

# EDA

## Data Gathering

In this section, we are simply going to read in the data from both the train and test files. Once we have the data, we will then transform the data types as needed to cast them to the correct type. Once we finish this, we will save the tibble as an RDS for our Shiny App.

```
library(tidyverse)

-- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
v dplyr     1.1.4     v readr     2.1.5
vforcats    1.0.0     v stringr   1.5.1
v ggplot2   3.5.2     v tibble    3.2.1
v lubridate 1.9.4     v tidyr    1.3.1
v purrr    1.0.4

-- Conflicts -----
x dplyr::filter() masks stats::filter()
x dplyr::lag()    masks stats::lag()
i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all conflicts to become non-conflicting
```

  

```
train <- read.csv2("data/test.csv")
test <- read.csv2("data/train.csv")
bank_data <- bind_rows(train, test)
bank_data <- bank_data |>
  mutate(
    job = as.factor(job),
    marital = as.factor(marital),
    education = as.factor(education),
    default = as.factor(default),
    housing = as.factor(housing),
    loan = as.factor(loan),
```

```

contact = as.factor(contact),
month = as.factor(month),
poutcome = as.factor(poutcome),
success = as.factor(y),
age = as.integer(age),
balance = as.integer(balance),
day = as.integer(day),
duration = as.integer(duration),
campaign = as.integer(campaign),
pdays = as.integer(pdays),
previous = as.integer(previous)
) |>
select(-y) |>
# Lets also reorder the month factor so it shows up in order
mutate(month = fct_relevel(month, "jan", "feb", "mar", "apr", "may", "jun",
                           "jul", "aug", "sep", "oct", "nov", "dec"))
saveRDS(bank_data, "data/full.rds")

```

## Contingency Tables

Now that the data is loaded and the types are correct, we can move on to the contingency tables.

### One-Way Contingency Tables

```

factor_columns <- bank_data |> select(where(is.factor)) |> names()
int_columns <- bank_data |> select(where(is.integer)) |> names()

for (factor in factor_columns) {
  cat("\nFactor:", factor)
  print(table(bank_data[[factor]]))
}

```

Factor: job	admin.	blue-collar	entrepreneur	housemaid	management
5649	10678	1655	1352	10427	
retired	self-employed	services	student	technician	

2494	1762	4571	1022	8365
unemployed	unknown			
1431	326			

Factor: marital  
divorced   married   single  
5735      30011     13986

Factor: education  
primary   secondary   tertiary   unknown  
7529      25508     14651     2044

Factor: default  
no   yes  
48841    891

Factor: housing  
no   yes  
22043   27689

Factor: loan  
no   yes  
41797   7935

Factor: contact  
cellular telephone   unknown  
32181      3207     14344

Factor: month  
jan   feb   mar   apr   may   jun   jul   aug   sep   oct   nov   dec  
1551   2871   526   3225   15164   5872   7601   6880   631   818   4359   234

Factor: poutcome  
failure   other   success   unknown  
5391      2037     1640     40664

Factor: success  
no   yes  
43922   5810

## Two-Way Contingency Tables

```
for (i in seq_along(factor_columns)[-length(factor_columns)]) {  
  for (j in seq.int(i + 1, length(factor_columns))) {  
    factor1 <- factor_columns[i]  
    factor2 <- factor_columns[j]  
    cat("\nFactors:", factor1, "x", factor2, "\n")  
    print(table(bank_data[[factor1]], bank_data[[factor2]]))  
  }  
}
```

Factors: job x marital

	divorced	married	single
admin.	819	2959	1871
blue-collar	829	7661	2188
entrepreneur	195	1202	258
housemaid	197	996	159
management	1230	5957	3240
retired	468	1907	119
self-employed	155	1120	487
services	611	2643	1317
student	6	64	952
technician	1014	4463	2888
unemployed	193	806	432
unknown	18	233	75

