Correlation

Pradeep Paladugula

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Title: Big Data Analytics Services for Enhancing Business Intelligence

Abstract: This article examines how to use big data analytics services to enhance business intelligence (BI). More specifically, this article proposes an ontology of big data analytics and presents a big data analytics service-oriented architecture (BASOA), and then applies BASOA to BI, where our surveyed data analysis shows that the proposed BASOA is viable for enhancing BI and enterprise information systems. This article also explores temporality, expectability, and relativity as the characteristics of intelligence in BI. These characteristics are what customers and decision makers expect from BI in terms of systems, products, and services of organizations. The proposed approach in this article might facilitate the research and development of business analytics, big data analytics, and BI as well as big data science and big data computing.

Dataset:

data <- read.csv('07 data.csv')</pre>

- Gender of the participant surveyed on these topics
- Temporality: an average score of the rated ability to adapt to change over time 1 (not changing) to 7 (changing a lot)
- Expectability: a rated degree of satisfaction with the BI
- Relativity: average score rating of how much better one system is than another in BI 1 (not very good) to 7 (very good)
- Positive emotion: how positive participants felt about BI (higher scores are more positive, ranges from 1 to 7).

summary(data)

## gender	temporality	expectability	relativity	positive
## men :150	Min. :1.737	Min. :0.000	Min. :-2.301	Min. :-
0.9128				
## women:150	1st Qu.:2.823	1st Qu.:2.000	1st Qu.: 2.439	1st Qu.:
2.0175				
##	Median :3.581	Median :3.000	Median : 3.564	Median :
3.0780				
##	Mean :3.532	Mean :3.643	Mean : 3.569	Mean :
3.1446				
##	3rd Qu.:4.225	3rd Qu.:5.000	3rd Qu.: 4.731	3rd Qu.:
4.2614				
##	Max. :5.184	Max. :9.000	Max. :10.508	Max. :

```
8.2126
## NA's :9 NA's :9 NA's :9
```

Data Screening:

Accuracy:

- a. Include output that indicates if the data are or are not accurate.
- b. If the data are not accurate, delete the inaccurate scores.
- c. Include a summary that shows that you fixed the inaccurate scores.

data\$temporality[data\$temporality < 1 | data\$temporality > 7] = NA

Mean

Max.

NA's

```
data$relativity[data$relativity < 1 | data$relativity > 7] = NA
data$positive[data$positive < 1 | data$positive > 7] = NA
summary(data)
                                                                     positive
##
      gender
                 temporality
                                 expectability
                                                   relativity
##
    men :150
                Min.
                       :1.737
                                 Min.
                                        :0.000
                                                 Min.
                                                        :1.065
                                                                  Min.
                                                                         :1.053
                1st Qu.:2.823
                                 1st Qu.:2.000
                                                 1st Qu.:2.625
##
    women:150
                                                                  1st Qu.:2.337
##
                Median :3.581
                                 Median :3.000
                                                 Median :3.618
                                                                  Median :3.250
```

3rd Qu.:5.000

:3.643

:9.000

:9

Mean

Max.

NA's

:3.650

:6.952

:44

3rd Qu.:4.676

Mean

Max.

NA's

:3.423

:6.918

:41

3rd Qu.:4.396

Missing:

##

##

##

##

a. Since any accuracy errors will create more than 5% missing data, exclude all data pairwise for the rest of the analyses.

```
cleanData <- na.omit(data)</pre>
summary(cleanData)
##
                                expectability
      gender
                 temporality
                                                  relativity
                                                                   positive
    men :107
                Min.
                       :1.737
                                Min.
                                       :0.00
                                                Min.
                                                      :1.065
                                                                Min.
                                                                      :1.053
    women:100
                1st Qu.:2.865
                                1st Qu.:2.00
                                                1st Qu.:2.634
                                                                1st Qu.:2.284
##
##
                Median :3.522
                                Median :3.00
                                                Median :3.591
                                                                Median :3.193
##
                Mean
                       :3.511
                                Mean
                                        :3.57
                                                Mean
                                                       :3.661
                                                                Mean
                                                                       :3.395
##
                3rd Qu.:4.188
                                3rd Qu.:5.00
                                                3rd Qu.:4.684
                                                                3rd Qu.:4.378
##
                Max. :5.102
                                Max. :8.00
                                                Max. :6.952
                                                                Max. :6.918
```

Outliers:

- a. Include a summary of your mahal scores.
- b. What are the df for your Mahalanobis cutoff?
- c. What is the cut off score for your Mahalanobis measure?
- d. How many outliers did you have?

Mean

Max.

