SISTEMI BAZA PODATAKA

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PODACI

- Skup podataka je preuzet sa sajta Kaggle
- Olist je brazilska kompanija koja se bavi online prodajom
- Skup podataka sadrži infromacije o ~100k porudžbina u periodu od 2016-2018, ali najviše je primeraka iz 2018.
- Kompletan skup podataka se sastoji od 9 csv fajlova

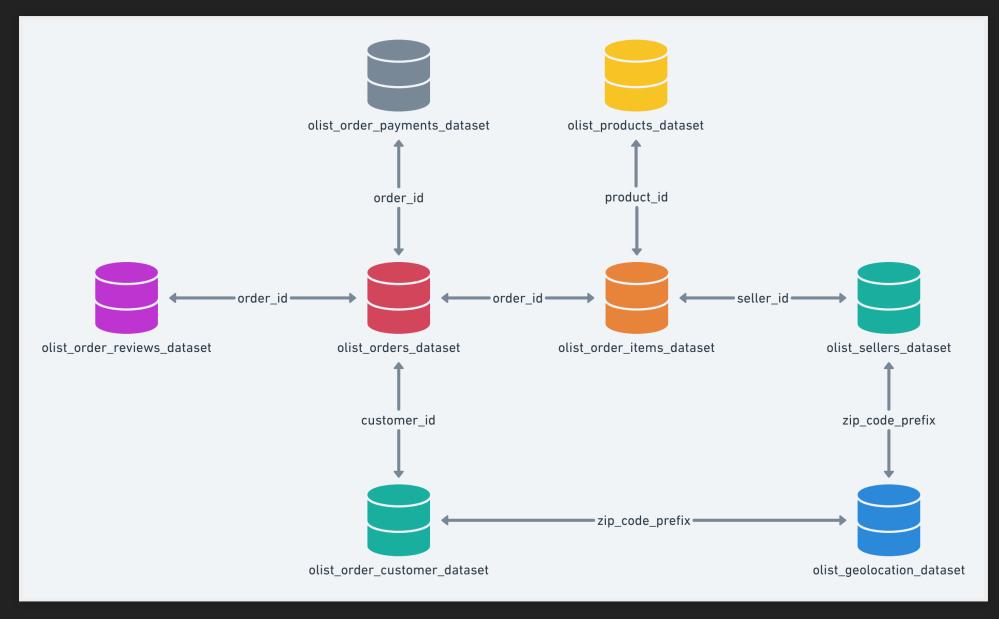
- Struktura customers i orders fajlova koji sadrže podatke o korisnicima i porudžbinama
- Polje customer_id iz fajla custmers je referenca ka customer_id polju u orders fajlu

	<pre>df_customers = pd.read_csv('/data/olist_customers_dataset.csv') info(df_customers)</pre>											
99	441 rows and 5 columns											
df	_customers.head()											
	customer_id	customer_unique_id	customer_zip	_code_prefix	custon	ner_city customer	state					
0	06b8999e2fba1a1fbc88172c00ba8bc7	861eff4711a542e4b93843c6dd7febb0		14409		franca	SP					
1	18955e83d337fd6b2def6b18a428ac77	290c77bc529b7ac935b93aa66c333dc3		9790	sao bernardo de	o campo	SP					
2	4e7b3e00288586ebd08712fdd0374a03	060e732b5b29e8181a18229c7b0b2b5e		1151	Si	ao paulo	SP					
3	b2b6027bc5c5109e529d4dc6358b12c3	259dac757896d24d7702b9acbbff3f3c		8775	mogi da	s cruzes	SP					
4	4f2d8ab171c80ec8364f7c12e35b23ad	345ecd01c38d18a9036ed96c73b8d066		13056	C	ampinas	SP					
<pre>df_orders = pd.read_csv('/data/olist_orders_dataset.csv') info(df_orders)</pre>												
99441 rows and 8 columns												
df	_orders.head()											
	order_id	customer_id	order_status	order_purcha	se_timestamp	order_approved_at	order_del	ivered_carrier_date				
0	e481f51cbdc54678b7cc49136f2d6af7	9ef432eb6251297304e76186b10a928d	delivered	2017-	10-02 10:56:33	2017-10-02 11:07:15		2017-10-04 19:55:00				
1	53cdb2fc8bc7dce0b6741e2150273451	b0830fb4747a6c6d20dea0b8c802d7ef	delivered	2018-0	07-24 20:41:37	2018-07-26 03:24:27	:	2018-07-26 14:31:00				
2	47770eb9100c2d0c44946d9cf07ec65d	41ce2a54c0b03bf3443c3d931a367089	delivered	2018-0	08-08 08:38:49	2018-08-08 08:55:23		2018-08-08 13:50:00				
3	949d5b44dbf5de918fe9c16f97b45f8a	f88197465ea7920adcdbec7375364d82	delivered	2017-	11-18 19:28:06	2017-11-18 19:45:59		2017-11-22 13:39:59				
4	ad21c59c0840e6cb83a9ceb5573f8159	8ab97904e6daea8866dbdbc4fb7aad2c	delivered	2018-0	02-13 21:18:39	2018-02-13 22:20:29		2018-02-14 19:46:34				

