EDA Learning Activity-1

World University Ranking Dataset

Submitted by - Shlesha(1NT21IS153), Sem: 5-'C'

Introduction

The World University Ranking dataset is a comprehensive collection of information that assesses and ranks higher education institutions globally based on various criteria. This dataset serves as a valuable resource for researchers, educators, and policymakers, offering insights into the comparative performance of universities worldwide. By examining factors such as academic reputation, faculty quality, research output, and international diversity, the dataset provides a nuanced understanding of the educational landscape on a global scale. These rankings play a pivotal role in shaping perspectives on academic excellence, aiding prospective students in making informed decisions about their educational journeys and contributing to discussions on the state of higher education internationally. Analyzing the World University Ranking dataset enables a deeper exploration of trends, patterns, and disparities within the global academic community, fostering a better understanding of the evolving dynamics in the realm of higher education.

```
#read data into a dataframe
df<- read.csv("~/Desktop/cwurData.csv")
#printing the summary of the dataframe
summary(df)</pre>
```

```
##
      world_rank
                      institution
                                             country
                                                               national_rank
##
           :
                      Length: 2200
                                           Length: 2200
                                                                      : 1.00
    Min.
                1.0
                                                               Min.
    1st Qu.: 175.8
                      Class : character
                                           Class : character
                                                               1st Qu.: 6.00
##
##
    Median: 450.5
                      Mode
                            :character
                                          Mode
                                                 :character
                                                               Median : 21.00
##
            : 459.6
                                                                       : 40.28
                                                               Mean
    3rd Qu.: 725.2
                                                               3rd Qu.: 49.00
##
##
    Max.
            :1000.0
                                                               Max.
                                                                       :229.00
##
##
    quality_of_education alumni_employment quality_of_faculty
                                                                  publications
                                  : 1.0
                                                                  Min.
##
           : 1.0
                          Min.
                                              Min.
                                                     : 1.0
                                                                              1.0
##
    1st Qu.:175.8
                          1st Qu.:175.8
                                              1st Qu.:175.8
                                                                  1st Qu.: 175.8
##
    Median :355.0
                          Median :450.5
                                              Median :210.0
                                                                  Median: 450.5
##
    Mean
            :275.1
                          Mean
                                  :357.1
                                              Mean
                                                     :178.9
                                                                  Mean
                                                                          : 459.9
                          3rd Qu.:478.0
                                                                  3rd Qu.: 725.0
##
    3rd Qu.:367.0
                                              3rd Qu.:218.0
##
    Max.
            :367.0
                          Max.
                                  :567.0
                                              Max.
                                                     :218.0
                                                                  Max.
                                                                          :1000.0
##
##
      influence
                       citations
                                       broad_impact
                                                            patents
##
                                                  1.0
           : 1.0
                                                                : 1.0
##
    1st Qu.:175.8
                     1st Qu.:161.0
                                      1st Qu.: 250.5
                                                         1st Qu.:170.8
    Median :450.5
                     Median :406.0
                                      Median: 496.0
                                                         Median :426.0
##
    Mean
            :459.8
                     Mean
                             :413.4
                                      Mean
                                              : 496.7
                                                         Mean
                                                                :433.3
##
    3rd Qu.:725.2
                     3rd Qu.:645.0
                                      3rd Qu.: 741.0
                                                         3rd Qu.:714.2
##
    Max.
            :991.0
                     Max.
                             :812.0
                                      Max.
                                              :1000.0
                                                         Max.
                                                                :871.0
##
                                              :200
                                      NA's
##
        score
                            year
```

```
## Min. : 43.36
                   Min. :2012
## 1st Qu.: 44.46 1st Qu.:2014
## Median: 45.10 Median: 2014
## Mean : 47.80
                         :2014
                   Mean
## 3rd Qu.: 47.55
                   3rd Qu.:2015
## Max. :100.00
                   Max. :2015
##
#viewing named objects in the workspace
## [1] "df"
#checking the structure of a data frame
str(df)
## 'data.frame':
                  2200 obs. of 14 variables:
## $ world_rank
                        : int 1 2 3 4 5 6 7 8 9 10 ...
## $ institution
                        : chr
                              "Harvard University" "Massachusetts Institute of Technology" "Stanford
                              "USA" "USA" "USA" "United Kingdom" ...
## $ country
                        : chr
                        : int 1231452678...
## $ national_rank
                              7 9 17 10 2 8 13 14 23 16 ...
## $ quality_of_education: int
## $ alumni_employment : int 9 17 11 24 29 14 28 31 21 52 ...
## $ quality_of_faculty : int 1 3 5 4 7 2 9 12 10 6 ...
## $ publications
                        : int 1 12 4 16 37 53 15 14 13 6 ...
## $ influence
                              1 4 2 16 22 33 13 6 12 5 ...
                        : int
                       : int 1 4 2 11 22 26 19 15 14 3 ...
## $ citations
## $ broad impact
                       : int NA NA NA NA NA NA NA NA NA ...
## $ patents
                       : int 5 1 15 50 18 101 26 66 5 16 ...
## $ score
                        : num 100 91.7 89.5 86.2 85.2 ...
## $ year
                        #display first few rows of the data frame
head(df)
##
    world_rank
                                       institution
                                                        country national_rank
## 1
                                Harvard University
                                                            USA
## 2
                                                            USA
                                                                           2
             2 Massachusetts Institute of Technology
## 3
                               Stanford University
                                                            USA
                                                                           3
## 4
            4
                           University of Cambridge United Kingdom
                 California Institute of Technology
## 6
             6
                              Princeton University
                                                            USA
## quality_of_education alumni_employment quality_of_faculty publications
## 1
                      7
                                      9
                                                        1
                                                                     1
## 2
                      9
                                      17
                                                         3
                                                                    12
## 3
                     17
                                                        5
                                                                     4
                                      11
## 4
                     10
                                                         4
                                      24
                                                                    16
## 5
                      2
                                      29
                                                        7
                                                                    37
                      8
                                      14
                                                                    53
## influence citations broad_impact patents score year
## 1
                    1
                                      5 100.00 2012
           1
                                NA
```

