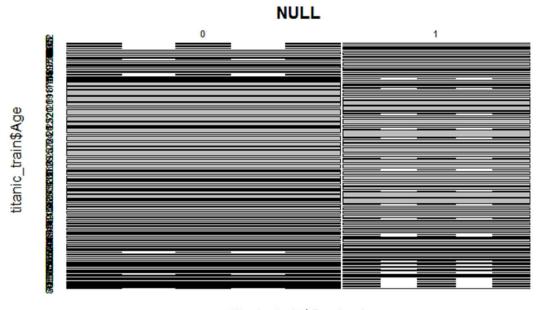
R Notebook

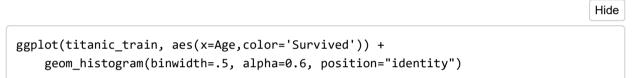
Code **▼**

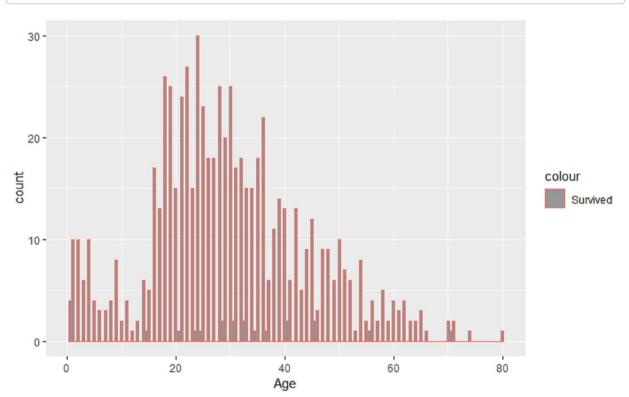
Try executing this chunk by clicking the *Run* button within the chunk or by placing your cursor inside it and pressing *Ctrl+Shift+Enter*. Add a new chunk by clicking the *Insert Chunk* button on the toolbar or by pressing *Ctrl+Alt+I*.

```
Hide
#install.packages("titanic")
library(titanic)
data(titanic_train)
View(titanic_train)
                                                                                         Hide
#remove and transform data
titanic_train$PassengerId<-NULL</pre>
titanic_train$Name<-NULL</pre>
titanic_train$Ticket<-NULL</pre>
titanic_train$Cabin<-NULL
titanic_train$Fare<-log(titanic_train$Fare)</pre>
NaNs produced
                                                                                         Hide
View(titanic_train)
                                                                                         Hide
#plots for 3 pairs of variables
titanic1<- as.data.frame(titanic_train)</pre>
library(GGally)
#Age Survived
mosaicplot(titanic train$Survived~titanic train$Age)
```

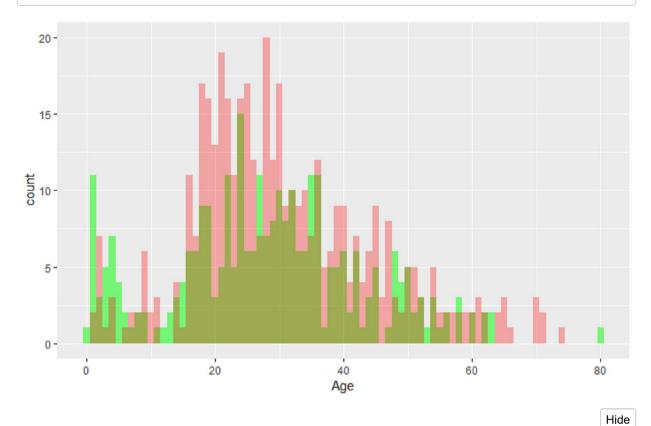


titanic_train\$Survived

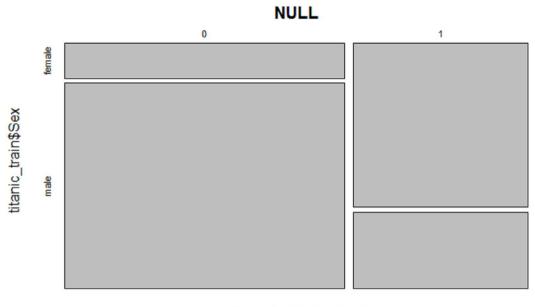




```
# Change histogram plot fill colors by if survived
cond <- titanic_train$Survived == 1
ggplot(titanic_train, aes(x=Age)) +
geom_histogram(data=subset(titanic_train,cond==TRUE),binwidth=1,fill="green",alpha=.
5) +
    geom_histogram(data=subset(titanic_train,cond==FALSE),binwidth=1,fill="red",alpha
=.3)</pre>
```

