

In [1]:

```
# This R environment comes with many helpful analytics packages installed
# It is defined by the kaggle/rstats Docker image: https://github.com/kaggle/docker-rstats
# For example, here's a helpful package to load

library(tidyverse) # metapackage of all tidyverse packages

# Input data files are available in the read-only "../input/" directory
# For example, running this (by clicking run or pressing Shift+Enter) will list all files
under the input directory

list.files(path = "../input")

# You can write up to 20GB to the current directory (/kaggle/working/) that gets preserved
as output when you create a version using "Save & Run All"
# You can also write temporary files to /kaggle/temp/, but they won't be saved outside of
the current session
```

— Attaching packages — tidyverse 1.3.1 —

```
✓ ggplot2 3.3.4      ✓ purrr 0.3.4
✓ tibble 3.1.2      ✓ dplyr 1.0.7
✓ tidyr 1.1.3       ✓ stringr 1.4.0
✓ readr 1.4.0       ✓ forcats 0.5.1
```

— Conflicts — tidyverse_conflicts() —

```
✖ dplyr::filter() masks stats::filter()
✖ dplyr::lag() masks stats::lag()
```

'crypto-coin-infos'

In [3]:

```
library(readxl)
```

In [4]:

```
cmd <- read_excel("../input/crypto-coin-infos/cmd_final.xlsx")
pod <- read_excel("../input/crypto-coin-infos/pod_final.xlsx")
```

In [5]:

```
str(cmd)
```

```
tibble [7,459 × 59] (S3: tbl_df/tbl/data.frame)
 $ id                                     : chr [1:7459] "bitcoin" "01coin" "0-5
x-long-algorand-token" "0-5x-long-altcoin-index-token" ...
 $ symbol                               : chr [1:7459] "btc" "zoc" "alghalf"
"althalf" ...
 $ name                                 : chr [1:7459] "Bitcoin" "01coin" "0.5
X Long Algorand Token" "0.5X Long Altcoin Index Token" ...
 $ asset_platform_id                   : chr [1:7459] NA NA "ethereum" "ether
eum" ...
 $ block_time_in_minutes               : num [1:7459] 10 0 0 0 0 0 0 0 0 0 ..
.
 $ hashing_algorithm                   : chr [1:7459] "SHA-256" "NeoScript" N
A NA ...
 $ categories                          : chr [1:7459] "["Cryptocurrency"]" "["
'Masternodes']" "[" "]" ...
 $ country_origin                      : chr [1:7459] NA NA NA NA ...
 $ genesis_date                        : chr [1:7459] "2009-01-03" NA NA NA .
..
 $ sentiment_votes_up_percentage       : num [1:7459] 55.4 NA NA NA NA NA NA N
A NA NA ...
 $ sentiment_votes_down_percentage     : num [1:7459] 44.6 NA NA NA NA NA NA N
A NA NA ...
```

```

$ market_cap_rank : num [1:7459] 1 2588 NA NA NA ...
$ coingecko_rank : num [1:7459] 2 990 6752 7230 6838 ..
.
$ coingecko_score : num [1:7459] 80.479 21.938 0.2 0.062
0.2 ...
$ liquidity_score : num [1:7459] 100.39 1 1 0.31 1 ...
$ ico_data : chr [1:7459] NA NA NA NA ...
$ md_current_price : chr [1:7459] "38362" "0.00267148" "1
4844.59" "18454.75" ...
$ md_total_value_locked : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_mcap_to_tvl_ratio : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_fdv_to_tvl_ratio : chr [1:7459] NA NA NA NA ...
$ md_roi : chr [1:7459] NA NA NA NA ...
$ md_ath : chr [1:7459] "64805" "0.03418169" "2
0123" "24262" ...
$ md_ath_change_percentage : num [1:7459] -40.8 -92.2 -26.2 -23.9
-29.6 ...
$ md_ath_date : chr [1:7459] "2021-04-14T11:54:46.76
3Z" "2018-10-10T17:27:38.034Z" "2021-02-13T05:56:26.817Z" "2021-05-15T00:11:58.556Z" ...
$ md_atl : chr [1:7459] "67.81" "0.00070641" "7
222.78" "7519.66" ...
$ md_atl_change_percentage : num [1:7459] 56474 278 106 145 104 ..
.
$ md_atl_date : chr [1:7459] "2013-07-06T00:00:00.00
0Z" "2020-03-16T10:22:30.944Z" "2020-11-04T21:58:23.744Z" "2020-11-04T21:58:06.513Z" ...
$ md_market_cap : chr [1:7459] "718732681723" "28442"
"0" "0" ...
$ md_market_cap_rank : num [1:7459] 1 2588 NA NA NA ...
$ md_fully_diluted_valuation : chr [1:7459] "806542068976" "{}" "{}
" "{}" ...
$ md_total_volume : chr [1:7459] "80381645199" "12269.7"
"99995" "35136" ...
$ md_high_24h : chr [1:7459] "39071" "0.00280229" "1
5369.99" "18897.43" ...
$ md_low_24h : chr [1:7459] "34387" "0.00163751" "1
4898.51" "18454.75" ...
$ md_price_change_24h : num [1:7459] 8.33e+02 8.11e-04 -4.22
e+02 -3.58e+02 -3.72e+02 ...
$ md_price_change_percentage_24h : num [1:7459] 2.22 43.62 -2.76 -1.9 -
2.88 ...
$ md_price_change_percentage_7d : num [1:7459] -23.1 21.5 -17.9 -23.8
-27.2 ...
$ md_price_change_percentage_14d : num [1:7459] -33.1 -13.6 -21.5 -22.6
0 ...
$ md_price_change_percentage_30d : num [1:7459] -29.2 -18.8 -12.7 -11.3
0 ...
$ md_price_change_percentage_60d : num [1:7459] -29.44 -36.39 0 8.88 0
...
$ md_price_change_percentage_200d : num [1:7459] 182.9 -55.6 0 0 0 ...
$ md_price_change_percentage_1y : num [1:7459] 323 121 0 0 0 ...
$ md_market_cap_change_24h : num [1:7459] 1.19e+10 8.20e+03 0.00
0.00 0.00 ...
$ md_market_cap_change_percentage_24h : num [1:7459] 1.68 40.51 0 0 0 ...
$ md_price_change_24h_in_currency : chr [1:7459] "833.22" "0.00081142" "-
421.61329671" "-357.94558902" ...
$ md_price_change_percentage_1h_in_currency : chr [1:7459] "1.76034" "5.60859" "{}"
"{}" ...
$ md_price_change_percentage_24h_in_currency : chr [1:7459] "2.2202" "43.62294" "-2.
76174" "-1.90268" ...
$ md_price_change_percentage_7d_in_currency : chr [1:7459] "-23.14226" "21.51652" "
-17.85343" "-23.83771" ...
$ md_price_change_percentage_14d_in_currency : chr [1:7459] "-33.12212" "-13.60597"
"-21.51847" "-22.63836" ...
$ md_price_change_percentage_30d_in_currency : chr [1:7459] "-29.20806" "-18.79421"
"-12.72064" "-11.32032" ...
$ md_price_change_percentage_60d_in_currency : chr [1:7459] "-29.44251" "-36.3899" "
{}" "8.87758" ...
$ md_price_change_percentage_200d_in_currency : chr [1:7459] "182.94129" "-55.61437"
"{}" "{}" ...
$ md pricechange percentage 1y in currency : chr [1:7459] "323.42564" "120.63372"

```

```

"{}" "{}" ...
$ md_market_cap_change_24h_in_currency      : chr [1:7459] "11889582775" "8199.6200
00000001" "0" "0" ...
$ md_market_cap_change_percentage_24h_in_currency: chr [1:7459] "1.68207" "40.50804" "0"
"0" ...
$ md_total_supply                          : num [1:7459] 21000000 65658824 NA NA
NA ...
$ md_max_supply                          : num [1:7459] 2.1e+07 NA NA NA NA NA
NA NA NA NA ...
$ md_circulating_supply                   : num [1:7459] 18713700 10646361 0 0 0
...
$ md_sparkline_7d                       : chr [1:7459] "{"'price': [48868.60305
863678, 49379.76315234058, 49052.68444471721, 49675.90532371078, 49053.167386888, 47917.9
"| __truncated__ "{"'price': [0.0021475681770300142, 0.0022167032925730704, 0.002263168198
9402023, 0.0021746056988295823, 0.002145"| __truncated__ "{"'price': [18641.185692094314,
18593.31088060331, 18566.090421298537, 18594.561731250385, 18248.214018945913, 1"| __trun
cated__ "{"'price': [23960.15859130861, 23925.783506376752, 23501.362488607054, 22248.9525
77643446, 21925.9349749464, 201"| __truncated__ ...
$ md_last_updated                       : chr [1:7459] "2021-05-22T16:40:21.32
1Z" "2021-05-22T16:34:16.193Z" "2021-05-22T16:18:29.824Z" "2021-05-21T19:32:35.706Z" ...

```

In [6]:

```

cmd[cmd == "{}"] <- NA
chr_cols <- c('md_current_price', 'md_fdv_to_tvl_ratio', 'md_roi', 'md_ath', 'md_atl', 'm
d_market_cap',
             'md_fully_diluted_valuation', 'md_total_volume', 'md_total_volume', 'md_high_2
4h', 'md_low_24h',
             'md_price_change_24h_in_currency', 'md_price_change_percentage_1h_in_currency',
             'md_price_change_percentage_24h_in_currency', 'md_price_change_percentage_7d_in
_currency',
             'md_price_change_percentage_14d_in_currency', 'md_price_change_percentage_30d_i
n_currency',
             'md_price_change_percentage_60d_in_currency', 'md_price_change_percentage_200d_
in_currency',
             'md_price_change_percentage_1y_in_currency', 'md_market_cap_change_24h_in_curre
ncy',
             'md_market_cap_change_percentage_24h_in_currency')
for(i in chr_cols){
  cmd[i] <- as.numeric(cmd[[i]])
}

```

```

Warning message in eval(expr, envir, enclos):
"NAs introduced by coercion"
Warning message in eval(expr, envir, enclos):
"NAs introduced by coercion"
Warning message in eval(expr, envir, enclos):
"NAs introduced by coercion"
Warning message in eval(expr, envir, enclos):
"NAs introduced by coercion"

```

In [7]:

```

str(cmd)

tibble [7,459 × 59] (S3: tbl_df/tbl/data.frame)
 $ id                      : chr [1:7459] "bitcoin" "01coin" "0-5
x-long-algorand-token" "0-5x-long-altcoin-index-token" ...
 $ symbol                  : chr [1:7459] "btc" "zoc" "algorithalf"
"althalf" ...
 $ name                    : chr [1:7459] "Bitcoin" "01coin" "0.5
X Long Algorand Token" "0.5X Long Altcoin Index Token" ...
 $ asset_platform_id       : chr [1:7459] NA NA "ethereum" "ether
eum" ...
 $ block_time_in_minutes   : num [1:7459] 10 0 0 0 0 0 0 0 0 0 ..
.
 $ hashing_algorithm       : chr [1:7459] "SHA-256" "NeoScript" N
A NA ...
 $ categories              : chr [1:7459] "["'Cryptocurrency']" "["
'Masternodes']" "[" "]" ...
 $ country_origin          : chr [1:7459] NA NA NA NA ...
 $ genesis date            : chr [1:7459] "2009-01-03" NA NA NA .

```

```

..
$ sentiment_votes_up_percentage : num [1:7459] 55.4 NA NA NA NA NA NA N
A NA NA ...
$ sentiment_votes_down_percentage : num [1:7459] 44.6 NA NA NA NA NA NA N
A NA NA ...
$ market_cap_rank : num [1:7459] 1 2588 NA NA NA ...
$ coingecko_rank : num [1:7459] 2 990 6752 7230 6838 ..
.
$ coingecko_score : num [1:7459] 80.479 21.938 0.2 0.062
0.2 ...
$ liquidity_score : num [1:7459] 100.39 1 1 0.31 1 ...
$ ico_data : chr [1:7459] NA NA NA NA ...
$ md_current_price : num [1:7459] 3.84e+04 2.67e-03 1.48e
+04 1.85e+04 1.25e+04 ...
$ md_total_value_locked : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_mcap_to_tvl_ratio : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_fdv_to_tvl_ratio : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_roi : num [1:7459] NA NA NA NA NA NA NA NA
NA NA ...
$ md_ath : num [1:7459] 6.48e+04 3.42e-02 2.01e
+04 2.43e+04 1.78e+04 ...
$ md_ath_change_percentage : num [1:7459] -40.8 -92.2 -26.2 -23.9
-29.6 ...
$ md_ath_date : chr [1:7459] "2021-04-14T11:54:46.76
3Z" "2018-10-10T17:27:38.034Z" "2021-02-13T05:56:26.817Z" "2021-05-15T00:11:58.556Z" ...
$ md_atl : num [1:7459] 6.78e+01 7.06e-04 7.22e
+03 7.52e+03 6.13e+03 ...
$ md_atl_change_percentage : num [1:7459] 56474 278 106 145 104 ..
.
$ md_atl_date : chr [1:7459] "2013-07-06T00:00:00.00
0Z" "2020-03-16T10:22:30.944Z" "2020-11-04T21:58:23.744Z" "2020-11-04T21:58:06.513Z" ...
$ md_market_cap : num [1:7459] 7.19e+11 2.84e+04 0.00
0.00 0.00 ...
$ md_market_cap_rank : num [1:7459] 1 2588 NA NA NA ...
$ md_fully_diluted_valuation : num [1:7459] 8.07e+11 NA NA NA NA ...
$ md_total_volume : num [1:7459] 8.04e+10 1.23e+04 1.00e
+05 3.51e+04 8.74e+03 ...
$ md_high_24h : num [1:7459] 3.91e+04 2.80e-03 1.54e
+04 1.89e+04 1.29e+04 ...
$ md_low_24h : num [1:7459] 3.44e+04 1.64e-03 1.49e
+04 1.85e+04 1.29e+04 ...
$ md_price_change_24h : num [1:7459] 8.33e+02 8.11e-04 -4.22
e+02 -3.58e+02 -3.72e+02 ...
$ md_price_change_percentage_24h : num [1:7459] 2.22 43.62 -2.76 -1.9 -
2.88 ...
$ md_price_change_percentage_7d : num [1:7459] -23.1 21.5 -17.9 -23.8
-27.2 ...
$ md_price_change_percentage_14d : num [1:7459] -33.1 -13.6 -21.5 -22.6
0 ...
$ md_price_change_percentage_30d : num [1:7459] -29.2 -18.8 -12.7 -11.3
0 ...
$ md_price_change_percentage_60d : num [1:7459] -29.44 -36.39 0 8.88 0
...
$ md_price_change_percentage_200d : num [1:7459] 182.9 -55.6 0 0 0 ...
$ md_price_change_percentage_1y : num [1:7459] 323 121 0 0 0 ...
$ md_market_cap_change_24h : num [1:7459] 1.19e+10 8.20e+03 0.00
0.00 0.00 ...
$ md_market_cap_change_percentage_24h : num [1:7459] 1.68 40.51 0 0 0 ...
$ md_price_change_24h_in_currency : num [1:7459] 8.33e+02 8.11e-04 -4.22
e+02 -3.58e+02 -3.72e+02 ...
$ md_price_change_percentage_1h_in_currency : num [1:7459] 1.76 5.61 NA NA -2.88 ..
.
$ md_price_change_percentage_24h_in_currency : num [1:7459] 2.22 43.62 -2.76 -1.9 -2
.88 ...
$ md_price_change_percentage_7d_in_currency : num [1:7459] -23.1 21.5 -17.9 -23.8 -
27.2 ...
$ md_price_change_percentage_14d_in_currency : num [1:7459] -33.1 -13.6 -21.5 -22.6
NA ...
$ md pricechange percentage 30d in currency : num [1:7459] -29.2 -18.8 -12.7 -11.3