1 91.67 2012

NA

2

4

4

##	3	2	2	NA	15	89.50 2012
##	4	16	11	NA	50	86.17 2012
##	5	22	22	NA	18	85.21 2012
##	6	33	26	NA	101	82.50 2012

#accessing a column in a dataframe
df\$world_rank

##	[645]	445	446	447	448	449	450	451	452	453	454	455	456	457	458
##	[659]	459	460	461	462	463	464	465	466	467	468	469	470	471	472
##	[673]	473	474	475	476	477	478	479	480	481	482	483	484	485	486
##	[687]	487	488	489	490	491	492	493	494	495	496	497	498	499	500
##	[701]	501	502	503	504	505	506	507	508	509	510	511	512	513	514
##	[715]	515	516	517	518	519	520	521	522	523	524	525	526	527	528
##	[729]	529	530	531	532	533	534	535	536	537	538	539	540	541	542
##	[743]	543	544	545	546	547	548	549	550	551	552	553	554	555	556
##	[757]	557	558	559	560	561	562	563	564	565	566	567	568	569	570
##	[771]	571	572	573	574	575	576	577	578	579	580	581	582	583	584
##	[785]	585	586	587	588	589	590	591	592	593	594	595	596	597	598
##	[799]	599	600	601	602	603	604	605	606	607	608	609	610	611	612
##	[813]	613	614	615	616	617	618	619	620	621	622	623	624	625	626
##	[827]	627	628	629	630	631	632	633	634	635	636	637	638	639	640
##	[841]	641	642	643	644	645	646	647	648	649	650	651	652	653	654
##	[855]	655	656	657	658	659	660	661	662	663	664	665	666	667	668
##	[869]	669	670	671	672	673	674	675	676	677	678	679	680	681	682
##	[883]	683	684	685	686	687	688	689	690	691	692	693	694	695	696
##	[897]	697	698	699	700	701	702	703	704	705	706	707	708	709	710
##	[911]	711	712	713	714	715	716	717	718	719	720	721	722	723	724
##	[925]	725	726	727	728	729	730	731	732	733	734	735	736	737	738
##	[939]	739	740	741	742	743	744	745	746	747	748	749	750	751	752
##	[953]	753	754	755	756	757	758	759	760	761	762	763	764	765	766
##	[967]	767	768	769	770	771	772	773	774	775	776	777	778	779	780
##	[981]	781	782	783	784	785	786	787	788	789	790	791	792	793	794
##	[995]	795	796	797	798	799	800	801	802	803	804	805	806	807	808
##	[1009]	809	810	811	812	813	814	815	816	817	818	819	820	821	822
##	[1023]	823	824	825	826	827	828	829	830	831	832	833	834	835	836
##	[1037]	837	838	839	840	841	842	843	844	845	846	847	848	849	850
##	[1051]	851	852	853	854	855	856	857	858	859	860	861	862	863	864
##	[1065]	865	866	867	868	869	870	871	872	873	874	875	876	877	878
##	[1079]	879	880	881	882	883	884	885	886	887	888	889	890	891	892
##	[1093]	893	894	895	896	897	898	899	900	901	902	903	904	905	906
##	[1107]	907	908	909	910	911	912	913	914	915	916	917	918	919	920
##	[1121]	921	922	923	924	925	926	927	928	929	930	931	932	933	934
##	[1135]	935	936	937	938	939	940	941	942	943	944	945	946	947	948
##	[1149]	949	950	951	952	953	954	955	956	957	958	959	960	961	962
##	[1163]	963	964	965	966	967	968	969	970	971	972	973	974	975	976
##	[1177]	977	978	979	980	981	982	983	984	985	986	987	988	989	990
##	[1191]	991	992	993	994	995	996	997	998		1000	1	2	3	4
##	[1205]	5	6	7	8	9	10	11	12	13	14	15	16	17	18
##	[1219]	19	20	21	22	23	24	25	26	27	28	29	30	31	32
##	[1233]	33	34	35	36	37	38	39	40	41	42	43	44	45	46
##	[1247]	47	48	49	50	51	52	53	54	55	56	57	58	59	60
##	[1261]	61	62	63	64	65	66	67	68	69	70	71	72	73	74
##	[1275]	75	76	77	78	79	80	81	82	83	84	85	86	87	88
##	[1289]	89	90	91	92	93	94	95	96	97	98	99	100	101	102
##	[1303]	103	104	105	106	107	108	109	110	111	112	113	114	115	116
##	[1317]	117	118	119	120	121	122	123	124	125	126	127	128	129	130
##	[1331]	131	132	133	134	135	136	137	138	139	140	141	142	143	144
##	[1345]	145	146	147	148	149	150	151	152	153	154	155	156	157	158
##	[1345]	159	160	161	162	163	164	165	166	167	168	169	170	171	172
##	[1373]	173	174	175	176	177	178	179	180	181	182	183	184	185	186
##	[1387]	187	188	189	190	191	192	193	194	195	196	197	198	199	200
##	[1901]	101	100	109	190	191	132	193	134	190	190	191	130	199	200

##	[1401]	201	202	203	204	205	206	207	208	209	210	211	212	213	214
##	[1415]	215	216	217	218	219	220	221	222	223	224	225	226	227	228
##	[1429]	229	230	231	232	233	234	235	236	237	238	239	240	241	242
##	[1443]	243	244	245	246	247	248	249	250	251	252	253	254	255	256
##	[1457]	257	258	259	260	261	262	263	264	265	266	267	268	269	270
##	[1471]	271	272	273	274	275	276	277	278	279	280	281	282	283	284
##	[1485]	285	286	287	288	289	290	291	292	293	294	295	296	297	298
##	[1499]	299	300	301	302	303	304	305	306	307	308	309	310	311	312
##	[1513]	313	314	315	316	317	318	319	320	321	322	323	324	325	326
##	[1527]	327	328	329	330	331	332	333	334	335	336	337	338	339	340
##	[1541]	341	342	343	344	345	346	347	348	349	350	351	352	353	354
##	[1555]	355	356	357	358	359	360	361	362	363	364	365	366	367	368
##	[1569]	369	370	371	372	373	374	375	376	377	378	379	380	381	382
##	[1583]	383	384	385	386	387	388	389	390	391	392	393	394	395	396
##	[1597]	397	398	399	400	401	402	403	404	405	406	407	408	409	410
##	[1611]	411	412	413	414	415	416	417	418	419	420	421	422	423	424
##	[1625]	425	426	427	428	429	430	431	432	433	434	435	436	437	438
##	[1639]	439	440	441	442	443	444	445	446	447	448	449	450	451	452
##	[1653]	453	454	455	456	457	458	459	460	461	462	463	464	465	466
##	[1667]	467	468	469	470	471	472	473	474	475	476	477	478	479	480
##	[1681]	481	482	483	484	485	486	487	488	489	490	491	492	493	494
##	[1695]	495	496	497	498	499	500	501	502	503	504	505	506	507	508
##	[1709]	509	510	511	512	513	514	515	516	517	518	519	520	521	522
##	[1723]	523	524	525	526	527	528	529	530	531	532	533	534	535	536
##	[1737]	537	538	539	540	541	542	543	544	545	546	547	548	549	550
##	[1751]	551	552	553	554	555	556	557	558	559	560	561	562	563	564
##	[1765]	565	566	567	568	569	570	571	572	573	574	575	576	577	578
##	[1779]	579	580	581	582	583	584	585	586	587	588	589	590	591	592
##	[1793]	593	594	595	596	597	598	599	600	601	602	603	604	605	606
##	[1807]	607	608	609	610	611	612	613	614	615	616	617	618	619	620
##	[1821]	621	622	623	624	625	626	627	628	629	630	631	632	633	634
##	[1835]	635	636	637	638	639	640	641	642	643	644	645	646	647	648
##	[1849]	649	650	651	652	653	654	655	656	657	658	659	660	661	662
##	[1863]	663	664	665	666	667	668	669	670	671	672	673	674	675	676
##	[1877]	677	678	679	680	681	682	683	684	685	686	687	688	689	690
##	[1891]	691	692	693	694	695	696	697	698	699	700	701	702	703	704
##	[1905]	705	706	707	708	709	710	711	712	713	714	715	716	717	718
##	[1919]	719	720	721	722	723	724	725	726	727	728	729	730	731	732
##	[1933]	733	734	735	736	737	738	739	740	741	742	743	744	745	746
##	[1947]	747	748	749	750	751	752	753	754	755	756	757	758	759	760
##	[1961]	761	762	763	764	765	766	767	768	769	770	771	772	773	774
##	[1975]	775	776	777	778	779	780	781	782	783	784	785	786	787	788
##	[1989]	789	790	791	792	793	794	795	796	797	798	799	800	801	802
##	[2003]	803	804	805	806	807	808	809	810	811	812	813	814	815	816
##	[2017]	817	818	819	820	821	822	823	824	825	826	827	828	829	830
##	[2031]	831	832	833	834	835	836	837	838	839	840	841	842	843	844
##	[2045]	845	846	847	848	849	850	851	852	853	854	855	856	857	858
##	[2059]	859	860	861	862	863	864	865	866	867	868	869	870	871	872
##	[2073]	873	874	875	876	877	878	879	880	881	882	883	884	885	886
##	[2087]	887	888	889	890	891	892	893	894	895	896	897	898	899	900
##	[2101]	901	902	903	904	905	906	907	908	909	910	911	912	913	914
##	[2115]	915	916	917	918	919	920	921	922	923	924	925	926	927	928
##	[2129]	929	930	931	932	933	934	935	936	937	938	939	940	941	942
##	[2143]	943	944	945	946	947	948	949	950	951	952	953	954	955	956
ππ	[CITO]	J-10	J-11	J- 1 U	J-10	J-II	J-10	J-13	500	201	JUZ	500	JU4	500	200

```
## [2157] 957 958 959 960
                                                                         970
                             961
                                  962
                                       963
                                            964
                                                 965
                                                      966
                                                           967
                                                                968
                                                                    969
                                                          981
                                                                         984
## [2171] 971 972 973 974 975
                                  976 977
                                            978 979 980
                                                               982
                                                                    983
## [2185] 985 986
                             989
                                           992 993
                                                      994
                                                                    997 998
                   987
                         988
                                  990
                                       991
                                                           995
                                                                996
## [2199] 999 1000
# Retrieves the names of all the columns present in the dataset
names(df)
   [1] "world_rank"
                              "institution"
                                                    "country"
   [4] "national_rank"
                              "quality_of_education" "alumni_employment"
                              "publications"
  [7] "quality_of_faculty"
                                                    "influence"
## [10] "citations"
                              "broad_impact"
                                                    "patents"
## [13] "score"
                              "year"
#Calculate mean of a specific column
mean(df$world_rank)
```

