DAR Defi Team Assignment 2 (Fall 2021)

DeFi Reserve Coins

your name here

08/03/2021

GITHUB UPDATE & SUBMISSION INSTRUCTIONS (Delete before submission!)

For this and subsequent assignments you'll follow the same basic github steps you used for Assignment 1, ie:

- Option 1: Update the copy of your team's repository currently in your home directory:
 - This is the preferred option **if** you have already cloned the repository
 - In the Linux terminal: git pull origin master
 - If there are errors, it's simplest to proceed to "Option 2"
 - If no errors, check your branch: git branch (should be something like dar-rcsid)
- Option 2: Get a fresh copy of your team's repository:
 - Do this only if Option 1 fails!
 - In Linux: cd ~ to get to your login directory
 - In Linux: rm -Rf IDEA-Blockchain (deletes all your previous, uncommitted work)
 - In Linux: git clone https://github.rpi.edu/DataINCITE/IDEA-Blockchain.git
 - In Linux: cd IDEA-Blockchain
 - In Linux: Recreate a personal branch to save your changes to: git checkout -b dar-rcsid (replace "rcsid" with your rcsid!)
- Locate and save a personal copy of the assignment notebook:
 - In RStudio "Files" tab, navigate to: Home > IDEA-Blockchain > DefiResearch > StudentNotebooks
 Assignment02
 - Double-click on blockchain-assignment2-f21.Rmd to open
 - Under the "File" menu, "Save as" something like rcsid-assignment2-f21.Rmd (replace "rcsid" with your rcsid!)
 - You should see your file appear in the "Files" tab, usually at the bottom
 - Under "More" in the "Files" tab, select "Set as working directory"
- Edit your notebook, saving as you make changes.
 - cntl-S works!
- "Knit" your notebook, generating a PDF file:
 - You should see your new PDF appear in the "Files" tab, usually at the bottom
 - "Export" your file (under the "More" menu in the "Files" tab) and save to your local file system
- Add your changed file(s) to your personal branch, and commit:
 - In Linux: cd ~/IDEA-Blockchain/DefiResearch/StudentNotebooks/Assignment02
 - In Linux: git add rcsid-assignment2.* (replace "rcsid" with your rcsid!)
 - In Linux: git commit -m "rcsid assignment 2"
- Push your changes to the remote repository:
 - In Linux: git push origin dar-rcsid (replace "rcsid" with your rcsid)
- Issue a pull request:
 - Navigate to https://github.rpi.edu/DataINCITE/IDEA-Blockchain in your browser
 - It should notify you of your recent push and prompt you to make a pull request.

- If not, find your branch under the popup (defaults to **master**), select and click to issue a pull request
- One of the instructors
- Upload your downloaded rcsid-assignment2-f21.pdf to LMS (replace "rcsid" with your rcsid)
- Be prepared to share your findings in the DeFi Meeting Thursday.

Prepare Transaction Data and Explore

We begin by loading our prepared AAVE transaction data into a dataframe. The dataset has over 400,000 rows, and 27 columns.

We are directly loading the dataframe from an Rds archive instead of a CSV file to conserve space.

```
#load Rds (binary version of csv file) into dataframe
# Assumes this notebook is in: ~/IDEA-Blockchain/DefiResearch/StudentNotebooks/Assignment02
df<-read_rds('.../.../Data/transactions.Rds')
# Let's take a quick look at the first few observation
head(df)</pre>
```

