e_commerce

November 11, 2018

1 CASE STUDY: E_COMMERCE DELIVERY

Here we are looking at the data obtained from an online delivery store, that delivers customized apparels to customers. Given various details such as the order details, factory details, expected_delivery_date, we need to predict whether the product would be delivered on time or not.

1.1 IMPORTS

```
In [480]: import pandas as pd
          from datetime import timedelta
          import matplotlib.pyplot as plt
          from tqdm import tqdm_notebook as tqdm
          import numpy as np
          import seaborn as sns
          from statsmodels.stats.outliers_influence import variance_inflation_factor
          from sklearn.model_selection import train_test_split
          from sklearn.linear_model import LogisticRegression
          from sklearn.svm import SVC,LinearSVC
          from sklearn.metrics import accuracy_score
          from sklearn.model_selection import cross_val_score
          from sklearn.metrics import confusion_matrix
          from sklearn.preprocessing import StandardScaler
          from sklearn.decomposition import PCA
          from sklearn.preprocessing import scale
          %matplotlib inline
```

1.2 READING THE DATA

We will work with the e_commerce data provided by the company. The data has 79,999 rows and 19 columns. It has variables the following: - Order ID - Country - Shipping Method - Units per Order - Facility - Product Category - On Sale - Transit days - Datetime Ordered - Datetime Sourced - Datetime Product Ready - Datetime Planned - Deadline Source - Deadline Make - Deadline Deliver - Delivered to Plan

The below code reads the data from excel file using python package pandas

```
In [431]: data=pd.read_excel(r"E:\Sem5\MS4110(Data_Analytics)\E-Commerce_Delivery (1)\E-Commerce
```

Check the head of the loaded data, and check out its info() and describe() methods.

```
In [432]: data.head()
Out [432]:
              order_id
                                country shipping_method
                                                         units_per_order facility \
             E0000001
          0
                        UNITED KINGDOM
                                                  Ground
                                                                         1
                                                                             OXFORD
          1
             E0000002
                                 FRANCE
                                                  Ground
                                                                            ANTWERP
                                                                         1
             E0000003
                                 FRANCE
                                                  Ground
                                                                         1
                                                                            ANTWERP
             E00000004
                                                  Ground
                                 FRANCE
                                                                            ANTWERP
            E00000005 UNITED KINGDOM
                                               Next Day
                                                                         1
                                                                             OXFORD
                                       transit_days
                                                        datetime_ordered \
            product_category on_sale
          0
                 ACCESSORIES
                                    Y
                                                   2 2016-07-03 03:07:29
          1
             JACKETS & VESTS
                                    N
                                                   3 2016-07-03 00:08:43
          2
                         TOPS
                                    Y
                                                   3 2016-07-03 00:36:00
             JACKETS & VESTS
                                    Y
                                                   5 2016-07-03 00:47:45
                                                   1 2016-07-03 03:52:13
             JACKETS & VESTS
               datetime_sourced datetime_product_ready datetime_planned
          0 2016-07-03 04:09:49
                                    2016-07-06 00:59:42
                                                               2016-07-08
          1 2016-07-03 02:16:24
                                    2016-07-03 07:17:04
                                                               2016-07-06
          2 2016-07-03 02:16:18
                                    2016-07-03 06:16:57
                                                               2016-07-06
          3 2016-07-03 02:16:18
                                    2016-07-03 06:16:55
                                                               2016-07-07
          4 2016-07-03 07:56:33
                                    2016-07-05 08:53:19
                                                               2016-07-06
                                              deadline_deliver delivered_to_plan
             deadline_source
                              deadline_make
          0
                       1612.0
                                          38
                                                              3
                                                                              PASS
          1
                       531.0
                                           8
                                                              3
                                                                              PASS
          2
                       504.0
                                           8
                                                              3
                                                                              PASS
          3
                                                              5
                       492.0
                                           8
                                                                              PASS
                       1567.0
                                           6
                                                              1
                                                                              PASS
```