NA's

:3.532

:5.184

3rd Qu.:4.225

:9

```
noMiss <- cleanData[,-c(1)]
mahalScores = mahalanobis(noMiss, colMeans(noMiss, na.rm = TRUE), cov(noMiss,
use = "pairwise.complete.obs"))
mahalScores</pre>
```

## 9	3	4	5	6	7	8	
## 4.999		7.7528981	3.4928848	2.8482000	2.1121758	9.0196110	
2.7785428 ##	12	13	16	17	18	19	
20 ## 4.015	1669	9.6081393	8.1755024	5.2475559	11.2900110	2.9232378	
3.3700619 ##	22	24	28	29	30	31	
## 32	22	24	20	29	30	21	
## 9.429 2.2227511		7.9294934	2.4968146	3.6749320	4.2856946	8.3638500	
## 43	34	37	38	39	40	42	
## 6.799		1.3100589	0.3517478	8.6130777	9.9905082	3.6773014	
6.1931893 ##	44	45	46	49	50	51	
52 ## 3.449	4180	3.5773830	0.8675374	0.3334311	3.6147266	9.3815495	
3.3335206							
## 63	53	55	56	59	60	62	
## 2.432 0.5204975		3.2579986	1.8985941	2.3810604	5.9115020	8.6528501	
##	64	65	67	68	69	70	
71 ## 2.887	0370	3.7149859	1.9060051	1.7955915	6.8169888	0.8373976	
5.8860736 ##	73	74	75	76	77	78	
81		, ,					
## 5.987 1.7554671		3.7436519	1.2377745	3.6873824	3.6379470	6.1606333	
## 97	82	83	85	86	88	90	
## 6.580 2.4839408		8.4432518	4.3106671	1.7894347	5.7204345	4.1863734	
##	98	100	101	102	104	105	
106 ## 4.469	7295	5.1250418	2.4749193	2.2301882	4.0613730	4.1151160	
4.6082655 ##	107	108	110	112	113	114	
116 ## 2.775	0276	4 1520765	0 1005076	2 5660510	2 9007152	4 6294445	
1.8070772		4.1529705	8.1095076	3.3000310	3.8097153	4.6284445	
## 127	118	119	121	122	124	126	
		5.7619392	4.1070443	3.4844882	4.5348788	3.9246492	
## 137	129	130	131	132	133	135	
13/							

## 2.4983191 4.6863715	4.4431081	5.7777735	2.3261948	1.2202746	3.2217760
## 139	142	143	144	146	147
148 ## 5.8057381	5.4417299	1.6583857	1.9234562	2.3883633	8.5028548
2.3913462 ## 149	150	151	152	153	154
155 ## 1.9439762	1.7205863	6.3168498	1.4229752	5.7672969	1.7062730
6.9954663					
## 157 164	158	159	160	162	163
## 6.3092421 4.6798505	1.5238410	8.5513133	2.9414767	1.4604493	1.5367560
## 166 175	167	171	172	173	174
## 1.2078748	10.1958360	2.6983768	0.1628773	0.9232773	1.9758751
5.3312994 ## 178	179	180	181	182	183
184 ## 2.3860644	1.9442042	3.7431914	2.6740206	3.0777747	5.3991064
7.5768331	100	100	101	101	405
## 187 196	188	190	191	194	195
## 3.1434331	1.2793994	3.9667099	7.4172474	2.7536696	3.2561614
5.7222224 ## 198	199	201	202	203	204
206					
## 2.2749307 4.9542651	4.7663118	3.2205634	5.6399895	2.9426663	1.4221475
## 207	208	209	210	212	213
216					
## 0.5290791 1.0298209	2.3579975	5.5376682	2.6545010	5.6929771	2.7118265
## 217 224	218	220	221	222	223
## 5.0186512	3.0412746	1.1129561	6.9554058	10.5638923	4.1655858
2.1790288 ## 225	226	227	229	230	231
232 ## 2.2113229	2.1417774	1.8637116	3.6151409	4.9296574	0.9738669
3.5685284					
## 233 241	234	235	236	239	240
## 1.5043300 3.9180309	2.7375489	3.8930982	4.8382047	3.5167003	3.5008299
## 244	246	248	249	250	251
252	4 2154217	2 6070215	2 0742002	F F070317	7 6045754
## 3.6101413 1.3583994	4.313421/	2.09/8315	2.9/42802	5.30/921/	7.6045754

```
##
          255
                      256
                                  257
                                              258
                                                          259
                                                                     260
261
## 3.3696235
                3.5574126
                           1.7051520
                                       3.7657469
                                                   2.5077374 4.7538616
3.6087123
##
          262
                      263
                                  265
                                              268
                                                          269
                                                                     270
271
                3.8043452
                           2.2711964
                                       2.9097699
                                                   3.2509074
                                                               2.4744362
   2.3318945
3.1190776
##
          274
                      275
                                  276
                                              278
                                                          279