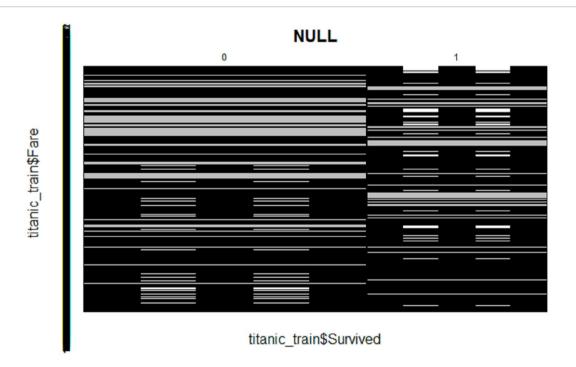


#Sex Survived
mosaicplot(titanic_train\$Survived~titanic_train\$Sex)



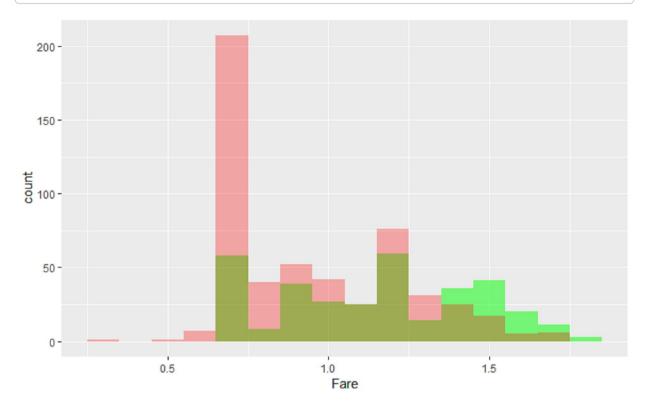
titanic_train\$Survived

#Fare Survived
mosaicplot(titanic_train\$Survived~titanic_train\$Fare)



Hide

```
# Change histogram plot fill colors by if survived
cond <- titanic_train$Survived == 1
ggplot(titanic_train, aes(x=Fare)) +
geom_histogram(data=subset(titanic_train,cond==TRUE),binwidth=0.1,fill="green",alpha
=.5) +
    geom_histogram(data=subset(titanic_train,cond==FALSE),binwidth=0.1,fill="red",alph
a=.3)</pre>
```



```
#create a model matrix
#matrix only contains numbers, convert a data frame into numeric
#remove Survived variable
titanic2 <- model.matrix(~Pclass+Age+SibSp+Parch+Fare, data=titanic1)
#delete rows with inf values
titanic2[is.infinite(titanic2)] <- NA
titanic2 <- na.omit(titanic2)
#turn into list titanic2<- split(titanic2, rep(1:ncol(titanic2), each = nrow(titanic2)))</pre>
```

Hide

titanicpca

```
Standard deviations (1, .., p=5):
[1] 1.4030982 1.3011731 0.8197669 0.7486194 0.3252923
Rotation (n \times k) = (5 \times 5):
          PC1
                           PC3
                                    PC4
                                              PC5
                   PC2
Pclass -0.5875243  0.34802286 -0.2622727  0.2095212  0.64885217
      0.1786743 -0.56484574 -0.5560489 0.5805830 0.05251396
Age
SibSp
      0.2542585   0.56541730   0.2373679   0.7180822   -0.20897428
      Parch
      Fare
```

Age and EmbarkedqQ are chosen.