```

```

NA ...
$ md_price_change_percentage_60d_in_currency      : num [1:7459] -29.44 -36.39 NA 8.88 NA
...
$ md_price_change_percentage_200d_in_currency     : num [1:7459] 182.9 -55.6 NA NA NA ...
$ md_price_change_percentage_1y_in_currency       : num [1:7459] 323 121 NA NA NA ...
$ md_market_cap_change_24h_in_currency           : num [1:7459] 1.19e+10 8.20e+03 0.00 0
.00 0.00 ...
$ md_market_cap_change_percentage_24h_in_currency: num [1:7459] 1.68 40.51 0 0 0 ...
$ md_total_supply                                : num [1:7459] 21000000 65658824 NA NA
NA ...
$ md_max_supply                                  : num [1:7459] 2.1e+07 NA NA NA NA NA
NA NA NA NA ...
$ md_circulating_supply                          : num [1:7459] 18713700 10646361 0 0 0
...
$ md_sparkline_7d                                : chr [1:7459] "{"price": [48868.60305
863678, 49379.76315234058, 49052.68444471721, 49675.90532371078, 49053.167386888, 47917.9
"| __truncated__ "{"price": [0.0021475681770300142, 0.0022167032925730704, 0.002263168198
9402023, 0.0021746056988295823, 0.002145"| __truncated__ "{"price": [18641.185692094314,
18593.31088060331, 18566.090421298537, 18594.561731250385, 18248.214018945913, 1"| __trun
cated__ "{"price": [23960.15859130861, 23925.783506376752, 23501.362488607054, 22248.9525
77643446, 21925.9349749464, 201"| __truncated__ ...
$ md_last_updated                                : chr [1:7459] "2021-05-22T16:40:21.32
1Z" "2021-05-22T16:34:16.193Z" "2021-05-22T16:18:29.824Z" "2021-05-21T19:32:35.706Z" ...

```

In [8]:

```

for(i in 1:dim(cmd)[2]){
  if(sum(is.na(cmd[i])) == dim(cmd)[1]){
    print(colnames(cmd)[i])
  }
}

```

```
[1] "md_roi"
```

In [9]:

```

drop <- c("md_roi")
cmd <- cmd[, !(names(cmd) %in% drop)]

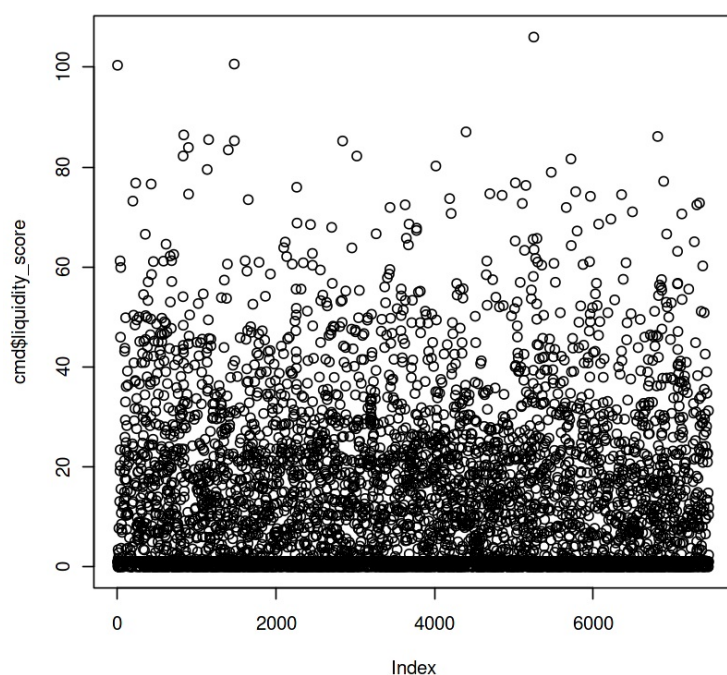
```

In [10]:

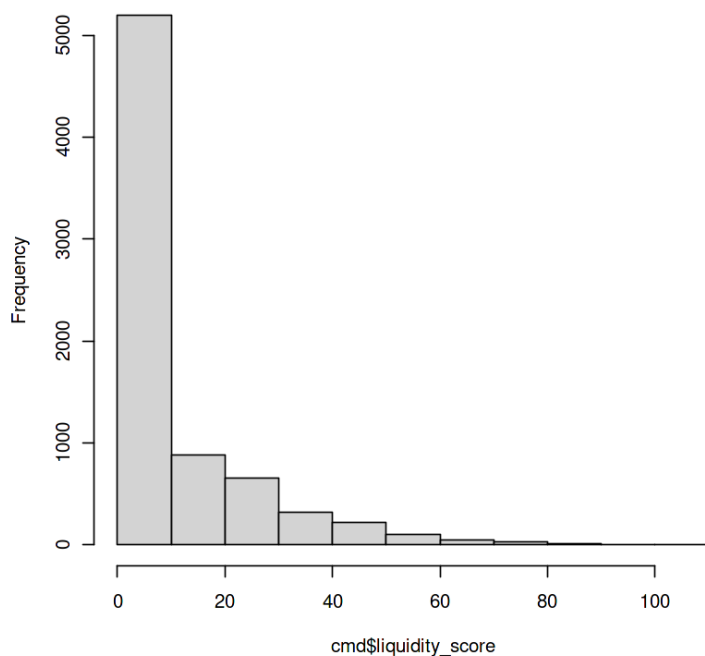
```

plot(cmd$liquidity_score)
hist(cmd$liquidity_score)

```

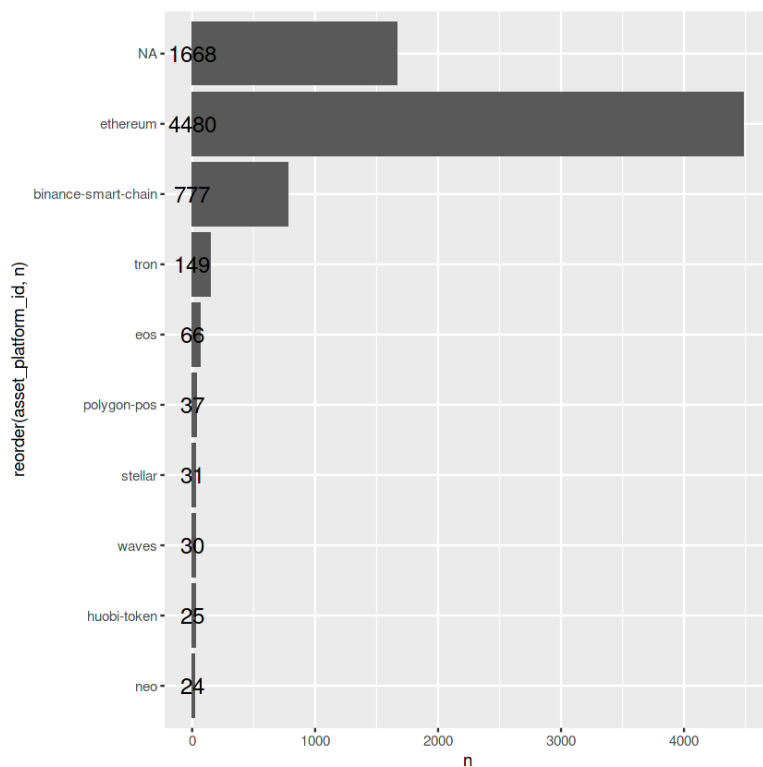


Histogram of cmd\$liquidity_score



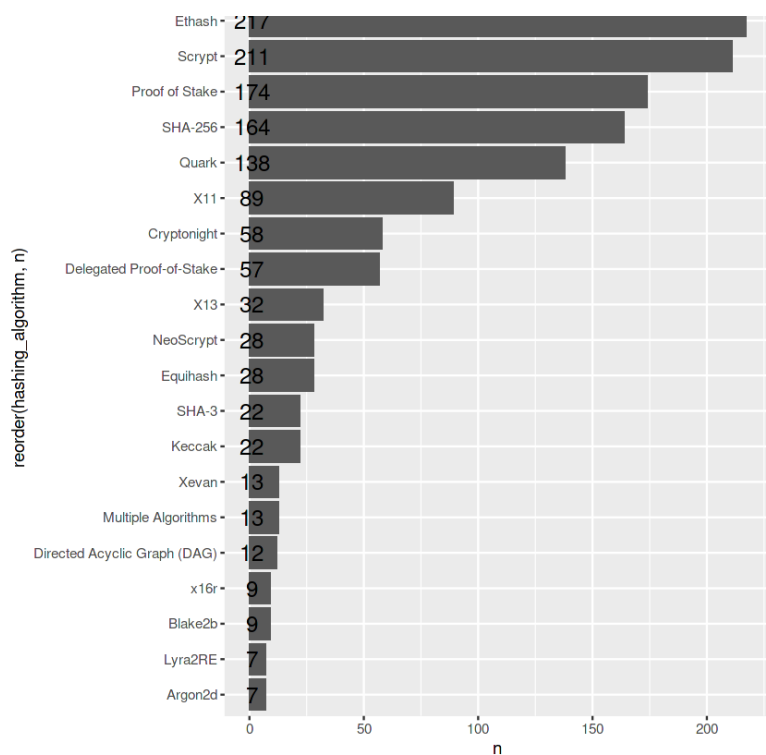
In [11]:

```
cmd %>% group_by(asset_platform_id) %>%
  summarise(n=n()) %>% arrange(desc(n)) %>% head(10) %>%
  ggplot(aes(x = reorder(asset_platform_id,n), y = n)) +
  geom_col() +
  geom_text(aes(label = paste(n)), y = 1, size = 5) +
  coord_flip()
```



In [12]:

```
cmd %>%
  select(id,hashing_algorithm) %>%
  na.omit() %>%
  group_by(hashing_algorithm) %>%
  summarise(n=n()) %>% arrange(desc(n)) %>% head(20) %>%
  ggplot(aes(x = reorder(hashing_algorithm,n), y = n))+
  geom_col()+
  geom_text(aes(label = paste(n)), y = 1, size = 5) +
  coord_flip()
```



In [13]:

```
cmd %>% filter(is.na(asset_platform_id)) %>%
  arrange(desc(liquidity_score)) %>%
  select(id,liquidity_score, symbol, name, md_current_price, coingecko_rank) %>% head(20
)
```

A tibble: 20 × 6

| id | liquidity_score | symbol | name | md_current_price | coingecko_rank |
|------------------|-----------------|--------|------------------|------------------|----------------|
| <chr> | <dbl> | <chr> | <chr> | <dbl> | <dbl> |
| ethereum | 100.635 | eth | Ethereum | 2.36604e+03 | 3 |
| bitcoin | 100.391 | btc | Bitcoin | 3.83620e+04 | 2 |
| ripple | 87.055 | xrp | XRP | 9.01118e-01 | 9 |
| cardano | 86.139 | ada | Cardano | 1.14000e+00 | 7 |
| dogecoin | 85.507 | doge | Dogecoin | 3.42034e-01 | 4 |
| ethereum-classic | 85.282 | etc | Ethereum Classic | 5.94600e+01 | 119 |
| litecoin | 85.238 | ltc | Litecoin | 1.77540e+02 | 13 |
| bitcoin-cash | 83.931 | bch | Bitcoin Cash | 6.60760e+02 | 121 |
| polkadot | 80.225 | dot | Polkadot | 2.27200e+01 | 135 |
| dkk-token | 79.522 | dkkt | DKK Token | 1.53614e-01 | 1877 |
| tron | 78.968 | trx | TRON | 7.62610e-02 | 10 |
| stellar | 76.846 | xlm | Stellar | 4.01923e-01 | 8 |
| abc-chain | 76.808 | abc | ABC Chain | 4.63508e-03 | 1975 |
| bitcoin-cash-sv | 74.596 | bsv | Bitcoin SV | 1.68510e+02 | 197 |
| zcash | 74.493 | zec | Zcash | 1.47250e+02 | 26 |
| solana | 74.359 | sol | Solana | 3.31600e+01 | 14 |
| filecoin | 73.484 | fil | Filecoin | 7.23000e+01 | 304 |
| dash | 72.819 | dash | Dash | 1.38130e+02 | 20 |
| neo | 71.926 | neo | NEO | 5.35800e+01 | 16 |
| qtum | 70.719 | qtum | Qtum | 9.96000e+00 | 24 |

In [14]:

```
cmd %>%
  arrange(coingecko_rank) %>%
  select(id, liquidity_score, symbol, name, md_current_price, coingecko_rank) %>% head(20)
)
```