                                                                     280
282
                4.7214993
                           5.0006462
## 4.1625853
                                       5.1647829
                                                   0.4777734
                                                               1.4532629
1.8331003
##
          283
                      286
                                  287
                                                          289
                                                                     290
                                              288
292
   0.7790014
               6.9994368
                           6.0580823
                                       6.6685918
                                                   3.3198625
                                                             1.2496108
4.6216365
##
          294
                      295
                                  296
                                              298
##
   2.4496549 4.7525092
                           6.5243098
                                       2.3416289
cutOff <- qchisq(1-.001, ncol(noMiss))</pre>
cut0ff
## [1] 18.46683
summary(mahalScores < cutOff)</pre>
##
      Mode
               TRUE
## logical
                207
noOut <- subset(cleanData, mahalScores < cutOff)</pre>
no0ut
##
       gender temporality expectability relativity positive
## 3
        women
                  4.586402
                                        3
                                             2.572868 1.223659
                                             1.347142 1.795185
## 4
        women
                  4.331763
                                        1
## 5
                  4.259832
                                        2
                                             2.446816 2.202066
        women
## 6
                  4.660960
                                        5
                                             3.775775 2.552891
        women
## 7
                                        5
                                             5.454099 3.019725
        women
                  4.036579
## 8
                  4.530757
                                        0
                                             4.198125 2.614516
        women
## 9
                                        5
                  3.208714
                                             2.967409 4.861072
        women
## 12
        women
                  4.165093
                                        6
                                             4.306817 4.648106
## 13
                  3.238961
                                        0
                                             4.171403 5.985619
        women
## 16
        women
                  4.571096
                                        5
                                             1.432909 1.774882
## 17
                                        7
                                             3.970333 2.305769
        women
                  3.982522
## 18
                  4.938608
                                        0
                                             4.389296 2.700692
        women
                                        5
## 19
        women
                  4.549474
                                             3.377292 2.378240
## 20
                                        5
        women
                  4.369895
                                             4.693000 1.380504
## 22
                                        7
                                             3.414720 1.606853
        women
                  5.102181
## 24
                                        2
                                             6.226048 4.115312
        women
                  4.386829
## 28
                                        3
                                             5.044878 3.939312
        women
                  4.172433
                                        5
## 29
                  3.956321
                                             3.369465 1.156475
        women
```