Factors: job x education

	primary	secondary	tertiary	unknown
admin.	226	4612	623	188
blue-collar	4127	5895	161	495
entrepreneur	209	600	759	87
housemaid	684	423	195	50
management	333	1237	8588	269
retired	875	1089	397	133
self-employed	145	653	921	43
services	370	3820	218	163
student	46	555	242	179
technician	173	5749	2179	264

unemployed	283	796	321	31
unknown	58	79	47	142

Factors: job x default

	no	yes
admin.	5569	80
blue-collar	10463	215
entrepreneur	1593	62
housemaid	1328	24
management	10249	178
retired	2465	29
self-employed	1725	37
services	4489	82
student	1018	4
technician	8220	145
unemployed	1398	33
unknown	324	2

Factors: job x housing

	no	yes
admin.	2165	3484
blue-collar	2935	7743
entrepreneur	692	963
housemaid	915	437
management	5246	5181
retired	1953	541
self-employed	909	853
services	1520	3051
student	753	269
technician	3826	4539
unemployed	830	601
unknown	299	27

Factors: job x loan

	no	yes
admin.	4567	1082
blue-collar	8838	1840
entrepreneur	1258	397
housemaid	1187	165
management	9054	1373

retired	2153	341
self-employed	1503	259
services	3661	910
student	1009	13
technician	6937	1428
unemployed	1309	122
unknown	321	5

Factors: job x contact

	cellular	telephone	unknown
admin.	3670	320	1659
blue-collar	5647	667	4364
entrepreneur	1059	100	496
housemaid	814	168	370
management	7732	522	2173
retired	1515	447	532
self-employed	1200	103	459
services	2734	256	1581
student	759	108	155
technician	5920	355	2090
unemployed	976	110	345
unknown	155	51	120

Factors: job x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
admin.	201	330	82	451	1907	636	956	392	84	119	465	26
blue-collar	204	440	28	830	4811	1403	1536	660	37	65	652	12
entrepreneur	42	97	2	75	468	230	337	95	14	13	279	3
housemaid	33	57	14	56	163	294	310	285	16	30	88	6
management	322	599	159	611	2395	1029	1481	2183	183	197	1211	57
retired	100	181	76	159	391	330	387	428	102	147	150	43
self-employed	58	114	16	93	412	251	277	237	14	28	256	6
services	140	227	21	307	1766	567	861	292	21	23	330	16
student	44	100	43	96	272	94	79	120	57	41	57	19
technician	273	467	62	472	2253	767	1147	2012	67	118	692	35
unemployed	114	245	19	67	294	173	194	103	25	24	163	10
unknown	20	14	4	8	32	98	36	73	11	13	16	1

Factors: job x poutcome

failure other success unknown

admin.	702	267	227	4453
blue-collar	1169	438	162	8909
entrepreneur	179	46	23	1407
housemaid	107	30	33	1182
management	1158	442	410	8417
retired	261	88	187	1958
self-employed	181	70	58	1453
services	481	193	94	3803
student	127	89	91	715
technician	880	329	273	6883
unemployed	124	42	68	1197
unknown	22	3	14	287

Factors: job x success

	no	yes
admin.	4960	689
blue-collar	9901	777
entrepreneur	1517	138
housemaid	1229	123
management	8995	1432
retired	1924	570
self-employed	1555	207
services	4164	407
student	734	288
technician	7442	923
unemployed	1216	215
unknown	285	41

Factors: marital x education

	primary	secondary	tertiary	unknown
divorced	831	3085	1626	193
married	5772	15197	7765	1277
single	926	7226	5260	574

Factors: marital x default

	no	yes
divorced	5589	146
married	29527	484
single	13725	261

Factors: marital x housing

	no	yes
divorced	2530	3205
married	13065	16946
single	6448	7538

Factors: marital x loan

	no	yes
divorced	4724	1011
married	24898	5113
single	12175	1811

Factors: marital x contact

	cellular telephone unknown			
divorced	3647	305	1783	
married	18902	2221	8888	
single	9632	681	3673	

Factors: marital x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
divorced	181	327	54	292	1814	737	971	643	55	88	549	24
married	780	1540	275	1919	8762	3665	4796	4547	347	467	2781	132
single	590	1004	197	1014	4588	1470	1834	1690	229	263	1029	78

Factors: marital x poutcome

	failure	other	success	unknown
divorced	608	246	162	4719
married	3217	1099	918	24777
single	1566	692	560	11168