nead(d1)									
##		amount	borrowRate bo	orrowRateMod	e onBehalf(Of	pool	reserve	
##	1	41501.63	6.274937	Variabl	e 8.502518e+4	17 1.03466	8e+48	DAI	
##	2	7000000.00	2.589628	Variabl	e 4.635974e+4	17 1.03466	8e+48	USDT	
##	3	15000.00	8.802541	Variabl	e 3.735263e+4	17 1.03466	8e+48	USDC	
##	4	8193.19	48.747052	Stabl	e 6.896232e+4	17 1.03466	8e+48	USDC	
##	5	11000.00	3.225055	Variabl	e 1.089455e+4	18 1.03466	8e+48	USDT	
##	6	40000.00	5.739208	Variabl	e 2.178337e+4	17 1.03466	8e+48	USDT	
##		timestamp	user	type rese	rvePriceETH	reservePri	ceUSD	amountU	SD
##	1	1621340435	8.502518e+47	borrow 2	.852900e+14	0.99	48044	41286.	00
##	2	1622477822	4.635974e+47	borrow 3	.812835e+14	1.00	00000	7000000.	00
##	3	1619775984	3.735263e+47	borrow 3	.611000e+14	1.00	43389	15065.	80
##	4	1615481632	6.896232e+47	borrow 5	.562201e+14	0.99	93909	8188.	20
##	5	1626914745	1.089455e+48	borrow 4	.971100e+14	1.00	00000	11000.	00
##	6	1620936688	2.178337e+47	borrow 2	.725248e+14	1.00	00000	40000.	00
##		collateral	Amount collate	eralReserve	principalAmou	ınt princi	palRes	serve	
##	1		NA			NA			
##	2		NA			NA			
##	3		NA			NA			
##	4		NA			NA			
##			NA			NA			
##	6		NA			NA			
##		reservePri	ceETHPrincipal	l reservePri	ceUSDPrincipa	al reserve	PriceE	ETHCollat	eral
##			NA			ΝA			NA
##			NA			ΝA			NA
##			NA			ΝA			NA
##			NA			VΑ			NA
##			NA			VΑ			NA
##	6		NA	=		VΑ			NA
##		reservePri	ceUSDCollatera		-	intUSDColl			
##	_			1A	NA		NA		
##	_			1A	NA		NA		
##	_			JA.	NA		NA		
##	_			JA.	NA		NA		
##				1A	NA		NA		
##	6		l	JΑ	NA		NA	1	

```
borrowRateModeFrom borrowRateModeTo stableBorrowRate variableBorrowRate
## 1
                                                                                 NA
## 2
                                                            NA
                                                                                NA
## 3
                                                            NA
                                                                                NA
## 4
                                                            NA
                                                                                NA
## 5
                                                            NA
                                                                                NΑ
## 6
                                                            NA
                                                                                NA
```

Now look at the summaries to see the types, values, and missingness (NA's) of the data.

