

Flip00 Presentation

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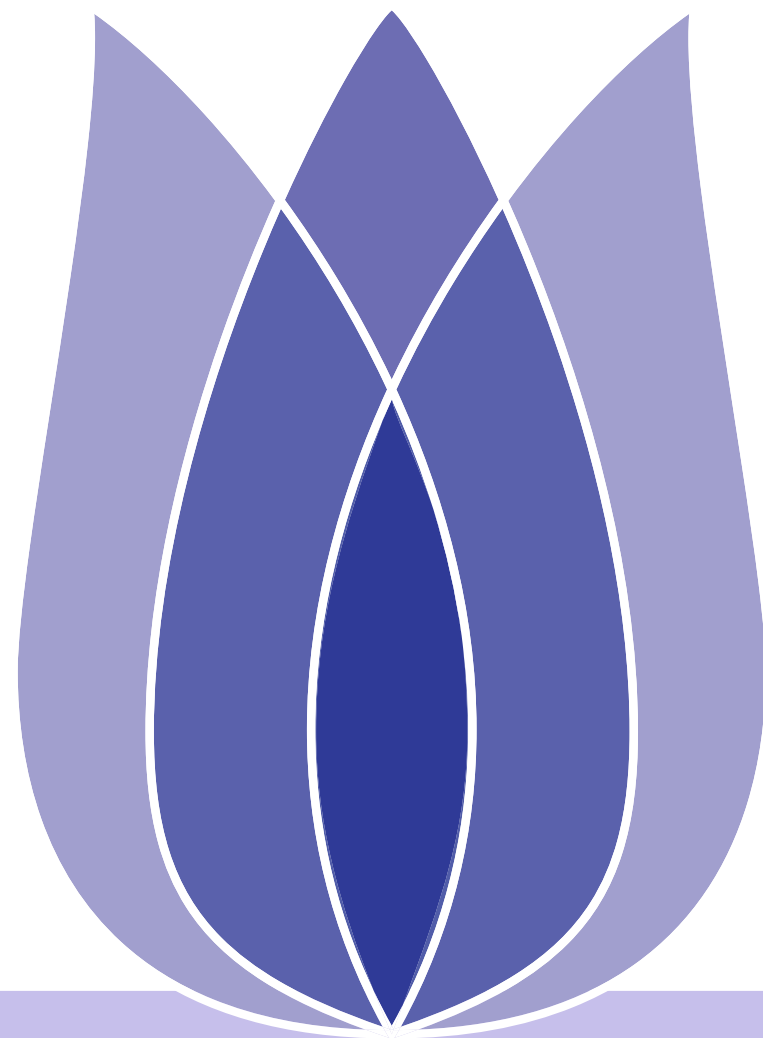




Table of Content

- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)

Problem

Description and Evaluation

Data Processing

- Basic Information of Data
- Missing Value and NaN Value
- Outliers and Duplicate Data
- Process Shops Set
- Process Items Set
- Process Categories Set
- Sales Analysis
- Closed Shops and Discontinued Products

Feature Selection

- Data Feature
- Monthly Sales Feature
- Historical Feature

Modeling and Forecasting

- Feature Engineering
- Lightgbm
- Comparison



Problem

Description and Evaluation

Data Processing

Feature Selection

Modeling and Forecasting

Problem



Description and Evalution

- Problem
- Description and Evalution
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Description Predict Future Sales by giving a time-series dataset consisting of daily sales data

Evalution Root mean squared error (RMSE)
True target values are clipped into [0,20] range



- [Problem](#)
- [Data Processing](#)**
 - [Basic Information of Data](#)
 - [Missing Value and NaN Value](#)
 - [Outliers and Duplicate Data](#)
 - [Process Shops Set](#)
 - [Process Items Set](#)
 - [Process Categories Set](#)
 - [Sales Analysis](#)
 - [Closed Shops and Discontinued Products](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)

Data Processing



Basic Information of Data

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Table 1:Data

Name	Description	Attribute
sales_train.csv	Training set(data from January 2013 to October 2015)	date,date_block_num,shop_id, item_id, item_price,item_cnt_day
test.csv	Test set(Predict sale in November 2015)	ID,shop_id,item_id
items.csv	Supplementary information of prod-ucts	item_name,item_id,item_category_id
shops.csv	Supplementary information of shops	shops_name,shops_id
item_categories.csv	Supplementary information of item categories	item_categories_name,item_categories_id
sample_submission.csv	Format of submission	ID,item_cnt_month

