







Measuring the Price of Data in Commercial Data Marketplaces

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Developing the

Science of Networks

A quiz

How valuable is this?



How much is it?











A quiz

And what's the price of this?

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|----|------------------------|--------|--------------|----|-----------------------|-------------------|---------------|--------------------|--------|-------|------|----|---------------|
| 38 | Private | 215646 | HS-grad | 9 | Divorced | Handlers-cleaners | Not-in-family | White | Male | 0 | 0 | 40 | United-States |
| 53 | Private | 234721 | 11th | 7 | Married-civ-spouse | Handlers-cleaners | Husband | Black | Male | 0 | 0 | 40 | United-States |
| 28 | Private | 338409 | Bachelors | 13 | Married-civ-spouse | Prof-specialty | Wife | Black | Female | 0 | 0 | 40 | Cuba |
| 37 | Private | 284582 | Masters | 14 | Married-civ-spouse | Exec-managerial | Wife | White | Female | 0 | 0 | 40 | United-States |
| 49 | Private | 160187 | 9th | 5 | Married-spouse-absent | Other-service | Not-in-family | Black | Female | 0 | 0 | 16 | Jamaica |
| 52 | Self-emp-not-inc | 209642 | HS-grad | 9 | Married-civ-spouse | Exec-managerial | Husband | White | Male | 0 | 0 | 45 | United-States |
| 31 | Private | 45781 | Masters | 14 | Never-married | Prof-specialty | Not-in-family | White | Female | 14084 | 0 | 50 | United-States |
| 42 | Private | 159449 | Bachelors | 13 | Married-civ-spouse | Exec-managerial | Husband | White | Male | 5178 | 0 | 40 | United-States |
| 37 | Private | 280464 | Some-college | 10 | Married-civ-spouse | Exec-managerial | Husband | Black | Male | 0 | 0 | 80 | United-States |
| 30 | State-gov | 141297 | Bachelors | 13 | Married-civ-spouse | Prof-specialty | Husband | Asian-Pac-Islander | Male | 0 | 0 | 40 | India |
| 23 | Private | 122272 | Bachelors | 13 | Never-married | Adm-clerical | Own-child | White | Female | 0 | 0 | 30 | United-States |
| 32 | Private | 205019 | Assoc-acdm | 12 | Never-married | Sales | Not-in-family | Black | Male | 0 | 0 | 50 | United-States |
| 40 | Private | 121772 | Assoc-voc | 11 | Married-civ-spouse | Craft-repair | Husband | Asian-Pac-Islander | Male | 0 | 0 | 40 | ? |
| 34 | Private | 245487 | 7th-8th | 4 | Married-civ-spouse | Transport-moving | Husband | Amer-Indian-Eskimo | Male | 0 | 0 | 45 | Mexico |
| 25 | Self-emp-not-inc | 176756 | HS-grad | 9 | Never-married | Farming-fishing | Own-child | White | Male | 0 | 0 | 35 | United-States |
| 32 | Private | 186824 | HS-grad | 9 | Never-married | Machine-op-inspct | Unmarried | White | Male | 0 | 0 | 40 | United-States |
| 38 | Private | 28887 | 11th | 7 | Married-civ-spouse | Sales | Husband | White | Male | 0 | 0 | 50 | United-States |
| 43 | Self-emp-not-inc | 292175 | Masters | 14 | Divorced | Exec-managerial | Unmarried | White | Female | 0 | 0 | 45 | United-States |
| 40 | Private | 193524 | Doctorate | 16 | Married-civ-spouse | Prof-specialty | Husband | White | Male | 0 | 0 | 60 | United-States |
| 54 | Private | 302146 | HS-grad | 9 | Separated | Other-service | Unmarried | Black | Female | 0 | 0 | 20 | United-States |
| 35 | Federal-gov | 76845 | 9th | 5 | Married-civ-spouse | Farming-fishing | Husband | Black | Male | 0 | 0 | 40 | United-States |
| 43 | Private | 117037 | 11th | 7 | Married-civ-spouse | Transport-moving | Husband | White | Male | 0 | 2042 | 40 | United-States |
| 59 | Private | 109015 | HS-grad | 9 | Divorced | Tech-support | Unmarried | White | Female | 0 | 0 | 40 | United-States |