Factors: marital x success

	no	yes
divorced	5036	699
married	26979	3032
single	11907	2079

Factors: education x default

	no	yes
primary	7392	137
secondary	25004	504
tertiary	14436	215
unknown	2009	35

Factors: education x housing

	no	yes
primary	3252	4277
secondary	10040	15468
tertiary	7610	7041
unknown	1141	903

Factors: education x loan

	no	yes
primary	6411	1118
secondary	20789	4719
tertiary	12693	1958
unknown	1904	140

Factors: education x contact

	cellular	telephone	unknown
primary	3911	797	2821
secondary	16134	1506	7868
tertiary	11051	695	2905
unknown	1085	209	750

Factors: education x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
primary	178	375	54	462	2579	1226	1201	741	78	109	502	24
secondary	778	1434	207	1739	8719	2830	4065	2948	248	345	2085	110
tertiary	507	947	237	909	3251	1465	2036	2999	258	317	1641	84
unknown	88	115	28	115	615	351	299	192	47	47	131	16

Factors: education x outcome

	failure	other	success	unknown
primary	704	266	148	6411

secondary	2842	1089	735	20842
tertiary	1649	609	666	11727
unknown	196	73	91	1684

Factors: education x success

	no	yes
primary	6874	655
secondary	22813	2695
tertiary	12462	2189
unknown	1773	271

Factors: default x housing

	no	yes
no	21632	27209
yes	411	480

Factors: default x loan

	no	yes
no	41232	7609
yes	565	326

Factors: default x contact

	cellular	telephone	unknown
no	31634	3178	14029
yes	547	29	315

Factors: default x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
no	1533	2830	526	3213	14899	5753	7361	6775	630	818	4269	234
yes	18	41	0	12	265	119	240	105	1	0	90	0

Factors: default x poutcome

	failure	other	success	unknown
no	5351	2017	1638	39835
yes	40	20	2	829

Factors: default x success

	no	yes
no	43092	5749
yes	830	61

Factors: housing x loan

	no	yes
no	18881	3162
yes	22916	4773

Factors: housing x contact

	cellular	telephone	unknown
no	16116	1909	4018
yes	16065	1298	10326

Factors: housing x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
no	970	1647	402	947	1869	3406	3918	5653	487	636	1921	187
yes	581	1224	124	2278	13295	2466	3683	1227	144	182	2438	47

Factors: housing x poutcome

	failure	other	success	unknown
no	1578	705	1129	18631
yes	3813	1332	511	22033

Factors: housing x success

	no	yes
no	18388	3655
yes	25534	2155

Factors: loan x contact

	cellular	telephone	unknown
no	26932	2751	12114
yes	5249	456	2230

Factors: loan x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
no	1321	2450	499	2835	12982	5076	5286	6209	598	756	3563	222
yes	230	421	27	390	2182	796	2315	671	33	62	796	12

Factors: loan x poutcome

	failure	other	success	unknown
no	4548	1748	1552	33949
yes	843	289	88	6715

Factors: loan x success

	no	yes
no	36514	5283
yes	7408	527

Factors: contact x month

	jan	feb	mar	apr	may	jun	jul	aug	sep	oct	nov	dec
cellular	1394	2561	455	3003	5860	802	6343	6557	508	621	3885	192
telephone	147	297	63	216	509	88	954	266	69	142	417	39
unknown	10	13	8	6	8795	4982	304	57	54	55	57	3

Factors: contact x poutcome

	failure	other	success	unknown
cellular	4976	1808	1499	23898
telephone	380	197	127	2503
unknown	35	32	14	14263

Factors: contact x success

	no	yes
cellular	27396	4785
telephone	2773	434
unknown	13753	591

Factors: month x poutcome

	failure	other	success	unknown
jan	320	165	73	993
feb	584	266	151	1870
mar	80	41	67	338

apr	809	280	144	1992
may	1864	656	256	12388
jun	144	81	124	5523
jul	123	49	108	7321
aug	259	97	223	6301
sep	127	68	143	293
oct	165	65	142	446
nov	871	240	151	3097
dec	45	29	58	102