- There are 2935849 lines in train set
There are 214200 lines in test set
- There are 21807 unique items in train set
There are 60 unique shops in train set
There are 5100 unique items in test set
There are 42 unique shops in test set



Missing Value and NaN Value

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```
-----missing value-----
date                0
date_block_num      0
shop_id             0
item_id             0
item_price          0
item_cnt_day        0
dtype: int64

-----nan value-----
date                0
date_block_num      0
shop_id             0
item_id             0
item_price          0
item_cnt_day        0
dtype: int64
```

Figure 1: Missing Value and NaN Value



Outliers and Duplicate Data

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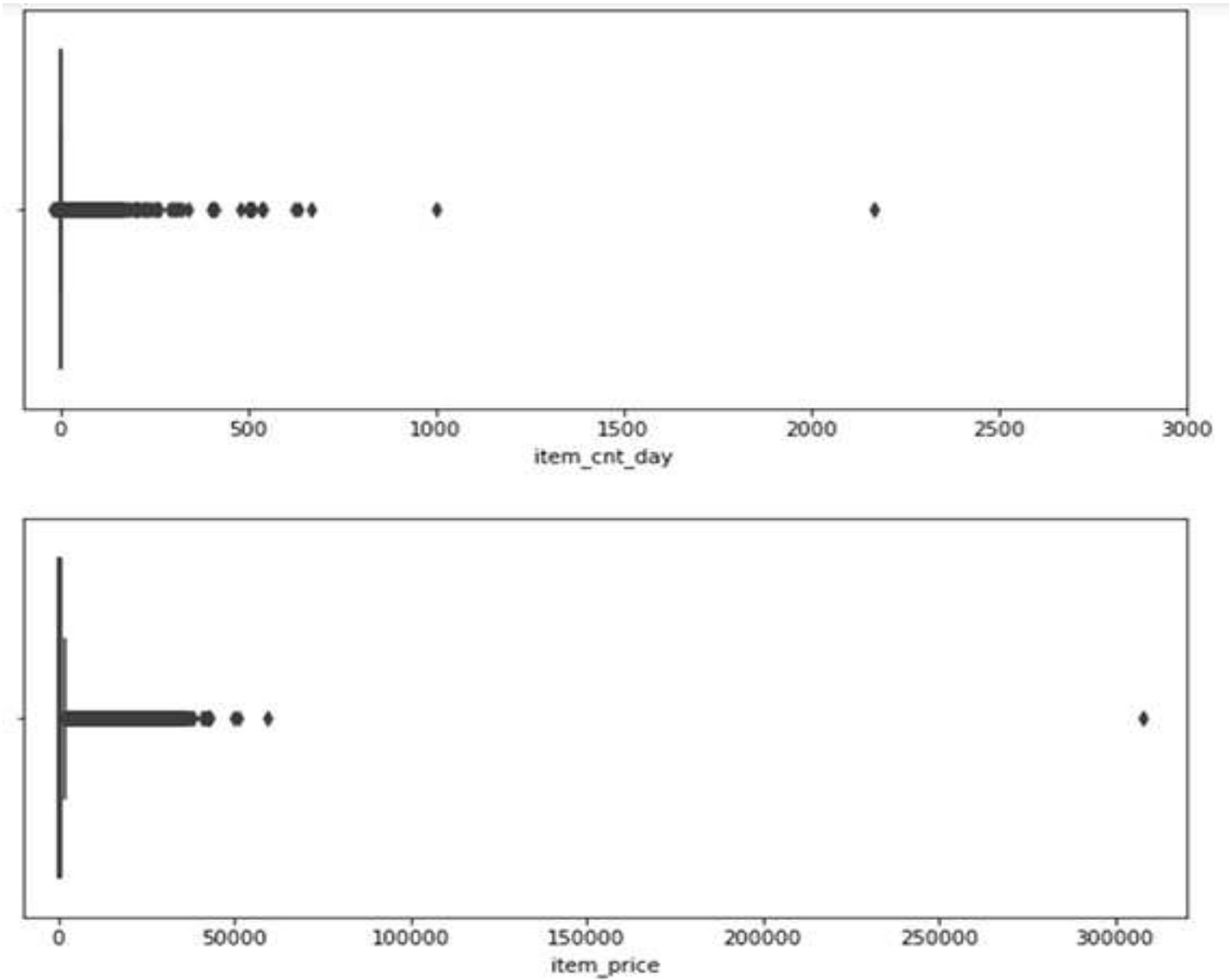


Figure 2: Outliers Data

- Filter duplicate data
- Filter data with price less than zero



Process Shops Set

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- Same shop name, different shop ID
39 and 40,10 and 11,0 and 57, 58 and 1
- Modify the ID based on the test
- Shop full name: shop’s city-shop’s type-shop’s name
- Encode shops information

	shop_name	shop_id	shop_city	shop_type	shop_city_code	shop_type_code
0	!Якутск Орджоникидзе, 56 фран	0	Якутск	Others	0	0
1	!Якутск ТЦ "Центральный" фран	1	Якутск	ТЦ	0	1
2	Адыгея ТЦ "Мега"	2	Адыгея	ТЦ	1	1
3	Балашиха ТРК "Октябрь-Киномир"	3	Балашиха	ТРК	2	2
4	Волжский ТЦ "Волга Молл"	4	Волжский	ТЦ	3	1
5	Вологда ТРЦ "Мармелад"	5	Вологда	ТРЦ	4	3
6	Воронеж (Плехановская, 13)	6	Воронеж	Others	5	0

Figure 3: Encode Shops Information



Process Items Set

Problem

Data Processing

Basic Information of Data

Missing Value and NaN Value

Outliers and Duplicate Data