summary(df)

```
borrowRate
                                              borrowRateMode
                                                                   onBehalfOf
##
        amount
    Min.
            :
                     0
                          Min.
                                       0.0
                                                      :386542
                                                                 Min.
                                                                         :2.578e+33
##
    1st Qu.:
                    24
                          1st Qu.:
                                       3.3
                                             Stable
                                                      : 18408
                                                                 1st Qu.:4.174e+47
##
    Median :
                  1427
                          Median:
                                       3.9
                                              Variable: 76569
                                                                 Median :7.522e+47
##
    Mean
                191103
                          Mean
                                       9.5
                                                                 Mean
                                                                         :7.592e+47
##
    3rd Qu.:
                 24382
                          3rd Qu.:
                                      10.8
                                                                 3rd Qu.:1.168e+48
##
    Max.
            :60000000
                          Max.
                                  :10002.0
                                                                 Max.
                                                                         :1.461e+48
                                  :386542
##
    NA's
            :7289
                          NA's
                                                                 NA's
                                                                         :7289
##
         pool
                                               timestamp
                             reserve
                                                                        user
##
                                                    :1.607e+09
                                                                          :2.578e+33
            :9.862e+47
                          USDC
                                  :105937
                                            Min.
                                                                  Min.
    Min.
##
    1st Qu.:1.035e+48
                          WETH
                                  :105279
                                            1st Qu.:1.615e+09
                                                                  1st Qu.:4.199e+47
                                                                  Median: 8.697e+47
##
    Median :1.035e+48
                          USDT
                                  : 58266
                                            Median :1.621e+09
##
    Mean
            :1.034e+48
                                  : 55211
                                                    :1.620e+09
                                                                          :8.082e+47
                          DAI
                                            Mean
                                                                  Mean
##
    3rd Qu.:1.035e+48
                          LINK
                                  : 26404
                                            3rd Qu.:1.624e+09
                                                                  3rd Qu.:1.173e+48
            :1.035e+48
                          WBTC
                                  : 26344
                                                    :1.629e+09
                                                                          :1.461e+48
##
    Max.
                                            Max.
                                                                  Max.
##
                          (Other):104078
                                                 reservePriceUSD
##
                           reservePriceETH
              type
##
                                   :1.000e+00
                                                 Min.
                                                        :0.000e+00
    borrow
                : 94977
                           Min.
                :192006
                                                 1st Qu.:1.000e+00
##
    deposit
                           1st Qu.:2.865e+14
##
                   6289
                           Median :4.652e+14
                                                 Median :1.000e+00
    liquidation:
##
    redeem
                :126705
                           Mean
                                   :3.458e+23
                                                 Mean
                                                         :6.774e+08
                : 60542
                           3rd Qu.:9.411e+14
                                                 3rd Qu.:1.000e+00
##
    repay
##
    swap
                   1000
                           Max.
                                   :1.647e+28
                                                 Max.
                                                         :4.252e+13
##
                           NA's
                                   :7289
                                                 NA's
                                                         :7289
##
      amountUSD
                          collateralAmount
                                             collateralReserve principalAmount
    Min.
##
                     0
                          Min.
                                                     :475230
                                                                 Min.
                                         0
##
                    70
                          1st Qu.:
                                         1
                                                        2665
                                                                 1st Qu.:
                                                                              962
    1st Qu.:
                                             WETH
##
    Median:
                  5836
                          Median:
                                        14
                                             LINK
                                                         1312
                                                                 Median:
                                                                             4362
                                                                            66005
##
    Mean
                245851
                          Mean
                                      5451
                                             WBTC
                                                     :
                                                          686
                                                                 Mean
##
    3rd Qu.:
                 49871
                          3rd Qu.:
                                       250
                                              AAVE
                                                          333
                                                                 3rd Qu.:
                                                                            21533
##
    Max.
            :754379487
                                  :4638724
                                             UNI
                                                          230
                                                                 Max.
                          Max.
                                                                         :4475668
            :7289
                                  :475230
                                                        1063
##
    NA's
                          NA's
                                              (Other):
                                                                 NA's
                                                                         :475230
##
    principalReserve reservePriceETHPrincipal reservePriceUSDPrincipal
##
            :475230
                      Min.
                              :1.000e+00
                                                  Min.
                                                               0.0
##
    USDC
               2142
                       1st Qu.:4.062e+14
                                                  1st Qu.:
                                                               1.0
##
    USDT
            :
               1549
                       Median: 4.682e+14
                                                  Median:
                                                               1.0
##
    DAI
               1459
                              :1.556e+17
                                                             295.6
                       Mean
                                                  Mean
##
    GUSD
                242
                       3rd Qu.:5.363e+14
                                                  3rd Qu.:
                                                               1.0
            :
##
    TUSD
                175
                              :4.203e+19
                                                          :83819.1
            :
                      Max.
                                                  Max.
##
    (Other):
                722
                      NA's
                              :475230
                                                  NA's
                                                          :475230
##
    reservePriceETHCollateral reservePriceUSDCollateral amountUSDPincipal
##
            :1.000e+00
                                        :0.000e+00
    Min.
                                Min.
                                                             Min.
                                                                            0
    1st Qu.:1.000e+00
                                1st Qu.:0.000e+00
                                                             1st Qu.:
                                                                         1022
```

```
Median :5.110e+14
                               Median :1.000e+00
                                                          Median :
                                                                     4481
##
    Mean
           :2.177e+21
                               Mean
                                      :4.543e+06
                                                          Mean
                                                                    67361
##
    3rd Qu.:1.110e+16
                               3rd Qu.:2.600e+01
                                                          3rd Qu.:
                                                                    22066
                                      :2.509e+09
##
   Max.
           :9.116e+23
                               Max.
                                                          Max.
                                                                 :4571839
##
    NA's
           :475230
                               NA's
                                      :475230
                                                          NA's
                                                                 :475230
##
    \verb|amountUSDCollateral| borrowRateModeFrom| borrowRateModeTo|
                                                              stableBorrowRate
##
   Min.
                  0
                                 :480519
                                                     :480519
                                                               Min. : 0.0
    1st Qu.:
                                                               1st Qu.: 9.0
##
                  0
                        Stable :
                                     471
                                            Stable :
                                                         529
##
    Median:
                476
                        Variable:
                                     529
                                            Variable:
                                                         471
                                                               Median: 10.9
##
   Mean
              37060
                                                               Mean
                                                                      : 11.7
    3rd Qu.:
               7457
                                                               3rd Qu.: 12.0
##
  {\tt Max.}
           :5029023
                                                               Max.
                                                                       :154.7
   NA's
           :475230
                                                               NA's
                                                                       :480519
##
##
   variableBorrowRate
##
  Min.
           : 0.0
##
   1st Qu.:
              3.8
##
  Median: 3.9
##
  Mean
           : 5.7
##
   3rd Qu.: 5.1
## Max.
           :148.7
##
  NA's
           :480519
```

First we'll do some preliminary analysis before we ask detailed questions.