Hide

```
#NMF rank 2
#install.packages("NMF")
library(NMF)
#W (u x k) and H (k x v)
#A ≈ WH
#matrix titanic2[,-1] with desired dimension k=2
#perform multiple runs of one algorithm (default is to keep only best fit)
titanicnmf <- nmf(titanic2[,-1],rank = 2,method = "snmf/r",nrun =10)
#consensusmap(titanicnmf)
#Sys.setlocale('LC_ALL','C') Chinese character not error
w <- basis(titanicnmf) # W user feature matrix matrix
h <- coef(titanicnmf)
A <- w %*% h #is matrix multiplication
dim(w)</pre>
```

```
[1] 707 2
```

Hide

```
df <- as.data.frame(w)
head(df,10)</pre>
```

	V1 <dbl></dbl>	V2 <dbl></dbl>
1	0.026214891	0.010867491
2	0.045236002	0.001064432
3	0.030988776	0.008200979
4	0.041665688	0.001493020
5	0.041695126	0.006722347
7	0.064255733	0.000000000
8	0.002395084	0.020167110

	V1 <dbl></dbl>	V2 <dbl></dbl>
9	0.032164461	0.011182300
10	0.016695727	0.008753946
11	0.004801688	0.015668638
1-10 of 10 rows		

#View(titanic2[,-1])

scaledifference <- scale(A -titanic2[,-1],scale=FALSE) ##lookingt at the sum of suqa
red difference compared to the original data and delete the smallest, why scale= FA
LSE?</pre>

squarescale <- scaledifference^2</pre>

colSums(squarescale) #since Age and EmbarkedqQ has the lowest square difference, the se two are chosen

Pclass Age SibSp Parch Fare 292.90644 15.49182 402.29678 410.24345 106.96629

Hide

summary(squarescale)

Pclass	Age	SibSp	Parch	
Fare				
Min. :0.000001 n. :0.0000007	Min. :3.200e-07	Min. : 0.000006	Min. : 0.000002	Mi
1st Qu.:0.073509 Qu.:0.0176337	1st Qu.:1.934e-03	1st Qu.: 0.039515	1st Qu.: 0.050505	1st
Median :0.308048 an :0.0666765	Median :9.391e-03	Median : 0.266784	Median : 0.196584	Medi
Mean :0.414295 n :0.1512960	Mean :2.191e-02	Mean : 0.569019	Mean : 0.580259	Mea
3rd Qu.:0.573993 Qu.:0.1861113	3rd Qu.:2.608e-02	3rd Qu.: 0.480116	3rd Qu.: 0.316182	3rd
Max. :4.185267 x. :1.3877824	Max. :3.063e-01	Max. :10.547229	Max. :24.936083	Ма