A tibble: 20 × 6

| id | liquidity_score | symbol | name | md_current_price | coingecko_rank |
|----------------|-----------------|--------|----------------|------------------|----------------|
| <chr> | <dbl> | <chr> | <chr> | <dbl> | <dbl> |
| silver-gateway | 9.751 | svs | Silver Gateway | 5.11428e-01 | 1 |
| bitcoin | 100.391 | btc | Bitcoin | 3.83620e+04 | 2 |
| ethereum | 100.635 | eth | Ethereum | 2.36604e+03 | 3 |
| dogecoin | 85.507 | doge | Dogecoin | 3.42034e-01 | 4 |
| eos | 83.446 | eos | EOS | 5.28000e+00 | 5 |
| binancecoin | 82.233 | bnb | Binance Coin | 3.14600e+02 | 6 |
| cardano | 86.139 | ada | Cardano | 1.14000e+00 | 7 |
| stellar | 76.846 | xlm | Stellar | 4.01923e-01 | 8 |
| ripple | 87.055 | xrp | XRP | 9.01118e-01 | 9 |
| tron | 78.968 | trx | TRON | 7.62610e-02 | 10 |
| chainlink | 77.156 | link | Chainlink | 1.67200e+01 | 11 |
| monero | 66.653 | xmr | Monero | 2.43630e+02 | 12 |
| litecoin | 85.238 | ltc | Litecoin | 1.77540e+02 | 13 |
| solana | 74.359 | sol | Solana | 3.31600e+01 | 14 |
| vechain | 75.082 | vet | VeChain | 1.04254e-01 | 15 |
| neo | 71.926 | neo | NEO | 5.35800e+01 | 16 |
| algorand | 66.563 | algo | Algorand | 1.00000e+00 | 17 |
| matic-network | 82.219 | matic | Polygon | 1.33000e+00 | 18 |
| nano | 57.841 | nano | Nano | 6.84000e+00 | 19 |
| dash | 72.819 | dash | Dash | 1.38130e+02 | 20 |

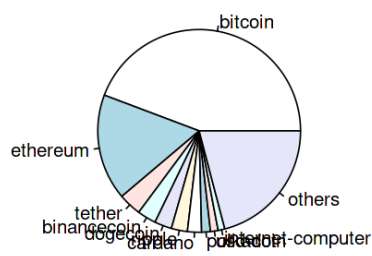
In [15]:

```
market_cap <- cmd %>%
  select(id, md_market_cap) %>%
  na.omit() %>%
  arrange(desc(md_market_cap))
df1 <- market_cap %>%
  head(10) %>%
  rbind(data.frame(md_market_cap=sum(market_cap[! market_cap$md_market_cap %in% head(market_cap$md_market_cap,10),"md_market_cap"]), id="others"))
df1
pie(df1$md_market_cap, df1$id)
```

A tibble: 11 × 2

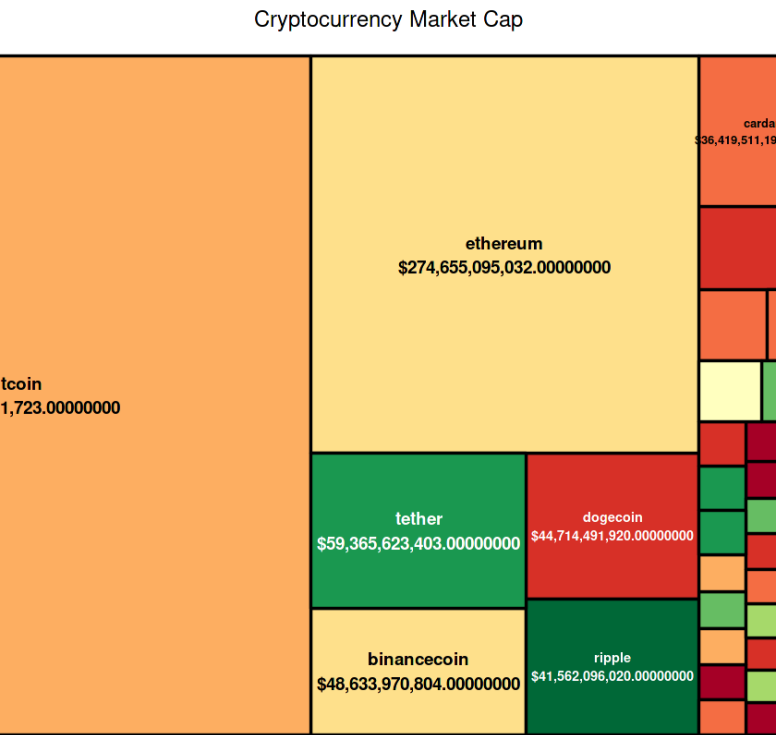
| id | md_market_cap |
|-------------|---------------|
| <chr> | <dbl> |
| bitcoin | 718732681723 |
| ethereum | 274655095032 |
| tether | 59365623403 |
| binancecoin | 48633970804 |
| dogecoin | 44714491920 |
| ripple | 41562096020 |

| | |
|-------------------|--------------|
| cardano | 36419511193 |
| polkadot | 22855709568 |
| usd-coin | 19707542193 |
| internet-computer | 17437393024 |
| others | 339713634264 |



In [16]:

```
library(treemap)
df1 <- na.omit(cmd[,c('id', 'md_market_cap')])
df1$formatted_market_cap <- paste0(df1$id, '\n', '$', format(df1$md_market_cap, big.mark = '
', scientific = F, trim = T))
treemap(df1, index = 'formatted_market_cap', vSize = 'md_market_cap', title = 'Cryptocur
rency Market Cap', palette='RdYlGn')
```



In [17]:

```
cmd %>% filter(is.na(asset_platform_id)) %>%
  select(id,md_current_price, md_circulating_supply) %>%
  na.omit() %>%
  arrange(desc(md_current_price))
```

A tibble: 1659 × 3

| id | md_current_price | md_circulating_supply |
|------------------------|------------------|-----------------------|
| <chr> | <dbl> | <dbl> |
| blipcoin | 435231.00 | 0.000000e+00 |
| 42-coin | 75910.00 | 4.199995e+01 |
| mirrored-bitcoin | 38507.00 | 2.802831e+02 |
| bitcoin | 38362.00 | 1.871370e+07 |
| rootstock | 37813.00 | 0.000000e+00 |
| project-x | 30341.00 | 0.000000e+00 |
| bankcoin-reserve | 11195.42 | 0.000000e+00 |
| elons | 5192.60 | 0.000000e+00 |
| usgold | 2464.93 | 0.000000e+00 |
| mirrored-ether | 2377.50 | 4.583276e+03 |
| ethereum | 2366.04 | 1.159805e+08 |
| eth2-staking-by-poolx | 2201.49 | 0.000000e+00 |
| binance-eth | 2128.00 | 0.000000e+00 |
| grace-period-token | 1408.73 | 0.000000e+00 |
| gold-bcr | 1063.30 | 1.842681e+02 |
| chia | 683.49 | 6.492728e+05 |
| bitcoin-cash | 660.76 | 1.874349e+07 |
| king-money | 463.60 | 0.000000e+00 |
| mixin | 457.50 | 0.000000e+00 |
| capital-x-cell | 437.46 | 0.000000e+00 |
| vectorium | 379.71 | 0.000000e+00 |
| mirrored-goldman-sachs | 365.53 | 1.270464e+04 |
| zilswap | 314.53 | 0.000000e+00 |
| kusama | 314.19 | 8.980098e+06 |
| monero | 243.63 | 1.791519e+07 |
| coinbase-stock | 218.88 | 0.000000e+00 |
| coinbase-stock-bittrex | 195.78 | 0.000000e+00 |
| litecoin | 177.54 | 6.675241e+07 |
| mirrored-gamestop | 175.21 | 1.731167e+04 |
| bitcoin-cash-sv | 168.51 | 1.873966e+07 |
| : | : | : |
| wechain-coin | 1.84e-06 | 0.000000e+00 |
| peepcoin | 1.82e-06 | 1.834683e+03 |
| bitcoinx-2 | 1.78e-06 | 0.000000e+00 |
| vestxcoin | 1.74e-06 | 0.000000e+00 |
| experiencecoin | 1.51e-06 | 1.928543e+10 |
| xrphd | 1.46e-06 | 0.000000e+00 |
| condensate | 1.44e-06 | 0.000000e+00 |
| valorbit | 1.33e-06 | 0.000000e+00 |

| simplicity-coin | id | md_current_price | md_circulating_supply |
|--------------------|-------|------------------|-----------------------|
| | <chr> | <dbl> | <dbl> |
| spartancoin | | 7.80e-07 | 0.000000e+00 |
| sandego | | 7.70e-07 | 0.000000e+00 |
| gcn-coin | | 6.90e-07 | 1.493812e+11 |
| junsonmingchancoin | | 6.90e-07 | 3.207213e+10 |
| compound-coin | | 5.60e-07 | 9.223321e+10 |
| dyngecoin | | 5.50e-07 | 0.000000e+00 |
| seed2need | | 4.90e-07 | 0.000000e+00 |
| cirquity | | 4.00e-07 | 0.000000e+00 |
| mousecoin | | 3.80e-07 | 0.000000e+00 |
| slothcoin | | 3.70e-07 | 0.000000e+00 |
| willowcoin | | 1.90e-07 | 2.810010e+09 |
| swaptoken | | 1.30e-07 | 0.000000e+00 |
| bitcoinmono | | 1.00e-07 | 0.000000e+00 |
| rock-n-rain-coin | | 5.00e-08 | 0.000000e+00 |
| safegalaxy | | 3.00e-08 | 0.000000e+00 |
| argentum | | 2.00e-08 | 1.491010e+07 |
| pos-coin | | 2.00e-08 | 0.000000e+00 |
| thebigcoin | | 2.00e-08 | 0.000000e+00 |
| sprouts | | 1.00e-08 | 0.000000e+00 |
| derogold | | 0.00e+00 | 0.000000e+00 |
| smartcoin | | 0.00e+00 | 2.909130e+07 |

In [18]:

```
#md_circulating_supply, md_current_price, liquidity_score
#forks, stars, subscribers, reddit_subscribers, reddit_average_posts_48h, reddit_average_comments_48h, twitter_followers
```

In [19]:

```
colnames (cmd)
```

```
'id' · 'symbol' · 'name' · 'asset_platform_id' · 'block_time_in_minutes' · 'hashing_algorithm' ·
'categories' · 'country_origin' · 'genesis_date' · 'sentiment_votes_up_percentage' ·
'sentiment_votes_down_percentage' · 'market_cap_rank' · 'coingecko_rank' · 'coingecko_score' ·
'liquidity_score' · 'ico_data' · 'md_current_price' · 'md_total_value_locked' · 'md_mcap_to_tvl_ratio' ·
'md_fdv_to_tvl_ratio' · 'md_ath' · 'md_ath_change_percentage' · 'md_ath_date' · 'md_atl' ·
'md_atl_change_percentage' · 'md_atl_date' · 'md_market_cap' · 'md_market_cap_rank' ·
'md_fully_diluted_valuation' · 'md_total_volume' · 'md_high_24h' · 'md_low_24h' · 'md_price_change_24h' ·
'md_price_change_percentage_24h' · 'md_price_change_percentage_7d' ·
'md_price_change_percentage_14d' · 'md_price_change_percentage_30d' ·
'md_price_change_percentage_60d' · 'md_price_change_percentage_200d' ·
'md_price_change_percentage_1y' · 'md_market_cap_change_24h' ·
'md_market_cap_change_percentage_24h' · 'md_price_change_24h_in_currency' ·
'md_price_change_percentage_1h_in_currency' · 'md_price_change_percentage_24h_in_currency' ·
'md_price_change_percentage_7d_in_currency' · 'md_price_change_percentage_14d_in_currency' ·
'md_price_change_percentage_30d_in_currency' · 'md_price_change_percentage_60d_in_currency' ·
'md_price_change_percentage_200d_in_currency' · 'md_price_change_percentage_1y_in_currency' ·
'md_market_cap_change_24h_in_currency' · 'md_market_cap_change_percentage_24h_in_currency' ·
'md_total_supply' · 'md_max_supply' · 'md_circulating_supply' · 'md_sparkline_7d' · 'md_last_updated'
```

In [20]:

```
col <- c('md_price_change_24h_in_currency', 'md_price_change_percentage_1h_in_currency',
'md_price_change_percentage_24h_in_currency',
'md_price_change_percentage_7d_in_currency', 'md_price_change_percentage_14d_in_currency',
'md_price_change_percentage_30d_in_currency',
'md_price_change_percentage_60d_in_currency', 'md_price_change_percentage_200d_in_currency',
'md_price_change_percentage_1y_in_currency',
'md_market_cap_change_24h_in_currency', 'md_market_cap_change_percentage_24h_in_currency')
cmd <- cmd[, !(names(cmd) %in% col)]
```

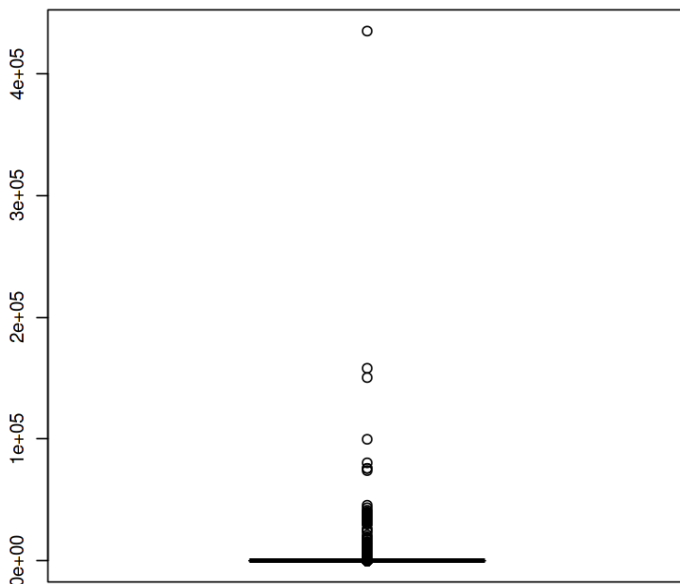
In [21]:

```
colnames(cmd)
```

```
'id'· 'symbol'· 'name'· 'asset_platform_id'· 'block_time_in_minutes'· 'hashing_algorithm'·
'categories'· 'country_origin'· 'genesis_date'· 'sentiment_votes_up_percentage'·
'sentiment_votes_down_percentage'· 'market_cap_rank'· 'coingecko_rank'· 'coingecko_score'·
'liquidity_score'· 'ico_data'· 'md_current_price'· 'md_total_value_locked'· 'md_mcap_to_tvl_ratio'·
'md_fdv_to_tvl_ratio'· 'md_ath'· 'md_ath_change_percentage'· 'md_ath_date'· 'md_atl'·
'md_atl_change_percentage'· 'md_atl_date'· 'md_market_cap'· 'md_market_cap_rank'·
'md_fully_diluted_valuation'· 'md_total_volume'· 'md_high_24h'· 'md_low_24h'· 'md_price_change_24h'·
'md_price_change_percentage_24h'· 'md_price_change_percentage_7d'·
'md_price_change_percentage_14d'· 'md_price_change_percentage_30d'·
'md_price_change_percentage_60d'· 'md_price_change_percentage_200d'·
'md_price_change_percentage_1y'· 'md_market_cap_change_24h'·
'md_market_cap_change_percentage_24h'· 'md_total_supply'· 'md_max_supply'· 'md_circulating_supply'·
'md_sparkline_7d'· 'md_last_updated'
```