[1] 459.5909

```
#checking data type of a column class(df$country)
```

```
## [1] "character"
```

```
# Create a subset of data frame where World rank is less than 25
subset_df <- df[df$world_rank < 10, ]
subset_df</pre>
```

##		$world_rank$		institution	country
##	1	1		Harvard University	USA
##	2	2	${\tt Massachusetts}$	Institute of Technology	USA
##	3	3		Stanford University	USA
##	4	4		University of Cambridge	United Kingdom
##	5	5	California	Institute of Technology	USA
##	6	6		Princeton University	USA
##	7	7		University of Oxford	United Kingdom
##	8	8		Yale University	USA
##	9	9		Columbia University	USA
##	101	1		Harvard University	USA
##	102	2		Stanford University	USA
##	103	3		University of Oxford	United Kingdom
##	104	4	${\tt Massachusetts}$	Institute of Technology	USA
##	105	5		${\tt University} \ {\tt of} \ {\tt Cambridge}$	United Kingdom
##	106	6		Columbia University	USA
##	107	7	University	of California, Berkeley	USA
##	108	8		Princeton University	USA
##	109	9		University of Chicago	USA
##	201	1		Harvard University	USA
##	202	2		Stanford University	USA
##	203	3	${\tt Massachusetts}$	Institute of Technology	USA
##		4		University of Cambridge	

```
## 205
                                       University of Oxford United Kingdom
                  5
## 206
                  6
                                        Columbia University
                                                                          USA
                       University of California, Berkeley
## 207
                  7
                                                                         USA
## 208
                  8
                                     University of Chicago
                                                                         USA
## 209
                  9
                                       Princeton University
                                                                         USA
## 1201
                  1
                                         Harvard University
                                                                         USA
## 1202
                                        Stanford University
                                                                         USA
## 1203
                  3 Massachusetts Institute of Technology
                                                                         USA
## 1204
                                   University of Cambridge United Kingdom
## 1205
                  5
                                       University of Oxford United Kingdom
## 1206
                  6
                                        Columbia University
## 1207
                  7
                                                                         USA
                       University of California, Berkeley
                  8
                                                                         USA
## 1208
                                     University of Chicago
                  9
## 1209
                                       Princeton University
                                                                         USA
##
        national_rank quality_of_education alumni_employment quality_of_faculty
## 1
                                            7
                                                               9
## 2
                     2
                                            9
                                                               17
                                                                                    3
                     3
## 3
                                           17
                                                                                    5
                                                               11
## 4
                     1
                                           10
                                                               24
                                                                                    4
                                                                                    7
## 5
                     4
                                            2
                                                               29
                                                               14
## 6
                     5
                                            8
                                                                                    2
## 7
                     2
                                           13
                                                               28
                                                                                    9
## 8
                     6
                                           14
                                                              31
                                                                                   12
                     7
## 9
                                           23
                                                               21
                                                                                   10
## 101
                     1
                                            1
                                                               1
                                                                                    1
## 102
                     2
                                           11
                                                                2
                                                                                    4
## 103
                     1
                                            7
                                                               12
                                                                                   10
## 104
                     3
                                            2
                                                               16
                                                                                    2
                     2
## 105
                                                                                    5
                                            3
                                                               15
## 106
                     4
                                                                                    9
                                           13
                                                                8
## 107
                     5
                                            6
                                                               28
                                                                                    6
## 108
                     6
                                            4
                                                               14
                                                                                    3
## 109
                     7
                                                                                    8
                                                               19
## 201
                                                                1
                     1
                                            1
                                                                                    1
                     2
## 202
                                                                2
                                           11
                                                                                    4
## 203
                     3
                                            3
                                                               11
                                                                                    2
## 204
                     1
                                            2
                                                               10
                                                                                    5
## 205
                     2
                                            7
                                                               12
                                                                                    10
## 206
                     4
                                           13
                                                                8
                                                                                    9
## 207
                     5
                                            4
                                                               22
                                                                                    6
## 208
                     6
                                           10
                                                               14
                                                                                    8
                     7
## 209
                                            5
                                                               16
                                                                                    3
## 1201
                     1
                                            1
                                                                1
                                                                                    1
## 1202
                     2
                                            9
                                                                2
                                                                                    4
## 1203
                                            3
                                                                                    2
                                                               11
## 1204
                                            2
                                                                                    5
                     1
                                                               10
## 1205
                     2
                                            7
                                                               13
                                                                                   10
## 1206
                     4
                                           13
                                                                6
                                                                                    9
## 1207
                     5
                                            5
                                                               21
                                                                                    6
## 1208
                     6
                                                                                    8
                                           11
                                                               14
                     7
## 1209
                                            4
                                                               15
                                                                                    3
##
        publications influence citations broad impact patents score year
## 1
                    1
                               1
                                          1
                                                       NA
                                                                 5 100.00 2012
## 2
                   12
                               4
                                          4
                                                       NA
                                                                 1 91.67 2012
```

```
## 3
                              2
                                                             15 89.50 2012
                                        2
                                                     NA
## 4
                  16
                             16
                                       11
                                                     NΑ
                                                             50
                                                                 86.17 2012
## 5
                             22
                                                                 85.21 2012
                  37
                                       22
                                                     NA
                                                             18
## 6
                             33
                                       26
                                                                 82.50 2012
                  53
                                                     NA
                                                            101
## 7
                  15
                             13
                                       19
                                                     NA
                                                             26
                                                                 82.34 2012
## 8
                  14
                              6
                                       15
                                                     NA
                                                             66
                                                                 79.14 2012
## 9
                  13
                             12
                                       14
                                                              5 78.86 2012
                                                     NA
                                                              7 100.00 2013
## 101
                   1
                              1
                                        1
                                                     NA
## 102
                   6
                              2
                                        2
                                                     NA
                                                             11
                                                                 93.94 2013
## 103
                              7
                                                     NA
                                                                 92.54 2013
                  11
                                       13
                                                             15
## 104
                  16
                              3
                                        3
                                                     NA
                                                              1
                                                                 91.45 2013
                                                                 90.24 2013
## 105
                   9
                                       10
                                                     NA
                                                             39
                             11
                                                                 88.21 2013
## 106
                  13
                              9
                                       11