Hide

testpca

```
PC1
                        PC<sub>2</sub>
    1.5270306 -0.355528761
1
2
     1.6968861 -0.243201948
3
    3.0540012 -1.821837573
4
    1.6663424 -0.056647983
5
    3.0244464 1.342217786
6
    1.6507094 0.452632057
7
    1.4126120 -0.182962015
8
     5.7400805 0.838087437
9
    1.1421538 0.278399519
     4.4829990 1.468301201
10
12
     5.8182243 -1.539979583
13
    8.4432835 0.048374367
14
    5.5970709 -1.177478378
15
    8.0602290 -0.905901490
16
    5.2650343 0.340624550
    3.2780717 -0.755341521
17
18
    1.1776421 0.161962052
19
    1.7353312 0.542439987
20
    1.4721829 -0.769174520
21
    8.0910578 -1.218580341
22 -0.5061484 1.134732919
24
    7.8235500 0.068585242
25 12.4449864 0.883637813
26
    3.3994861 -0.302709021
27
    7.8580741 0.030547756
28
    1.1960509 0.103766016
29
    6.1220017 -1.333523585
31
    5.4375279 -0.673112735
32
    5.8299012 0.956646321
33
    4.6859022 1.527247434
35
    7.7198060 -0.250846927
    1.1482901 0.259000840
36
38
    1.5927072 0.176136161
    1.8528992 0.028155672
39
41
    3.1616584 0.083491684
43
    1.6128710 -0.607504333
44
    3.3340380 -0.557348055
45
    7.6882405 -0.840171661
46
    1.4382610 0.013996143
47
    6.1102933 -1.490789233
49
     8.4523660 -1.999056315
50
    3.8605964 0.784682544
51
    7.7335985 -0.015077205
52
    3.6296236 -0.429604708
    5.4087444 1.658803387
53
54 12.4027190 2.300314226
   5.6688222 3.693314518
56
    1.5525427 -0.374265772
57
58
    1.3574771 0.011237447
60 10.9832622 -0.971433558
61
    1.3316371 0.324086657
```

```
62
    3.4449108 -0.631994754
    1.3012765 0.283833417
63
   1.3429759 0.128391604
64
65 11.9406634 2.276050174
67
   1.3390955 0.285124904
    6.9491604 -1.540575565
68
69
   5.8471459 -0.950745136
70 12.9450087 0.989789078
71
    1.3749117 0.051049274
72
    1.3807272 0.168897229
73
   1.4873511 -0.141193286
74
   5.7500472 -0.856019835
75 10.4779383 -0.949473472
76 10.4472570 -0.852480079
78
    6.4471808 -0.677985226
79
   3.3340380 -0.557348055
    1.3749117 0.051049274
80
   3.3215302 1.979826191
81
82 11.2517390 -1.581243305
83
    5.8550419 -1.656371655
87
    1.4495483 -0.064051311
88
    1.3881507 0.286800096
    4.9153136 1.751117257
90
91
    2.9591895 0.780315933
93
    8.1377044 1.000420066
95
    5.5605011 -0.725235082
96
    1.4006623 0.012712182
97
    8.9966979 -2.011199053
98
    1.4873511 -0.141193286
99
    1.3563713 0.207281949
100 1.5722387 -0.295160262
101 7.7860423 -0.758398909
102 5.1552596 0.219226480
104 1.4068236 -0.026293868
105 2.1123518 1.546369280
106 3.8645183 -0.020798667
107 1.3588958 0.168151707
110 3.1929039 -0.111178447
111 3.8033402 -0.972702785
113 6.1474089 -1.136573684
114 1.1653443 0.259583226
115 11.2026489 -1.426053876
116 2.9995285 0.938559288
118 3.4685615 2.180929448
119 8.1261249 -1.069002278
120 5.1798047 0.141631766
121 3.5520664 0.155993584
123 7.7811687 -0.444833713
124 1.2714511 -0.109349627
126 3.3087017 0.951275058
127 1.3638447 0.129104254
129 3.4813084 -1.022916341
130 1.4617859 0.054015953
```