Factors: month x success

	no	yes
jan	1393	158
feb	2392	479
mar	257	269
apr	2592	633
may	14146	1018
jun	5271	601
jul	6913	688
aug	6113	767
sep	345	286
oct	458	360
nov	3917	442
dec	125	109

Factors: poutcome x success

	no	yes
failure	4710	681
other	1692	345
success	579	1061
unknown	36941	3723

## Data Summaries

Now that the contingency tables are completed, we can turn our attention to creating summaries for our quantitative variables at the levels of categorical variables.

```
for (factor in factor_columns) {
  for (int_var in int_columns) {
```

```

int_by_cat <- bank_data |>
  group_by(.data[[factor]]) |>
  summarise(
    n = n(),
    mean = mean(.data[[int_var]]),
    median = median(.data[[int_var]]),
    sd = sd(.data[[int_var]])
  )
  cat("\n", factor, "by", int_var, "\n")
  print(int_by_cat)
}
}

```

```

job by age
# A tibble: 12 x 5
  job          n  mean median   sd
  <fct>     <int> <dbl> <dbl> <dbl>
1 admin.      5649  39.3   38  9.37
2 blue-collar 10678  40.1   39  9.03
3 entrepreneur 1655  42.2   41  9.04
4 housemaid    1352  46.5   47 10.5 
5 management   10427  40.5   38  9.37
6 retired      2494  61.6   59  9.56
7 self-employed 1762  40.6   39  9.63
8 services     4571  38.7   37  9.06
9 student       1022  26.6   26  4.88
10 technician   8365  39.3   37  8.92
11 unemployed   1431  41.0   40  9.77
12 unknown      326   47.7   47 10.7
```

```

job by balance
# A tibble: 12 x 5
  job          n  mean median   sd
  <fct>     <int> <dbl> <dbl> <dbl>
1 admin.      5649  39.3   38  9.37
2 blue-collar 10678  40.1   39  9.03
3 entrepreneur 1655  42.2   41  9.04
4 housemaid    1352  46.5   47 10.5 
5 management   10427  40.5   38  9.37
6 retired      2494  61.6   59  9.56
7 self-employed 1762  40.6   39  9.63
```

8 services	4571	38.7	37	9.06
9 student	1022	26.6	26	4.88
10 technician	8365	39.3	37	8.92
11 unemployed	1431	41.0	40	9.77
12 unknown	326	47.7	47	10.7

job by day

```
# A tibble: 12 x 5
  job          n   mean median    sd
  <fct>     <int> <dbl> <dbl> <dbl>
  1 admin.     5649  15.6   16    8.44
  2 blue-collar 10678  15.4   15    7.91
  3 entrepreneur 1655   15.7   17    7.87
  4 housemaid   1352   15.9   16    8.08
  5 management   10427  16.1   17    8.36
  6 retired      2494   15.5   15    8.32
  7 self-employed 1762   16.0   17    8.20
  8 services      4571   15.6   16    8.28
  9 student       1022   15.0   14.5  8.78
  10 technician   8365   16.4   17    8.52
  11 unemployed   1431   15.6   15    9.42
  12 unknown       326   14.8   14    8.76
```

job by duration

```
# A tibble: 12 x 5
  job          n   mean median    sd
  <fct>     <int> <dbl> <dbl> <dbl>
  1 admin.     5649  246.   173   240.
  2 blue-collar 10678  264.   188   261.
  3 entrepreneur 1655  259.   181   255.
  4 housemaid   1352  250.   166.  261.
  5 management   10427  255.   174   257.
  6 retired      2494  287.   204   262.
  7 self-employed 1762  268.   178   281.
  8 services      4571  260.   186   260.
  9 student       1022  247.   181   227.
  10 technician   8365  253.   176   256.
  11 unemployed   1431  290.   200   296.
  12 unknown       326  235.   165   223.
```

job by campaign

```
# A tibble: 12 x 5
  job          n   mean median    sd
  <fct>     <int> <dbl> <dbl> <dbl>
```