Dimensions of the data

```
In [433]: print(data.shape)
(79999, 16)
```

We can see the number of unique categories in the categorical data by using data.describe

```
In [434]: data.describe(include='all')
```

```
Out [434]:
                              country shipping_method
                    order_id
                                                          units_per_order
                                                                            facility
                                                  79999
                                 79999
                                                             79999.000000
                                                                                79999
          count
                       79999
                       79999
                                     5
                                                                                    6
          unique
                                                                       NaN
          top
                   E00031961
                               GERMANY
                                                 Ground
                                                                       NaN
                                                                            AUGSBURG
          freq
                            1
                                 46259
                                                  55494
                                                                                19080
                                                                       NaN
          first
                         NaN
                                   NaN
                                                    NaN
                                                                       NaN
                                                                                  NaN
```

last mean std min 25% 50% 75%	NaN Na NaN Na NaN Na NaN Na NaN Na NaN Na	N N N N N	Nal Nal Nal Nal Nal Nal	Л Л Л Л	N 1.0400 0.4669 1.0000 1.0000 1.0000	13 N 23 N 00 N 00 N	aN aN aN aN aN aN	
max	NaN Na		Nai		50.0000		aN	
	<pre>product_category o</pre>	n_sale	transit_c	days	datetim	e_ordered	\	
count	79999	79999	79999.000	0000		79999		
unique	3	2		NaN		78681		
top	JACKETS & VESTS	Y		NaN	2016-08-20	17:03:18		
freq		41168		NaN		8		
first	NaN	NaN		NaN	2016-07-03	00:08:43		
last	NaN	NaN		NaN	2016-10-21			
mean	NaN	NaN	2.338	3067		NaN		
std	NaN	NaN	0.992			NaN		
min	NaN	NaN	1.000			NaN		
25%	NaN	NaN	2.000			NaN		
50%	NaN	NaN	2.000			NaN		
75%	NaN	NaN	3.000			NaN		
max	NaN	NaN	8.000			NaN		
	datetime_sourc	ed date	time produ	ıct r	eady da	tetime_pla	nned	\
count	799		-1		9999	_	9999	
unique	726				7461		127	
top	2016-09-16 08:39:		016-07-11			09-30 00:0	0:00	
freq		6			4		1539	
first	2016-07-03 02:16:	18 2	016-07-03	06:1	6:55 2016-	07-05 00:0		
last	2016-11-10 00:33:		016-11-10			11-17 00:0		
mean		aN			NaN		NaN	
std		aN			NaN		NaN	
min		aN			NaN		NaN	
25%		aN			NaN		NaN	
50%		aN			NaN		NaN	
75%		aN			NaN		NaN	
max		aN			NaN		NaN	
max		ai.			IV CIIV		wan	
	deadline_source	deadlin	e make de	eadli	ne_deliver	delivered	to pl	an
count	79464.000000	79999.	_		999.000000	_	799	
unique	NaN		NaN		NaN			2
top	NaN		NaN		NaN		РΔ	SS
freq	NaN		NaN		NaN		709	
first	NaN		NaN		NaN			JaN
last	NaN		NaN		NaN			JaN
mean	1349.708975	41	173127		3.450756			JaN
std	1104.229891		686936		1.617486			JaN
204	1101.220001	20.	555550		1.011 100		11	. 4.1

min	1.000000	1.000000	1.000000	NaN
25%	484.000000	23.000000	2.000000	NaN
50%	1115.000000	33.000000	3.000000	NaN
75%	1600.250000	55.000000	5.000000	NaN
max	6392.000000	168.000000	13.000000	NaN

In [435]: data.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 79999 entries, 0 to 79998
Data columns (total 16 columns):
order id
                          79999 non-null object
country
                          79999 non-null object
shipping_method
                          79999 non-null object
units_per_order
                          79999 non-null int64
facility
                          79999 non-null object
                          79999 non-null object
product_category
                          79999 non-null object
on_sale
                          79999 non-null int64
transit_days
datetime_ordered
                          79999 non-null datetime64[ns]
datetime_sourced
                          79999 non-null datetime64[ns]
datetime_product_ready 79999 non-null datetime64[ns]
datetime_planned
                          79999 non-null datetime64[ns]
deadline_source
                          79464 non-null float64
                          79999 non-null int64
deadline_make
deadline_deliver
                          79999 non-null int64
delivered_to_plan
                          79999 non-null object
dtypes: datetime64[ns](4), float64(1), int64(4), object(7)
memory usage: 9.8+ MB
```

1.3 CREATING NEW COLUMNS THAT RECORD THE TIME INTERVAL BETWEEN DATES

We create new columns to record the time intervals between the carious dates and the time ordered as this is easier to work with and captures the necessary information from this data.__Old variables__ are being replaced by **new variables** here.

Old variables - Datetime Ordered - Datetime Sourced - Datetime Product Ready - Datetime Planned

New Variables - Time Sourced: Time taken to take the product to work station **- Time Make** : Time taken to make the product at the work station **- Time Ready**: Total time taken to make the product ready from the time it has been ordered