In [22]:

```
boxplot(cmd$md_current_price)
```



In [23]:

```
library(psych)
describe(cmd)
```

Attaching package: 'psych'

The following objects are masked from 'package:ggplot2':

```
%+%, alpha
```

A psych: 47 × 13

| | vars | n | mean | sd | median | trimmed | mad |
|---------------------------------|-------|-------|---------------|---------------|---------------|---------------|---------------|
| | <int> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| id* | 1 | 7459 | 3.730000e+03 | 2.153372e+03 | 3.730000e+03 | 3.730000e+03 | 2.765049e+03 |
| symbol* | 2 | 7458 | 3.246540e+03 | 1.892309e+03 | 3.252500e+03 | 3.240209e+03 | 2.441101e+03 |
| name* | 3 | 7459 | 3.730000e+03 | 2.153372e+03 | 3.730000e+03 | 3.730000e+03 | 2.765049e+03 |
| asset_platform_id* | 4 | 5791 | 1.421084e+01 | 7.706776e+00 | 1.400000e+01 | 1.344938e+01 | 0.000000e+00 |
| block_time_in_minutes | 5 | 7459 | 1.988007e+03 | 1.242472e+05 | 0.000000e+00 | 1.390518e-02 | 0.000000e+00 |
| hashing_algorithm* | 6 | 1371 | 2.863384e+01 | 1.207604e+01 | 3.200000e+01 | 2.884777e+01 | 1.037820e+01 |
| categories* | 7 | 7459 | 4.480940e+02 | 1.812953e+02 | 5.750000e+02 | 4.785946e+02 | 0.000000e+00 |
| country_origin* | 8 | 3357 | 7.057432e+01 | 3.931656e+01 | 6.500000e+01 | 7.119017e+01 | 5.782140e+01 |
| genesis_date* | 9 | 926 | 3.343790e+02 | 1.682260e+02 | 3.520000e+02 | 3.381523e+02 | 1.808772e+02 |
| sentiment_votes_up_percentage | 10 | 3798 | 6.982434e+01 | 3.194462e+01 | 7.647000e+01 | 7.476738e+01 | 3.488558e+01 |
| sentiment_votes_down_percentage | 11 | 3798 | 3.017567e+01 | 3.194462e+01 | 2.353000e+01 | 2.523263e+01 | 3.488558e+01 |
| market_cap_rank | 12 | 2766 | 1.383641e+03 | 7.988502e+02 | 1.383500e+03 | 1.383658e+03 | 1.024477e+03 |
| coingecko_rank | 13 | 7451 | 3.725670e+03 | 2.150670e+03 | 3.726000e+03 | 3.725888e+03 | 2.762084e+03 |
| coingecko_score | 14 | 7459 | 1.029740e+01 | 1.086945e+01 | 6.430000e+00 | 8.543092e+00 | 7.807372e+00 |
| liquidity_score | 15 | 7459 | 9.308542e+00 | 1.441905e+01 | 1.000000e+00 | 6.108326e+00 | 1.482600e+00 |
| ico_data* | 16 | 965 | 4.830000e+02 | 2.787158e+02 | 4.830000e+02 | 4.830000e+02 | 3.573066e+02 |
| md_current_price | 17 | 7392 | 4.728221e+02 | 6.714226e+03 | 3.853833e-02 | 7.488595e-01 | 5.712447e-02 |
| md_total_value_locked | 18 | 171 | 6.294763e+08 | 1.696571e+09 | 6.102321e+07 | 1.739638e+08 | 8.627794e+07 |
| md_mcap_to_tvl_ratio | 19 | 168 | 1.437625e+01 | 1.226071e+02 | 4.650000e-01 | 1.119338e+00 | 6.449310e-01 |
| md_fdv_to_tvl_ratio | 20 | 125 | 4.117712e+01 | 3.369956e+02 | 1.670000e+00 | 4.390693e+00 | 1.957032e+00 |
| md_ath | 21 | 7392 | 7.801413e+04 | 3.978454e+06 | 7.385705e-01 | 1.014604e+01 | 1.092639e+00 |
| md_ath_change_percentage | 22 | 7459 | 7.941723e+01 | 2.497075e+01 | 8.938354e+01 | 8.434264e+01 | 1.483023e+01 |
| md_ath_date* | 23 | 7392 | 3.294691e+03 | 2.106729e+03 | 3.277500e+03 | 3.277500e+03 | 2.739845e+03 |
| md_atl | 24 | 7392 | 1.427421e+02 | 1.800040e+03 | 3.253180e-03 | 1.944452e-01 | 4.823150e-03 |
| md_atl_change_percentage | 25 | 7459 | 2.615939e+41 | 2.259269e+43 | 4.352196e+02 | 1.823148e+03 | 6.346500e+02 |
| md_atl_date* | 26 | 7392 | 3.467353e+03 | 2.113570e+03 | 3.454500e+03 | 3.454500e+03 | 2.739845e+03 |
| md_market_cap | 27 | 7392 | 2.196696e+08 | 9.049240e+09 | 0.000000e+00 | 9.791538e+05 | 0.000000e+00 |
| md_market_cap_rank | 28 | 2766 | 1.383641e+03 | 7.988502e+02 | 1.383500e+03 | 1.383658e+03 | 1.024477e+03 |
| md_fully_diluted_valuation | 29 | 878 | 3.649316e+09 | 5.966921e+10 | 2.380776e+07 | 1.032170e+08 | 3.501052e+07 |
| md_total_volume | 30 | 7408 | 7.349535e+07 | 2.733270e+09 | 8.292795e+03 | 1.664653e+05 | 1.229490e+04 |
| md_high_24h | 31 | 6122 | 5.224067e+02 | 8.006449e+03 | 5.450700e-02 | 9.160927e-01 | 8.080063e-02 |
| md_low_24h | 32 | 6122 | 4.534231e+02 | 7.122084e+03 | 4.187671e-02 | 7.255975e-01 | 6.208052e-02 |
| md_price_change_percentage_24h | 33 | 6122 | -7.001000e+01 | -7.001000e+01 | -2.249300e-01 | -2.833894e-01 | -3.000151e-01 |

| | md_price_change_24h | 33 vars | 6122 n | 1.811738e+01 mean | 7.321202e+02 sd | 0.0 median | 0.0 trimmed | 3.960151e-03 mad |
|--|-------------------------------------|-------------|---------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| | md_price_change_percentage_24h | <int> 34 | <dbl> 6122 | <dbl> 1.389696e+00 | <dbl> 6.792436e+01 | <dbl> 4.188960e+00 | <dbl> 5.007055e+00 | <dbl> 9.898164e+00 |
| | md_price_change_percentage_7d | 35 | 7459 | 1.029045e+01 | 5.620028e+02 | 2.910886e+01 | 2.653455e+01 | 3.599990e+01 |
| | md_price_change_percentage_14d | 36 | 7459 | 2.290472e+07 | 1.978177e+09 | 3.121857e+01 | 2.739223e+01 | 4.070690e+01 |
| | md_price_change_percentage_30d | 37 | 7459 | 4.914687e+03 | 3.407884e+05 | 2.175484e+01 | 2.349443e+01 | 3.225373e+01 |
| | md_price_change_percentage_60d | 38 | 7459 | 5.329205e+15 | 4.602594e+17 | 0.000000e+00 | 1.328573e+01 | 4.243772e+01 |
| | md_price_change_percentage_200d | 39 | 7459 | 4.804918e+03 | 2.620314e+05 | 0.000000e+00 | 5.610365e+01 | 3.321383e+01 |
| | md_price_change_percentage_1y | 40 | 7459 | 5.697896e+09 | 4.920380e+11 | 0.000000e+00 | 4.118958e+01 | 0.000000e+00 |
| | md_market_cap_change_24h | 41 | 6208 | 8.622653e+06 | 3.029149e+08 | 0.000000e+00 | 6.796571e+04 | 0.000000e+00 |
| | md_market_cap_change_percentage_24h | 42 | 6208 | 1.301579e+00 | 4.464876e+01 | 0.000000e+00 | 1.507751e+00 | 0.000000e+00 |
| | md_total_supply | 43 | 6729 | 1.061826e+18 | 8.703581e+19 | 1.053543e+08 | 1.472584e+09 | 1.561687e+08 |
| | md_max_supply | 44 | 884 | 2.843558e+14 | 4.931465e+15 | 4.779826e+07 | 2.177229e+08 | 7.085289e+07 |
| | md_circulating_supply | 45 | 7392 | 1.249366e+13 | 7.109012e+14 | 0.000000e+00 | 1.503804e+07 | 0.000000e+00 |
| | md_sparkline_7d* | 46 | 7459 | 3.119449e+03 | 2.110675e+03 | 3.092000e+03 | 3.092096e+03 | 2.765049e+03 |
| | md_last_updated* | 47 | 7408 | 3.703623e+03 | 2.137845e+03 | 3.703500e+03 | 3.703654e+03 | 2.744293e+03 |

In [24]:

```
describe(pod)
```

A psych: 20 x 13

| | | vars | n | mean | sd | median | trimmed | mad | mi |
|--|--------------------------------------|-------|-------|--------------|--------------|------------|--------------|--------------|-------|
| | | <int> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| | forks | 1 | 7457 | 1.473340e+01 | 3.726661e+02 | 0.000 | 2.545668e-01 | 0.000000e+00 | |
| | stars | 2 | 7457 | 3.775070e+01 | 7.685227e+02 | 0.000 | 3.591419e-01 | 0.000000e+00 | |
| | subscribers | 3 | 7457 | 4.820974e+00 | 5.717826e+01 | 0.000 | 3.056812e-01 | 0.000000e+00 | |
| | total_issues | 4 | 7457 | 1.661325e+01 | 1.879830e+02 | 0.000 | 2.362996e-02 | 0.000000e+00 | |
| | closed_issues | 5 | 7457 | 1.406008e+01 | 1.660098e+02 | 0.000 | 8.379420e-04 | 0.000000e+00 | |
| | pull_requests_merged | 6 | 7457 | 2.886737e+01 | 2.776798e+02 | 0.000 | 3.720463e-02 | 0.000000e+00 | |
| | pull_request_contributors | 7 | 7457 | 1.437173e+00 | 1.315016e+01 | 0.000 | 2.865762e-02 | 0.000000e+00 | |
| | code_additions_deletions_4_weeks* | 8 | 7457 | 2.334565e+02 | 1.169882e+02 | 295.000 | 2.547955e+02 | 0.000000e+00 | |
| | commit_count_4_weeks | 9 | 7457 | 1.692101e+00 | 1.864748e+01 | 0.000 | 0.000000e+00 | 0.000000e+00 | |
| | last_4_weeks_commit_activity_series* | 10 | 7457 | 6.324527e+00 | 2.871528e+01 | 1.000 | 1.157366e+00 | 0.000000e+00 | |
| | developer_score | 11 | 7459 | 8.178051e+00 | 1.727893e+01 | 0.000 | 3.509087e+00 | 0.000000e+00 | |
| | alexa_rank | 12 | 4968 | 1.877779e+06 | 2.671637e+06 | 581286.000 | 1.293440e+06 | 8.618146e+05 | |
| | twitter_followers | 13 | 7447 | 2.151358e+04 | 1.946319e+05 | 2186.000 | 5.317259e+03 | 3.240964e+03 | |
| | reddit_average_posts_48h | 14 | 7459 | 7.099611e-02 | 5.525225e-01 | 0.000 | 0.000000e+00 | 0.000000e+00 | |
| | reddit_average_comments_48h | 15 | 7459 | 4.641961e+00 | 1.871918e+02 | 0.000 | 0.000000e+00 | 0.000000e+00 | |
| | reddit_subscribers | 16 | 7459 | 2.704932e+03 | 5.809277e+04 | 0.000 | 3.728698e+01 | 0.000000e+00 | |
| | reddit_accounts_active_48h | 17 | 7459 | 1.965746e+01 | 4.405582e+02 | 0.000 | 6.565589e-01 | 0.000000e+00 | |

| | | | | | | | | | |
|-----------------------------|------|-------|-------|--------------|--------------|----------|--------------|--------------|-------|
| telegram_channel_user_count | vars | 18 | 5642 | 6.476295e+03 | 1.338939e+04 | 2129.500 | 3.584081e+03 | 2.756895e+03 | mi |
| | id* | <int> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| community_score | | 20 | 7459 | 1.076133e+01 | 1.063399e+01 | 7.705 | 9.024142e+00 | 4.422596e+00 | |

In [25]:

```
summary (pod)
```

| | | | |
|-------------------------------------|----------------------------|-----------------------------|---------------|
| forks | stars | subscribers | total_issues |
| Min. : 0.00 | Min. : 0.00 | Min. : 0.000 | Min. : 0.00 |
| 1st Qu.: 0.00 | 1st Qu.: 0.00 | 1st Qu.: 0.000 | 1st Qu.: 0.00 |
| Median : 0.00 | Median : 0.00 | Median : 0.000 | Median : 0.00 |
| Mean : 14.73 | Mean : 37.75 | Mean : 4.821 | Mean : 16.61 |
| 3rd Qu.: 0.00 | 3rd Qu.: 0.00 | 3rd Qu.: 0.000 | 3rd Qu.: 0.00 |
| Max. :29231.00 | Max. :53934.00 | Max. :3811.000 | Max. :6229.00 |
| NA's :2 | NA's :2 | NA's :2 | NA's :2 |
| closed_issues | pull_requests_merged | pull_request_contributors | |
| Min. : 0.00 | Min. : 0.00 | Min. : 0.000 | |
| 1st Qu.: 0.00 | 1st Qu.: 0.00 | 1st Qu.: 0.000 | |
| Median : 0.00 | Median : 0.00 | Median : 0.000 | |
| Mean : 14.06 | Mean : 28.87 | Mean : 1.437 | |
| 3rd Qu.: 0.00 | 3rd Qu.: 0.00 | 3rd Qu.: 0.000 | |
| Max. :5760.00 | Max. :12639.00 | Max. :728.000 | |
| NA's :2 | NA's :2 | NA's :2 | |
| code_additions_deletions_4_weeks | commit_count_4_weeks | | |
| Length:7459 | Min. : 0.000 | | |
| Class :character | 1st Qu.: 0.000 | | |
| Mode :character | Median : 0.000 | | |
| | Mean : 1.692 | | |
| | 3rd Qu.: 0.000 | | |
| | Max. :642.000 | | |
| | NA's :2 | | |
| last_4_weeks_commit_activity_series | developer_score | alex_rank | |
| Length:7459 | Min. : 0.000 | Min. : 0 | |
| Class :character | 1st Qu.: 0.000 | 1st Qu.: 0 | |
| Mode :character | Median : 0.000 | Median : 581286 | |
| | Mean : 8.178 | Mean : 1877779 | |
| | 3rd Qu.:12.000 | 3rd Qu.: 2678638 | |
| | Max. :98.879 | Max. :17290931 | |
| | | NA's :2491 | |
| twitter_followers | reddit_average_posts_48h | reddit_average_comments_48h | |
| Min. : 0 | Min. : 0.000 | Min. : 0.000 | |
| 1st Qu.: 96 | 1st Qu.: 0.000 | 1st Qu.: 0.000 | |
| Median : 2186 | Median : 0.000 | Median : 0.000 | |
| Mean : 21514 | Mean : 0.071 | Mean : 4.642 | |
| 3rd Qu.: 9962 | 3rd Qu.: 0.000 | 3rd Qu.: 0.000 | |
| Max. :9998924 | Max. :13.000 | Max. :15222.273 | |
| NA's :12 | | | |
| reddit_subscribers | reddit_accounts_active_48h | telegram_channel_user_count | |
| Min. : 0 | Min. : 0.00 | Min. : 2.0 | |
| 1st Qu.: 0 | 1st Qu.: 0.00 | 1st Qu.: 652.2 | |
| Median : 0 | Median : 0.00 | Median : 2129.5 | |
| Mean : 2705 | Mean : 19.66 | Mean : 6476.3 | |
| 3rd Qu.: 0 | 3rd Qu.: 0.00 | 3rd Qu.: 6405.5 | |
| Max. :2945960 | Max. :30675.00 | Max. :188388.0 | |
| | | NA's :1817 | |
| id | community_score | | |
| Length:7459 | Min. : 0.000 | | |
| Class :character | 1st Qu.: 4.870 | | |
| Mode :character | Median : 7.705 | | |
| | Mean :10.761 | | |
| | 3rd Qu.:10.878 | | |
| | Max. :79.379 | | |