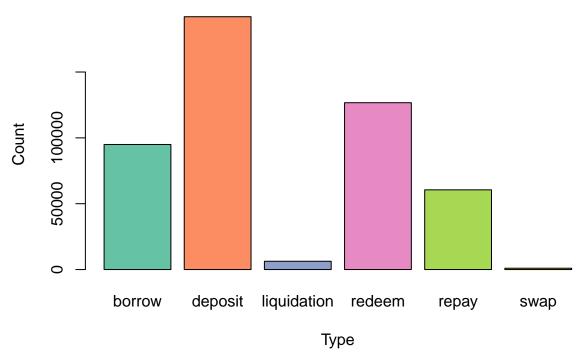
Analyze Transaction Types

Let's examine the different types of *transactions* present in the data. We'll make a simple bar plot to visualize the number of each transaction types. "Deposit" is the most common type of transaction, whereas "swaps" are the most rare.

```
#set color palette
colors = brewer.pal(6, "Set2")

#create barplot
barplot(table(df$type), main='Transaction Type Counts', xlab='Type',ylab='Count',col=colors)
```

Transaction Type Counts

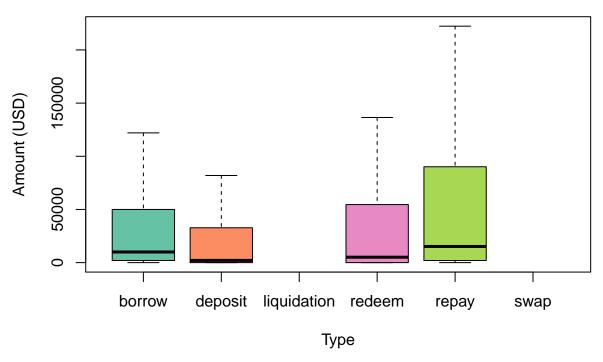


There are more "deposits" than "borrows," because users often need to overcollateralize for loans.

Now we'll examine the amount of US dollars being used in the different types of transactions. We create box plots for the four types of transactions that have the "amount" feature associated with them, and we visualize the distribution of that column for the different transactions.

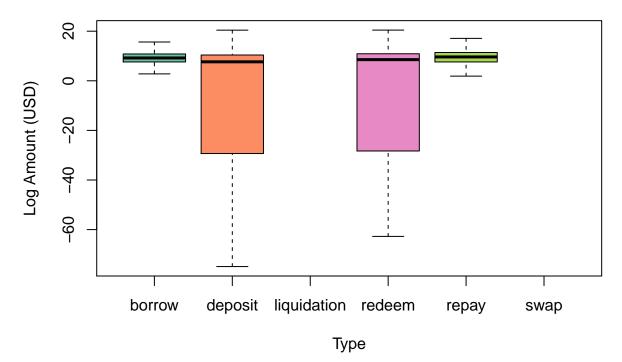
We can see that most transactions are completed with very little money.

Transaction Amounts



We do find some very large amounts, so it's helpful to look at this on a log scale.

Log Transaction Amounts



Observation: There are many borrows and repays with high transactions amounts, but deposits and redeems

have much lower transactions amounts.

Examine Reserve Coins

There are 50 different "Reserve" coins used in transactions in AAVE. Let's create a table of those reserve coins with at least 500 transactions and rank order them by their volume.

```
# Use deplyr to drop NA reserves, add the counts and then kep only the top 20
reservecoins <- df %>% drop_na(reserve) %>%
    count(reserve) %>%
    arrange(-n) %>%
    head(20)

# Add the rank to help keep track of the reserve coins
reservecoins <- reservecoins %>%
    mutate(rank=1:nrow(reservecoins),.before=reserve)

# List the results nicely with kable()
kable(reservecoins)
```

rank	reserve	n
1	USDC	105937
2	WETH	105279
3	USDT	58266
4	DAI	55211
5	LINK	26404
6	WBTC	26344
7	AAVE	12174
8	CRV	10593
9	UNI	7547
10	XSUSHI	7337
11	SNX	6938
12	SUSD	6542
13		6289
14	GUSD	6009
15	YFI	5919
16	BUSD	4863
17	TUSD	3317
18	BAL	3152
19	MKR	3101
20	REN	2638