```
In [436]: #converting the given dates to time intervals which ccan be worked with. check the l # function for conversion to seconds minutes or days
```

```
data['time_sourced'] = (data.datetime_sourced-data.datetime_ordered).map(lambda x:int()
data['time_make'] = (data.datetime_product_ready-data.datetime_ordered).map(lambda x:
data['time_ready'] = (data.datetime_product_ready-data.datetime_ordered).map(lambda x:
```

1.4 IMPUTING NULL VALUES INTO THE DATA

Here we check for the null value in the data

```
In [437]: for i in data:
              print(i,data[i].isnull().values.any(),sep='\t\t\t')
order_id
                                 False
country
                                False
shipping_method
                                        False
units_per_order
                                        False
facility
                                 False
product_category
                                         False
on_sale
                                False
transit_days
                                     False
datetime_ordered
                                         False
                                         False
datetime_sourced
datetime_product_ready
                                               False
                                         False
datetime_planned
deadline_source
                                        True
deadline_make
                                      False
deadline_deliver
                                         False
delivered_to_plan
                                          False
time_sourced
                                     False
                                 False
time_make
time_ready
                                   False
```

We find out that only the deadline source column has null value. The code below is used to find the number of rows which have null values

```
In [438]: data[data.isnull().values]
```

\	facility	units_per_order	shipping_method	country	order_id	Out[438]:
	ANTWERP	1	Ground	FRANCE	E00000026	25
	ANTWERP	1	Ground	FRANCE	E00000035	34
	ANTWERP	1	Ground	FRANCE	E00000038	37
	ANTWERP	1	Ground	FRANCE	E00000040	39
	ANTWERP	1	Ground	FRANCE	E00000041	40
	ANTWERP	1	Ground	FRANCE	E00000042	41
	ANTWERP	1	Ground	FRANCE	E00000043	42
	ANTWERP	1	Ground	FRANCE	E00000044	43
	ANTWERP	1	Ground	FRANCE	E00000045	44
	ANTWERP	1	Ground	FRANCE	E00000046	45
	ANTWERP	1	Ground	FRANCE	E00000048	47
	ANTWERP	1	Ground	FRANCE	E00000049	48
	ANTWERP	1	Ground	FRANCE	E00000050	49
	ANTWERP	1	Ground	FRANCE	E00000053	52

53	E00000054	F	RANCE	Ground	1	ANTWERP
54	E00000055	F	RANCE	Ground	1	ANTWERP
55	E00000056		RANCE	Ground	1	ANTWERP
58	E00000059		RANCE	Ground	1	ANTWERP
	E00000033					ANTWERP
60			RANCE	Ground	1	
65	E00000066		RANCE	Ground	1	ANTWERP
70	E00000071		RANCE	Ground	1	ANTWERP
77	E00000078		RANCE	Ground	1	ANTWERP
78	E00000079	F.	RANCE	Ground	1	ANTWERP
83	E00000084	F:	RANCE	Ground	1	ANTWERP
97	E00000098	F	RANCE	Ground	1	ANTWERP
104	E00000105	F:	RANCE	Ground	1	ANTWERP
111	E00000112	GE:	RMANY	Ground	1	EINDHOVEN
115	E00000116		RANCE	Ground	1	ANTWERP
116	E00000117		RANCE	Ground	1	ANTWERP
118	E00000117		NGDOM	Next Day	1	OXFORD
	E00000119	ONTIED KI	NGDUN	Next Day	1	OVI.OITD
75440		INTERD IXI	· · ·		• • •	···
75449	E00075531	UNITED KI		Ground	1	MANCHESTER
75464	E00075546	UNITED KI		Ground	1	MANCHESTER
75465	E00075547	UNITED KI	NGDOM	Ground	1	MANCHESTER
75471	E00075553	UNITED KI	NGDOM	Ground	1	OXFORD
75476	E00075558	UNITED KI	NGDOM	Ground	1	OXFORD
75479	E00075561	UNITED KI	NGDOM	Ground	1	OXFORD
75484	E00075566	UNITED KI	NGDOM	Ground	1	OXFORD
75488	E00075570	UNITED KI	NGDOM	Ground	1	MANCHESTER
75498	E00075580	UNITED KI		Ground	1	MANCHESTER
75500	E00075582		NGDOM	Ground	1	OXFORD
75502	E00075584	UNITED KI		Ground	1	OXFORD
		UNITED KI				
75503	E00075585			Ground	1	MANCHESTER
75507	E00075589	UNITED KI		Ground	1	OXFORD
75511	E00075593	UNITED KI		Ground	2	OXFORD
75513	E00075595	UNITED KI		Ground	1	MANCHESTER
75526	E00075608	UNITED KI	NGDOM	Ground	1	OXFORD
75529	E00075611	UNITED KI	NGDOM	Ground	1	OXFORD
75544	E00075626	UNITED KI	NGDOM	Ground	1	OXFORD
75545	E00075627	UNITED KI	NGDOM	Ground	1	OXFORD
75550	E00075632	UNITED KI	NGDOM	Ground	1	OXFORD
75552	E00075634	UNITED KI		Ground	1	OXFORD
75554	E00075636	UNITED KI		Ground	1	MANCHESTER
75556	E00075638	UNITED KI		Ground	2	MANCHESTER
75557	E00075639	UNITED KI		Ground	1	OXFORD
75572	E00075654	UNITED KI		Ground	1	OXFORD
75583	E00075665	UNITED KI		Ground	1	OXFORD
75606	E00075688	UNITED KI		Ground	2	MANCHESTER
75620	E00075702	UNITED KI		Ground	1	OXFORD
75678	E00075760	UNITED KI	NGDOM	Ground	1	MANCHESTER
79998	E00080081	UNITED KI	NGDOM	Ground	1	OXFORD

```
product_category on_sale
                                transit_days
                                                  datetime_ordered
25
                              Y
                                             4 2016-07-03 04:52:12
                   TOPS
34
       JACKETS & VESTS
                              N
                                             3 2016-07-03 05:42:00
37