                                                     NA
                                                             10
## 107
                              6
                                                                 85.07 2013
                   8
                                        4
                                                     NA
                                                             19
## 108
                  58
                             35
                                       27
                                                     NA
                                                            101
                                                                 82.17 2013
## 109
                  37
                             21
                                        30
                                                     NA
                                                            101
                                                                 79.16 2013
## 201
                              1
                                                      1
                                                              2 100.00 2014
                   1
                                        1
## 202
                                                                 99.09 2014
                   5
                              3
                                        3
                                                      4
## 203
                  15
                              2
                                        2
                                                      2
                                                                 98.69 2014
                                                              1
## 204
                              9
                                                                 97.64 2014
                  10
                                       12
                                                     13
                                                             48
                             12
## 205
                  11
                                       11
                                                     12
                                                             16 97.51 2014
## 206
                  14
                             13
                                        9
                                                     13
                                                              4 97.41 2014
## 207
                   7
                                                      7
                                                             28 92.84 2014
                              4
                                        3
## 208
                  17
                             19
                                       10
                                                     18
                                                            149
                                                                 92.03 2014
                                                            204 88.56 2014
                             25
## 209
                  70
                                       19
                                                     41
## 1201
                   1
                              1
                                        1
                                                      1
                                                              3 100.00 2015
## 1202
                   5
                              3
                                        3
                                                      4
                                                             10 98.66 2015
## 1203
                  15
                              2
                                        2
                                                      2
                                                                 97.54 2015
                                                              1
## 1204
                              6
                                                                 96.81 2015
                                       12
                                                             48
                  11
                                                     13
## 1205
                                                                 96.46 2015
                   7
                             12
                                        7
                                                      9
                                                             15
## 1206
                  13
                             13
                                        11
                                                     12
                                                              4
                                                                 96.14 2015
## 1207
                  10
                              4
                                        4
                                                      7
                                                             29
                                                                 92.25 2015
## 1208
                  17
                             16
                                       12
                                                     22
                                                            141
                                                                 90.70 2015
## 1209
                  72
                             25
                                       24
                                                     33
                                                            225
                                                                 89.42 2015
```

```
# Add a new column "Gender" to the data frame
df$Gender <- c("F", "M", "M", "F")
```

```
# Remove the "Patents" column from the data frame
df$Patents <- NULL
summary(df)</pre>
```

```
##
     world_rank
                    institution
                                        country
                                                         national_rank
##
   Min. : 1.0
                    Length: 2200
                                      Length:2200
                                                         Min. : 1.00
   1st Qu.: 175.8
                    Class :character
                                      Class : character
                                                         1st Qu.: 6.00
##
   Median : 450.5
                    Mode :character
                                      Mode :character
                                                         Median : 21.00
##
   Mean
         : 459.6
                                                         Mean
                                                              : 40.28
   3rd Qu.: 725.2
##
                                                         3rd Qu.: 49.00
##
   Max. :1000.0
                                                               :229.00
                                                         Max.
##
##
   quality_of_education alumni_employment quality_of_faculty publications
##
   Min. : 1.0
                       Min. : 1.0
                                         Min. : 1.0
                                                           Min. : 1.0
   1st Qu.:175.8
                        1st Qu.:175.8
                                         1st Qu.:175.8
                                                           1st Qu.: 175.8
```

```
Median :355.0
                         Median :450.5
                                          Median :210.0
                                                              Median: 450.5
##
   Mean
         :275.1
                        Mean
                               :357.1
                                          Mean
                                                :178.9
                                                              Mean : 459.9
                                          3rd Qu.:218.0
   3rd Qu.:367.0
                         3rd Qu.:478.0
                                                              3rd Qu.: 725.0
           :367.0
                                                             Max.
                                                                     :1000.0
##
   Max.
                         Max.
                                :567.0
                                          Max.
                                                 :218.0
##
##
      influence
                     citations
                                     broad impact
                                                        patents
   Min. : 1.0
                                   Min. : 1.0
                   Min. : 1.0
                                                     Min.
                                                            : 1.0
                                    1st Qu.: 250.5
   1st Qu.:175.8
                   1st Qu.:161.0
                                                     1st Qu.:170.8
##
##
   Median :450.5
                   Median :406.0
                                   Median: 496.0
                                                     Median :426.0
##
   Mean :459.8
                   Mean
                          :413.4
                                   Mean : 496.7
                                                     Mean
                                                            :433.3
   3rd Qu.:725.2
                   3rd Qu.:645.0
                                    3rd Qu.: 741.0
                                                     3rd Qu.:714.2
   Max. :991.0
                                   Max.
##
                   Max. :812.0
                                          :1000.0
                                                     Max.
                                                            :871.0
                                    NA's
##
                                           :200
##
                                      Gender
        score
                         year
   Min. : 43.36
##
                            :2012
                                    Length: 2200
                    Min.
##
   1st Qu.: 44.46
                     1st Qu.:2014
                                    Class : character
##
   Median : 45.10
                     Median:2014
                                   Mode :character
##
   Mean : 47.80
                    Mean
                          :2014
##
   3rd Qu.: 47.55
                    3rd Qu.:2015
##
   Max. :100.00
                    Max.
                           :2015
##
# Rename the "Score" column to "Points"
names(df)[names(df) == "score"] <- "points"</pre>
summary(df)
##
      world_rank
                     institution
                                          country
                                                           national_rank
##
   Min.
         :
              1.0
                     Length: 2200
                                        Length: 2200
                                                           Min. : 1.00
                     Class :character
##
   1st Qu.: 175.8
                                        Class :character
                                                           1st Qu.: 6.00
   Median : 450.5
                    Mode :character
                                        Mode :character
                                                           Median : 21.00
##
   Mean
         : 459.6
                                                           Mean : 40.28
##
   3rd Qu.: 725.2
                                                           3rd Qu.: 49.00
   Max. :1000.0
##
                                                           Max.
                                                                 :229.00
##
   quality_of_education alumni_employment quality_of_faculty publications
##
##
   Min. : 1.0
                        Min. : 1.0
                                          Min. : 1.0
                                                              Min. : 1.0
   1st Qu.:175.8
                        1st Qu.:175.8
                                          1st Qu.:175.8
                                                              1st Qu.: 175.8
##
   Median :355.0
                        Median :450.5
                                          Median :210.0
                                                             Median: 450.5
   Mean :275.1
                        Mean
                              :357.1
                                          Mean
                                                :178.9
                                                              Mean
                                                                   : 459.9
##
                         3rd Qu.:478.0
                                                              3rd Qu.: 725.0
##
   3rd Qu.:367.0
                                          3rd Qu.:218.0
##
   Max.
          :367.0
                        Max.
                               :567.0
                                          Max.
                                                 :218.0
                                                             Max.
                                                                    :1000.0
##
##
                      citations
                                     broad_impact
      influence
                                                        patents
##
   Min.
          : 1.0
                   Min.
                          : 1.0
                                   Min.
                                         :
                                              1.0
                                                     Min.
                                                            : 1.0
##
   1st Qu.:175.8
                    1st Qu.:161.0
                                    1st Qu.: 250.5
                                                     1st Qu.:170.8
##
   Median :450.5
                   Median :406.0
                                   Median: 496.0
                                                     Median :426.0
##
   Mean
         :459.8
                   Mean
                         :413.4
                                   Mean
                                         : 496.7
                                                     Mean
                                                            :433.3
   3rd Qu.:725.2
                   3rd Qu.:645.0
                                    3rd Qu.: 741.0
##
                                                     3rd Qu.:714.2
##
   Max.
          :991.0
                   Max.
                          :812.0
                                   Max.
                                          :1000.0
                                                     Max.
                                                            :871.0
##
                                   NA's
                                         :200
##
       points
                                       Gender
                          year
   Min. : 43.36
##
                    Min.
                           :2012
                                   Length: 2200
```

