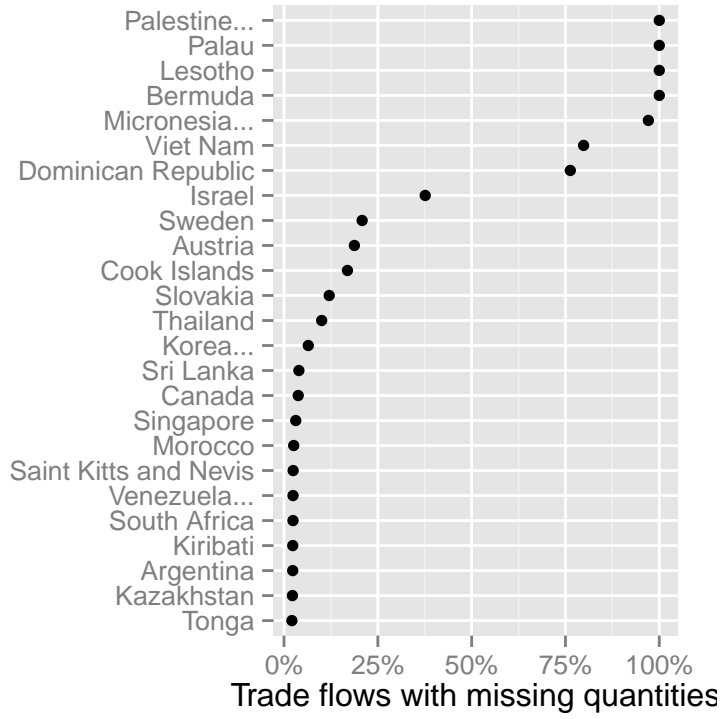
There are cases when a country reports itself as a partner to exports or imports. Such situations can occur due to mistakes or when an entrepôt exists.

Table 4: Self-trade of commodities from 2nd, 10th and 15th HS chapters in 2011

Reporter	Flow	Total
France	Import	163
Canada	Import	56
Portugal	Import	50
Slovakia	Import	50
New Zealand	Import	31
South Africa	Import	27
United Kingdom	Import	17
Slovenia	Import	16
Estonia	Import	12
Thailand	Import	12
China	Import	7
Greenland	Import	3
Ethiopia	Import	2
Papua New Guinea	Import	2
Saint Kitts and Nevis	Import	2
Indonesia	Import	1
Malaysia	Import	1
Palau	Import	1

Missing quantities

We identify which reporters provide data of insufficient quality. Firstly for every reporter proportion of trade flows with missing quantity is calculated.