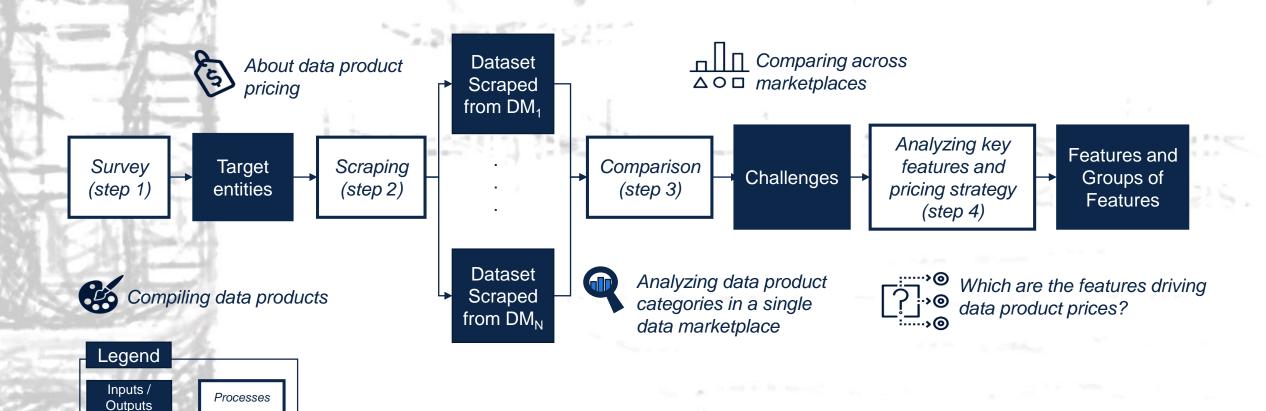








So, what is the price of data in the B2B market? What are the features that are driving the prices of data products?













We found 15 scrapable DMs + 30 individual providers that allowed us to collect information about 215,075 data products from 2,115 data sellers

| Marketplace | #Data Products | #Paid products | #Sellers |
|----------------------------|----------------|----------------|----------|
| Advaneo | 198,743 | 1 | N/A |
| AWS | 4,263 | 2,674 | 262 |
| DataRade | 1,592 | 1,592 | 1,262 |
| Snowflake | 889 | 889 | 200 |
| Knoema | 158 | 158 | 142 |
| DAWEX | 160 | 160 | 79 |
| Carto spatial data catalog | 8,182 | 5,283 | 42 |
| Crunchbase Marketplace | 9 | 9 | 15 |
| Veracity | 115 | 95 | 38 |
| Refinitiv | 187 | 187 | 76 |
| Liveramp | N/A | N/A | 135 |
| LOTAME | 16 | 16 | 126 |
| TheTradeDesk | N/A | N/A | 122 |
| Quandl | N/A | N/A | 49 |
| Factset | N/A | N/A | 84 |
| Other data providers | 777 | 775 | 30 |



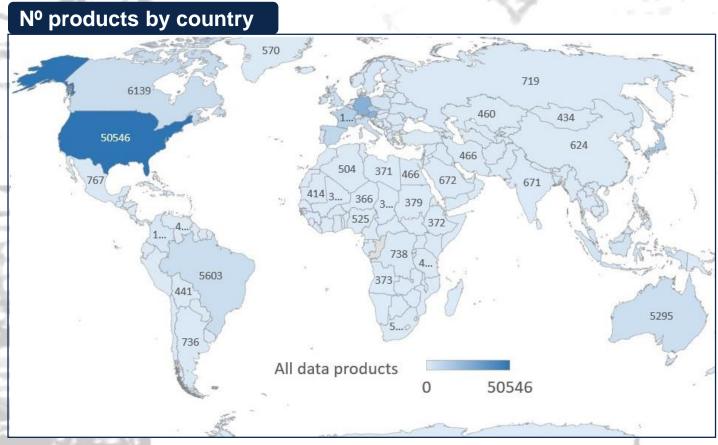








14,472 (7%) of data products did not inform about scope and 1,177 claim to have global scope



Top countries by paid products

| Country | % paid products |
|----------------|-----------------|
| United States | 30% |
| Canada | 9.3% |
| United Kingdom | 9.2% |
| Germany | 7.6% |
| France | 7.4% |
| Spain | 7.1% |

