

# Data Mining Contest #2

March 20, 2018

## Will the customer place an order?

The second contest for this course is to construct a model to predict whether a customer will place an order after visiting the website of an online shop.

Imagine how you will shop online. When you open the website of an online store, it is called you start a *session*. Then you may pick some products and *click* their detail pages. If you like the product, you will add it to the *cart*, and after a few processing steps, you can place the *order*. These behaviors are recorded in the data. If the customer had signed up in the past, then some customer information like purchase history, can be provided as well.

The training data set records the “historical” transactions from Friday morning to Sunday afternoon, and you need to predict the customer’s behavior from Sunday evening to Monday morning.

## Kaggle website

The data can be downloaded from the kaggle site (<https://www.kaggle.com/c/unodatamining-2018-2>).

## Description of variables

- sessionID: Session ID. 1-50000 in **train.csv**, 50001-55111 in **test.csv**.
- hour: Hour when the session was started. Numbers between 0 and 23.
- weekday: Day of the week when the session was started. 5: Friday, 6: Saturday, 7: Sunday, 1: Monday.
- duration: Time in seconds passed since the start of the session.
- clickCount: Number of products that were visited (clicked).
- clickMin: Lowest price of the products visited (clicked).
- clickMax: Highest price of the products visited (clicked).
- clickTotal: Sum of the prices of all the products visited (clicked).
- cartCount: Number of products that were added to the cart.
- cartMin: Lowest price of the products in the cart.
- cartMax: Highest price of the products in the cart.
- cartTotal: Sum of the prices of all the products in the cart.
- cartStep: Purchase processing step. Possible values: 1,2,3,4,5.
- status: Whether the customer is online. ‘y’: yes. ‘n’: no.
- availability: Whether the cart is orderable or not. There are seven possible values.
- customerID: customer ID. 1-25038 in **train.csv**. In **test.csv** there exist both old and new customers.
- purchase: Highest purchase price in history for the customer.
- score: Customer score evaluated by the online store.
- account: Lifetime of the customer’s account in months.
- payments: Number of payments made by the customer.
- age: Age of the customer.
- salutation: Salutation of the customer. 1: Mr, 2: Ms, 3: Company.
- lastOrder: Time in days passed since the last order.
- order: (Response variable) Whether the order is placed. ‘y’: yes. ‘n’: no.

## Data

Here is a quick look at the data.

```
train = read.csv("train.csv")
str(train)

## 'data.frame': 429013 obs. of 24 variables:
## $ sessionID : int 1 1 1 2 2 2 2 2 3 3 ...
## $ hour : int 6 6 6 6 6 6 6 6 6 6 ...
## $ weekday : int 5 5 5 5 5 5 5 5 5 5 ...
## $ duration : num 0 11.9 39.9 0 15.6 ...
## $ clickCount : int 1 1 1 0 0 0 0 0 9 11 ...
## $ clickMin : num 60 60 60 NA NA ...
## $ clickMax : num 60 60 60 NA NA ...
## $ clickTotal : num 60 60 60 NA NA ...
## $ cartCount : int 1 1 1 0 0 0 0 0 1 2 ...
## $ cartMin : num 60 60 60 NA NA ...
## $ cartMax : num 60 60 60 NA NA ...
## $ cartTotal : num 60 60 60 NA NA ...
## $ cartStep : int NA 2 NA 2 NA 4 4 NA NA NA ...
## $ status : Factor w/ 2 levels "n","y": NA 2 2 2 2 2 2 NA NA ...
## $ availability: Factor w/ 7 levels "completely not determinable",...: NA 3 3 3 3 3 3 NA NA ...
## $ customerID : int 1 1 1 NA NA NA NA NA 3 3 ...
## $ purchase : int 600 600 600 NA NA NA NA NA 1800 1800 ...
## $ score : int 70 70 70 NA NA NA NA NA 475 475 ...
## $ account : int 21 21 21 NA NA NA NA NA 302 302 ...
## $ payments : int 1 1 1 NA NA NA NA NA 12 12 ...
## $ age : int 43 43 43 NA NA NA NA NA 45 45 ...
## $ salutation : int 1 1 1 NA NA NA NA NA 1 1 ...
## $ lastOrder : int 49 49 49 NA NA NA NA NA 11 11 ...
## $ order : Factor w/ 2 levels "n","y": 2 2 2 2 2 2 2 2 2 2 ...

table(train$order)

##
## n y
## 138983 290030
```

It seems that there are more placed orders than non-placed orders. However, if using the sessionID, you'll find that there are a little more non-placed orders than placed orders.

```
table(train$order[!duplicated(train$sessionID)])

##
## n y
## 26822 23178
```