Let's look at the number of transactions types for each currency.

```
TopcoinSummary <- df %>% filter(reserve %in% reservecoins$reserve) %>%
  group_by(reserve) %>%
  count(type) %>%
  mutate(percent = n/sum(n)*100)

kable(TopcoinSummary)
```

reserve	type	n	percent
	liquidation	6289	100.0000000

reserve	type	n	percent
AAVE	borrow	2	0.0164285
AAVE	deposit	7028	57.7295876
AAVE	redeem	5141	42.2293412
AAVE	repay	3	0.0246427
BAL	borrow	215	6.8210660
BAL	deposit	2171	68.8769036
BAL	redeem	612	19.4162437
BAL	repay	154	4.8857868
BUSD	borrow	1685	34.6493934
BUSD	deposit	1135	23.3395024
BUSD	redeem	836	17.1910343
BUSD	repay	1207	24.8200699
CRV	borrow	1054	9.9499670
CRV	deposit	5780	54.5643349
CRV	redeem	2607	24.6105919
CRV	repay	1152	10.8751062
DAI	borrow	14133	25.5981598
DAI	deposit	18552	33.6019996
DAI	redeem	13381	24.2361124
DAI	repay	8895	16.1109199
DAI	swap	250	0.4528083
GUSD	borrow	2282	37.9763688
GUSD	deposit	1493	24.8460642
GUSD	redeem	967	16.0925279
GUSD	repay	1267	21.0850391
LINK	borrow	1321	5.0030298
LINK	deposit	15270	57.8321466
LINK	redeem	8713	32.9987881
LINK	repay	1097	4.1546735
LINK	swap	3	0.0113619
MKR	borrow	188	6.0625605
MKR	deposit	1766	56.9493712
MKR	redeem	986	31.7961948
MKR	repay	159	5.1273783
MKR	swap	2	0.0644953
REN	borrow	196	7.4298711
REN	deposit	1417	53.7149356
REN	redeem	840	31.8423048
REN	repay	183	6.9370735
REN	swap	2	0.0758150
SNX	borrow	433	6.2409916
SNX	deposit	4002	57.6823292
SNX	redeem	2052	29.5762468
SNX	repay	451	6.5004324
SUSD	borrow	1277	19.5200245
SUSD	deposit	2403	36.7318863
SUSD	redeem	1781	27.2240905
SUSD	repay	1081	16.5239988
TUSD	borrow	991	29.8763943
TUSD	deposit	853	25.7160084
TUSD	redeem	661	19.9276455
TUSD	repay	796	23.9975882
1000	1 opay	150	20.0010002

reserve type n percent TUSD swap 16 0.4823636 UNI borrow 567 7.5129190 UNI deposit 3912 51.8351663 UNI redeem 2540 33.6557573 UNI redeem 2540 33.6557573 UNI repay 527 6.9829071 UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC redeem 22131 20.8997181 USDC redeem 20326 19.1868752 USDC swap 425 0.4011818 USDT deposit 12593 21.6129475 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971				
UNI borrow 567 7.5129190 UNI deposit 3912 51.8351663 UNI redeem 2540 33.6557573 UNI repay 527 6.9829071 UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	reserve	type	n	percent
UNI deposit 3912 51.8351663 UNI redeem 2540 33.6557573 UNI repay 527 6.9829071 UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	TUSD	swap	16	0.4823636
UNI redeem 2540 33.6557573 UNI repay 527 6.9829071 UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	UNI	borrow	567	7.5129190
UNI repay 527 6.9829071 UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	UNI	deposit	3912	51.8351663
UNI swap 1 0.0132503 USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	UNI	redeem	2540	33.6557573
USDC borrow 35469 33.4812200 USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	UNI	repay	527	6.9829071
USDC deposit 27586 26.0400049 USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	UNI	swap	1	0.0132503
USDC redeem 22131 20.8907181 USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 <td>USDC</td> <td>borrow</td> <td>35469</td> <td>33.4812200</td>	USDC	borrow	35469	33.4812200
USDC repay 20326 19.1868752 USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDC	deposit	27586	26.0400049
USDC swap 425 0.4011818 USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDC	redeem	22131	20.8907181
USDT borrow 22332 38.3276697 USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDC	repay	20326	19.1868752
USDT deposit 12593 21.6129475 USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDC	swap	425	0.4011818
USDT redeem 10349 17.7616449 USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDT	borrow	22332	38.3276697
USDT repay 12719 21.8291971 USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDT	deposit	12593	21.6129475
USDT swap 273 0.4685408 WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDT	redeem	10349	17.7616449
WBTC borrow 2082 7.9031278 WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDT	repay	12719	21.8291971
WBTC deposit 13994 53.1202551 WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	USDT	swap	273	0.4685408
WBTC redeem 8442 32.0452475 WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WBTC	borrow	2082	7.9031278
WBTC repay 1816 6.8934103 WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WBTC	deposit	13994	53.1202551
WBTC swap 10 0.0379593 WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WBTC	redeem	8442	32.0452475
WETH borrow 7234 6.8712659 WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WBTC	repay	1816	6.8934103
WETH deposit 56373 53.5462913 WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WBTC	swap	10	0.0379593
WETH redeem 35505 33.7246744 WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WETH	borrow	7234	6.8712659
WETH repay 6155 5.8463701 WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WETH	deposit	56373	53.5462913
WETH swap 12 0.0113983 XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WETH	redeem	35505	33.7246744
XSUSHI borrow 242 3.2983508 XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WETH	repay	6155	5.8463701
XSUSHI deposit 4382 59.7246831 XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	WETH	swap	12	0.0113983
XSUSHI redeem 2454 33.4469129 XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	XSUSHI	borrow	242	3.2983508
XSUSHI repay 259 3.5300532 YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	XSUSHI	deposit	4382	59.7246831
YFI borrow 403 6.8085825 YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243		redeem	2454	33.4469129
YFI deposit 2976 50.2787633 YFI redeem 2146 36.2561243	XSUSHI	repay	259	3.5300532
YFI redeem 2146 36.2561243	YFI	borrow	403	6.8085825
	YFI	deposit	2976	50.2787633
YFI repay 394 6.6565298	YFI	redeem	2146	
	YFI	repay	394	6.6565298