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 06:01:54
                                             3 2016-07-03 06:38:27
39
                  TOPS
                              N
                   TOPS
                              Y
                                             3 2016-07-03 06:39:40
40
41
                   TOPS
                              N
                                             4 2016-07-03 07:16:03
42
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 07:33:24
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 07:49:19
43
44
       JACKETS & VESTS
                              N
                                             4 2016-07-03 07:55:02
45
                              Y
                                             4 2016-07-03 07:59:58
                   TOPS
47
           ACCESSORIES
                              Y
                                             2 2016-07-03 08:16:49
       JACKETS & VESTS
48
                              N
                                             3 2016-07-03 08:22:15
                                             3 2016-07-03 08:25:17
49
       JACKETS & VESTS
                              N
52
       JACKETS & VESTS
                              Y
                                             4 2016-07-03 08:51:53
53
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 08:52:33
54
                   TOPS
                              N
                                             4 2016-07-03 08:55:24
55
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 08:56:31
58
                  TOPS
                              Y
                                             3 2016-07-03 09:41:02
60
                   TOPS
                              Y
                                             3 2016-07-03 09:42:17
65
       JACKETS & VESTS
                              Y
                                             4 2016-07-03 10:18:41
70
                              Y
                                             3 2016-07-03 10:36:41
                   TOPS
77
                  TOPS
                              Y
                                             3 2016-07-03 11:27:04
78
       JACKETS & VESTS
                              Y
                                             3 2016-07-03 11:29:29
83
           ACCESSORIES
                              Y
                                             3 2016-07-03 11:36:10
                              Y
                                             2 2016-07-03 12:28:30
97
                   TOPS
       JACKETS & VESTS
                                             5 2016-07-03 13:03:22
104
                              N
                                             2 2016-07-03 15:19:55
111
           ACCESSORIES
                              N
                              Y
                                             3 2016-07-03 13:30:37
115
       JACKETS & VESTS
116
                   TOPS
                              Y
                                             3 2016-07-03 13:34:35
       JACKETS & VESTS
                                             1 2016-07-03 16:38:00
118
                              N
. . .
                    . . .
75449
                   TOPS
                              Y
                                             1 2016-10-14 17:59:01
75464
                  TOPS
                              Y
                                             1 2016-10-14 18:08:15
                                             3 2016-10-14 18:10:40
75465
           ACCESSORIES
                              N
75471
       JACKETS & VESTS
                              Y
                                             2 2016-10-14 18:18:18
       JACKETS & VESTS
                                             1 2016-10-14 18:26:35
75476
                              Y
75479
       JACKETS & VESTS
                              N
                                             2 2016-10-14 18:27:03
75484
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 18:37:41
75488
                   TOPS
                              Υ
                                             2 2016-10-14 18:44:12
75498
                   TOPS
                              N
                                             2 2016-10-14 18:57:49
75500
       JACKETS & VESTS
                              N
                                             2 2016-10-14 18:58:52
75502
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 19:02:06
                                             1 2016-10-14 19:03:39
                              N
75503
                   TOPS
75507
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 19:14:17
75511
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 19:17:36
75513
                   TOPS
                              Y
                                             3 2016-10-14 19:19:50
75526
      JACKETS & VESTS
                              Y
                                             1 2016-10-14 19:34:48
```