Only 11,823 data products are paid, and 4,162 from 443 distinct providers of them disclose information about their prices





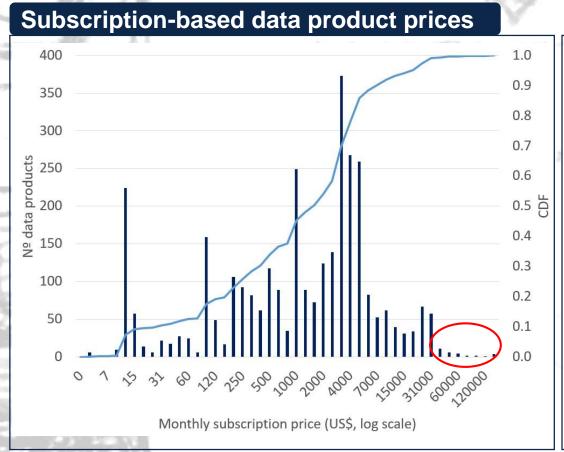


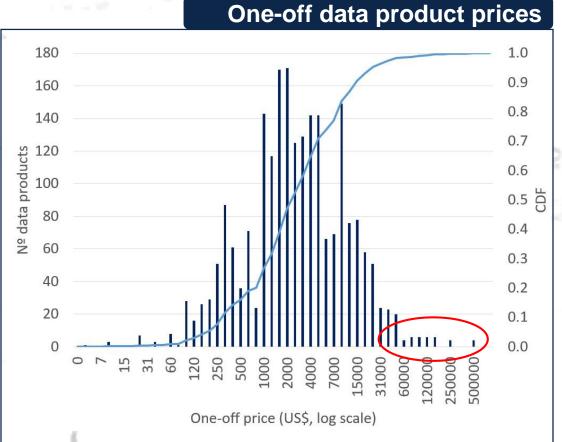






Data sells at an immensely wide range of prices





Most valuable data products in the long tail are related to marketing. We will come back to them later.





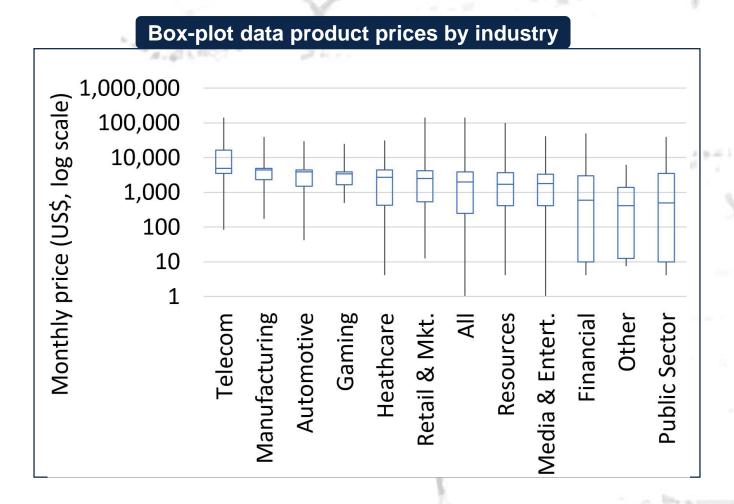








Focusing on AWS marketplace, we observe that prices depend heavily on the category, which in this DMs resemble "industries"