Look at Sample User Transaction Histories

Finally, we will examine the transaction history of different users. To do this, we will select 3 random users from the data who have completed between 100 and 300 transactions. Then, we create swarmplots displaying the different types of transactions those users made over time.

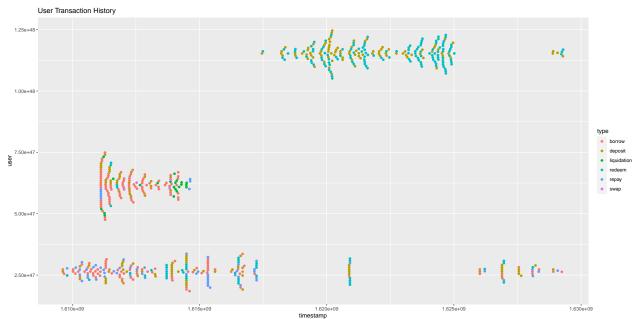
```
#set seed
set.seed(1)

# Select three random users that have between 100 and 300 transactions
users<-vector(length=3)
count<-0
while(count<=3){
    success<-FALSE
    while(!success){
        #get random user
        ruser<-sample(df$user,1)</pre>
```

```
#check for valid number of transactions
length<-nrow(filter(df,user==ruser))
if (length>100 && length<300){
    users[count]=ruser
    success<-TRUE
    count<-count+1
    }
}
df.rusers<-filter(df, user %in%users)

# Create a "swarmplot"

ggplot(df.rusers,aes(user, timestamp,color=type)) +
    geom_beeswarm(cex=1)+
    coord_flip()+
    ggtitle("User Transaction History")</pre>
```



Observation: Users have very different transactions patterns, which we will try to better understand.

Activities

 $\#\#Exercise\ 1(10pts)$

- 1. Divide the top 20 reserve coins between your team members so each team member has the same amount of coins; feel free to add or subtract coins if necessary.
- 2. Look up your coins on the internet to find out what they are. ProTip: Look them up on http://defipulse.com to see their Total Value Locked (TVL).
- 3. Examine the percentage of transaction types for your coins. Hypothesize why a given coin might have more of one type of transaction than another.
- 4. Prepare one slide with the findings for each of your coins. (one slide summarizing each coin)

- 5. Coordinate with your team, to combine each of your member's coin descriptions into a single presentation. Please develop a common format or template for presenting your coin summaries so that the common information for a coin (e.g. TVL) is shown in the same format. (Your slide summaries should look the same!)
- 6. Be prepared to present your team presentation to your client in class on Thursday 9/16.

$\#\#Exercise\ 2(10pts)$

- 1. Perform a "creative exploration" of some aspect of the Defi data that you find interesting. Add your work in this notebook. Your work should include at least one data visualization.
- 2. Put your work in this notebook.
- 3. Write a paragraph describing your findings in the context of DeFi.
- 4. Be prepared to share (2 minutes) in team meeting.
- 5. You'll receive extra credit for work that goes "above and beyond" this assignment!