```
75529
       JACKETS & VESTS
                              Y
                                             3 2016-10-14 19:36:43
       JACKETS & VESTS
                                             1 2016-10-14 19:50:58
75544
                              N
75545
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 19:53:14
75550
       JACKETS & VESTS
                              Y
                                             1 2016-10-14 20:00:25
                              Y
                                             2 2016-10-14 20:01:00
75552
       JACKETS & VESTS
75554
                              Y
                                             1 2016-10-14 20:02:16
                  TOPS
75556
           ACCESSORIES
                              N
                                             1 2016-10-14 20:03:24
75557
       JACKETS & VESTS
                              Y
                                             2 2016-10-14 20:03:43
       JACKETS & VESTS
                              N
                                             2 2016-10-14 20:24:07
75572
                                             1 2016-10-14 20:40:16
75583
       JACKETS & VESTS
                              Υ
                                             1 2016-10-14 21:04:55
75606
           ACCESSORIES
                              N
       JACKETS & VESTS
                              N
                                             1 2016-10-14 21:28:55
75620
                                             2 2016-10-14 22:46:46
75678
                  TOPS
                              N
                              N
                                             3 2016-10-21 12:15:57
79998
       JACKETS & VESTS
         datetime_sourced datetime_product_ready datetime_planned
25
      2016-07-03 07:17:09
                              2016-07-03 09:17:13
                                                         2016-07-06
      2016-07-03 07:16:36
34
                              2016-07-03 10:16:49
                                                         2016-07-05
37
      2016-07-03 08:16:37
                              2016-07-03 10:17:00
                                                         2016-07-05
39
      2016-07-03 08:17:11
                              2016-07-04 08:17:50
                                                         2016-07-05
                              2016-07-04 03:16:16
40
      2016-07-03 08:16:57
                                                         2016-07-06
41
      2016-07-03 09:16:34
                              2016-07-04 04:16:23
                                                         2016-07-06
42
      2016-07-03 09:17:23
                              2016-07-04 04:16:47
                                                         2016-07-05
43
      2016-07-03 09:17:20
                              2016-07-04 07:18:13
                                                         2016-07-06
44
      2016-07-03 10:16:45
                              2016-07-04 05:17:01
                                                         2016-07-06
45
      2016-07-03 10:16:52
                              2016-07-04 07:18:00
                                                         2016-07-07
47
      2016-07-03 10:17:01
                              2016-07-04 04:18:33
                                                         2016-07-06
                              2016-07-04 04:17:25
48
      2016-07-03 10:16:57
                                                         2016-07-06
49
      2016-07-03 10:16:57
                              2016-07-04 07:19:29
                                                         2016-07-06
52
      2016-07-03 10:16:24
                              2016-07-04 04:17:49
                                                         2016-07-07
53
      2016-07-03 11:16:29
                              2016-07-04 07:17:06
                                                         2016-07-06
      2016-07-03 11:16:22
54
                              2016-07-04 07:16:16
                                                         2016-07-08
55
      2016-07-03 11:16:37
                              2016-07-04 04:17:52
                                                         2016-07-06
58
      2016-07-04 03:16:31
                              2016-07-04 07:19:21
                                                         2016-07-06
60
      2016-07-03 11:16:26
                              2016-07-04 03:17:04
                                                         2016-07-06
65
      2016-07-03 12:16:29
                              2016-07-04 06:16:18
                                                         2016-07-09
70
      2016-07-03 13:16:30
                              2016-07-04 06:16:27
                                                         2016-07-06
77
      2016-07-03 13:16:44
                              2016-07-04 04:17:35