Class : character

Mode : character

1st Qu.: 44.46

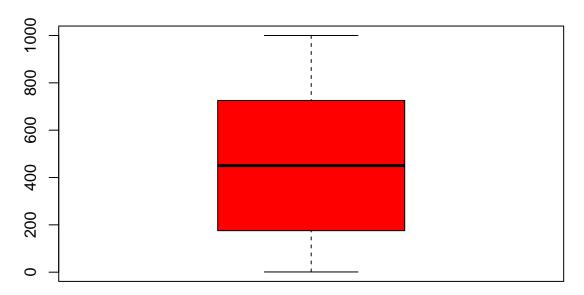
Median: 45.10

##

1st Qu.:2014

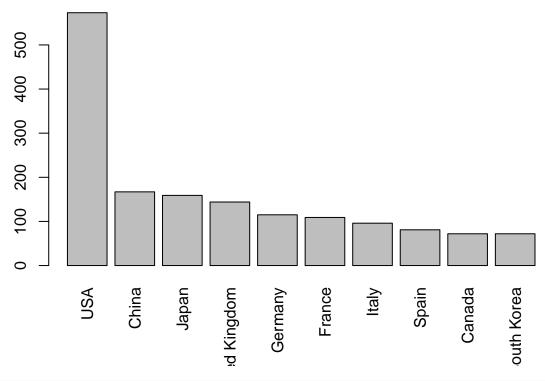
Median:2014

Box Plot with Means



```
#Visualizing the Top Countries in Higher Learning
height<- sort(table(df$country), decreasing = TRUE)
barplot(height[1:10], las = 3, main = "Top Countries in University Rankings 2015")</pre>
```

Top Countries in University Rankings 2015



#Calculates the standard deviation a dataset
sd(df\$national_rank)

[1] 51.74087

#Building a subset dataframe that contains information about only the schools of USA usa <- subset(df, df\$country == "USA")

Analysis

Looking at the data, it is clear that national ranking is determined by multiple factors. To determine how different factors correlate with National rank, we first begin by visualizing National Rank against different variables.

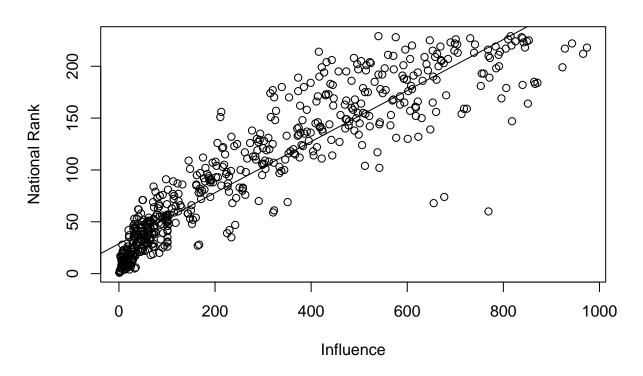
I chose these three variables for comparison.

- 1. Quality of Faculty
- 2. Influence
- 3. Citations

#To determine how different factors correlate with National rank, we begin by visualizing

#National Rank against the influence variable.
plot (usa\$influence, usa\$national_rank, xlab ="Influence", ylab="National Rank", main = "Influence vs National_rank ~ influence, data = usa)
abline(c)

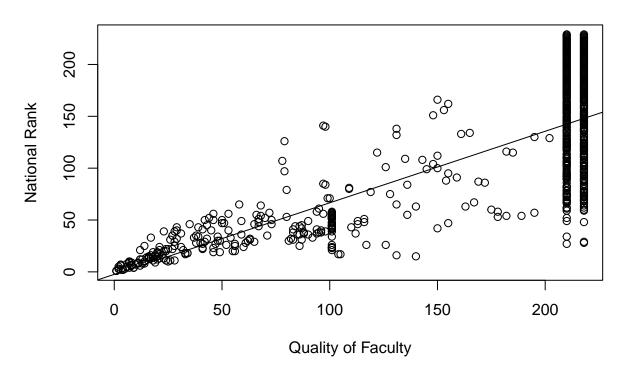
Influnce vs National Rank



summary(c) #regression model

```
##
## Call:
## lm(formula = national_rank ~ influence, data = usa)
## Residuals:
##
        Min
                  1Q
                       Median
                                    3Q
## -158.197 -16.764
                       -0.922
                                15.220
                                         82.746
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
##
                                      17.05
                                              <2e-16 ***
## (Intercept) 28.793900
                           1.689222
## influence
                0.246298
                           0.004449
                                      55.36
                                              <2e-16 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 27.3 on 571 degrees of freedom
## Multiple R-squared: 0.843, Adjusted R-squared: 0.8427
## F-statistic: 3065 on 1 and 571 DF, p-value: < 2.2e-16
#To determine how different factors correlate with National rank, we then visualize National Rank
#against the quality of faculty variable.
plot (usa$quality_of_faculty, usa$national_rank, xlab ="Quality of Faculty", ylab = "National Rank", ma
c <- lm(national_rank ~ quality_of_faculty, data = usa)</pre>
abline(c)
```