		<fct>	<int>	<dbl>	<dbl>	<dbl>
1	admin.		5649	2.58	2	2.94
2	blue-collar		10678	2.82	2	3.27
3	entrepreneur		1655	2.78	2	2.84
4	housemaid		1352	2.79	2	2.73
5	management		10427	2.87	2	3.20
6	retired		2494	2.36	2	2.29
7	self-employed		1762	2.90	2	3.30
8	services		4571	2.73	2	3.06
9	student		1022	2.31	2	2.36
10	technician		8365	2.89	2	3.23
11	unemployed		1431	2.45	2	2.78
12	unknown		326	3.22	2	3.64

job by pdays

```
# A tibble: 12 x 5
  job          n   mean median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 admin.      5649  48.0   -1 109.
2 blue-collar 10678  43.8   -1 109.
3 entrepreneur 1655   32.5   -1  88.3
4 housemaid    1352   21.9   -1  71.1
5 management   10427  38.9   -1  97.6
6 retired      2494   37.2   -1  86.5
7 self-employed 1762   34.1   -1  86.9
8 services      4571   41.5   -1 104.
9 student       1022   56.1   -1 106.
10 technician   8365   37.4   -1  95.1
11 unemployed   1431   34.4   -1  95.9
12 unknown       326   22.8   -1  82.6
```

job by previous

```
# A tibble: 12 x 5
  job          n   mean median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 admin.      5649  0.669     0  1.99
2 blue-collar 10678  0.504     0  1.85
3 entrepreneur 1655  0.473     0  1.76
4 housemaid    1352  0.371     0  1.35
5 management   10427  0.657     0  3.39
6 retired      2494  0.634     0  1.72
7 self-employed 1762  0.556     0  1.78
8 services      4571  0.496     0  1.61
```

```

 9 student          1022 0.954      0  2.37
10 technician       8365 0.575      0  1.94
11 unemployed      1431 0.468      0  1.55
12 unknown          326 0.340      0  1.12

marital by age
# A tibble: 3 x 5
  marital     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced   5735  45.8     45 10.1
2 married    30011  43.4     42 10.3
3 single     13986  33.7     32  7.59

marital by balance
# A tibble: 3 x 5
  marital     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced   5735  45.8     45 10.1
2 married    30011  43.4     42 10.3
3 single     13986  33.7     32  7.59

marital by day
# A tibble: 3 x 5
  marital     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced   5735  15.8     16  8.25
2 married    30011  15.9     16  8.22
3 single     13986  15.7     16  8.55

marital by duration
# A tibble: 3 x 5
  marital     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced   5735  264.     179 265.
2 married    30011  254.     178 253.
3 single     13986  267.     188 265.

marital by campaign
# A tibble: 3 x 5
  marital     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced   5735  2.63     2  2.79
2 married    30011  2.84     2  3.15

```

```

3 single   13986  2.66      2  3.10

  marital by pdays
# A tibble: 3 x 5
  marital     n  mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced  5735  40.8     -1 102.
2 married   30011  38.0     -1  97.4
3 single    13986  44.5     -1 105.

  marital by previous
# A tibble: 3 x 5
  marital     n  mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 divorced  5735  0.541      0  1.78
2 married   30011  0.553      0  2.41
3 single    13986  0.643      0  2.06

  education by age
# A tibble: 4 x 5
  education     n  mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 primary    7529  46.0     45 11.4
2 secondary  25508  40.0     38 10.2
3 tertiary   14651  39.6     37  9.86
4 unknown    2044  44.6     45 12.1

  education by balance
# A tibble: 4 x 5
  education     n  mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 primary    7529  46.0     45 11.4
2 secondary  25508  40.0     38 10.2
3 tertiary   14651  39.6     37  9.86
4 unknown    2044  44.6     45 12.1

  education by day
# A tibble: 4 x 5
  education     n  mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 primary    7529  15.4     15  7.97
2 secondary  25508  15.8     16  8.30
3 tertiary   14651  16.1     17  8.45