##	30	women	4.711761	2	3.904243 2.516802
##		women	4.453575	3	6.823700 1.903434
##		women	3.902674	3	5.126074 2.473248
##		women	3.774439	5	6.890952 1.996212
##		women	3.756984	5	4.735555 2.660313
##		women	3.580643	4	3.427767 2.766761
##		women	4.880203	5	1.708481 3.702972
##		women	4.497580	8	5.794069 1.332978
##		women	3.357322	3	2.929358 1.053080
##		women	4.489371	1	4.012190 4.108021
##		women	4.510224	6	4.307027 3.368739
##		women	4.107657	6	4.572920 1.766861
##		women	3.532016	5	4.294086 3.482421
##		women	3.697138	3	3.931719 3.546228
##		women	4.429213	2	3.470736 1.941459
##		women	4.501909	0	2.048414 4.014267
##		women	3.827140	2	5.053673 2.672276
##		women	4.017592	6	4.237871 3.008700
##		women	4.575270	3	5.000347 2.568674
##		women	4.351336	4	5.061722 2.861471
##		women	3.942428	2	3.759540 2.082552
##		women	3.677005	2	5.420026 5.265431
##		women	4.814168	6	2.093971 1.992358
##		women	3.923024	3	3.638681 3.072078
##		women	4.230702	3	5.229934 2.386120
##		women	4.304208	6 5	4.446851 4.264415
##		women	4.161915		3.176782 3.078182 3.154534 3.717381
## ##		women	3.965989	2	3.154534 3.717381
##		women	3.625076	5	3.567371 6.496277 4.262741 3.502236
##		women	3.687233	3	5.849361 3.078863
##		women women	4.847632 4.478682	1	3.302405 1.780330
##		women	4.379877	3	3.479904 4.891106
##		women	4.196348	3	3.940425 2.645100
##		women	4.850326	3	4.403256 2.836303
##		women	4.534421	3	2.627935 1.929732
##		women	3.751175	7	2.983053 3.529162
##		women	3.664787	5	4.769536 4.388264
##		women	4.825495	6	2.832920 3.352723
##		women	4.796455	4	1.601453 4.412049
##		women	4.317156	3	2.636163 1.119419
##		women	3.994235	4	3.611095 1.663199
##		women	3.611191	5	1.334881 4.056140
##		women	3.944988	6	4.291311 4.961690
##		women	4.219107	3	2.589417 3.997488
##		women	4.269762	6	5.605873 1.819293
	100	women	4.450653	4	3.438885 5.382597
	101	women	3.930155	6	4.812154 3.020127
	102	women	4.064349	3	4.853484 2.164687
	104	women	3.854926	1	4.018477 2.433384
	'			_	

```
## 105
        women
                  3.769718
                                         4
                                              5.294288 5.446013
## 106
        women
                  3.722240
                                         6
                                              6.140299 3.965083
## 107
                                         6
                                              4.772485 3.192741
        women
                  4.241797
                                         2
## 108
                  4.328969
                                              3.879007 4.646513
        women
## 110
        women
                  4.743356
                                         1
                                              1.771300 2.589870
## 112
                                         6
                                              4.553060 2.942572
                  4.602453
        women
## 113
        women
                  3.747071
                                         3
                                              5.952156 3.062766
## 114
        women
                  4.458603
                                         4
                                              6.146362 2.246621
## 116
                  3.699054
                                         4
                                              5.403625 3.818490
        women
                                         8
## 118
                  4.406552
                                              6.952331 2.437226
        women
## 119
                                         6
        women
                  4.179697
                                              2.852232 1.400704
## 121
                  4.052246
                                         2
                                              1.668263 2.358009
        women
                                         4
## 122
                  3.520630
                                              5.317935 5.238084
        women
## 124
                                         1
                                              1.731494 2.586268
        women
                  3.803345
## 126
                  3.637311
                                         1
                                              2.632513 2.028701
        women
## 127
                                         5
        women
                  4.940459
                                              4.825002 4.469485
## 129
                  4.533000
                                         4
                                              5.122298 2.694319
        women
## 130
        women
                  3.915179
                                         6
                                              6.203989 3.148667
## 131
                                         2
                                              5.324121 1.846499
        women
                  4.437800
## 132
                                         2
                  4.201867
                                              3.033992 3.108088
        women
## 133
                  3.370932
                                         4
                                              4.925695 2.921602
        women
## 135
                                         5
                                              4.943528 1.438993
                  3.837700
        women
        women
## 137
                  3.927346
                                         6
                                              5.796859 1.865389
                                         2
                                              1.414181 3.492809
## 139
        women
                  4.386522
## 142
                  4.307427
                                         7
                                              5.113893 2.161609
        women
## 143
                  4.320685
                                         4
                                              4.713258 3.690872
        women
## 144
                                         5
        women
                  4.210081
                                              3.455504 3.674238
## 146
        women
                  4.409023
                                         3
                                              4.286366 3.954879
                                         8
## 147
                  3.927122
                                              4.289237 2.033583
        women
                                              2.375924 2.846238
## 148
                                         3
        women
                  4.238844
## 149
                  3.507742
                                         5
                                              2.726591 3.761112
        women
                                         3
                                              2.452957 2.200834
## 150
        women
                  3.713487
## 151
                                         2
                                              5.294903 3.772522
           men
                  2.336727
## 152
           men
                  2.726785
                                         3
                                              3.069251 4.496115
## 153
           men
                  3.106870
                                         3
                                              1.520510 1.180436
                                         3
## 154
                                              2.857508 3.847856
           men
                  2.534931
## 155
           men
                  3.815084
                                         2
                                              6.271164 2.500474
                                         4
## 157
                  1.989499
                                              4.668152 2.936548
           men
## 158
                                              3.093465 4.529629
           men
                  2.690661
                                         3
## 159
           men
                  2.793906
                                         6
                                              5.175555 6.302868
                                         2
## 160
                  3.100414
                                              2.054146 2.179032
           men
## 162
                                         5
                                              4.675207 3.505386
           men
                  3.225676
## 163
                  3.396440
                                         4
                                              2.356302 2.766210
           men
## 164
           men
                  2.237072
                                         3
                                              2.507146 2.242218
                                         4
## 166
                  2.956398
                                              3.387720 2.719957
           men
## 167
                  2.128099
                                         0
                                              2.504722 1.623457
           men
                                         3
                                              3.849424 5.523582
## 171
                  3.409561
           men
## 172
                  3.521942
                                         3
                                              3.334153 3.498738
           men
## 173
                  3.591058
                                         4
                                              4.358191 2.316429
           men
## 174
                                              3.794276 5.188459
           men
                  3.074163
```