Quality of Faculty vs National Rank

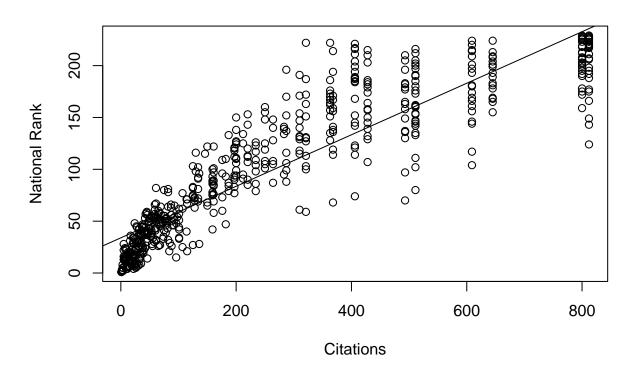


summary(c) #regression model

```
##
## Call:
## lm(formula = national_rank ~ quality_of_faculty, data = usa)
##
## Residuals:
##
        Min
                       Median
                                    3Q
                  1Q
                                            Max
  -119.998 -23.826
                        2.042
                                23.002
                                         86.521
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                      -2.40754
                                  3.51066 -0.686
                                                     0.493
## quality_of_faculty 0.68993
                                  0.02115
                                           32.623
                                                    <2e-16 ***
##
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 40.7 on 571 degrees of freedom
## Multiple R-squared: 0.6508, Adjusted R-squared: 0.6502
## F-statistic: 1064 on 1 and 571 DF, p-value: < 2.2e-16
```

```
#To determine how different factors correlate with National rank, we then visualize National Rank
#against the citations variable.
plot (usa$citations, usa$national_rank, xlab = "Citations", ylab = "National Rank", main = "Citations v
c <- lm(national_rank ~ citations, data = usa)
abline(c)</pre>
```

Citations vs National Rank



summary(c) #regression model

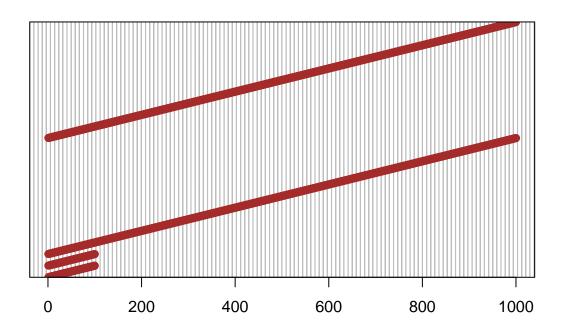
```
##
## Call:
## lm(formula = national_rank ~ citations, data = usa)
##
## Residuals:
##
       Min
                1Q
                   Median
                                3Q
## -111.66 -20.41
                     -4.23
                             16.74
                                   108.32
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
                                      18.41
## (Intercept) 33.926097
                           1.843120
                                              <2e-16 ***
## citations
                0.248446
                           0.005161
                                      48.14
                                              <2e-16 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Residual standard error: 30.63 on 571 degrees of freedom
## Multiple R-squared: 0.8023, Adjusted R-squared: 0.802
```

```
## F-statistic: 2317 on 1 and 571 DF, p-value: < 2.2e-16
```

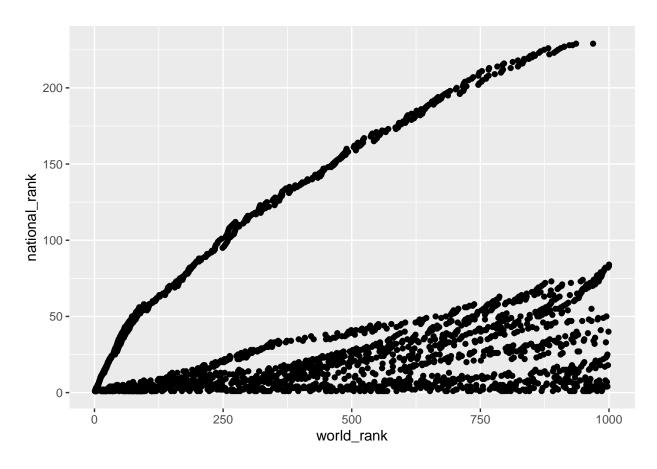
```
# Making a Dot Plot of World_Rank column

dotchart(df$world_rank, pch = 19, col = "brown", main = "Dot Plot")
```

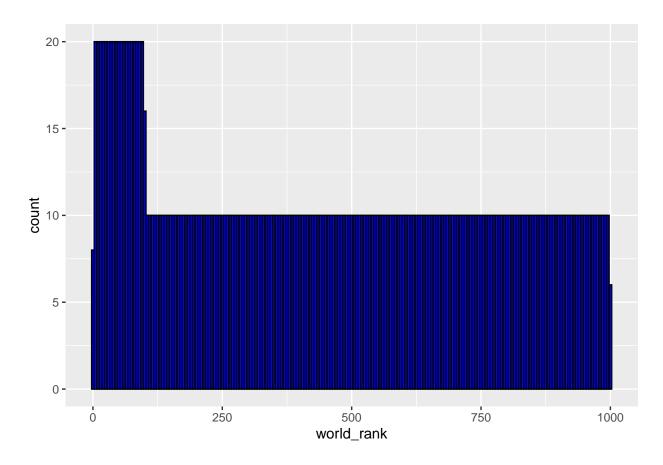
Dot Plot



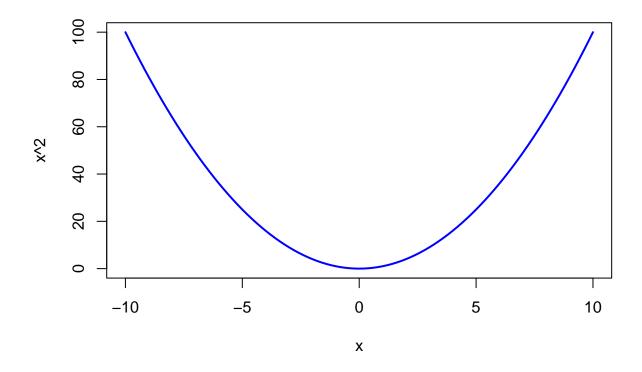
```
# Creating a Scatter Plot for world rank vs national rank
library(ggplot2)
ggplot(df, aes(x = world_rank, y = national_rank)) + geom_point()
```



```
# Creating a Histogram for the world_rank column
ggplot(df, aes(x = world_rank)) + geom_histogram(binwidth = 5, fill = "blue", color = "black")
```

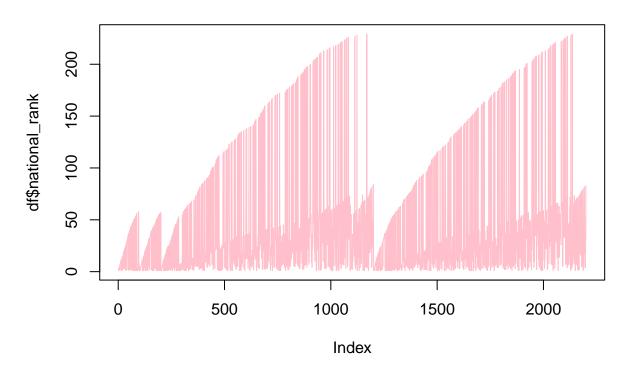


Plotting a Function Curve for the given dataset
curve(x^2, from = -10, to = 10, col = "blue", lwd = 2)



Making a Frequency Polygon for the national_rank column
plot(df\$national_rank, type = "l", lty = 1, col = "pink", main = "Frequency Polygon")