In [26]:

```
# Top 20 popular coins
library (reshape2)
```

```

top_coins <- pod %>%
  select(id, forks, stars, subscribers, commit_count_4_weeks, twitter_followers,
         reddit_average_posts_48h, reddit_average_comments_48h, reddit_subscribers, reddit_accounts_active_48h) %>%
  mutate(sum = reddit_average_posts_48h + reddit_average_comments_48h + reddit_accounts_active_48h) %>%
  top_n(20, wt=sum)

pod %>%
  select(id, reddit_average_posts_48h, reddit_average_comments_48h, reddit_accounts_active_48h) %>%
  na.omit() %>%
  filter(id %in% top_coins$id) %>%
  melt(id="id") %>%
  ggplot(aes(x = reorder(id, value), y = value, fill = variable)) +
  geom_col() +
  labs(x = 'Coins', y = 'Total Score') +
  coord_flip()

# Top 20 coins that are being actively developed(based on github data)
top_coins1 <- pod %>%
  select(id, forks, stars, subscribers, commit_count_4_weeks, twitter_followers,
         reddit_average_posts_48h, reddit_average_comments_48h, reddit_subscribers, reddit_accounts_active_48h) %>%
  mutate(sum = forks + stars + subscribers + commit_count_4_weeks) %>%
  top_n(20, wt=sum)

pod %>%
  select(id, forks, stars, subscribers, commit_count_4_weeks) %>%
  na.omit() %>%
  filter(id %in% top_coins1$id) %>%
  melt(id="id") %>%
  ggplot(aes(x = reorder(id, value), y = value, fill = variable)) +
  geom_col() +
  labs(x = 'Coins', y = 'Total Score') +
  coord_flip()

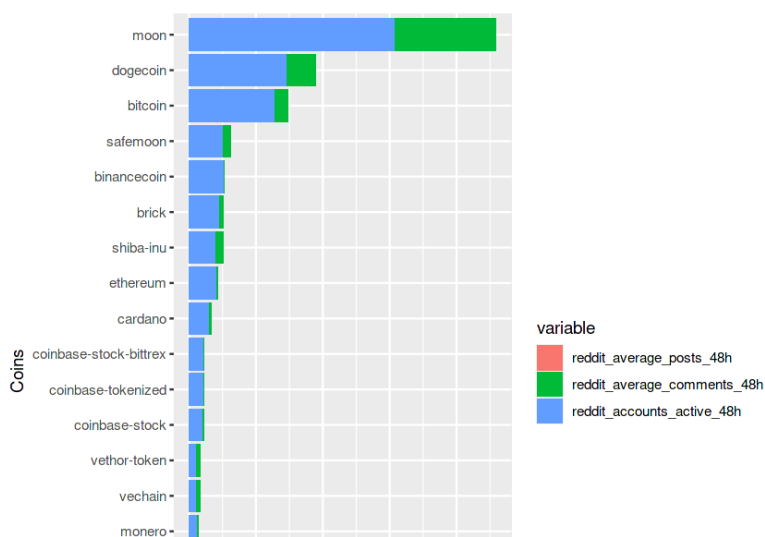
pod %>%
  select(id, commit_count_4_weeks) %>%
  na.omit() %>%
  top_n(20, wt = commit_count_4_weeks) %>%
  ggplot(aes(x = reorder(id, commit_count_4_weeks), y = commit_count_4_weeks)) +
  geom_col() +
  coord_flip()

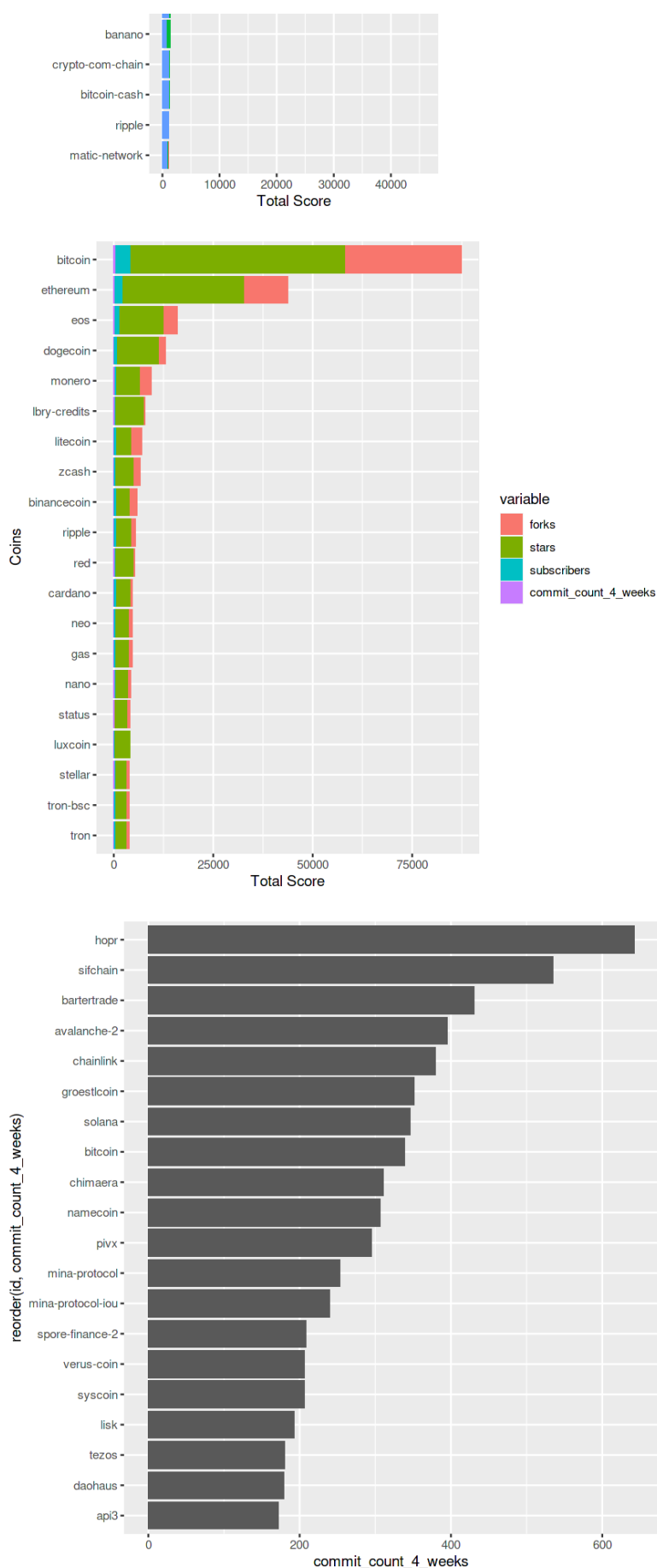
```

Attaching package: 'reshape2'

The following object is masked from 'package:tidyr':

smiths





In [27]:

```
library(GGally)
lowerFn <- function(data, mapping, method = "lm") {
  ggplot(data = data, mapping = mapping) +
    geom_point(colour = "slategray4", size = 2, shape = 18) +
    geom_smooth(method = method, color = "coral3") +
    theme_minimal() +
    theme(axis.text.x = element_text(size = 8, angle = 45))
}
cmd %>%
```

```

select(md_circulating_supply, md_current_price, md_ath_change_percentage, md_price_change_percentage_1y) %>%
na.omit() %>%
ggpairs(lower = list(continuous = wrap(lowerFn, method = "lm")),
diag = list(continuous = wrap("barDiag", fill = 'skyblue1', colour = "skyblue4")),
upper = list(continuous = wrap("cor", size = 5)),
progress = FALSE)

```

Registered S3 method overwritten by 'GGally':
method from
+.gg ggplot2

```

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

`geom_smooth()` using formula 'y ~ x'

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

`geom_smooth()` using formula 'y ~ x'

`geom_smooth()` using formula 'y ~ x'

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

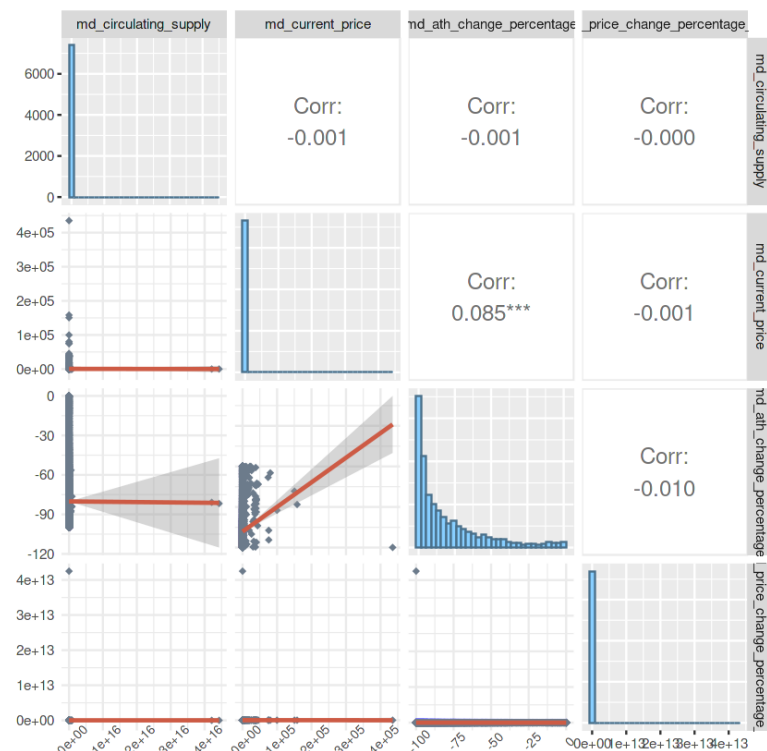
`geom_smooth()` using formula 'y ~ x'

`geom_smooth()` using formula 'y ~ x'

`geom_smooth()` using formula 'y ~ x'

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

```

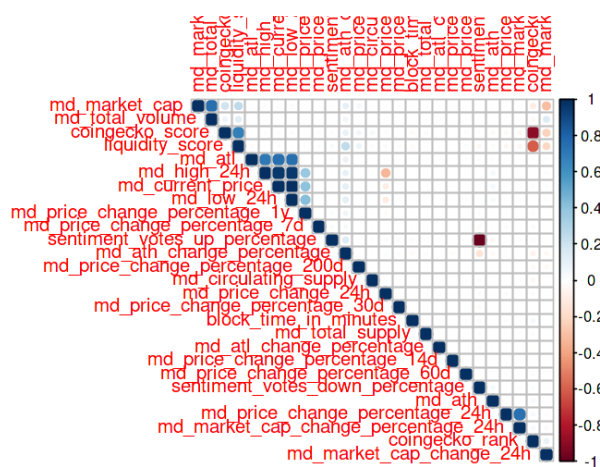


In [28]:

```

cmd %>%
select(md_price_change_percentage_24h, md_price_change_percentage_7d, md_price_change_percentage_14d,
md_price_change_percentage_30d, md_price_change_percentage_60d, md_price_change_percentage_200d,
md_price_change_percentage_1y) %>%
na.omit() %>%
ggpairs(lower = list(continuous = wrap(lowerFn, method = "lm")),
diag = list(continuous = wrap("barDiag", fill = 'skyblue1', colour = "skyblue4")),
upper = list(continuous = wrap("cor", size = 5)),
progress = FALSE)

```

HYPOTHESIS TESTING

In [31]:

```
mod1<- md_price_change_percentage_24h~md_price_change_percentage_7d+md_price_change_percentage_14d
fit1<-lm(mod1, data = cmd)
summary(fit1)
```

Call:

```
lm(formula = mod1, data = cmd)
```

Residuals:

| Min | 1Q | Median | 3Q | Max |
|-------|-------|--------|-----|--------|
| -98.6 | -10.7 | -2.8 | 2.8 | 3217.4 |

Coefficients:

| | Estimate | Std. Error | t value | Pr(> t) |
|--------------------------------|------------|------------|---------|----------|
| (Intercept) | -1.363e+00 | 8.684e-01 | -1.570 | 0.116 |
| md_price_change_percentage_7d | 2.027e-03 | 1.406e-03 | 1.441 | 0.150 |
| md_price_change_percentage_14d | -3.244e-11 | 3.976e-10 | -0.082 | 0.935 |

Residual standard error: 67.92 on 6119 degrees of freedom

(1337 observations deleted due to missingness)

Multiple R-squared: 0.0003405, Adjusted R-squared: 1.379e-05

F-statistic: 1.042 on 2 and 6119 DF, p-value: 0.3527

In [32]:

```
t.test(cmd$md_price_change_percentage_7d, cmd$md_price_change_percentage_14d)
```