                                                         2016-07-07
78
      2016-07-03 13:16:38
                              2016-07-04 04:17:25
                                                         2016-07-07
      2016-07-03 13:16:50
                              2016-07-04 04:16:16
83
                                                         2016-07-07
97
      2016-07-03 14:16:38
                              2016-07-04 08:18:23
                                                         2016-07-06
104
      2016-07-03 15:16:40
                              2016-07-04 05:16:35
                                                         2016-07-13
      2016-07-03 15:56:23
                              2016-07-06 11:58:22
111
                                                         2016-07-07
      2016-07-03 15:16:17
                              2016-07-04 04:18:16
115
                                                         2016-07-07
116
      2016-07-03 16:16:21
                              2016-07-04 04:17:31
                                                         2016-07-07
118
      2016-07-03 17:41:49
                              2016-07-05 06:19:13
                                                         2016-07-06
75449 2016-10-14 19:09:18
                              2016-10-18 19:09:56
                                                         2016-10-19
```

13404	2010 10 14	19.09.22	2010 10 10	13.23.01	2010 10 13		
75465	2016-10-14	19:29:24	2016-10-18	15:49:13	2016-10-21		
75471	2016-10-14	19:28:20	2016-10-18	19:18:48	2016-10-20		
				10:49:21			
75479	2016-10-14	19:28:32	2016-10-17	10:05:15	2016-10-20		
				10:20:22			
75488	2016-10-14	19:50:33	2016-10-18	19:23:35	2016-10-20		
				19:27:22			
75500	2016-10-14	19:51:31	2016-10-18	14:12:39	2016-10-20		
				14:12:43			
75503	2016-10-14	20:03:22	2016-10-18	19:23:18	2016-10-19		
				10:22:37			
75511	2016-10-14	20:33:45	2016-10-18	18:25:25	2016-10-19		
				19:31:01			
75526	2016-10-14	20:33:56	2016-10-19	18:05:18	2016-10-19		
				14:10:35			
75544	2016-10-14	21:10:36	2016-10-17	10:21:10	2016-10-21		
				10:52:38			
75550	2016-10-14	21:10:31	2016-10-18	19:28:21	2016-10-19		
75552	2016-10-14	20:56:40	2016-10-18	14:30:53	2016-10-20		
75554	2016-10-14	21:10:21	2016-10-18	19:20:27	2016-10-19		
				19:20:58			
				18:25:24			
75572	2016-10-14	21:35:47	2016-10-17	10:22:46	2016-10-20		
75583	2016-10-14	21:57:33	2016-10-18	10:22:46 14:36:15	2016-10-19		
				19:20:21			
				14:57:24			
75678	2016-10-15	00:04:43	2016-10-17	16:08:02	2016-10-19		
79998	2016-10-21	13:19:49	2016-10-24	17:20:54	2016-10-31		
	deadline_s	source dead]	line_make o	deadline_delive	delivered_to	plan	\
25		NaN	3	4	1	PASS	
34		NaN	3	3	3	PASS	
37		NaN	2	3	3	PASS	
39		NaN	2	3	3	PASS	
40		NaN	2	3	3	PASS	
41		NaN	25	4	1	PASS	
42		NaN	25	3	3	FAIL	
43		NaN	25	3	3	PASS	
44		NaN	24	4	1	FAIL	
45		NaN	24	4	1	PASS	
47		NaN	24	2	2	PASS	
48		NaN	24	3	3	PASS	
49		NaN	24	3	3	PASS	
52		NaN	24	4	1	PASS	
53		NaN	23	3	3	PASS	
54		NaN	23	4	1	PASS	
55		NaN	23	3	3	PASS	

75464 2016-10-14 19:09:22 2016-10-18 19:29:07 2016-10-19

58	NaN	7	3	PASS
60	NaN	23	3	PASS
65	NaN	22	4	PASS
70	NaN	21	3	PASS
77	NaN	21	3	PASS
78	NaN	21	3	PASS
83	NaN	21	3	PASS
97	NaN	20	2	PASS
104	NaN	19	5	PASS
111	NaN	83	2	FAIL
115	NaN	19	3	PASS
116	NaN	18	3	PASS
118	NaN	20	1	PASS
75449	NaN	143	2	FAIL
75464	NaN	143	2	PASS
75465	NaN	143	3	PASS
75471	NaN	143	3	PASS
75476	NaN	143	1	PASS
75479	NaN	143	2	PASS
75484	NaN	143	1	PASS
75488	NaN	142	3	PASS
75498	NaN	142	3	FAIL
75500	NaN	142	2	FAIL
75502	NaN	142	1	PASS
75503	NaN	142	2	PASS
75507	NaN	141	1	PASS
75511	NaN	141	1	PASS
75513	NaN	141	6	FAIL
75526	NaN	141	1	FAIL
75529	NaN	142	3	PASS
75544	NaN	141	1	FAIL
75545	NaN	141	1	PASS
75550	NaN	141	2	PASS
75552	NaN	141	2	PASS
75554	NaN	141	2	PASS
75556	NaN	141	2	PASS
75557	NaN	141	2	PASS
75572	NaN	140	2	PASS
75583	NaN	140	1	PASS
75606	NaN	140	2	FAIL
75620	NaN	140	1	PASS
75678	NaN	134	3	PASS
79998	NaN	77	3	PASS

	time_sourced	time_make	time_ready
25	144	4	0
34	94	4	0

37	134	4	0
39	98	1	1
40	97	20	0
41	120	21	0
42	103		
		20	0
43	88	23	0
44	141	21	0
45	136	23	0
47	120	20	0
48	114	19	0
49	111	22	0
52	84	19	0
53	143	22	0
54	140	22	0
55	140	19	0
58	1055	21	0
60	94	17	0
65	117	19	0
70	159	19	0
77	109	16	0
78	107	16	0
83	100	16	0
97	108	19	0
104	133	16	0
111	36	20	2
115	105	14	0
116	161	14	0
118	63	13	1
	• • •	• • •	• • •
75449	70	1	4
75464	61	1	4
75465	78	21	3
75471	70	1	4
75476	62	16	3
75479	61	15	2
75484	50	15	2
75488	66	0	4
75498	65	0	4
75500	52	19	3
75502	53	19	3
75503	59	0	4
75507	77	15	2
75511	76	23	3
75513	72	0	4
75526	59	22	4
75529	45	18	3
75544	79	14	2
75545	77	14	3

75550	70	23	3
75552	55	18	3
75554	68	23	3
75556	56	23	3
75557	66	22	3
75572	71	13	2
75583	77	17	3
75606	54	22	3
75620	53	17	3
75678	77	17	2
79998	63	5	3

[535 rows x 19 columns]

535 rows have null columns in the data matrix

Here we create a new data matrix by the name of **data_corr**. We drop the old variables and introduce the old variables.