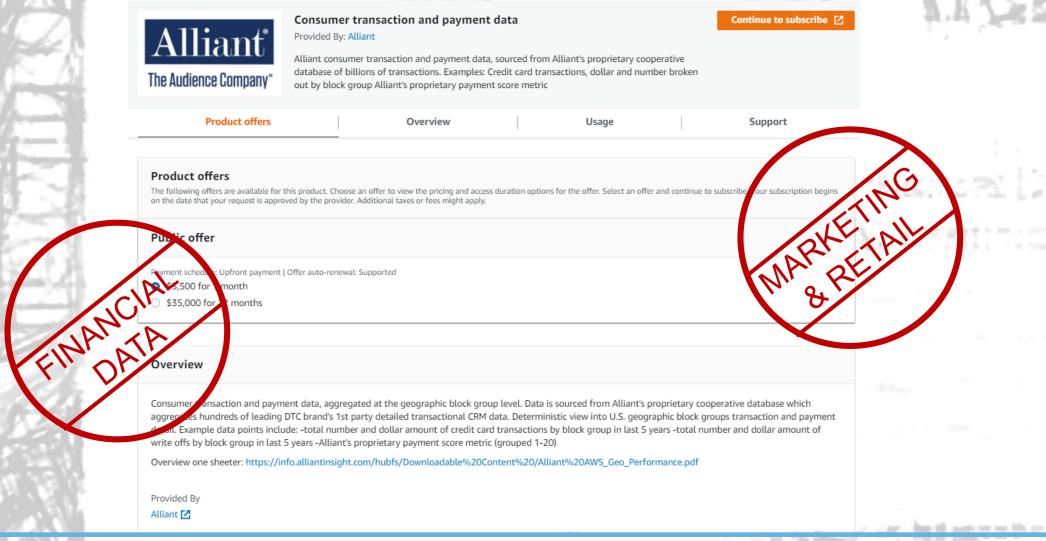








Cross DMs analysis is more challenging, since DMs i) provide different detail, and ii) use different categorisation and criteria to assign categories to products



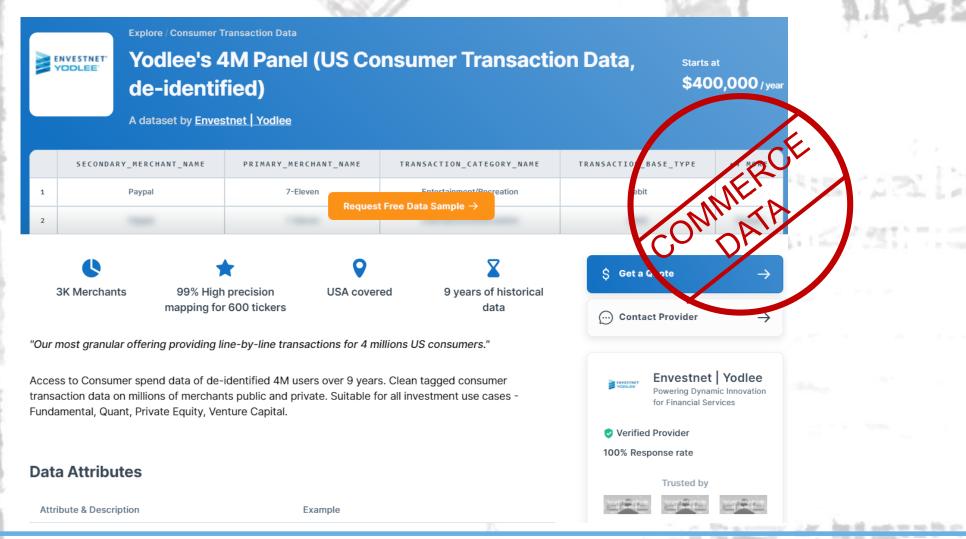








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So, which are the features actually driving the prices of data products?

Design the Park Lamb Transfer at Lamb











Top 33 datasets worth > US\$30K per month share some characteristics...

- All of them provide huge amounts of data for MM people,
 10k locations or companies
- ▶ 61% of them offer daily updates
- ► They provide fresh rather than long-historical data
- ▶ 67% of them are US-focused, 21% are global
- > 73% of them relate to retail and marketing
- Most valuable B2B marketing products include precise enterprise data, and key contact information
- At least 48% of them enable a very granular locationbased analysis, and 27% of them geo-located data
- 21% B2C marketing products allow for session reconstruction (i.e., connecting the different data points of individuals and entities)









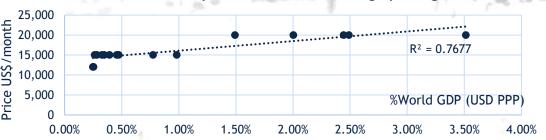


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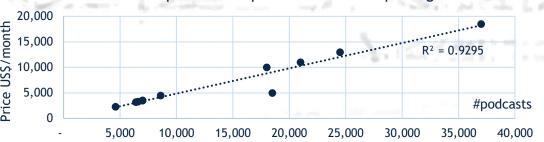
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... and we are able to find clear simple seller-specific pricing strategies

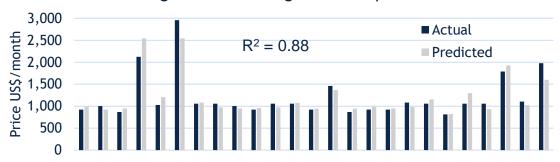
Price vs country GDP in mobile coverage pricing