##	175	men	2.786789	3	1.484051 5.677937
##	178	men	3.068317	4	5.371776 3.528376
##	179	men	3.556170	5	5.361251 3.249898
	180	men	2.392952	2	3.695500 5.093878
	181	men	2.816046	2	2.237057 2.545074
		men	3.168144	3	3.860453 5.712322
	183	men	3.300704	3	1.168180 1.607464
	184	men	2.061124	6	3.112401 3.968311
	187	men	3.444325	5	5.115539 1.845404
	188	men	3.050001	4	4.664999 3.232131
	190	men	3.991960	3	2.512196 5.232465
	191	men	2.612402	1	1.197637 1.666395
		men	2.816316	2	1.739012 4.215709
	195	men	3.221441	3	3.527149 5.813175
	196	men	2.238792	4	5.359369 3.461063
	198	men	3.326545	3	2.307952 1.969035
	199	men	2.728919	2	1.065340 4.761410
		men	3.009388	2	1.754372 2.372983
	202	men	1.822843	3	2.431565 3.109280
	203	men	2.365260	3	4.251906 3.829847
	204	men	4.018225	4	3.624222 4.416546
	206	men	2.559531	2	1.322553 2.396667
	207	men	3.069821	4	3.408699 3.415337
	208	men	2.932070	3	2.510986 2.133501
	209	men	2.900932	4	5.919196 2.226729
	210	men	2.408588	3	2.702978 2.996351
	212	men	2.599196	3	1.478144 1.765139
	213	men	2.893652	5	4.982687 3.327594
	216	men	2.828903	4	3.584666 3.443160
	217	men	2.693676	5	3.019242 1.746532
	218	men	2.653215	3	1.616944 4.095464
		men	3.415689	3	2.693594 2.419690
		men	3.034004	3	2.945140 6.917850
	222	men	1.737005	2	1.166226 1.729102
	223	men	3.330804	3	4.492552 5.908982
	224	men	3.434845	3	3.564123 5.313472
	225	men	2.500352	3	3.361036 2.953067
		men	2.861364	4	2.884833 4.930289
	227	men	3.477868	4	5.004304 2.261938
		men	2.673674	2	4.475379 2.856397
##	230	men	2.579059	5	4.132823 5.673863
	231	men	2.976619	3	3.077592 4.450620
	232	men	2.319537	4	4.320963 3.221564
	233	men	2.581890	3	3.097525 3.995890
	234	men	2.708071	2	1.763934 3.899858
	235	men	2.775622	2	3.807071 5.604616
		men	2.898672	1	1.443664 2.470409
##	239	men	2.870655	2	4.725485 4.632785
	240	men	2.422825	5	3.636333 3.527521
##	241	men	2.480026	2	2.362665 5.384554

```
3.999557 2.006255
## 244
           men
                  2.623366
## 246
           men
                  2.217544
                                         2
                                             3.182469 2.660570
## 248
                  2.755291
                                             4.807695 3.077961
           men
                                         3
## 249
                  3.532593
                                         6
                                             3.262747 3.423234
           men
## 250
           men
                  2.499757
                                         5
                                             4.448056 1.972448
                  3.204959
## 251
                                         4
                                             1.550434 6.255282
           men
## 252
           men
                  3.356991
                                         3
                                             3.129086 2.057760
## 255
           men
                  2.907395
                                         4
                                             5.579760 4.059044
## 256
                  3.627211
                                         5
                                             2.330340 4.558613
           men
## 257
                                             2.690931 4.436595
                  2.889013
                                         4
           men
## 258
                                         4
                                             3.511552 5.936271
           men
                  3.388204
## 259
                  2.567475
                                         4
                                             2.650998 3.075368
           men
## 260
                                         5
                  3.449674
                                             3.424650 5.920239
           men
## 261
                  2.757023
                                         2
                                             2.867790 1.880720
           men
## 262
                  2.476768
                                         2
                                             3.108310 3.861350
           men
## 263
                                         4
                                             1.534532 4.294841
           men
                  2.836130
## 265
                  2.868961
                                         5
                                             3.992758 4.494895
           men
## 268
                  3.143223
                                         1
                                             3.542089 3.165685
           men
## 269
                                         2
                                             4.202921 5.218222
           men
                  3.085682
## 270
                                         3
                  3.355050
                                             2.218999 4.954981
           men
                                         2
## 271
                  2.911627
                                             1.446835 4.038551
           men
                                             3.868879 5.760789
## 274
                                         2
                  2.905948
           men
## 275
                  2.905350
                                         2
                                             2.164807 5.869336
           men
## 276
                                         3
           men
                  2.703809
                                             1.410999 2.005636
## 278
                  3.325057
                                         2
                                             4.459036 1.151065
          men
## 279
           men
                  3.472604
                                         4
                                             3.744902 4.233559
## 280
                                         5
           men
                  3.817198
                                             3.475110 4.035084
## 282
           men
                  2.519300
                                         3
                                             3.268659 4.368698
                                         3
## 283
                  3.481826
                                             2.510573 3.576451
           men
## 286
                                         4
                                             6.878332 2.128341
           men
                  3.621432
## 287
                                         3
                                             4.852248 6.190165
           men
                  2.672530
## 288
                                         2
           men
                  2.375195
                                             2.614499 6.507269
## 289
                  2.885393
                                         4
                                             2.232491 5.147775
           men
## 290
           men
                  3.179726
                                         4
                                             3.085760 4.639073
## 292
           men
                  2.566394
                                         5
                                             3.591400 5.539623
## 294
                  2.794594
                                         4
                                             4.190815 5.107869
           men
## 295
           men
                  2.281292
                                         2
                                             4.191726 5.108889
## 296
                  2.648135
                                         3
                                             5.229720 1.622311
           men
                  2.773299
## 298
                                             2.159914 3.692774
           men
```