Frequency Polygon



#converting data type as.numeric(df\$broad_impact)

[1] NA NA NA NANA NA NA NANA NANA NA NA NA## [15] NA NANA NANA NA NANANANANA NA NANA[29] ## NA NA NA NANA NANA NANA NA NA NANANA## [43] NA NANANANANANANANA NANANANANA## [57] NANA NA NANANANA NANA NA NA NANA NA## [71] NA NA NA NA NA NANA NA NA NA NA NANA NA## [85] NA [99] ## NA NA NA NA NA NANA NANA NA NA NANANA## [113] NA ## [127] NA NA NANANANA NANA NA NA NANANA## [141] NANANANANANANA NANANA NA NANANA[155] NA ## NA NANANANANANANA NA NANANANA[169] NA NA NA NA NA ## NANANANANANA NA NA NA## [183] NANA NANA NANA NA NANA NANANANANA [197] ## NA NANANA 1 4 2 13 12 13 7 18 41 19 6 51 3 27 ## [211] 23 24 26 10 31 86 16 10 151 107 ## [225] 28 15 9 68 74 21 8 5 51 266 311 295 62 137 [239] 56 22 33 ## 17 380 89 32 132 37 361 29 102 54 121 [253] ## 24 144 155 46 50 19 63 56 41 94 77 238 215 34 ## [267] 37 66 59 46 40 112 36 102 79 73 70 37 34 51 ## [281] 97 48 101 81 56 151 162 49 54 77 145 207 124 59 ## [295] 94 180 81 145 97 326 45 70 99 30 137 145 251 121 [309] 102 70 ## 207 74 100 106 195 472 66 211 90 88 41 68

##	[323]	110	102	110	118	79	306	81	293	162	192	61	64	137	129
##	[337]	92	114	158	107	81	135	44	86	126	129	135	251	164	437
##	[351]	151	176	318	141	118	121	81	90	117	196	124	355	107	74
##	[365]	64	132	917	112	196	173	628	94	164	415	92	224	129	145
##	[379]	132	203	114	176	114	126	137	295	185	251	230	306	160	155
##	[393]	118	128	234	234	238	339	161	201	155	203	234	295	192	290
##	[407]	247	201	189	180	189	141	145	141	249	176	288	185	169	249
##	[421]	207	169	173	215	176	200	224	238	164	196	151	158	185	215
##	[435]	203	322	211	230	145	189	196	472	272	192	173	395	277	220
##	[449]	164	164	169	184	220	224	220	180	169	523	220	180	266	211
##	[463]	185	230	238	261	274	230	251	266	281	238	251	215	245	224
##	[477]	281	256	266	306	322	207	585	272	756	277	355	256	215	349
##	[491]	295	313	203	569	211	295	372	266	224	346	261	274	234	265
##	[505]	245	596	832	266	261	238	504	224	256	420	819	295	256	375
##	[519]	346	277	247	295	281	326	261	281	420	756	402	274	306	386
##	[533]	238	543	337	295	326	277	749	313	281	295	293	288	256	281
##	[547]	523	341	361	318	339	290	334	472	313	386	322	311	281	318
##	[561]	523	386	318	596	472	349	295	290	355	690	430	409	295	452
##	[575]	343	306	313	349	334	569	395	326	488	523	504	343	313	326
##	[589]	504	355	326	460	341	663	337	724	769	409	642	430	380	442
##	[603]	322	366	326	618	380	504	420	514	442	514	402	326	415	749
##	[617]	514	386	402	897	355	543	334	420	361	343	420	889	618	370
##	[631]	355	361	346	415	395	769	386	420	430	496	361	349	642	504
##	[645]	366	349	663	488	380	395	409	349	442	375	372	366	437	430
##	[659]	554	380	460	395	420	554	596	370	386	395	452	372	442	460
##	[673]	395	430	496	402	482	386	375	460	380	596	442	366	472	409
##	[687]	628	628	716	375	375	769	460	874	430	514	452	514	569	420
##	[701]	472	420	482	739	402	488	605	409	386	402	386	437	979	554
##	[715]	472	409	415	437	724	488	402	442	923	531	460	430	675	496
##	[729]	724	420	482	460	415	452	724	452	536	783	642	472	442	460
##	[743]	569	819	452	442	437	585	460	442	442	504	605	452	531	496
##	[757]	452	460	488	800	849	482	642	460	523	496	472	663	724	642
##	[771]	496	488	703	703	460	756	514	472	642	514	554	482	488	724
##	[785]	514	496	889	569	488	482	531	523	543	675	536	642	504	496
##	[799]	897	531	897	554	585	504	523	675	675	531	716	504	554	543
##	[813]	536	716	569	504	536	514	585	569	523	675	605	569	569	536
##	[827]	554	569	628	536	554	543	543	605	642	585	819	569	769	543
##	[841]	554	569	543	703	536	543	554	663	756	554	605	596	909	569
##	[855]	554	543	554	585	628	675	703	543	569	596	675	618	756	989
##	[869]	554	739	628	663	585	554	596	569	628	585	642	585	605	663
##	[883]	690	690	749	569	663	605	585	675	618	618	663	585	605	897
##	[897]	690	596	703	663	596	642	690	869	628	605	739	605	703	843
##	[911]	605	618	642	628	769	724	628	690	605	703	605	642	819	618
##	[925]	628	618	832	618	663	690	690	628	618	675	716	739	642	739
##	[939]	628	675	703	642	716	663	628	769	675	642	769	642	642	663
##	[953]	756	642	756	642	819	690	642	642	909	675	675	675	675	769
##	[967]	724	800	756	690	690	690	769	703	874	874	703	979	724	832
##	[981]	800	756	690	724	703	783	897	739	716	897	739	783	756	703
##	[995]	724	724	724	739	703	716	948	843	756	724	749	819	970	724
##	[1009]	800	716	769	783	874	739	874	749	800	783	843	800	800	819
##	[1023]	739	756	749	819	800	749	819	769	874	800	783	874	869	756
##	[1037]	970	769	769	973	769	849	800	849	783	956	783	783	800	783
##	[1051]	783	937	800	783	783	783	897	909	800	783	800	832	783	783
##	[1065]	948	849	800	800	874	832	800	800	832	832	819	800	819	897