Price vs #podcasts in podcast metadata pricing



Pricing of customer segmentation products













Based on this analysis we derived a list of "desirable" features of data that data prices seem to depend upon

| Question | Group | Definition | Nº features | Example of features |
|-----------|-----------------|--|-------------|--|
| | Category | Labels attached to the product that define the type of data it contains | custom | 'Weather', 'Gaming', 'Financial' |
| What? | Description | Stem-like features obtained from data product descriptions | custom | 'wordmarket', 'wordidentifi', 'wordlist' |
| | Identifiability | Tells whether the product allows the buyer to recognize the activity of individuals or | 2 | 'idSessions', 'IdCompanies' |
| | | to identify specific companies | | |
| | Volume | Normalized no units covered broken down by the nature of such units | 14 | 'people', 'entities' |
| How much? | Update rate | Defines the frequency between data updates as announced by the seller | 11 | 'real time', 'monthly', 'hourly' |
| | Granularity | Defines the resolution and potential aggregations of data | 3 | 'aggLevel','spatialResol', 'timeResol' |
| | Delivery method | Defines how the buyer can have access to data | 8 | 'S3Bucket', 'Download', 'FeedAPI' |
| How? | Format | Defines the way in which data is arranged | 17 | 'txt', 'shapefile', 'xls' |
| | Add-ons | Tells whether the product attaches any add-on or has any limitations | 2 | 'ProfServices', 'Limitations' |
| When? | History | Time scope included | 1 | 'History' |
| Where? | Geo scope | Metrics about countries included in the data product | up to 249 | 'Nº Countries', 'USA', 'Canada' |









Bottomline...

- ▶ We have provided a first glimpse into the growing market of B2B data.
- ▶ We found that data sells at an immensely wide range of prices up to US\$500k or US\$150k monthly
- ▶ We have pointed to the challenges of comparing across DMs and potential solutions for that.
- ▶ We were able to list groups of features that are determining prices of real products in the market.
- ► We came to the conclusion that there is a need of an overarching solution to provide transparency on how much a piece of data might be worth in the market, and why.

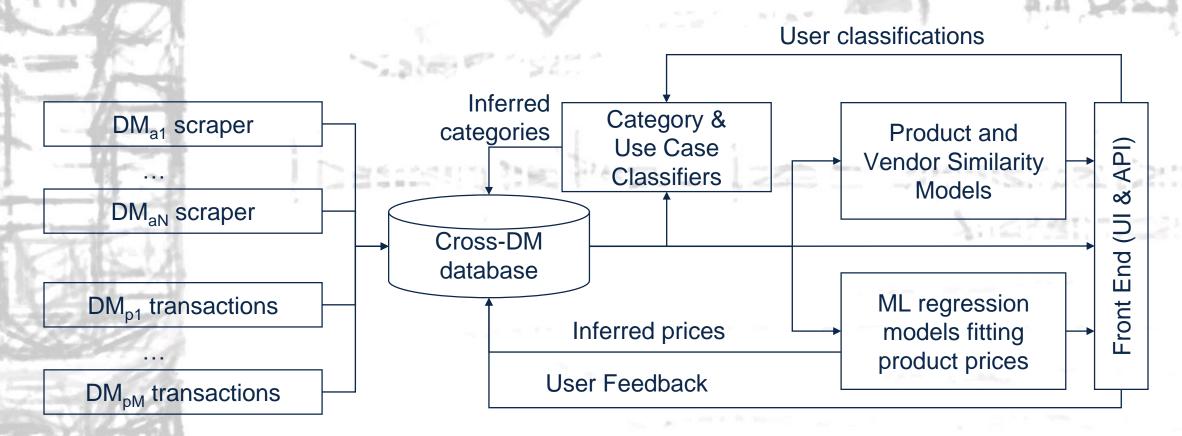








We are working on such a data quotation tool to be able to predict the prices of a data product out of its metadata based on market prices and transactions



Such a tool will have limitations, since it does not consider: i) the usability for the buyer, ii) the quality of the data, iii) the specific value for a buyer.









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Thank you!

Now it is Q&A time!

Acknowledgement to:

Horizon 2020

For more information please contact:







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