```

```

4 unknown     2044  15.8      16  8.71

education by duration
# A tibble: 4 x 5
  education     n   mean   median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 primary     7529  256.   178   261.
2 secondary  25508  260.   184   254.
3 tertiary   14651  258.   176   264.
4 unknown     2044  257.   178.  245.

education by campaign
# A tibble: 4 x 5
  education     n   mean   median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 primary     7529  2.84     2   3.18
2 secondary  25508  2.70     2   2.98
3 tertiary   14651  2.83     2   3.16
4 unknown     2044  2.82     2   3.69

education by pdays
# A tibble: 4 x 5
  education     n   mean   median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 primary     7529  36.0    -1   97.4
2 secondary  25508  42.2    -1  103.
3 tertiary   14651  39.1    -1   96.3
4 unknown     2044  37.3    -1   96.1

education by previous
# A tibble: 4 x 5
  education     n   mean   median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 primary     7529  0.487     0   1.89
2 secondary  25508  0.564     0   1.83
3 tertiary   14651  0.657     0   3.04
4 unknown     2044  0.490     0   1.56

default by age
# A tibble: 2 x 5
  default     n   mean   median    sd
  <fct>     <int> <dbl>  <int> <dbl>
1 no       48841  41.0     39 10.6

```

```

2 yes      891 39.6      38  9.40

  default by balance
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  41.0     39 10.6
2 yes      891   39.6     38  9.40

  default by day
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  15.8     16  8.31
2 yes      891   16.3     17  8.56

  default by duration
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  259.     181 258.
2 yes      891   239.     171 217.

  default by campaign
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  2.76     2  3.09
2 yes      891   3.09     2  3.51

  default by pdays
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  40.6     -1 100.
2 yes      891   18.2     -1  74.1

  default by previous
# A tibble: 2 x 5
  default     n   mean median    sd
  <fct>   <int> <dbl>  <int> <dbl>
1 no       48841  0.583     0  2.26
2 yes      891   0.263     0  1.58

```

```

housing by age
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  43.2      42 12.1
2 yes       27689  39.2      38  8.92

housing by balance
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  43.2      42 12.1
2 yes       27689  39.2      38  8.92

housing by day
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  16.1      17  8.65
2 yes       27689  15.6      15  8.03

housing by duration
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  257.     178 257.
2 yes       27689  260.     183 259.

housing by campaign
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  2.84      2  3.02
2 yes       27689  2.71      2  3.16

housing by pdays
# A tibble: 2 x 5
  housing     n   mean   median    sd
  <fct>   <int> <dbl>   <int> <dbl>
1 no        22043  26.3     -1 77.6
2 yes       27689  51.2     -1 114.

```

```

housing by previous
# A tibble: 2 x 5
  housing     n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no        22043  0.483     0  1.65
2 yes       27689  0.651     0  2.64

loan by age
# A tibble: 2 x 5
  loan      n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no      41797  41.0     39 10.8
2 yes     7935   40.6     39  9.68

loan by balance
# A tibble: 2 x 5
  loan      n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no      41797  41.0     39 10.8
2 yes     7935   40.6     39  9.68

loan by day
# A tibble: 2 x 5
  loan      n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no      41797  15.8     16  8.30
2 yes     7935   16.0     17  8.40

loan by duration
# A tibble: 2 x 5
  loan      n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no      41797  260.     182 258.
2 yes     7935   252.     174 254.

loan by campaign
# A tibble: 2 x 5
  loan      n   mean median    sd
  <fct> <int> <dbl> <int> <dbl>
1 no      41797  2.75     2  3.05
2 yes     7935   2.84     2  3.35

loan by pdays
```

```

# A tibble: 2 x 5
  loan      n  mean median   sd
  <fct> <int> <dbl> <int> <dbl>
1 no     41797  41.2    -1 101.
2 yes     7935  34.8    -1  93.6

loan by previous
# A tibble: 2 x 5
  loan      n  mean median   sd
  <fct> <int> <dbl> <int> <dbl>
1 no     41797  0.588     0  2.30
2 yes     7935  0.516     0  2.01

contact by age
# A tibble: 3 x 5
  contact      n  mean median   sd
  <fct> <int> <dbl> <dbl> <dbl>
1 cellular  32181  40.4     38 10.5
2 telephone  3207   47.9     47 13.9
3 unknown   14344  40.6     39  9.42

contact by balance
# A tibble: 3 x 5
  contact      n  mean median   sd
  <fct> <int> <dbl> <dbl> <dbl>
1 cellular  32181  40.4     38 10.5
2 telephone  3207   47.9     47 13.9
3 unknown   14344  40.6     39  9.42

contact by day
# A tibble: 3 x 5
  contact      n  mean median   sd
  <fct> <int> <dbl> <dbl> <dbl>
1 cellular  32181  15.9     16  8.20
2 telephone  3207   16.7     17  8.74
3 unknown   14344  15.4     15  8.46

contact by duration
# A tibble: 3 x 5
  contact      n  mean median   sd
  <fct> <int> <dbl> <dbl> <dbl>
1 cellular  32181  263.    184 253.
2 telephone  3207   236.    156 289.