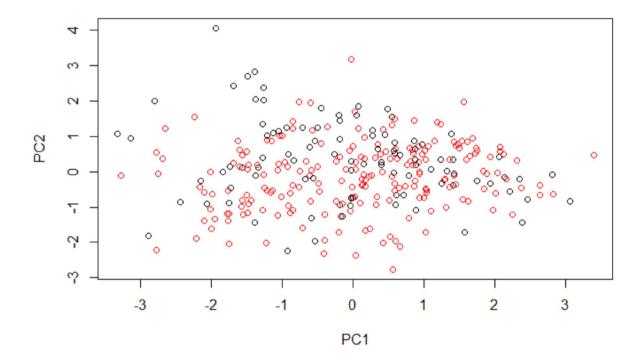
```
131 1.5599662 -0.256362905
132 6.1141338 -1.804389707
135 1.6507229 -0.684644629
136 1.4054614 0.052092520
137 1.2451410 -0.051423413
138 3.2849479 -0.402158626
139 1.4495134 0.092813310
140 8.0457414 3.606161348
141 7.3784280 4.908101500
142 9.6909769 -0.897914602
143 12.6045294 0.379272170
144 4.8950069 -0.425609436
145 5.8170171 -1.383154996
146 4.2059499 1.663407749
148 1.4372409 0.131610667
150 5.5393867 0.674368109
151 8.5427253 0.014711537
154 3.2515659 0.763884689
155 6.2240771 4.154300010
156 1.3151066 0.049006984
157 10.5128575 -0.712982291
158 1.3931889 0.090889878
159 5.8170171 -1.383154996
160 3.4097101 1.161449711
162 3.3338027 1.941028833
163 3.3712756 -0.399210611
165 3.4690359 -0.984118984
166 4.4084610 1.232614850
167 7.3611397 -1.565723291
168 5.9483606 2.755338140
170 1.6828567 0.139998231
172 1.2512773 -0.070822091
173 2.9714620 0.741518576
175 6.7797885 3.003256789
176 6.3575493 1.253495761
177 5.5883670 -0.088200174
178 7.9210402 -1.185169838
179 6.9625820 1.010284960
180 9.3932087 -1.004446408
181 3.3340380 -0.557348055
182 8.9870660 0.077587095
183 7.3805154 0.208164040
185 11.3593334 0.550762468
186 3.9317204 -0.929102263
187 4.6678765 0.400822820
188 1.9209286 1.537674571
190 3.4567634 -0.945321627
191 5.2411674 -0.052355020
193 3.2743030 1.762522930
194 3.5971576 -1.764072808
195 5.8545968 1.510835551
196 1.5159142 -0.297083694
197 9.7812316 1.283358528
```

```
198 1.3086434 0.284084990
199 2.7595981 -0.302449499
202 3.1961732 2.160843973
203 11.0647954 -0.803298196
204 5.2693910 1.527909967
205 2.7841431 -0.380044213
207 1.5099096 -0.375721655
208 2.7718706 -0.341246856
209 5.8052737 -1.030607942
210 1.4298173 0.013707800
211 3.9136085 -0.175988096
213 7.1370634 0.082335802
214 5.5602532 -1.061086307
215 3.3388139 3.075359481
216 6.8931862 -1.346404767
218 10.7980022 -0.644900097
219 11.2818610 -0.353861571
221 3.7528089 0.053684666
222 1.4249683 0.170408024
223 2.7473255 -0.263652142
224 1.3515722 0.167901611
225 6.0279191 -1.807333865
227 1.3761172 0.090306896
229 3.1031175 -0.537005504
230 3.4076732 -0.790132198
231 6.8191270 0.189127914
232 5.5592938 -0.568410495
233 1.2068062 0.759690043
235 8.3118479 -0.583577300
236 1.3563713 0.207281949
237 8.7425334 -1.549281104
238 1.1653696 0.200759409
239 3.8066023 1.085792490
240 9.3390466 -0.901447451
241 6.0752694 -1.884149800
242 6.1255898 0.069080948
243 10.1850761 -0.195233543
246 7.6088444 -0.686017156
247 4.3328395 -0.209508237
248 6.1970787 0.226230267
249 5.1798047 0.141631766
251 5.6788115 2.379217191
252 1.3768983 0.207982929
253 9.6552981 -0.067102220
254 1.7980971 0.065500684
255 1.9449432 -0.262824507
258 1.5108761 -0.101173476
259 3.1990401 -0.130577126
260 1.3454610 0.167692918
261 3.6508516 0.235297010
262 1.3686438 0.168484592
263 5.3214564 0.669083754
264 2.7472428 2.156297050
```

```
265 3.2873772 -0.558941482
270 1.5436171 0.331325589
271 8.2488503 -1.456975850
273 9.6430255 -0.028304863
276 5.0693519 0.490807981
277 2.8209607 -0.496436285
278 5.3148026 -0.285139163
279 4.7035450 0.086151465
280 2.7473255 -0.263652142
281 1.6172523 0.098541446
282 3.0250443 2.175587839
284 3.3583478 1.863434119
285 3.9174841 2.157043305
286 1.3696314 -0.419728485
288 8.4555561 0.009577010