- Struktura fajlova koji sadrže dodatne detalje o porudžbinama, kao sto su način plaćanja i recenzija
- Fajlovi se mogu spojiti putem order_id polja

:	<pre>f_order_payments = pd.read_csv('/data/olist_order_payments_dataset.csv') nfo(df_order_payments)</pre>									
	103886 rows and 5 columns									
:	df_order_payments.head()									
:	order_i	d payment_sequential paym	ment_type	payment_installme	ents payment_val	ie				
	0 b81ef226f3fe1789b1e8b2acac839d1	7 1 0	credit_card		8 99.	33				
	1 a9810da82917af2d9aefd1278f1dcfa	1 0	credit_card		1 24.	39				
	2 25e8ea4e93396b6fa0d3dd708e76c1b	i 1 c	credit_card		1 65.	71				
	3 ba78997921bbcdc1373bb41e913ab95	3 1 0	credit_card		8 107.	78				
	4 42fdf880ba16b47b59251dd489d4441	1 0	credit_card		2 128.	45				
:	df_order_reviews = pd.read_cs info(df_order_reviews)	v('/data/olist_order	_reviews	_dataset.csv')						
	100000 rows and 7 columns									
:	df_order_reviews.head()									
:	review_ic		order_id	review_score rev	view_comment_title	review_comment_message	review_creation_date	review_answer_timestamp		
i	0 7bc2406110b926393aa56f80a40eba40	73fc7af87114b39712e6da79	9b0a377eb	4	NaN	NaN	2018-01-18 00:00:00	2018-01-18 21:46:59		
	1 80e641a11e56f04c1ad469d5645fdfde	a548910a1c6147796b98fdf7	73dbeba33	5	NaN	NaN	2018-03-10 00:00:00	2018-03-11 03:05:13		
l	2 228ce5500dc1d8e020d8d1322874b6f0	f9e4b658b201a9f2ecdecbb3	34bed034b	5	NaN	NaN	2018-02-17 00:00:00	2018-02-18 14:36:24		
	3 e64fb393e7b32834bb789ff8bb30750e	658677c97b385a9be1707378	859d3511b	5	NaN	Recebi bem antes do prazo estipulado.	2017-04-21 00:00:00	2017-04-21 22:02:06		
	4 f7c4243c7fe1938f181bec41a392bdef	8e6bfb81e283fa7e4f11123	3a3fb894f1	5	NaN	Parabéns lojas lannister adorei comprar pela I	2018-03-01 00:00:00	2018-03-02 10:26:53		

• Prikaz kompletne šeme fajlova, koja pokazuje na koji način je moguće spojiti fajlove



OPIS PROCESA OBRADE PODATAKA

Korišćenje tehnologije:

- Python
- Pandas Python biblioteka za manipulaciju podacima(čišćenje, spajanje, agregacija...)
- PyMongo Python klijent za MongoDB

- Primer učitavanja fajlova u DataFrame struktura podataka koju nam obezbeđuje Pandas
- DataFrame je veoma sličan tabelama u relacionoj bazi podataka

```
1 def _extract(self) -> None:
2    logging.info('Loading csv files to DataFrames...')
3    self._customers = pd.read_csv('../../data/olist_customers_dataset.csv')
4    self._orders = pd.read_csv('../../data/olist_orders_dataset.csv')
5    self._order_payments = pd.read_csv('../../data/olist_order_payments_dataset.csv')
6    self._order_reviews = pd.read_csv('../../data/olist_order_reviews_dataset.csv')
7    self._order_items = pd.read_csv('../../data/olist_order_items_dataset.csv')
8    self._products = pd.read_csv('../../data/olist_products_dataset.csv')
9    self._product_category_translation = pd.read_csv('../../data/product_category_name_translation.csv')
10    self._sellers = pd.read_csv('../../data/olist_sellers_dataset.csv')
```