Assumptions:

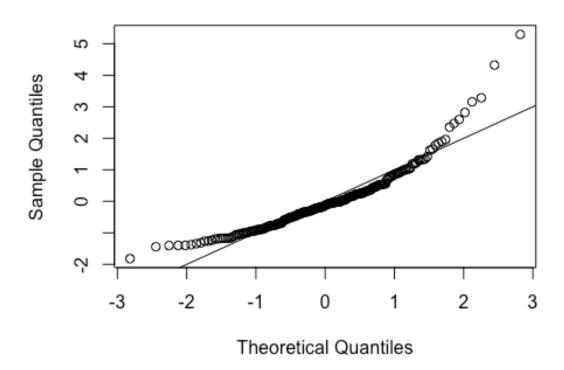
Linearity:

```
a. Include a picture that shows how you might assess multivariate linearity.b. Do you think you've met the assumption for linearity?
```

```
random = rchisq(nrow(noOut), 7)
fake = lm(random~., data = noOut)
```

```
standardized = rstudent(fake)
fitvalues = scale(fake$fitted.values)
qqnorm(standardized)
abline(0,1)
```

Normal Q-Q Plot



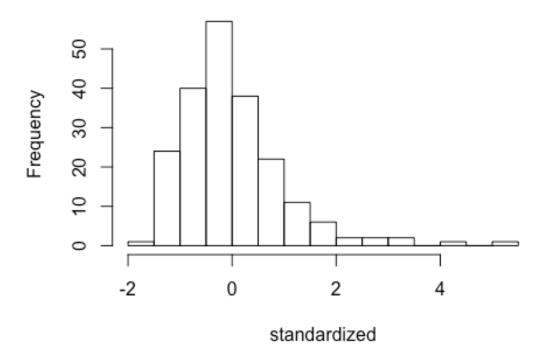
Normality:

- a. Include a picture that shows how you might assess multivariate normality.
- b. Do you think you've met the assumption for normality?

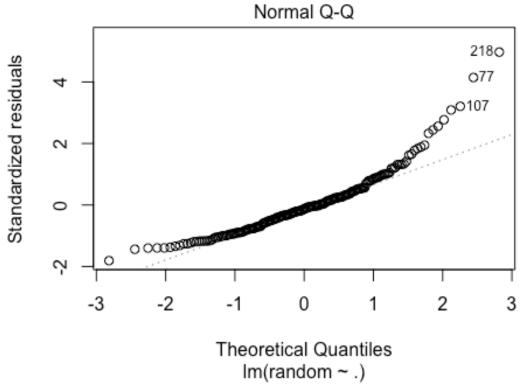
From below picture it is we can confirm that the assumption has met the normality

hist(standardized, breaks=15)

Histogram of standardized



```
library(moments)
skewness(noOut[,-c(1)], na.rm=TRUE)
     temporality expectability
##
                                   relativity
                                                   positive
                    0.27131476
##
     -0.03251117
                                   0.11609442
                                                 0.42983894
kurtosis(noOut[,-c(1)], na.rm=TRUE)
##
     temporality expectability
                                   relativity
                                                   positive
##
        2.001327
                      2.894151
                                     2.399474
                                                   2.331996
plot(fake, 2)
```



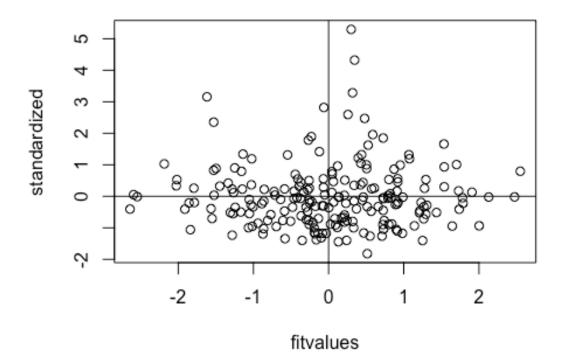
Homogeneity and Homoscedasticity:

- a. Include a picture that shows how you might assess multivariate homogeneity.
- b. Do you think you've met the assumption for homogeneity?
- c. Do you think you've met the assumption for homoscedasticity?

Both the assumption of homogeneity and homoscedasticity are met from looking at graph.

```
{plot(fitvalues, standardized)
    abline(0,0, v = 0)}
```

##



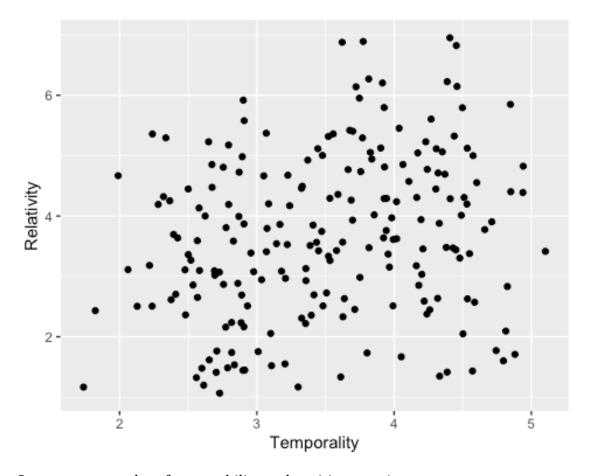
Hypothesis Testing / Graphs:

Create a scatter plot of temporality and relativity.

```
a. Be sure to check x/y axis labels and length.
b. What type of relationship do these two variables appear to have?

Positive relationship.

library(ggplot2)
scatter = ggplot(cleanData, aes(temporality, relativity))
scatter + geom_point() + xlab("Temporality") + ylab("Relativity")
```

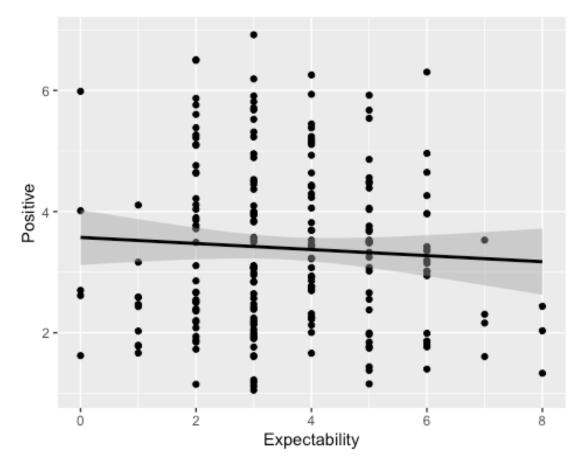


Create a scatter plot of expectability and positive emotion.

```
a. Include a linear line on the graph.
b. Be sure to check x/y axis labels and length.
c. What type of relationship do these two variables appear to have?

Expectability and Positive have no relationship.

scatter2 = ggplot(cleanData, aes(expectability, positive))
scatter2 + geom_point() + geom_smooth(method = "lm", color = "black") +
xlab("Expectability") + ylab("Positive")
```

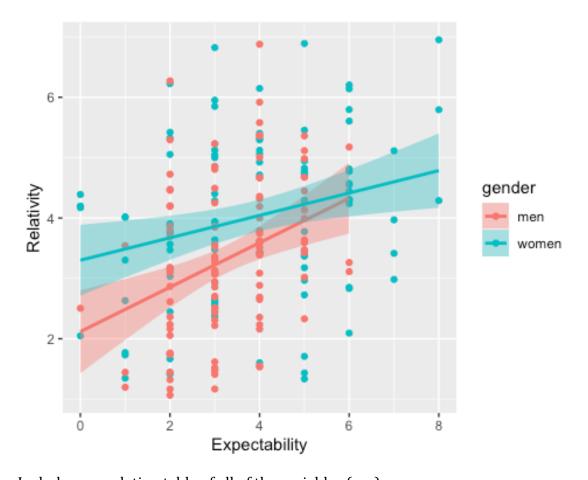


Create a scatter plot of expectability and relativity, grouping by gender.

- a. Include a linear line on the graph.
- b. Be sure to check x/y axis labels and length.
- c. What type of relationship do these two variables appear to have for each group?

Men and women has postive relationship based on the below graph.

```
scatter3 = ggplot(cleanData, aes(expectability, relativity, color = gender))
scatter3 + geom_point() + geom_smooth(method = "lm", aes(fill = gender)) +
xlab("Expectability") + ylab("Relativity")
```



Include a correlation table of all of the variables (cor).

```
Include the output for Pearson.
a.
   Include the output for Spearman.
b.
с.
   Include the output for Kendall.
   Which correlation was the strongest?
    For the correlations with gender, would point biserial or biserial be
more appropriate? Why?
cor(noMiss, use="pairwise.complete.obs", method = "pearson")
##
                 temporality expectability relativity
                                                          positive
## temporality
                   1.0000000
                                0.20209959
                                            0.22754039 -0.25275929
## expectability
                   0.2020996
                                1.00000000 0.32131190 -0.05948884
## relativity
                   0.2275404
                                0.32131190
                                            1.00000000 -0.03781882
## positive
                  -0.2527593
                               -0.05948884 -0.03781882 1.00000000
cor(noMiss, use="pairwise.complete.obs", method = "spearman")
##
                 temporality expectability relativity
                                                          positive
## temporality
                   1.0000000
                                0.18839790
                                            0.22410733 -0.25005006
## expectability
                                1.00000000
                                            0.31390642 -0.02067472
                   0.1883979
## relativity
                   0.2241073
                                0.31390642
                                            1.00000000 -0.01305998
## positive
                               -0.02067472 -0.01305998
                  -0.2500501
                                                        1.00000000
```

```
cor(noMiss, use="pairwise.complete.obs", method = "kendall")
##
                 temporality expectability relativity
                                                         positive
## temporality
                   1.0000000
                                0.14863742 0.1507903 -0.16429811
## expectability
                   0.1486374
                                1.00000000 0.2273461 -0.01704321
## relativity
                   0.1507903
                                0.22734605 1.0000000 -0.01561840
## positive
                  -0.1642981
                               -0.01704321 -0.0156184 1.00000000
```

Calculate confidence interval for temporality and relativity.

```
cor.test(cleanData$temporality, cleanData$relativity, method = "pearson")

##

## Pearson's product-moment correlation

##

## data: cleanData$temporality and cleanData$relativity

## t = 3.3456, df = 205, p-value = 0.0009763

## alternative hypothesis: true correlation is not equal to 0

## 95 percent confidence interval:

## 0.09408996 0.35295823

## sample estimates:

## cor

## 0.2275404
```