292 1.1993305 -0.190245388
294 9.1473853 -0.544401395
295 1.9878970 -0.398615257
296 1.4420899 -0.025089557
297 6.6047413 2.407699561
299 6.9019363 -0.875508520
300 1.4668241 -0.141894265
301 1.4804588 -0.259078011
303 4.9378723 -0.452719038
304 1.6295248 0.059744089
306 6.7068476 -1.059124595
307 10.6213036 0.967583428
308 1.8671763 1.536178288
309 9.4760917 -0.611609269
310 3.2754817 -0.110861393
311 1.5558896 0.292528232
312 1.1899146 0.123164695
314 1.5344546 -0.453316369
315 9.7071598 -1.760123948
316 1.2840696 0.322462272
317 10.1808469 -1.225648794
318 2.7105079 -0.147260070
319 1.4422790 -0.064299551
320 5.8053562 1.034241035
321 1.4068236 -0.026293868
322 1.2280616 0.006818018
323 3.2849479 -0.402158626
324 5.7065643 -1.033978781
325 10.5252703 -1.104722940
326 1.1461007 0.082452033
327 6.5184726 2.010431251
328 8.3661276 -1.452970934
329 5.1798047 0.141631766
330 3.2235852 -0.208171840
331 6.6266170 -0.031458776
332 6.0366580 -1.258005090
334 3.5542914 1.477960885
335 1.4543624 -0.063886914
```

```
336 5.6218638 -0.919221868
337 3.3585831 -0.634942769
338 2.0944961 0.606722417
339 5.2971234 -0.294228154
341 2.6982354 -0.108462713
342 1.4221165 -0.261070349
344 13.1312875 -1.201168979
346 1.2470243 0.360413661
347 3.2849479 -0.402158626
348 1.3876045 -0.497547625
349 3.3467305 -0.321615896
350 4.4432923 -0.558684451
351 8.1906817 -0.860072417
352 2.7841431 -0.380044213
353 7.1493359 0.043538445
354 8.2158099 0.580326371
355 4.2829949 2.800964670
356 5.8673144 -1.695169012
357 8.0853068 -0.778910481
360 3.3139530 0.478699167
361 9.1525355 6.582407854
362 6.2730594 0.934721105
363 4.4432923 -0.558684451
364 1.6663424 -0.056647983
365 7.5651367 -0.060046480
368 5.0864979 0.256229578
369 8.0431168 -0.865111628
370 3.4680112 -0.513556536
371 3.2156682 0.388289866
372 9.3934259 -0.829642801
374 3.5058535 -1.100511055
375 9.1596579 -0.583198752
376 11.0937151 -1.320609773
377 2.1500302 1.349415921
378 2.9431430 -0.217748693
379 7.4244771 -1.838075546
380 6.1258968 4.464678868
382 1.4372758 -0.025253954
384 3.2584625 0.908185202
386 7.9089966 1.550260300
387 1.3822786 0.051300847
388 3.6653964 -1.604876699
389 1.3380941 0.167441346
390 4.6072071 3.217195051
391 8.4635359 -0.547666098
392 7.1777039 -1.129963436
393 4.1315062 1.695912304
394 3.0541389 -1.233586071
395 4.9903290 2.328299897
396 7.6599633 0.217706938
397 1.2223610 0.045839801
398 9.0105074 -0.352993390
399 1.3577335 0.128895561
```

```
400
    1.4558851 -0.220700729
401 9.8468091 -0.774943712
402 4.8017253 -0.224227393
403 7.7608485 0.027227587
404 6.8214479 -0.368443234
405 6.2005242 -0.812542955
406 3.3582515 -0.164356651
407
    3.0321233 0.303589060
408 11.2818610 -0.353861571
410 3.0526575 2.088293785
412 8.8206077 -0.487770694
413 1.4313687 -0.103888582
415 9.0086551 -1.156514012
416 1.4003127 -0.516721878
```



logpca_cv = cv.lpca(data1, ks = 2, ms = 1:10)

Algorithm stopped because deviance increased.

This should not happen!NaNs producedNaNs producedAlgorithm stopped because deviance increased.

This should not happen!NaNs producedAlgorithm stopped because deviance increased.

This should not happen!NaNs producedNaNs producedAlgorithm stopped because deviance increased.

This should not happen!NaNs producedNaNs pro