• Primer učitavanja i spajanja dva DataFrame-a

```
1 customers = pd.read_csv('../../data/olist_customers_dataset.csv')
2 orders = pd.read_csv('../../data/olist_orders_dataset.csv')
3 customer_order = customers.merge(orders, how='left', on='customer_id')
```

• Kako rešiti problem nedostajućih vrednosti u tabeli?

```
df['order_purchase_timestamp'].\
fillna(datetime.strptime('0001-01-01 00:00:00', '%Y-%m-%d %H:%M:%S'), inplace=True)
df['payment_type'] = table['payment_type'].fillna('not_defined')

df['order_purchase_timestamp'] = df['order_purchase_timestamp'].\
apply(lambda x: datetime.strptime(str(x), '%Y-%m-%d %H:%M:%S'))
```

FINALNA MONGO ŠEMA DOKUMENTA

```
" id" : ObjectId("5cf544dcfc4169c743361a45"),
"customer" : {
    "zip": 9790,
   "city" : "sao bernardo do campo",
   "state" : "SP"
"orders" : [
        "order" : {
            "status" : "delivered",
            "purchase timestamp" : ISODate("2018-01-12T20:48:24.000Z"),
            "delivered carrier date" : ISODate("2018-01-15T17:14:59.000Z"),
            "delivered customer date" : ISODate("2018-01-29T12:41:19.000Z"),
            "payment type" : "credit_card",
            "payment value" : 335.48,
            "review score" : 5
        "product" : {
            "price" : 289.0,
           "category" : "housewares"
        "seller" : {
           "zip": 88303.0,
           "city" : "itajai",
            "state" : "SC"
```

PITANJA

- Broj porudžbina po gradu i državi
- Minimalna i maksimalna cena porudžbine
- Broj porudžbina po statusu porudžbine
- Koliko porudžbina je dobilo koju ocenu
- Prosečan broj porudžbina i prosečna potrošnja po mesecima
- Prosečna potrošnja po gradovima i državama
- Najpopularnije metode plaćanja
- Prosečna cena porudžbine po metodi plaćanja
- Top 10 najpopularnijih kategorija proizvoda
- Prosečno vreme čekanja od naručivanja do predaje kuriru
- Prosečno vreme čekanja od kurira do kupca
- Prosečno vreme čekanja od naručivanja do kupca

• Prosečna potrošnja po metodu plaćanja

• Prosečno vreme u danima koje treba kuriru da dostavi porudžbinu

```
1 db.orders.aggregate([
          {'$unwind': '$orders'},
          {'$match': {
                  '$and': [{'orders.order.delivered_customer_date':{'$qt': ISODate('0001-01-01 00:00:00')}},
                                  {'orders.order.delivered_carrier_date':{\gt': ISODate('0001-01-01 00:00:00')}},
                                  {'orders.order.purchase_timestamp':{'$gt': ISODate('0001-01-01 00:00:00')}}
          {'$addFields': { 'curier_customer':
                  {'$ceil': {'$divide': [
                                          {'$subtract':
                                          ['$orders.order.delivered_customer_date', '$orders.order.delivered_carrier_date']}, 86400000]
          {'$group': {'_id': {'$month' : '$orders.order.purchase_timestamp'}, 'avg': {'$avg': '$curier_customer'}}},
          {'$sort': {'avg': -1}}
```

• Broj porudžbina po mesecima

REST API I VIZUALIZACIJA

U sklopu projekta, napisan je REST API preko kojeg se mogu dobiti odgovori u JSON formatu na prethodno definisana pitanja, kao i web aplikacija koja vizualizuje rezultate nekih upita

Korišćenje tehnologije:

- Python
- Javascript
- Flask Web framework
- PyMongo Python klijent za MongoDB
- Chart.js Javascript biblioteka za vizualizaciju podataka

PYMONGO PRIMER

```
1 import pymongo
 3 def get_most_popular_products() -> list:
     client = pymongo.MongoClient('mongodb://localhost:27017/') # konekcija na Mongo server
     db = client['sbp'] # selekcija baze
     collection = db['orders'] # selekcija kolekcije unutar baze
     pipline = [
           {'$unwind': '$orders'},
           {'$group': {'_id': '$orders.product.category', 'count': {'$sum': 1}}},
           {'$sort': {'count': -1}},
11
12
           {'$limit': 5}
13
14
     result = list(collection.aggregate(pipline))
15
```

PRIMER VIZUALIZACIJE



PRIMER VIZUALIZACIJE