Welch Two Sample t-test

data: cmd\$md_price_change_percentage_7d and cmd\$md_price_change_percentage_14d

t = -1, df = 7458, p-value = 0.3173

alternative hypothesis: true difference in means is not equal to 0

95 percent confidence interval:

-67804428 21994975

sample estimates:

mean of x mean of y

-1.029045e+01 2.290472e+07

In [33]:

```
anova1 <- aov(mod1, data = cmd)
summary(anova1)
```

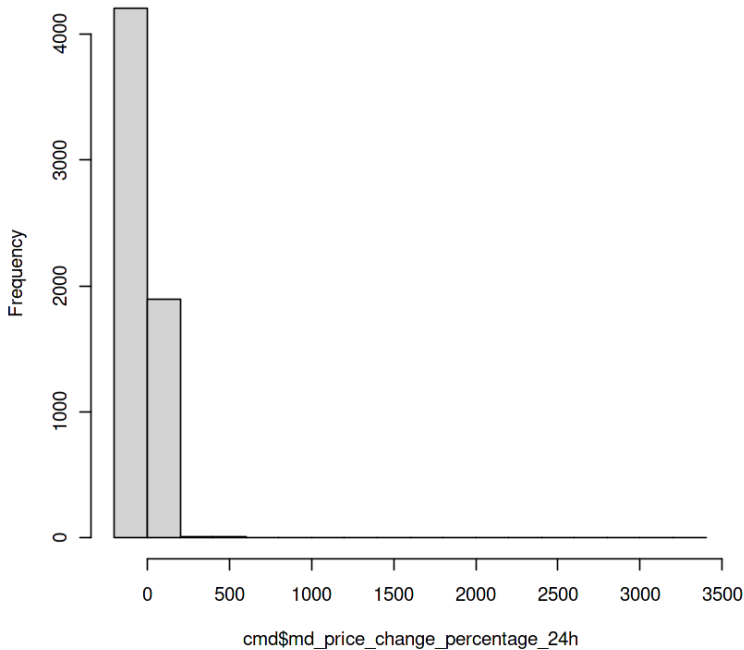
| | Df | Sum Sq | Mean Sq | F value | Pr(>F) |
|--------------------------------|------|----------|---------|---------|--------|
| md_price_change_percentage_7d | 1 | 9586 | 9586 | 2.078 | 0.150 |
| md_price_change_percentage_14d | 1 | 31 | 31 | 0.007 | 0.935 |
| Residuals | 6119 | 28230954 | 4614 | | |

1337 observations deleted due to missingness

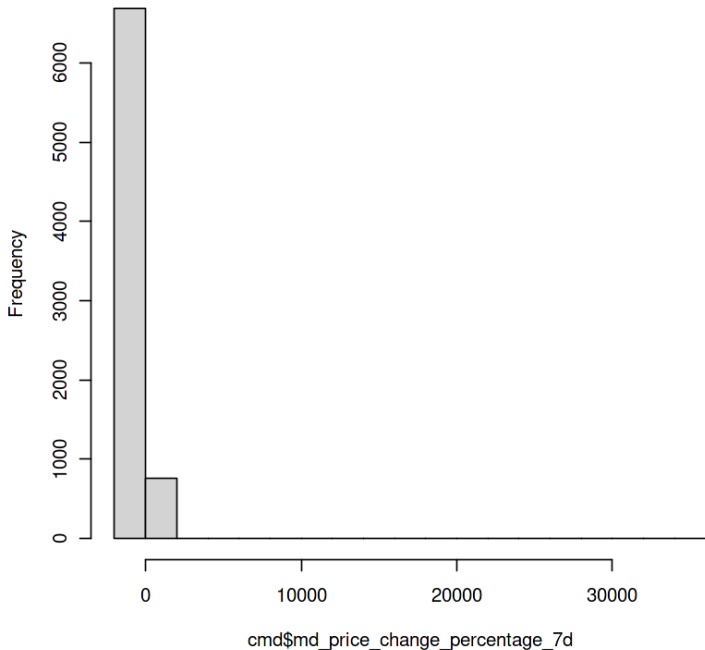
In [34]:

```
hist(cmd$md_price_change_percentage_24h)
hist(cmd$md_price_change_percentage_7d)
hist(cmd$md_price_change_percentage_14d)
```

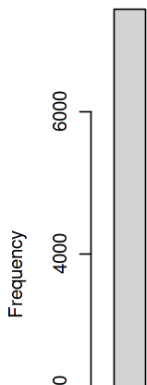
Histogram of cmd\$md_price_change_percentage_24h

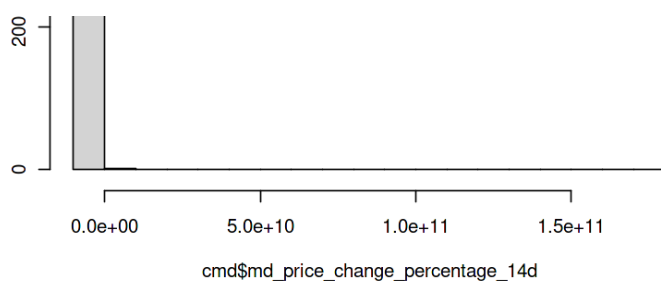


Histogram of cmd\$md_price_change_percentage_7d



Histogram of cmd\$md_price_change_percentage_14d





CLUSTERING

In [35]:

```
library(clustertend)
library(cluster)
library(factoextra)
```

Welcome! Want to learn more? See two factoextra-related books at <https://goo.gl/ve3WBa>

In [36]:

```
c_df1 <- cmd %>%
  select(id, md_circulating_supply, md_current_price, liquidity_score) %>%
  na.omit()
print(dim(c_df1))
# hopkins(c_df1[,2:4], n=nrow(c_df1)-1)
```

```
[1] 7391    4
```

In [37]:

```
c_df1 <- cmd %>%
  select(id, md_circulating_supply, md_current_price, md_ath_change_percentage, md_total_volume, coingecko_score, liquidity_score) %>%
  na.omit()
print(dim(c_df1))
```

```
[1] 7391    7
```

In [38]:

```
c_df2 <- scale(c_df1[,2:6])
head(c_df2)
```

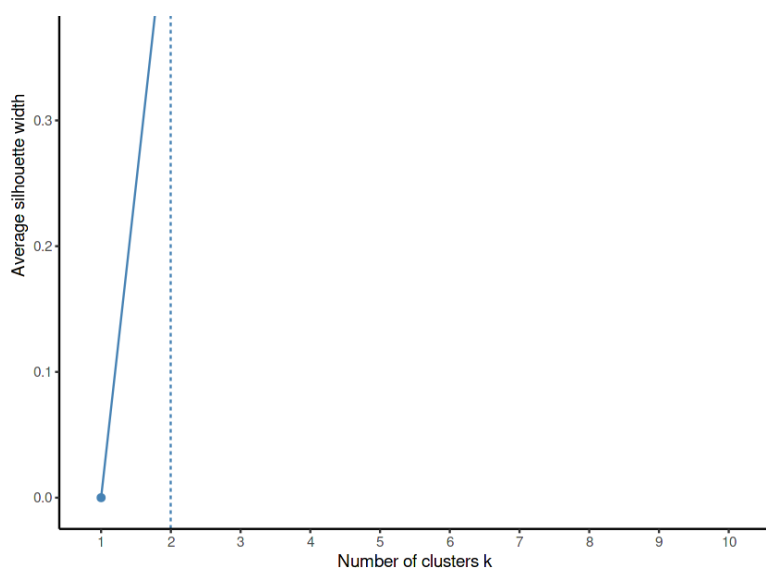
A matrix: 6 × 5 of type dbl

| md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score |
|-----------------------|------------------|--------------------------|-----------------|-----------------|
| -0.01757555 | 5.64273005 | 1.6469403 | 29.34793463 | 6.4399859 |
| -0.01757557 | -0.07042533 | -0.5038442 | -0.02691558 | 1.0634154 |
| -0.01757558 | 2.14034157 | 2.2569243 | -0.02688352 | -0.9330639 |
| -0.01757558 | 2.67799358 | 2.3530290 | -0.02690723 | -0.9457382 |
| -0.01757558 | 1.79417306 | 2.1174197 | -0.02691687 | -0.9330639 |
| -0.01757558 | 2.20245028 | 3.0801292 | -0.02691863 | -0.9514324 |

In [39]:

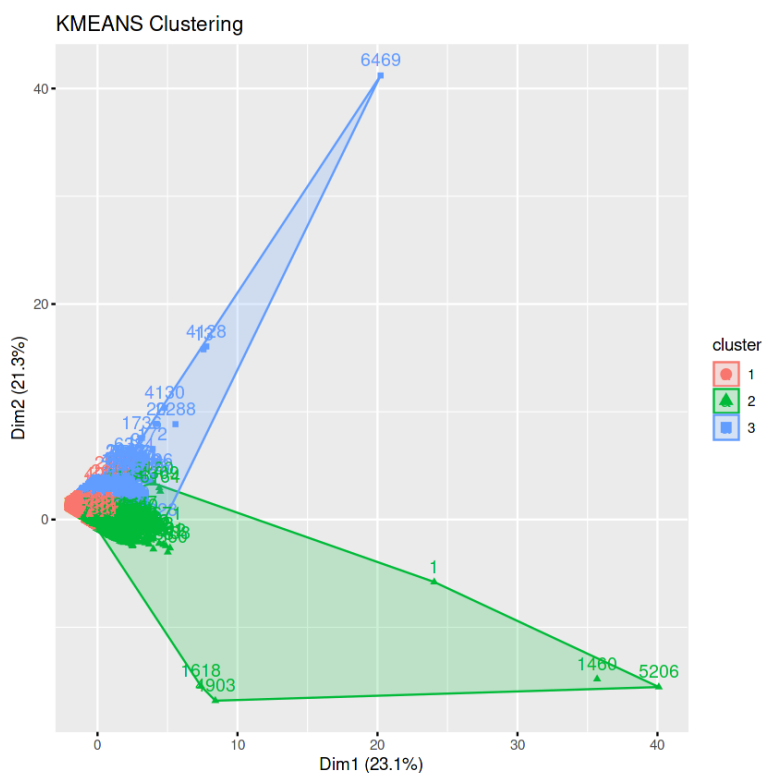
```
fviz_nbclust(c_df2, kmeans, method = "silhouette") + theme_classic()
```





In [40]:

```
res.km <-clust(c df2, "kmeans", hc metric="euclidean",k=3)
```



In [41]:

res.km

K-means clustering with 3 clusters of sizes 4492, 1752, 1147

Cluster means:

```

md_circulating_supply md_current_price md_ath_change_percentage
1          -0.01724655          -0.06184674          -0.45053117
2           0.05572452          -0.04737055          -0.09031705
3          -0.01757442           0.31456736           1.90237270
md_total_volume coingecko_score
1      -0.02656424      -0.4641020
2       0.08142433       1.4207148
3      -0.02033901      -0.3525248

```

Clustering vector:

| | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | | |
|-------|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| [1] | 2 | 2 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 3 | 1 | 2 | 2 | 2 | 3 | 1 | 1 |
| [38] | 1 | 1 | 3 | 2 | 3 | 1 | 1 | 2 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | |
| [75] | 3 | 1 | 1 | 3 | 1 | 1 | 2 | 1 | 1 | 1 | 1 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | |
| [112] | 1 | 3 | 1 | 1 | 1 | 1 | 3 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | |
| [149] | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 1 | 1 | 1 | 1 | 3 | 3 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 3 | 1 | 1 | 2 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 1 | |
| [186] | 1 | 1 | 2 | 1 | 1 | 1 | 3 | 1 | 2 | 3 | 3 | 3 | 3 | 3 | 1 | 1 | 3 | 2 | 3 | 2 | 3 | 2 | 3 | 2 | 3 | 2 | 1 | 1 | 3 | 2 | 3 | 2 | 3 | 3 | 2 |

[223] 3 1 3 3 3 2 1 1 1 1 2 3 2 1 1 1 1 1 2 2 3 1 1 3 1 2 1 2 1 1 1 1 2 2 2 1
[260] 1 2 1 1 2 2 2 1 3 1 1 1 2 3 3 2 1 2 2 1 1 2 1 1 1 1 1 1 1 1 1 3 2 2 1 2
[297] 1 2 1 2 1 1 1 1 1 2 1 1 2 1 2 1 1 3 3 2 2 1 2 1 1 2 1 1 3 3 2 1 1 3 1 2 1
[334] 1 1 1 3 1 1 2 3 3 2 3 1 2 2 3 1 1 2 3 1 2 2 3 1 1 1 1 2 1 1 1 1 1 1 1 3 1
[371] 1 2 3 3 1 2 2 3 1 1 1 1 2 1 1 2 1 2 1 2 1 2 1 1 1 2 3 1 2 1 1 1 3 1 1 1 1
[408] 1 1 2 1 2 2 2 1 2 1 1 3 1 2 1 1 2 1 1 1 2 2 3 2 2 3 1 1 3 1 1 1 1 1 2 3 1
[445] 2 1 2 1 1 1 3 3 3 2 3 1 1 1 2 1 1 1 2 2 2 2 2 1 2 1 1 3 1 1 3 1 3 2 2 2 3
[482] 1 1 1 2 1 2 1 1 1 1 1 1 1 1 1 2 1 1 3 1 2 1 1 1 2 1 2 1 3 1 1 1 2 2 1 1 2 2
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[1444] 2 3 2 1 2 3 1 3 3 3 1 2 2 1 1 2 2 1 1 1 3 3 1 2 1 3 3 3 1 1 3 3 3 1 1 2 2
[1481] 1 1 2 1 2 1 1 1 2 3 2 1 3 3 3 3 3 1 2 2 2 1 3 3 3 3 3 1 1 1 3 3 1 2 2
[1518] 1 1 1 1 1 1 3 3 1 3 2 1 3 2 2 2 2 2 1 1 1 2 1 3 1 3 1 1 1 1 1 3 2 1 2 2
[1555] 1 3 3 1 3 1 1 1 2 2 2 1 2 3 1 2 1 3 1 1 1 3 1 1 3 2 1 2 2 1 1 1 1 1 1 1
[1592] 1 1 1 1 2 1 2 1 1 1 1 1 1 1 3 1 2 1 3 2 2 1 1 1 2 1 2 2 3 1 1 1 3 2 2 1 2
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[1740] 1 3 2 1 1 1 2 1 1 1 2 2 1 3 3 1 1 1 1 1 2 1 1 1 1 2 1 2 2 2 1 1 2 1 3 1 1
[1777] 3 1 1 2 1 1 2 1 1 1 1 1 1 1 2 1 1 1 1 1 2 2 1 1 1 1 1 1 1 1 3 2 2 2 1 3 1
[1814] 3 1 2 1 1 2 1 1 1 2 3 1 2 2 1 1 1 1 2 1 2 1 1 1 2 1 2 1 1 1 3 2 1 1 1 2 2
[1851] 1 1 1 3 1 1 1 1 2 2 1 1 1 1 2 1 1 3 1 2 1 1 2 1 1 1 1 1 1 1 1 3 3 3 1 2 1
[1888] 1 1 1 1 1 3 1 2 1 1 2 1 1 3 1 2 2 1 2 1 2 3 2 3 3 1 1 1 3 1 1 3 1 1 1 1 1
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[1962] 1 1 1 1 3 1 1 1 2 1 1 1 2 1 1 3 1 1 1 2 1 1 1 1 1 3 2 1 1 2 1 3 1 1 1 1 1
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[2110] 1 1 1 1 2 3 2 1 1 1 2 1 1 1 1 3 3 2 2 1 3 2 2 1 1 1 1 1 2 2 1 1 3 2 2 1 3
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Within cluster sum of squares by cluster:

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(between_SS / total_SS = 26.7 %)
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Available components:

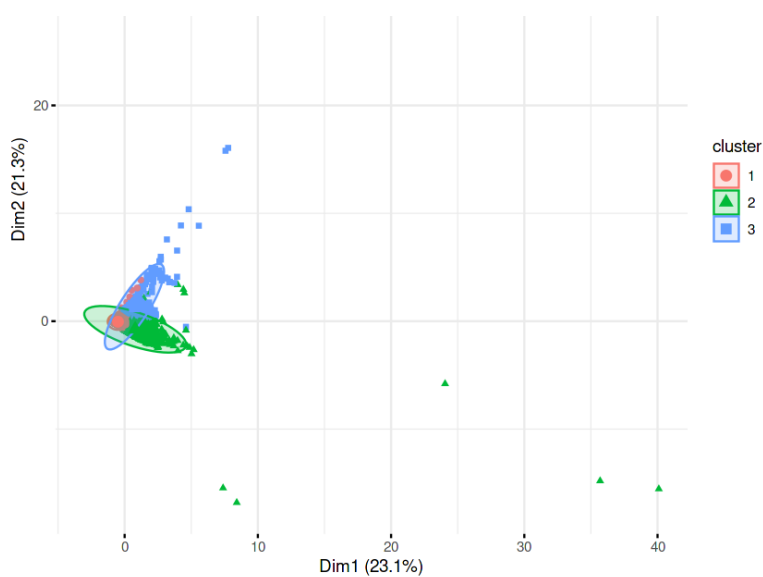
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[1] "cluster"      "centers"      "totss"        "withinss"     "tot.withinss"
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[11] "silinfo"      "nbclust"     "data"
```

In [42]:

```
fviz_cluster(res.km, geom = "point", ellipse.type = "norm", ggtheme = theme_minimal())
```

Cluster plot





In [43]:

```
df2 <- select(cmd, id, asset_platform_id)
c_df1 <- left_join(c_df1, df2, by = "id")
head(c_df1)
```

A tibble: 6 × 8

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity_s |
|-------------------------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-------------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| bitcoin | 18713700 | 3.836200e+04 | -40.80338 | 8.038165e+10 | 80.479 | 100 |
| 01coin | 10646361 | 2.671480e-03 | -92.18446 | 1.226970e+04 | 21.938 | |
| 0-5x-long-algorand-token | 0 | 1.484459e+04 | -26.23119 | 9.999500e+04 | 0.200 | |
| 0-5x-long-altcoin-index-token | 0 | 1.845475e+04 | -23.93530 | 3.513600e+04 | 0.062 | |
| 0-5x-long-balancer-token | 0 | 1.252018e+04 | -29.56388 | 8.744970e+03 | 0.200 | |
| 0-5x-long-bitcoin-cash-token | 0 | 1.526163e+04 | -6.56527 | 3.932310e+03 | 0.000 | |

In [44]:

```
c_df1$cluster <- res.km$cluster
c_df1 %>%
  group_by(cluster) %>%
  slice_max(order_by = coingecko_score, n = 7)

c_df1 %>%
  filter(id == "chainlink")
```

A grouped_df: 21 × 9

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity |
|--------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| lightpaycoin | 0.000000e+00 | 2.170915e-02 | -99.91057 | 2.171000e+01 | 16.761 | |

| dimcoin | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity |
|--------------------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| cappasity | 0.000000e+00 | 3.092680e-03 | -99.35413 | 4.827300e+04 | 18.644 | |
| hilux | 1.043483e+07 | 8.292100e-04 | -98.61603 | 1.680000e+00 | 16.626 | |
| lition | 8.783512e+07 | 6.620860e-03 | -98.21895 | 1.608196e+04 | 16.605 | |
| liquidity-network | 5.221878e+07 | 9.215160e-03 | -99.42599 | 6.786500e+04 | 16.587 | |
| gentarium | 5.381715e+06 | 1.612052e-02 | -99.48856 | 1.640000e+01 | 16.566 | |
| bitcoin | 1.871370e+07 | 3.836200e+04 | -40.80338 | 8.038165e+10 | 80.479 | |
| ethereum | 1.159805e+08 | 2.366040e+03 | -45.64788 | 1.413929e+11 | 77.576 | |
| dogecoin | 1.297079e+11 | 3.420340e-01 | -53.03660 | 6.910886e+09 | 72.131 | |
| eos | 9.576606e+08 | 5.280000e+00 | -76.74584 | 4.683260e+09 | 67.251 | |
| binancecoin | 1.545337e+08 | 3.146000e+02 | -54.18894 | 4.659247e+09 | 66.874 | |
| cardano | 3.206639e+10 | 1.140000e+00 | -53.07300 | 6.196208e+09 | 66.017 | |
| stellar | 2.310744e+10 | 4.019230e-01 | -53.61976 | 1.733884e+09 | 65.245 | |
| binance-usd | 8.608934e+09 | 1.000000e+00 | -13.21252 | 9.314613e+09 | 36.080 | |
| musd | 3.247126e+07 | 1.000000e+00 | -16.74699 | 5.861900e+04 | 33.328 | |
| compound-usdt | 3.166555e+10 | 2.118068e-02 | -9.68700 | 6.166010e+05 | 31.336 | |
| husd | 1.007187e+09 | 1.010000e+00 | -20.57916 | 3.676914e+08 | 30.699 | |
| interest-bearing-bitcoin | 5.249890e+02 | 3.956300e+04 | -23.78174 | 3.680445e+06 | 30.371 | |
| wrapped-bitcoin | 1.816634e+05 | 3.825000e+04 | -40.75814 | 8.553752e+08 | 30.320 | |
| liquity-usd | 6.336208e+08 | 9.964900e-01 | -13.78112 | 3.086008e+07 | 30.105 | |

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A tibble: 1 × 9

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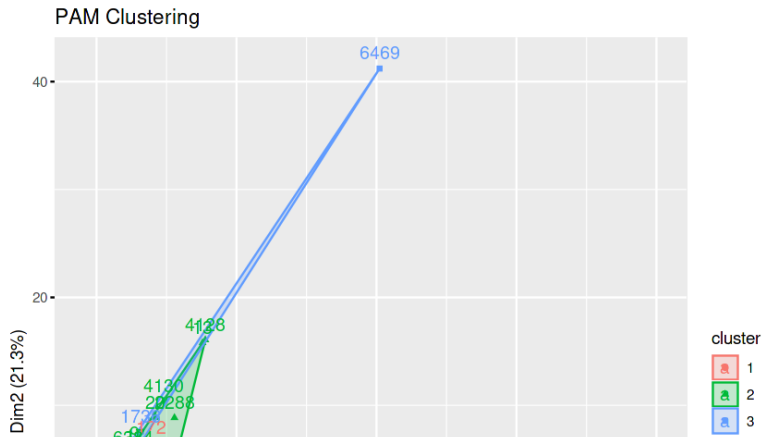
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|--|--|--|--|--|--|--|
| | | | | | | |
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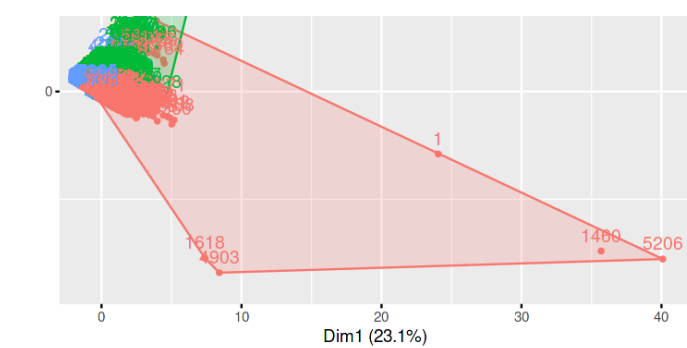
In [47]:

```
# Using Partitioning Around Medoids
fviz_nbclust(c_df2,pam, method = "silhouette") + theme_classic()
```

In [50]:

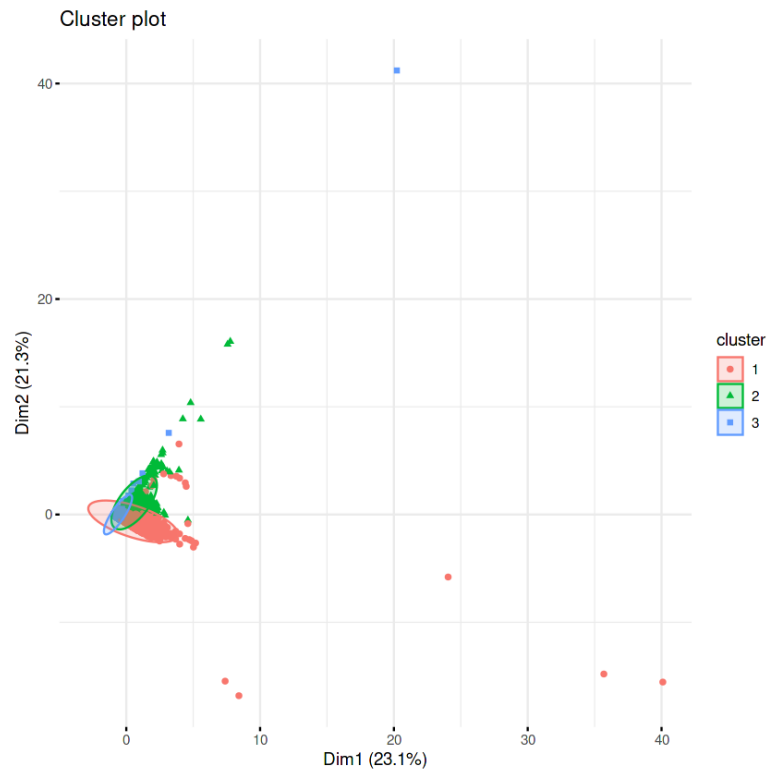
```
pam.res <- eclust(c_df2, "pam", k = 3, hc_metric="euclidean")
```





In [51]:

```
fviz_cluster(pam.res, geom = "point", ellipse.type = "norm", ggtheme = theme_minimal())
```



In [52]:

```
pam.res$clusinfo
```

A matrix: 3 × 5 of type dbl

| size | max_diss | av_diss | diameter | separation |
|------|----------|-----------|----------|-------------|
| 2538 | 62.30673 | 0.9948755 | 87.53293 | 0.007520285 |
| 1423 | 23.55546 | 1.1426882 | 24.03467 | 0.012946979 |
| 3430 | 64.81840 | 0.4188246 | 64.83250 | 0.007520285 |

In [53]:

```
c_df1$pcluster <- pam.res$clustering
# head(c_df1)
c_df1 %>%
  group_by(pcluster) %>%
  slice_max(order_by = coingecko_score, n = 7)
```

A grouped_df: 21 × 10

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity |
|----------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| bitcoin | 18713700 | 3.836200e+04 | -40.80338 | 8.038165e+10 | 80.479 | |
| ethereum | 115980456 | 2.366040e+03 | -45.64788 | 1.413929e+11 | 77.576 | |

| dogecoin | md_circul2017090119 | md_circul2017090119 | md_ath_change_per5.01566 | md_circul2017090119 | coingecko_72.004 | liquidity |
|----------------------|---------------------|---------------------|--------------------------|---------------------|------------------|-----------|
| <ch> | 957660518 | 5.280000e+01 | -76.74514 | 4.683260e+09 | 67.011 | |
| binancecoin | 154533652 | 3.146000e+02 | -54.18894 | 4.659247e+09 | 66.874 | |
| cardano | 32066390668 | 1.140000e+00 | -53.07300 | 6.196208e+09 | 66.017 | |
| stellar | 23107442288 | 4.019230e-01 | -53.61976 | 1.733884e+09 | 65.245 | |
| dai | 4064376026 | 9.902140e-01 | -18.76367 | 1.125371e+09 | 40.359 | |
| paxos-standard | 1419829455 | 9.992850e-01 | -11.21073 | 1.099693e+08 | 40.300 | |
| binance-usd | 8608933842 | 1.000000e+00 | -13.21252 | 9.314613e+09 | 36.080 | |
| celsius-degree-token | 383306566 | 5.920000e+00 | -24.62409 | 3.685521e+07 | 35.489 | |
| usdp | 117057384 | 1.010000e+00 | -28.31659 | 1.888397e+07 | 34.836 | |
| unit-protocol-duck | 211357079 | 4.755070e-01 | -26.50658 | 2.248108e+06 | 34.228 | |
| quant-network | 12873332 | 4.149000e+01 | -33.74473 | 8.272062e+06 | 33.622 | |
| secure-cash | 106931 | 7.501000e-02 | -99.94411 | 8.180000e+00 | 11.396 | |
| sucrocoin | 10170765 | 1.245560e-03 | -99.62235 | 3.323000e+01 | 11.385 | |
| nyxcoin | 8965008 | 3.042344e-02 | -99.79206 | 2.329600e+05 | 11.349 | |
| paypex | 94048768 | 4.772000e-05 | -99.99944 | 5.553000e+01 | 11.347 | |
| emergency-coin | 8788203 | 1.421780e-03 | -98.39714 | 1.418940e-03 | 11.346 | |
| lux | 565400550 | 9.162700e-04 | -99.94490 | 8.766000e+01 | 11.307 | |
| zeusshield | 1960019216 | 2.820100e-04 | -99.68156 | 1.974070e+03 | 11.296 | |

In [54]:

```
p_df1 <- pod %>%
  select(id, community_score, stars, reddit_accounts_active_48h, reddit_average_comments_48h,
         developer_score, commit_count_4_weeks) %>%
  na.omit()
print(dim(p_df1))