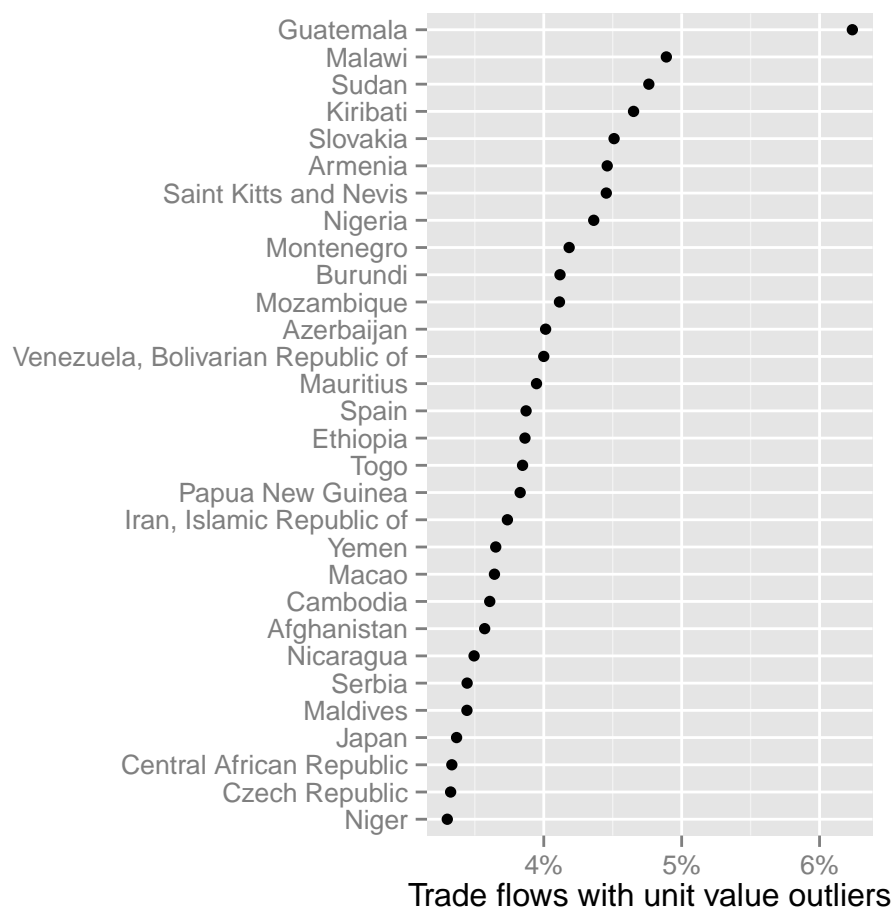


Detection of outliers

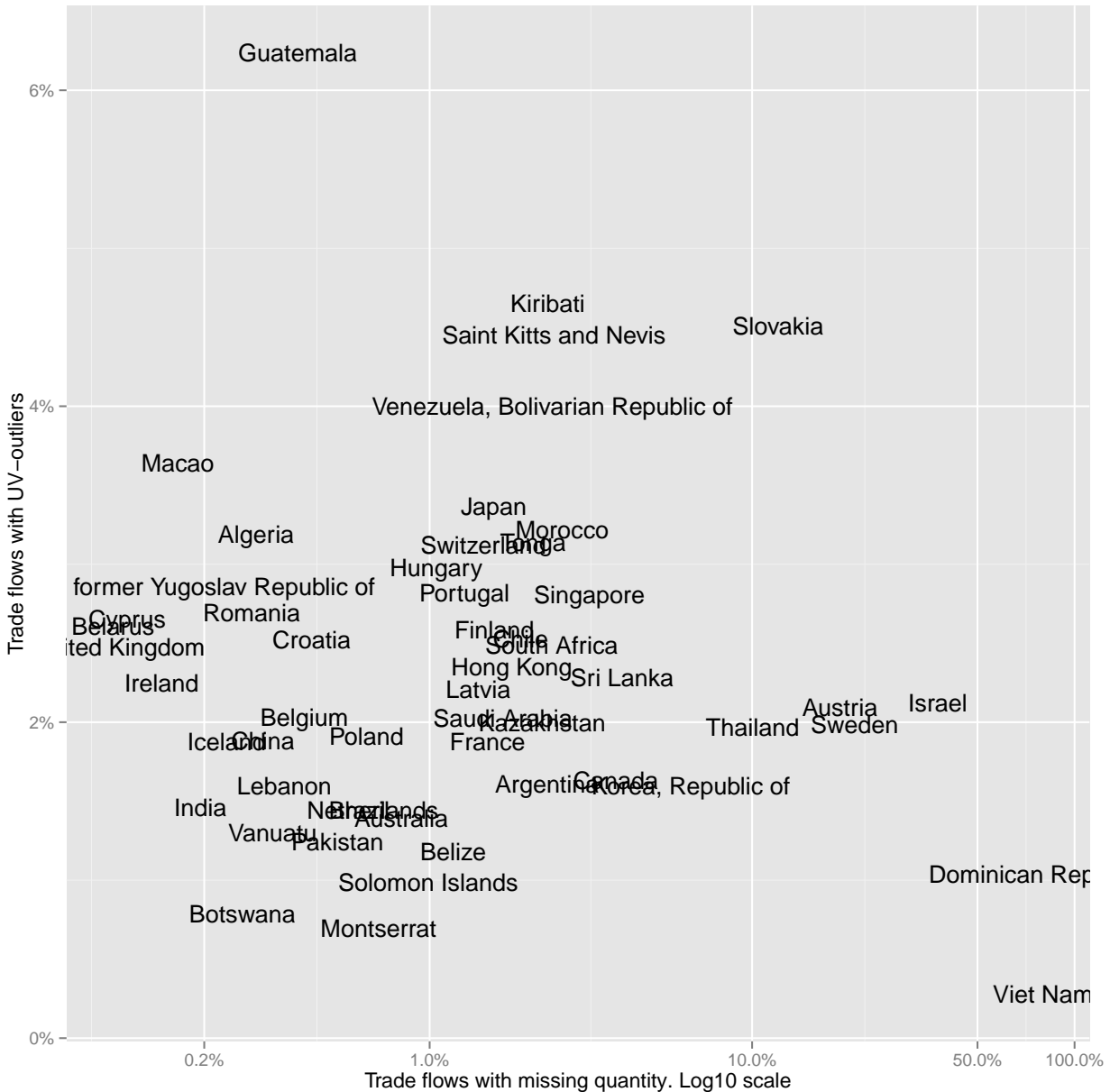
We define outliers as observations located outside the range:

$$[Q_1 - k(Q_3 - Q_1), Q_3 + k(Q_3 - Q_1)]$$

where Q_1 and Q_3 are the lower and upper quartiles respectively, and k is a non negative constant. In this paper we use $k = 1.5$.



Missing quantites and outliers combined



Imputing of missing quantities and replacement of outliers

In data reported by USA for 2011 year in HS chapters 2, 10 and 15 there are 0 trade flows with missing quantity and 33 trade flows with UV-outliers.