Process Shops Set

Process Items Set

Process Categories Set

Sales Analysis

Closed Shops and Discontinued Products

Feature Selection

Modeling and Forecasting

- Same item name, different item ID
2514 and 2558,2968 and 2970,5061 and 5063, 14537 and 14539,19465 and 19475,19579 and 19581
- Modify the ID based on the test



Process Categories Set

- [Problem](#)
- [Data Processing](#)
- [Basic Information of Data](#)
- [Missing Value and NaN Value](#)
- [Outliers and Duplicate Data](#)
- [Process Shops Set](#)
- [Process Items Set](#)
- [Process Categories Set](#)**
- [Sales Analysis](#)
- [Closed Shops and Discontinued Products](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)

- Shop full name: category’s type-category’s subtype
- Encode categories information

	item_category_name	item_category_id	item_type	item_type_code	sub_type	sub_type_code
0	PC - Гарнитуры/Наушники	0	PC	0	Гарнитуры/Наушники	0
1	Аксессуары - PS2	1	Аксессуары	1	PS2	1
2	Аксессуары - PS3	2	Аксессуары	1	PS3	2
3	Аксессуары - PS4	3	Аксессуары	1	PS4	3
4	Аксессуары - PSP	4	Аксессуары	1	PSP	4

Figure 4: Encode Categories Information



- [Problem](#)
- [Data Processing](#)
- [Basic Information of Data](#)
- [Missing Value and NaN Value](#)
- [Outliers and Duplicate Data](#)
- [Process Shops Set](#)
- [Process Items Set](#)
- [Process Categories Set](#)
- [Sales Analysis](#)**
- [Closed Shops and Discontinued Products](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)

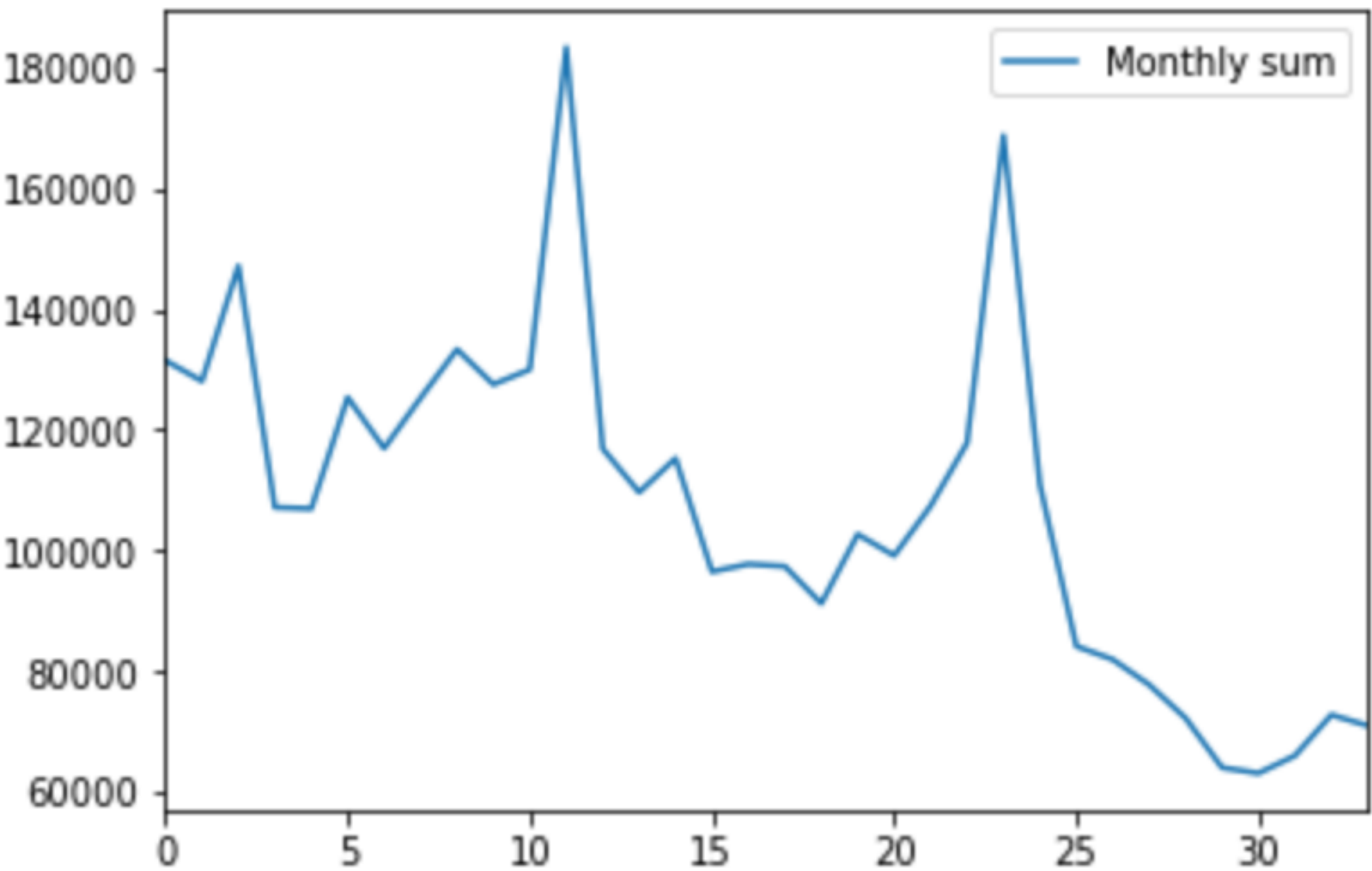


Figure 5: Total Sales Over Time



Closed Shops and Discontinued Products

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- new shops:9,20,36
- closed shops:0,1,8,11,13,17,23,27,29,30,32,33,40,43,51,54