```
In [439]: data_corr=data;
          data_corr=data_corr.drop(['order_id','delivered_to_plan','datetime_ordered','datetime
          data_corr.head()
Out [439]:
                     country shipping_method units_per_order facility product_category
             UNITED KINGDOM
                                       Ground
                                                                  OXFORD
                                                                               ACCESSORIES
          1
                                       Ground
                                                                 ANTWERP
                                                                           JACKETS & VESTS
                      FRANCE
          2
                                       Ground
                      FRANCE
                                                              1 ANTWERP
                                                                                       TOPS
          3
                      FRANCE
                                       Ground
                                                              1
                                                                 ANTWERP
                                                                           JACKETS & VESTS
             UNITED KINGDOM
                                     Next Day
                                                              1
                                                                  OXFORD
                                                                           JACKETS & VESTS
                                                      deadline_make
                                                                       deadline_deliver
            on_sale
                      transit_days
                                    deadline_source
          0
                   Y
                                 2
                                              1612.0
                                                                  38
                                                                                       3
          1
                                                                   8
                                                                                       3
                  N
                                 3
                                               531.0
          2
                   Y
                                 3
                                               504.0
                                                                   8
                                                                                       3
                   Y
                                 5
          3
                                               492.0
                                                                   8
                                                                                       5
          4
                   Y
                                  1
                                              1567.0
                                                                    6
                                                                                       1
             time_sourced time_make
                                       time_ready
          0
                        62
                                    21
                                                 2
          1
                       127
                                     7
                                                 0
          2
                                     5
                                                 0
                       100
          3
                        88
                                     5
                                                 0
                       244
                                     5
                                                 2
```

(79999, 13)

In [440]: print(data_corr.shape)

The new matrix: data_corr has 13 columns now.

- 1.4.1 Creating a dictionary so that we can map the categorical values. Categorical variables are:
 - Country: UNITED KINGDOM: 0, FRANCE: 1, GERMANY: 2, SWEDEN: 3, BELGIUM: 4
 - Shipping Method: Ground: 0,: Next Day: 1, 3-Day: 2, 2-Day**: 3
 - Facility: OXFORD: 0, ANTWERP: 1, MANCHESTER: 2, AUGSBURG: 3, HANOVER: 4, EINDHOVEN: 5
 - Product Category: ACCESSORIES: 0, JACKETS & VESTS: 1, TOPS: 2
 - On Sale: Y: 0, N: 1