[1] 7457      7
```

In [55]:

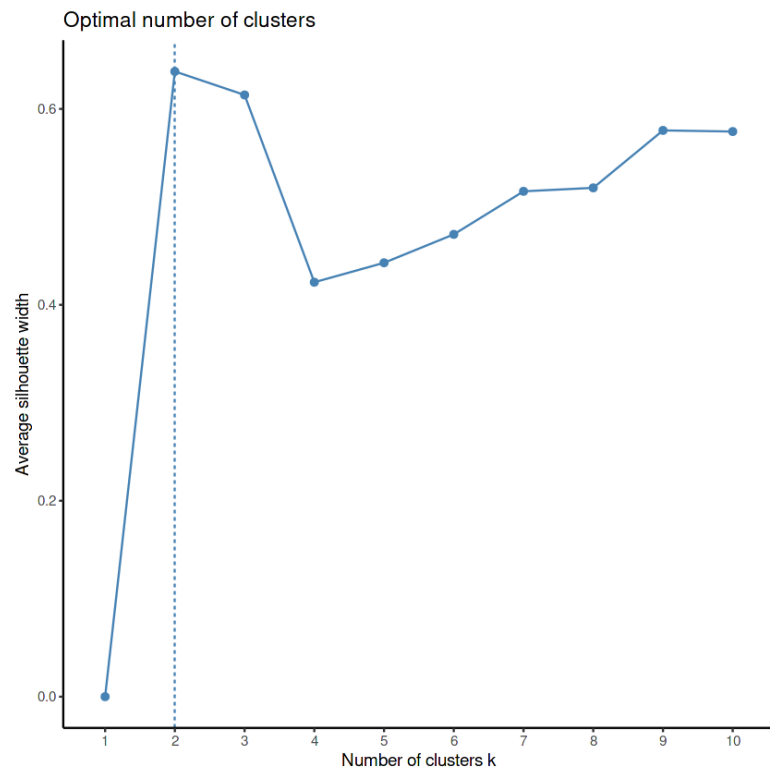
```
p_df2 <- scale(p_df1[,2:7])
head(p_df2)
```

A matrix: 6 × 6 of type dbl

| community_score | stars | reddit_accounts_active_48h | reddit_average_comments_48h | developer_score | commit_count_4_w |
|-----------------|-------------|----------------------------|-----------------------------|-----------------|------------------|
| 5.690806 | 70.12967668 | 28.68326425 | 11.24894366 | 5.2485493 | 18.088 |
| 0.394753 | -0.03090436 | -0.03327772 | -0.02480121 | 2.0968303 | -0.090 |
| -1.012249 | -0.04912113 | -0.04462544 | -0.02480121 | -0.4733738 | -0.090 |
| -1.012249 | -0.04912113 | -0.04462544 | -0.02480121 | -0.4733738 | -0.090 |
| -1.012249 | -0.04912113 | -0.04462544 | -0.02480121 | -0.4733738 | -0.090 |
| -1.012249 | -0.04912113 | -0.04462544 | -0.02480121 | -0.4733738 | -0.090 |

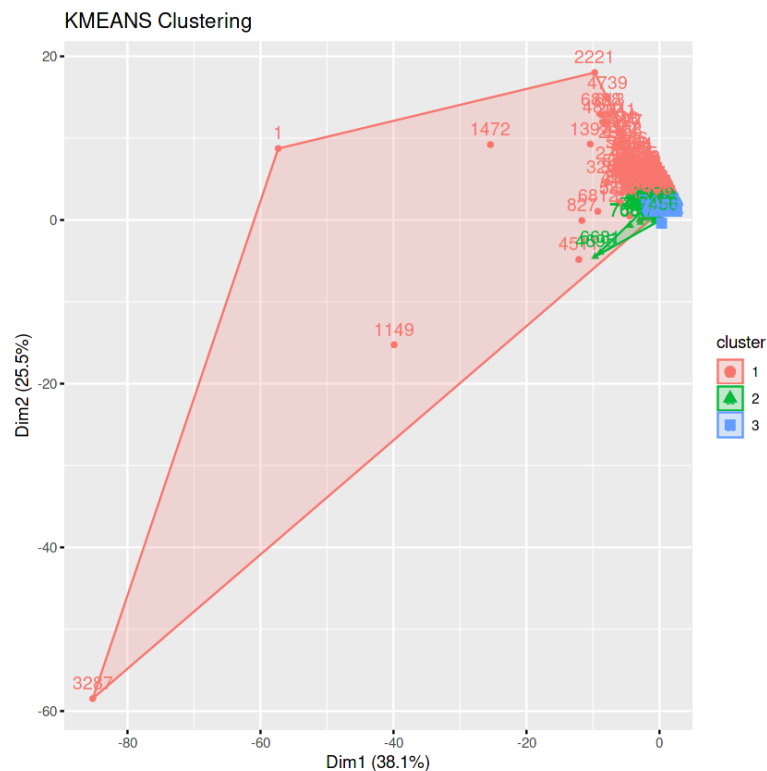
In [56]:

```
fviz_nbclust(p_df2, kmeans, method = "silhouette") + theme_classic()
```



In [57]:

```
res.km1 <- eclust(p_df2, "kmeans", hc_metric="euclidean", k=3)
```



In [58]:

```
res.km1
```

K-means clustering with 3 clusters of sizes 726, 1131, 5600

Cluster means:

| | community_score | stars | reddit_accounts_active_48h |
|---|-----------------|-------------|----------------------------|
| 1 | 1.2184279 | 0.44095546 | 0.28327054 |
| 2 | 1.5669983 | -0.04577552 | 0.03786476 |
| 3 | -0.4744382 | -0.04792170 | -0.04437133 |

reddit average comments 48h developer score commit count 4 weeks

Clustering vector:

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[7364] 3 3 3 3 3 3 3 3 3 2 2 3 3 3 2 3 3 1 3 3 3 3 3 3 3 2 3 3 3 3 3 3 1
[7401] 3 3 1 3 1 3 3 3 3 3 3 3 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3
[7438] 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 2 3

```

Within cluster sum of squares by cluster:

```

[1] 30301.038 1175.210 1701.912
    (between_SS / total_SS =  25.8 %)

```

Available components:

```

[1] "cluster"      "centers"      "totss"        "withinss"     "tot.withinss"
[6] "betweenss"    "size"         "iter"         "ifault"       "clust.plot"

```

```
[11] "silinfo"      "nbclust"      "data"
```

In [59]:

```
df2 <- select(cmd, id, asset_platform_id)
p_df1 <- left_join(p_df1, df2, by = "id")
head(p_df1)
```

A tibble: 6 × 8

| id | community_score | stars | reddit_accounts_active_48h | reddit_average_comments_48h | developer_score | commit_cou |
|-------------------------------|-----------------|-------|----------------------------|-----------------------------|-----------------|------------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| bitcoin | 71.280 | 53934 | 12658 | 2110.636 | 98.879 | |
| 01coin | 14.962 | 14 | 5 | 0.000 | 44.415 | |
| 0-5x-long-algorand-token | 0.000 | 0 | 0 | 0.000 | 0.000 | |
| 0-5x-long-altcoin-index-token | 0.000 | 0 | 0 | 0.000 | 0.000 | |
| 0-5x-long-balancer-token | 0.000 | 0 | 0 | 0.000 | 0.000 | |
| 0-5x-long-bitcoin-cash-token | 0.000 | 0 | 0 | 0.000 | 0.000 | |

In [60]:

```
p_df1$pod_cluster <- res.kml$cluster
p_df1 %>%
  group_by(pod_cluster) %>%
  slice_max(order_by = developer_score, n = 7)

p_df1 %>%
  filter(id == "chainlink")
```

A grouped_df: 21 × 9

| id | community_score | stars | reddit_accounts_active_48h | reddit_average_comments_48h | developer_score | commit_cc |
|----------------|-----------------|-------|----------------------------|-----------------------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| bitcoin | 71.280 | 53934 | 12658 | 2110.636 | 98.879 | |
| ethereum | 62.899 | 30455 | 3961 | 278.167 | 97.173 | |
| eos | 48.324 | 11188 | 391 | 31.636 | 94.125 | |
| status | 37.677 | 3127 | 47 | 0.750 | 89.147 | |
| lisk | 43.460 | 2741 | 80 | 2.250 | 88.940 | |
| monero | 55.134 | 5855 | 1120 | 222.167 | 88.847 | |
| stellar | 50.643 | 2715 | 649 | 52.333 | 87.629 | |
| nucleus-vision | 43.643 | 0 | 68 | 0.000 | 36.042 | |
| cortex | 39.537 | 10 | 12 | 0.250 | 34.532 | |
| blockv | 29.645 | 6 | 20 | 0.000 | 33.618 | |
| digitalnote | 33.505 | 0 | 72 | 0.917 | 33.600 | |

| id | community_score | stars | reddit_accounts_active_48h | reddit_average_comments_48h | developer_score | commit_count |
|---------------|-----------------|-------|----------------------------|-----------------------------|-----------------|--------------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| thunder-token | 30.033 | 35 | 4 | 0.000 | 33.026 | |
| chronologic | 0.000 | 39 | 0 | 0.000 | 45.077 | |
| bitcoen | 0.000 | 5 | 0 | 0.000 | 44.573 | |
| narrative | 0.000 | 14 | 0 | 0.000 | 44.237 | |
| iftoken | 5.122 | 5 | 0 | 0.000 | 40.544 | |
| proxynode | 4.139 | 11 | 0 | 0.000 | 40.043 | |
| lunarium | 4.879 | 4 | 0 | 0.000 | 39.812 | |
| lightbit | 6.222 | 3 | 0 | 0.000 | 39.639 | |

A tibble: 1 × 9

| id | community_score | stars | reddit_accounts_active_48h | reddit_average_comments_48h | developer_score | commit_count |
|-----------|-----------------|-------|----------------------------|-----------------------------|-----------------|--------------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| chainlink | 48.091 | 1945 | 466 | 12.667 | 84.784 | |

In [61]:

```
df3 <- select(p_df1, id, pod_cluster, developer_score, community_score)
value_coins <- left_join(c_df1, df3, by = "id")
head(value_coins)
```

A tibble: 6 × 13

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity_score |
|-------------------------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> |
| bitcoin | 18713700 | 3.836200e+04 | -40.80338 | 8.038165e+10 | 80.479 | 100 |
| 01coin | 10646361 | 2.671480e-03 | -92.18446 | 1.226970e+04 | 21.938 | |
| 0-5x-long-algorand-token | 0 | 1.484459e+04 | -26.23119 | 9.999500e+04 | 0.200 | |
| 0-5x-long-altcoin-index-token | 0 | 1.845475e+04 | -23.93530 | 3.513600e+04 | 0.062 | |
| 0-5x-long-balancer-token | 0 | 1.252018e+04 | -29.56388 | 8.744970e+03 | 0.200 | |
| 0-5x-long-bitcoin-cash-token | 0 | 1.526163e+04 | -6.56527 | 3.932310e+03 | 0.000 | |

In [62]:

```
value_coins <- value_coins %>%
  filter(cluster == 2 & pcluster == 1 & pod_cluster == 1) %>%
  arrange(desc(coingecko_score))
print(dim(value_coins))
head(value_coins)
```

A tibble: 6 × 13

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity |
|-------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | |
| bitcoin | 18713700 | 3.83620e+04 | -40.80338 | 80381645199 | 80.479 | |
| ethereum | 115980456 | 2.36604e+03 | -45.64788 | 141392923000 | 77.576 | |
| dogecoin | 129707901212 | 3.42034e-01 | -53.03660 | 6910885512 | 72.131 | |
| eos | 957660558 | 5.28000e+00 | -76.74584 | 4683260015 | 67.251 | |
| binancecoin | 154533652 | 3.14600e+02 | -54.18894 | 4659247041 | 66.874 | |
| cardano | 32066390668 | 1.14000e+00 | -53.07300 | 6196208407 | 66.017 | |

In [63]:

```
value_coins %>%
  filter(id %in% top_coins$id)
```

A tibble: 13 × 13

| id | md_circulating_supply | md_current_price | md_ath_change_percentage | md_total_volume | coingecko_score | liquidity |
|---------------|-----------------------|------------------|--------------------------|-----------------|-----------------|-----------|
| <chr> | <dbl> | <dbl> | <dbl> | <dbl> | <dbl> | |
| bitcoin | 1.871370e+07 | 3.836200e+04 | -40.80338 | 80381645199 | 80.479 | |
| ethereum | 1.159805e+08 | 2.366040e+03 | -45.64788 | 141392923000 | 77.576 | |
| dogecoin | 1.297079e+11 | 3.420340e-01 | -53.03660 | 6910885512 | 72.131 | |
| binancecoin | 1.545337e+08 | 3.146000e+02 | -54.18894 | 4659247041 | 66.874 | |
| cardano | 3.206639e+10 | 1.140000e+00 | -53.07300 | 6196208407 | 66.017 | |
| ripple | 4.613537e+10 | 9.011180e-01 | -73.49166 | 9566094773 | 64.922 | |
| monero | 1.791519e+07 | 2.436300e+02 | -55.07632 | 671078996 | 63.943 | |
| vechain | 6.524175e+10 | 1.042540e-01 | -62.64408 | 1896226504 | 63.058 | |
| matic-network | 6.155590e+09 | 1.330000e+00 | -49.22384 | 3994657609 | 59.958 | |
| vethor-token | 3.569292e+10 | 9.752670e-03 | -78.94933 | 73678442 | 56.276 | |
| safemoon | 5.836952e+14 | 4.740000e-06 | -56.37564 | 38231343 | 44.822 | |
| banano | 1.244918e+09 | 2.631352e-02 | -51.39859 | 676190 | 39.781 | |
| moon | 0.000000e+00 | 7.291100e-02 | -84.24242 | 22774 | 17.663 | |

In [65]:

```
value_coins$coingecko_rank <- cmd$coingecko_rank[match(value_coins$id,cmd$id)]
```

In [71]:

```
dim(value_coins)
```

In [94]:

```
m <- c(100, 200, 300, 400, 500, 600)
for (i in m){
  rank <- value_coins %>%
    arrange(coingecko_rank) %>%
```

```
head(i) %>%  
tail(1) %>%  
select(coingecko_rank)  
print(paste0("Top ", i, " coins - ", (i/rank$coingecko_rank)*100, "%"))  
}
```

```
[1] "Top 100 coins - 99.009900990099%"  
[1] "Top 200 coins - 89.2857142857143%"  
[1] "Top 300 coins - 78.9473684210526%"  
[1] "Top 400 coins - 67.0016750418761%"  
[1] "Top 500 coins - 54.585152838428%"  
[1] "Top 600 coins - 35.3565114908662%"
```