```

```

3 unknown    14344  253.     179  260.

  contact by campaign
# A tibble: 3 x 5
  contact      n   mean median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 cellular    32181  2.70     2  2.91
2 telephone   3207   3.37     2  3.58
3 unknown     14344  2.79     2  3.37

  contact by pdays
# A tibble: 3 x 5
  contact      n   mean median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 cellular    32181 56.9     -1 113.
2 telephone   3207  46.4     -1 104.
3 unknown     14344  1.31     -1  36.3

  contact by previous
# A tibble: 3 x 5
  contact      n   mean median    sd
  <fct>     <int> <dbl>  <dbl> <dbl>
1 cellular    32181 0.800     0  2.64
2 telephone   3207  0.819     0  2.45
3 unknown     14344  0.0229    0  0.497

month by age
# A tibble: 12 x 5
  month      n   mean median    sd
  <fct> <int> <dbl>  <dbl> <dbl>
1 jan       1551  40.6     38 11.7
2 feb       2871  40.9     38 11.7
3 mar        526  43.3     38 16.1
4 apr       3225  39.8     37 11.0
5 may      15164  38.9     37  9.36
6 jun       5872  42.4     41  9.91
7 jul       7601  41.0     40 10.4
8 aug       6880  42.9     42 10.5
9 sep        631  43.6     38 16.5
10 oct      818   46.1     43 15.9
11 nov      4359  42.1     40  9.57
12 dec       234  44.3     39 16.3

```

```

month by balance
# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan     1551  40.6    38 11.7
2 feb     2871  40.9    38 11.7
3 mar      526  43.3    38 16.1
4 apr     3225  39.8    37 11.0
5 may    15164  38.9    37 9.36
6 jun     5872  42.4    41 9.91
7 jul     7601  41.0    40 10.4
8 aug     6880  42.9    42 10.5
9 sep      631  43.6    38 16.5
10 oct     818  46.1    43 15.9
11 nov    4359  42.1    40 9.57
12 dec     234  44.3    39 16.3

month by day
# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan     1551  27.5    29  4.40
2 feb     2871  6.37     4  5.73
3 mar      526  14.1    12  9.36
4 apr     3225  17.3    17  7.10
5 may    15164  15.5    14  7.67
6 jun     5872  11.4    11  7.57
7 jul     7601  18.7    18  8.69
8 aug     6880  16.4    17.5 7.96
9 sep      631  11.9     9  8.39
10 oct     818  17.8    19  8.12
11 nov    4359  18.4    19  3.43
12 dec     234  14.6    14  8.73

month by duration
# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan     1551  268.   193  270.
2 feb     2871  249.   172  259.
3 mar      526  240.   186.  232.
4 apr     3225  298.   224  260.
5 may    15164  262.   191  247.

```

```

6 jun      5872   244.    164    267.
7 jul      7601   268.    181    266.
8 aug      6880   233.    156    243.
9 sep       631    286.    222    255.
10 oct     818    287.    209    302.
11 nov     4359   255.    169    269.
12 dec      234    337.    268    291.