Table 5: Example trade flows with outlying unit values

Reporter	Partner	Flow	Commodity	Weight	Value	UV	UV_me
United States	Italy	Import	1515300000	34	2334	68.65	4.57
United States	Uruguay	Export	0201100010	278	4384	15.77	3.88

Reporter	Partner	Flow	Commodity	Weight	Value	UV	UV_me
United States	United Kingdom	Import	1521100040	84	6181	73.58	6.89
United States	Germany	Import	1505009000	105784	2191650	20.72	7.15
United States	Japan	Import	1514999020	431	9193	21.33	3.71
United States	Japan	Import	1516100000	1090	93260	85.56	27.54
United States	Japan	Import	1516201000	2853	24030	8.42	3.87
United States	Japan	Import	1515190000	89	3267	36.71	4.91
United States	Japan	Import	1006204040	2520	9679	3.84	0.89
United States	Japan	Import	1509904000	769	22842	29.7	3.66

Imputing using reporter median unit values

Now we correct weight of this outlying trade flows with help of median reporter unit value for a given commodity.

$$Weight = \frac{Weight}{UV_{reporter}}$$

Table 6: Example trade flows with corrected weight

Reporter	Partner	Flow	HS-code	Weight, kg	Corrected, kg	Difference, kg
United States	Italy	Import	1515300000	34	511	-477
United States	Uruguay	Export	0201100010	278	1130	-852
United States	United Kingdom	Import	1521100040	84	897	-813
United States	Germany	Import	1505009000	105784	306524	-200740
United States	Japan	Import	1514999020	431	2478	-2047
United States	Japan	Import	1516100000	1090	3386	-2296
United States	Japan	Import	1516201000	2853	6209	-3356
United States	Japan	Import	1515190000	89	665	-576
United States	Japan	Import	1006204040	2520	10875	-8355
United States	Japan	Import	1509904000	769	6241	-5472

Detection of wrongly coded trade flows

Another approach to impute missing or outlying quantities of a reporter is to use mirror data from trade partner. Let's check are there any such trade flows related to wheat among reported by the US.

Year	Trade partner	Flow	HS-code	Weight, kg	Value, \$US	Unit Value	UV median
2011	Japan	Import	1001902096	61	46362	760	1.466

Outlier detection algorithm shows, that the price (unit value) in this trade flow differs too much from the median price of trade flows of this commodity, reported by the US: 760 \$US per kg versus 1.5 \$US per kg.

The commodity code *1001.90.20.96* is country-specific and is used only by the US. It is not listed in the recent Harmonized Tariff Schedule of the United States¹⁰. It means this HS-subheading was removed from Harmonized Tariff Schedule and had not been used any more. Panjiva website reports last use of the code

¹⁰<http://hts.usitc.gov/?query=wheat> Harmonized Tariff Schedule (2015 HTSA Revision 1 Edition)

was fixed in 2011 and gives description of it¹¹. *1001.90.20.96* stands for wheat and meslin not mentioned in any other subheadings of *1001.90.20*.

We want to check characteristics of this trade flow from a partner's side. But Japan didn't report any export of wheat-related commodities to the US in 2011. We expand our search to all trade flows from Japan to the US with nearly the same quantity and value. We find suitable trade flow what was not reported by the US.

Year	Trade partner	Flow	HS-code	Weight, kg	Value, \$US	Unit Value	UV median
2011	United States	Export	041000000	70	36483	521.2	521.2

Code *0410.00.000* stands for Edible products of animal origin (not especially specified)¹². Probably, imported shipment was not properly coded in the US. We can check in data from Japan existence of similar trade flows to other countries.

Year	Trade partner	Weight, kg	Value, \$US	Unit Value	UV median
2011	United States	70	36483	521.2	521.2
2011	Other Asia	50	26185	523.7	521.2
2011	Netherlands	150	50863	339.1	521.2

Japan reported export of similar commodity to three destinations. All of these trade flows are not outliers. It supports the hypothesis, that the mistake was done on the part of the US.

Imputing using data from trade partner (mirroring)

Year	Trade partner	Flow	HS-code	Weight, kg	Value, \$US	Unit Value	UV median
2011	Japan	Import	1008100000	810	7833	9.67	1.241
2011	Japan	Import	1008200000	327	2479	7.581	1.882

year	partner_name	flow	hs	weight	value	uv	uv_reporter	out_range
2011	New Zealand	Export	100810000	5000	16326	3.265	4.559	FALSE
2011	United States	Export	100810000	3000	17557	5.852	4.559	FALSE
2011	Canada	Export	100810000	-	6644	-	4.559	FALSE
2011	France	Export	100810000	-	13915	-	4.559	FALSE

¹¹<https://panjiva.com/trendspotting/imports/United-States/1001.90.20.96/Cereals-Wheat-and-meslin-Other-Other-Other-Other/1368> Trend report HTS Code 1001.90.20.96

¹²http://www.customs.go.jp/yusyutu/2011/data/e201101j_04.htm