In the test data, there are 5111 sessions that you need to predict.

```
test = read.csv("test.csv")
str(test)

## 'data.frame': 45068 obs. of 23 variables:
## $ sessionID : int 50001 50001 50001 50001 50001 50001 50001 50001 50001 50002 ...
## $ hour : int 18 18 18 18 18 18 18 18 18 18 ...
## $ weekday : int 7 7 7 7 7 7 7 7 7 7 ...
## $ duration : num 137 190 343 411 460 ...
```

```
## $ clickCount : int 3 3 6 8 10 10 11 11 11 7 ...
## $ clickMin : num 40 40 17 17 17 ...
## $ clickMax : num 40 40 40 40 40 ...
## $ clickTotal : num 80 80 114 150 190 ...
## $ cartCount : int 1 1 2 3 4 4 5 5 5 1 ...
## $ cartMin : num 40 40 17 17 17 ...
## $ cartMax : num 40 40 40 40 40 ...
## $ cartTotal : num 40 40 57 75 95 ...
## $ cartStep : int 2 NA NA NA NA 1 NA 1 NA NA ...
## $ status : Factor w/ 2 levels "n","y": 2 2 NA NA NA 2 NA 2 2 NA ...
## $ availability: Factor w/ 7 levels "completely not determinable",...: 3 3 NA NA NA 3 NA 3 3 NA ...
## $ customerID : int 25039 25039 25039 25039 25039 25039 25039 25039 25039 25040 ...
## $ purchase : int 1300 1300 1300 1300 1300 1300 1300 1300 1300 1200 ...
## $ score : int 489 489 489 489 489 489 489 489 489 543 ...
## $ account : int 188 188 188 188 188 188 188 188 188 43 ...
## $ payments : int 5 5 5 5 5 5 5 5 5 5 ...
## $ age : int 49 49 49 49 49 49 49 49 49 29 ...
## $ salutation : int 1 1 1 1 1 1 1 1 1 2 ...
## $ lastOrder : int 65 65 65 65 65 65 65 65 65 184 ...
```

```
summary(unique(test$sessionID))
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 50001  51279   52556   52556   53834   55111
```

## Task

1. Create the most accurate classifier that you can for the data, as measured by the test data.
2. Write a 3-5 page slides summarizing your approach to
  - (a) formulating the model (design) matrix,
  - (b) building the classifier, and
  - (c) your findings from the data.

## Format of submission

Your submission file should be in the csv format with two columns: `sessionID` and `order`. Example:

```
sessionID,order
50001,n
50002,y
50003,n
...
55111,n
```

## Deadlines:

- April 4 (11:59 pm): Final prediction submission.
- April 9 (in class): Presentation. 6 minutes per two teams.
- April 11 (11:59 pm): Slides and code submission.

## Grading:

- Total points: 20 (+1)
  - Accuracy of classifier: 6
    - \*  $\text{Score} = 6 * \text{accuracy rate}$
  - Progress made from multiple submissions: 6
    - \* Number of good submissions (decreasing error rate): 4
    - \* Amount of decreasing of the error rate: 2
  - Presentation: 6 (+1)
    - \* Model matrix: 2
    - \* Model selection: 2
    - \* Model assessment: 2
    - \* Team battle: (+1)
  - Met the deadline: 2

## Presentation

To save time for the presentations, two teams will be giving the presentation together in a battle mode. All the audience (including students who audit the class) will vote for the better presenter and one of the two teams who gets higher votes will receive an extra point. Teams will be grouped based on their final submission results – the battling teams will have very similar error rates. Teams in battle should make their slides together and present alternately in case they run out of time. One of the undergrad teams will not have a competitor in their presentation, so this team need to win 2/3 of the votes to receive the extra point.

## Teams

- Undergrad 1: Kent Rainey Biler, Brendan Schutte
- Undergrad 2: Phillip Baumberger, Jeremiah Casanova
- Undergrad 3: Russell Buffum, Kevin Emmel
- Undergrad 4: Theophilus Amankwah, Jerrid Kimball
- Undergrad 5: Christopher Johnson, Siddhi Munde
- Grad 1: Amir Ebrahimifakhar, David Pease
- Grad 2: Tim Mastny, Catherine Rivier
- Grad 3: Yifeng Hu, Moctar Sadou Nouhou
- Grad 4: Sohan Gyawali, Nicole Netsov, Xinyu Zuo
- Grad 5: Wei Chen, Nathan Hotovy
- Grad 6: Amanda Vander Wal, David Vincent
- Grad 7: Carolina Goncalves, Lale Madahali
- Grad 8: Jiaqi Huang, Nirmal K C
- Grad 9: Kieren Smith, Siddesh Southehal
- Grad 10: Jacques Anthony, Adithi Deborah Chakravarthy