	item_id	0	1	2	3	4	5	6	7	8	9	...	22150	22151	22152	22156	22157	22160	22161	22165	22168	22169	
date_block_num																							
	22	0	0	1	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	23	0	0	0	0	0	1	0	1	0	0	...	0	0	0	0	0	0	0	0	0	0	
	24	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	25	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	26	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	27	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	28	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	29	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	30	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	31	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	32	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	
	33	0	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0	

Figure 6: Discontinued Products



- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)**
- [Data Feature](#)
- [Monthly Sales Feature](#)
- [Historical Feature](#)
- [Modeling and Forecasting](#)

Feature Selection



Data Feature

- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Data Feature](#)**
- [Monthly Sales Feature](#)
- [Historical Feature](#)
- [Modeling and Forecasting](#)

	date_block_num	shop_id	item_id	item_cnt_month	shop_type_code	shop_city_code	item_category_id	item_type_code	sub_type_code
0	0	59	22154	1.0	1	29	37	10	21
1	0	59	2552	0.0	1	29	58	12	41
2	0	59	2554	0.0	1	29	58	12	41
3	0	59	2555	0.0	1	29	56	12	39
4	0	59	2564	0.0	1	29	59	12	42
...
11054935	34	45	18454	0.0	1	21	55	12	38
11054936	34	45	16188	0.0	1	21	64	13	47
11054937	34	45	15757	0.0	1	21	55	12	38
11054938	34	45	19648	0.0	1	21	40	10	24
11054939	34	45	969	0.0	1	21	37	10	21

Figure 7: Data Feature



Monthly Sales Feature

- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Data Feature](#)
- [Monthly Sales Feature](#)**
- [Historical Feature](#)
- [Modeling and Forecasting](#)

- average monthly sales of items
- average monthly sales of shops
- average monthly sales of categories
- average monthly sales of types and subtypes
- average monthly sales of shop’s city-item
- average monthly sales of shop’s type-item



Historical Feature

- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Data Feature](#)
- [Monthly Sales Feature](#)
- [Historical Feature](#)
- [Modeling and Forecasting](#)

- Historical delay:1,2,3,6,12
- Historical Feature:
 - monthly sales of items
 - average monthly sales of shops
 - average monthly sales of items
 - average monthly sales of categories
 - average monthly sales of types and subtypes
 - average monthly sales of shop’s city-item
 - average monthly sales of shop’s type-item
- Delete the records in first 12 months and NAN records



Problem

Data Processing

Feature Selection

Modeling and Forecasting

Feature Engineering

Lightgbm

Comparison

Modeling and Forecasting



Feature Engineering

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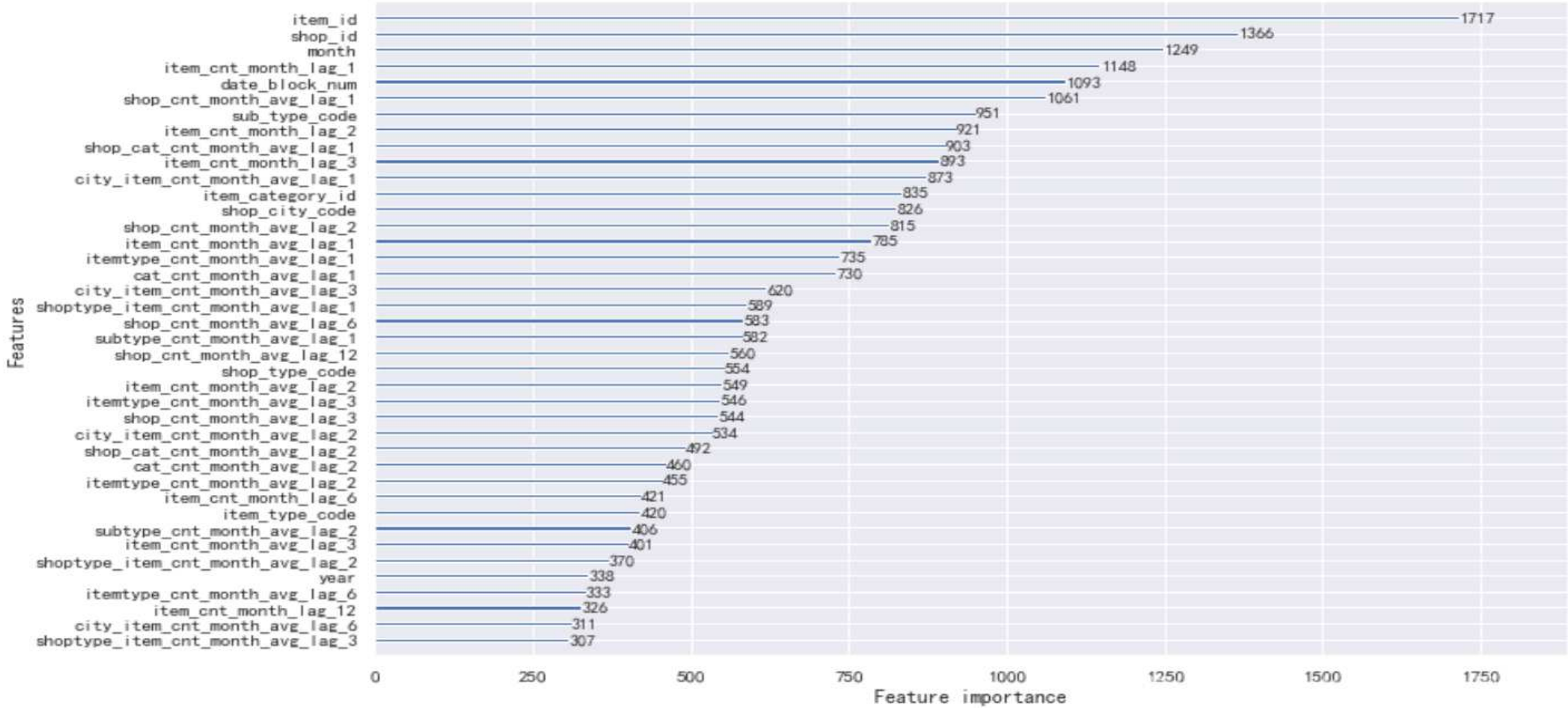


Figure 8: Feature Importance



- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)
- [Feature Engineering](#)
- [Lightgbm](#)**
- [Comparison](#)

- train set:date_block_num< 33
validation set:date_block_num == 33
test set:date_block_num == 34
- score:0.93740
- 3027/8738



Comparison

- [Problem](#)
- [Data Processing](#)
- [Feature Selection](#)
- [Modeling and Forecasting](#)
- [Feature Engineering](#)
- [Lightgbm](#)
- [Comparison](#)

- 1.0485→0.93
- model and feature
 - LightGBM and XGBoost
 - Add feature:historical feature