```

```

month by campaign
# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan     1551  1.68     1  0.977
2 feb     2871  2.37     2  2.02
3 mar      526   2.25     2  2.12
4 apr     3225  1.95     1  1.47
5 may    15164  2.45     2  2.47
6 jun      5872  3.14     2  3.91
7 jul     7601  3.54     2  4.29
8 aug     6880  3.93     3  3.75
9 sep      631   1.75     1  1.32
10 oct     818   1.53     1  0.896
11 nov     4359  1.92     1  1.39
12 dec      234   2.17     2  1.60

```

```

month by pdays
# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan     1551  68.7    -1  106.
2 feb     2871  68.6    -1  107.
3 mar      526   69.1    -1  113.
4 apr     3225  95.1    -1  136.
5 may    15164  52.3    -1  120.
6 jun      5872   9.18   -1  52.4
7 jul     7601   7.98   -1  54.3
8 aug     6880   13.3   -1  61.3
9 sep      631  112.     79  168.
10 oct     818   84.3   -1  133.
11 nov     4359   42.8   -1  75.9
12 dec      234  110.    126. 107.

```

```
month by previous
```

```

# A tibble: 12 x 5
  month     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 jan      1551  1.18     0  3.11
2 feb      2871  1.17     0  5.63
3 mar       526  1.16     0  2.37
4 apr      3225  1.04     0  2.16
5 may     15164  0.588    0  1.97
6 jun      5872  0.194    0  1.15
7 jul      7601  0.126    0  1.03
8 aug      6880  0.275    0  1.31
9 sep       631  1.86     1  3.06
10 oct      818  1.56     0  2.80
11 nov     4359  0.860    0  2.09
12 dec      234  1.82     1  3.49

poutcome by age
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 failure    5391  40.9     38 10.5
2 other      2037  39.8     37 11.0
3 success    1640  43.1     39 14.3
4 unknown   40664  40.9     39 10.4

poutcome by balance
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 failure    5391  40.9     38 10.5
2 other      2037  39.8     37 11.0
3 success    1640  43.1     39 14.3
4 unknown   40664  40.9     39 10.4

poutcome by day
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct> <int> <dbl> <dbl> <dbl>
1 failure    5391  14.2     14  7.66
2 other      2037  14.5     15  8.16
3 success    1640  14.5     13  8.41
4 unknown   40664  16.2     17  8.37

```

```

poutcome by duration
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct>   <int>  <dbl>  <dbl> <dbl>
1 failure    5391  245.    177  228.
2 other      2037  257.    185  249.
3 success    1640  319.    255  237.
4 unknown   40664  258.    178  262.

poutcome by campaign
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct>   <int>  <dbl>  <dbl> <dbl>
1 failure    5391  1.98     1  1.48
2 other      2037  2.45     2  1.90
3 success    1640  1.80     1  1.26
4 unknown   40664  2.93     2  3.33

poutcome by pdays
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct>   <int>  <dbl>  <dbl> <dbl>
1 failure    5391  242.    245 112.
2 other      2037  229.    222 122.
3 success    1640  163.    165 95.1
4 unknown   40664 -0.965   -1  3.60

poutcome by previous
# A tibble: 4 x 5
  poutcome     n   mean median    sd
  <fct>   <int>  <dbl>  <dbl> <dbl>
1 failure    5391  2.89     2  3.11
2 other      2037  3.95     2  7.48
3 success    1640  3.07     2  2.59
4 unknown   40664 0.000418    0  0.0452

success by age
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int>  <dbl>  <dbl> <dbl>
1 no       43922  40.9    39  10.2
2 yes      5810   41.7    38  13.5

```

```

success by balance
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  40.9     39  10.2
2 yes       5810   41.7     38  13.5

success by day
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  15.9     16  8.29
2 yes       5810   15.2     15  8.48

success by duration
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  222.    164  208.
2 yes       5810   539.    427  392.

success by campaign
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  2.85     2  3.21
2 yes       5810   2.15     2  1.94

success by pdays
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  36.4     -1  96.7
2 yes       5810   68.7     -1 119.

success by previous
# A tibble: 2 x 5
  success     n   mean median    sd
  <fct>   <int> <dbl>  <dbl> <dbl>
1 no        43922  0.499     0  2.21
2 yes       5810   1.16     0  2.51

```