```
In [441]: col=['country','shipping method','facility','product category','on sale']
          tmp=[];
          for i,j in enumerate(col):
              a=data_corr[j].unique()
              tmp.append(dict(zip(a,list(range(0,len(a))))))
              print(tmp[i])
              data_corr[j]=data_corr[j].map(tmp[i])
{'UNITED KINGDOM': 0, 'FRANCE': 1, 'GERMANY': 2, 'SWEDEN': 3, 'BELGIUM': 4}
{'Ground': 0, 'Next Day': 1, '3-Day': 2, '2-Day': 3}
{'OXFORD': 0, 'ANTWERP': 1, 'MANCHESTER': 2, 'AUGSBURG': 3, 'HANOVER': 4, 'EINDHOVEN': 5}
{'ACCESSORIES': 0, 'JACKETS & VESTS': 1, 'TOPS': 2}
{'Y': 0, 'N': 1}
In [442]: data_corr.head()
Out [442]:
                      shipping_method units_per_order facility product_category
             country
          0
                   0
                                    0
                                                      1
                                                                0
          1
                   1
                                    0
                                                      1
                                                                1
                                                                                   1
          2
                                    0
                                                                                   2
                   1
                                                      1
                                                                1
          3
                   1
                                    0
                                                      1
                                                                1
                                                                                   1
          4
                   0
                                                                0
                                     1
                                                      1
                                                                                   1
             on sale transit_days deadline_source deadline_make deadline_deliver
          0
                                 2
                                              1612.0
                                                                 38
                                                                                     3
                   0
                                 3
                                                                                     3
          1
                   1
                                               531.0
                                                                  8
          2
                   0
                                 3
                                               504.0
                                                                  8
                                                                                     3
                                 5
          3
                   0
                                               492.0
                                                                  8
                                                                                     5
          4
                   0
                                 1
                                              1567.0
                                                                  6
                                                                                     1
             time sourced time make time ready
          0
                       62
                                  21
          1
                      127
                                   7
                                                0
          2
                      100
                                   5
                                                0
          3
                       88
                                   5
                                                0
```

Pushing the column with NaN values:deadline_source to the front for easy matrix manipulation which will be required later