Calculate the difference in correlations for 1) temporality and expectbility and 2) temporality and positive emotion.

```
Include the output from the test through Pearson's test.
   Is there a significant difference in their correlations?
        Yes
cor.test(cleanData$temporality, cleanData$expectability, method = "pearson")
##
## Pearson's product-moment correlation
## data: cleanData$temporality and cleanData$expectability
## t = 2.9546, df = 205, p-value = 0.003497
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.06759244 0.32939147
## sample estimates:
         cor
##
## 0.2020996
cor.test(cleanData$temporality, cleanData$positive, method = "pearson")
##
   Pearson's product-moment correlation
##
## data: cleanData$temporality and cleanData$positive
```

```
## t = -3.7404, df = 205, p-value = 0.0002384
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.3761634 -0.1205443
## sample estimates:
## cor
## -0.2527593
```

Calculate the difference in correlations for gender on temporality and relativity.

```
Include the output from the test.
    Is there a significant difference in their correlations?
    NO
library(cocor)
women <- subset(cleanData, gender = "women")</pre>
men <- subset(cleanData, gender = "men")</pre>
subsetList <- list(women, men)</pre>
cocor(~temporality + relativity | temporality + relativity, data =
subsetList)
##
##
     Results of a comparison of two correlations based on independent groups
## Comparison between r1.jk (temporality, relativity) = 0.2275 and r2.hm
(temporality, relativity) = 0.2275
## Difference: r1.jk - r2.hm = 0
## Data: subsetList: j = temporality, k = relativity, h = temporality, m =
relativity
## Group sizes: n1 = 207, n2 = 207
## Null hypothesis: r1.jk is equal to r2.hm
## Alternative hypothesis: r1.jk is not equal to r2.hm (two-sided)
## Alpha: 0.05
## fisher1925: Fisher's z (1925)
     z = 0.0000, p-value = 1.0000
     Null hypothesis retained
##
##
## zou2007: Zou's (2007) confidence interval
     95% confidence interval for r1.jk - r2.hm: -0.1831 0.1831
     Null hypothesis retained (Interval includes 0)
```

Calculate the partial and semipartial correlations for all variables, and include the output. a. Are any of the correlations significant after controlling for all other relationships?

```
library(ppcor)
## Loading required package: MASS
pcor(cleanData[ , -c(1)], method = "pearson")
```

```
## $estimate
##
                temporality expectability relativity
                                                       positive
## temporality
                  1.0000000
                               0.13170144 0.17590386 -0.24664382
## expectability
                               1.00000000 0.28896009 -0.01557263
                  0.1317014
## relativity
                 0.1759039
                               0.28896009 1.00000000 0.02450912
## positive
                 -0.2466438
                              -0.01557263 0.02450912 1.00000000
##
## $p.value
                 temporality expectability
##
                                            relativity
                                                           positive
## temporality
                0.000000000 5.978787e-02 1.164039e-02 0.0003637952
## expectability 0.0597878683 0.000000e+00 2.646039e-05 0.8246126598
## relativity 0.0116403917 2.646039e-05 0.0000000e+00 0.7272215415
                0.0003637952 8.246127e-01 7.272215e-01 0.0000000000
## positive
##
## $statistic
##
                temporality expectability relativity
                                                      positive
## temporality
                   0.000000
                                1.8929453 2.5459421 -3.6261593
                   1.892945
## expectability
                                0.0000000 4.3005021 -0.2219028
                  2.545942
                              4.3005021 0.0000000 0.3493062
## relativity
## positive
                  -3.626159 -0.2219028 0.3493062 0.0000000
##
## $n
## [1] 207
##
## $gp
## [1] 2
##
## $method
## [1] "pearson"
```

Theory:

- What are we using as our model for understanding the data in a correlational analysis?
- How might we determine model fit?

The Primary tool to determine model fit using graphical residual analysis.

- What is the difference between correlation and covariance?
 Covariance: Indicates the direction of the linear relationship.
 Correlation: Measures both the strength and direction of the linear relationship between two variables.
- What is the difference between R and r?

r: Correlation r determines how well two variables are correlated with each other. Basically it is defined in numerical range between -1 to +1, Correlation value more nearest to 1 in either direction says two strong

coefficient of determination.

R: R square is literally the square of correlation between x and y.

- When would I want to use a nonparametric correlation over Pearson's correlation?
- What is the distinction between semi-partial and partial correlations? semi-partial correlations is same as partail correlations, But variation is:

Partial Correlations: Partial correlation measures the strength of a relationship between two variables, while controlling for the effect of one or more other variables.

Semi-partial correltions: the semi partial correlation statistic can tell us the particular part of variance, that a particular independent variable explains. It explains how one specific independent variable affects the dependent variable, while other variables are controlled for to prevent them getting in the way.