##	[1079]	923	819	849	819	849	832	832	874	849	832	843	843	832	843
##	[1093]	849	897	849	849	849	869	956	849	979	874	849	849	889	869
##	[1107]	917	849	849	849	849	849	849	869	948	994	874	874	923	985
##	[1121]	909	937	923	897	889	874	874	956	889	874	889	909	889	889
##	[1135]	897	897	917	909	909	948	985	923	917	948	973	909	985	923
##	[1149]	917	923	956	917	923	923	923	923	937	923	937	997	937	923
##	[1163]	923	937	937	937	937	937	937	948	966	956	948	948	956	956
##	[1177]	956	956	956	985	966	966	966	970	973	979	973	973	973	979
##	[1191]	979	998	989	989	989	989	994	994	999	1000	1	4	2	13
##	[1205]	9	12	7	22	33	22	20	25	29	9	6	3	60	32
##	[1219]	14	79	15	26	143	112	27	11	18	16	70	71	5	8
##	[1233]	74	270	19	295	295	388	143	21	90	34	117	154	67	24
##	[1247]	38	28	38	89	56	17	52	74	43	125	204	97	344	59
##	[1261]	150	34	63	55	90	34	53	49	41	90	34	67	119	31
##	[1275]	40	46	235	156	51	106	79	46	99	41	44	154	46	84
##	[1289]	54	29	110	79	71	74	85	56	140	235	102	200	95	143
##	[1303]	99	906	74	190	103	56	190	67	65	130	204	60	273	83
##	[1317]	60	111	119	130	44	95	106	103	195	318	66	87	79	164
##	[1331]	97	164	190	74	204	209	112	134	49	140	112	646	63	289
##	[1345]	161	71	90	130	447	87	90	138	85	99	134	115	127	150
##	[1359]	125	130	150	127	170	122	281	105	127	179	119	147	109	106
##	[1373]	147	216	116	124	184	251	188	209	147	219	122	349	204	117
##	[1387]	184	170	176	164	265	396	134	242	204	235	161	256	174	159
##	[1401]	170	235	179	134	174	197	184	161	138	195	270	159	247	169
##	[1415]	143	179	156	190	200	209	150	256	200	184	156	388	219	335
##	[1429]	200	219	213	242	164	140	179	188	197	247	247	170	213	176
##	[1443]	273	265	318	164	227	265	190	1000	178	225	308	179	247	285
##	[1457]	251	273	213	235	242	242	361	511	197	256	231	227	292	227
##	[1471]	231	251 273	235 219	330 216	362 590	235 273	285 216	209 219	590 308	231 256	292 255	292 265	227 219	281 300
## ##	[1485] [1499]	225 251	273	273	242	231	262	409	486	413	341	281	529	558	265
##	[1513]	409	311	334	335	262	270	300	335	300	381	260	285	300	402
##	[1513]	273	289	260	285	606	353	295	330	318	313	388	503	295	262
##	[1541]	781	281	313	289	388	300	311	318	381	362	850	300	358	375
##	[1555]	324	295	313	313	362	511	339	324	373	330	565	300	344	344
##	[1569]	300	540	308	318	339	413	318	388	313	324	796	362	349	324
##	[1583]	330	437	437	413	324	353	606	457	375	335	503	381	324	480
##	[1597]	503	529	344	480	558	349	424	388	353	754	375	358	471	437
##	[1611]	341	471	409	388	396	353	590	362	409	671	424	646	358	341
##	[1625]	424	369	424	590	344	388	424	349	671	606	770	402	353	558
##	[1639]	471	437	437	362	480	659	781	369	375	447	402	373	375	503
##	[1653]	486	381	457	381	381	495	381	565	369	437	495	369	362	457
##	[1667]	424	447	511	659	413	437	637	471	420	375	471	579	447	715
##	[1681]	457	809	396	471	480	529	420	457	396	402	540	457	402	424
##	[1695]	424	896	413	741	402	396	413	413	396	457	424	511	424	402
##	[1709]	457	503	590	529	520	457	420	437	424	809	424	447	495	424
##	[1723]	447	420	549	549	447	437	486	886	457	447	606	796	471	457
##	[1737]	457	754	447	447	457	495	606	606	880	437	495	958	606	520
##	[1751]	471	457	529	471	480	495	590	503	495	997	486	511	520	520
##	[1765]	520	565	540	529	837	486	486	480	579	486	486	486	796	565
##	[1779]	529	646	921	495	529	511	503	622	511	646	520	520	520	606
##	[1793]	549	770	549	699	540	686	565	503	540	686	529	511	540	637
##	[1807]	754	590	511	989	529	540	565	686	565	558	529	520	715	622
##	[1821]	558	540	558	606	754	565	590	622	606	540	549	671	558	549

```
## [1835]
            549
                  622
                        565
                              565
                                    549
                                          549
                                               565
                                                     715
                                                           671
                                                                 579
                                                                       579
                                                                            579
                                                                                  671
                                                                                        826
   [1849]
            565
                  579
                        590
                              837
                                    659
                                         590
                                               579
                                                     590
                                                           732
                                                                 579
                                                                       622
                                                                            590
                                                                                  741
                                                                                        565
   [1863]
            622
                  671
                        565
                              646
                                    590
                                          637
                                               622
                                                     606
                                                           622
                                                                 579
                                                                       579
                                                                             606
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                                                                                        579
   [1877]
                                    686
                                                           590
                                                                 622
                                                                                  732
                                                                                        606
            590
                  741
                        741
                              590
                                         880
                                               732
                                                     622
                                                                       622
                                                                            606
   [1891]
            606
                  637
                        781
                              646
                                    659
                                          606
                                               732
                                                     622
                                                           637
                                                                 686
                                                                       622
                                                                            622
                                                                                  646
                                                                                        946
   [1905]
            770
                  671
                        715
                              671
                                    646
                                          671
                                               646
                                                     622
                                                           637
                                                                 715
                                                                       671
                                                                            646
                                                                                  896
                                                                                        826
##
   Γ1919
            699
                  754
                        826
                              637
                                    637
                                          659
                                               699
                                                     715
                                                           699
                                                                 637
                                                                       699
                                                                             699
                                                                                  659
                                                                                        646
## [1933]
                        646
                              741
                                                                 699
                                                                                  686
                                                                                        741
            699
                  659
                                    686
                                         671
                                               646
                                                     686
                                                           659
                                                                       659
                                                                            686
##
   [1947]
            659
                  715
                        699
                              659
                                    781
                                          659
                                               796
                                                     671
                                                           671
                                                                 886
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                                                                            671
                                                                                  715
                                                                                        686
   [1961]
            741
                        686
                              699
                                    699
                                          686
                                               699
                                                     770
                                                           699
                                                                 867
                                                                       699
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##
                  732
                                                                                  715
   [1975]
            686
                  754
                        715
                              715
                                    699
                                         741
                                               741
                                                     896
                                                           837
                                                                 754
                                                                       732
                                                                            741
                                                                                  715
                                                                                        741
## [1989]
            715
                              770
                                         826
                                                           754
                                                                       781
                                                                                        715
                  741
                        715
                                    715
                                               754
                                                     781
                                                                 732
                                                                            715
                                                                                  732
## [2003]
                                                                                  796
            781
                  826
                        754
                              809
                                    781
                                         741
                                               781
                                                     932
                                                           932
                                                                 781
                                                                       809
                                                                            754
                                                                                        770
## [2017]
            754
                  754
                        781
                              754
                                    886
                                         826
                                               770
                                                     754
                                                           796
                                                                 770
                                                                       921
                                                                            770
                                                                                  770
                                                                                        754
## [2031]
            809
                  809
                        770
                              896
                                    809
                                         781
                                               781
                                                     781
                                                           826
                                                                 906
                                                                       850
                                                                            796
                                                                                  850
                                                                                        796
## [2045]
            796
                  809
                        984
                              809
                                    796
                                         826
                                               781
                                                     809
                                                           809
                                                                 796
                                                                       796
                                                                            796
                                                                                  809
                                                                                        837
##
   [2059]
            809
                  921
                        809
                              837
                                    826
                                         850
                                               809
                                                     837
                                                           809
                                                                 837
                                                                       809
                                                                            886
                                                                                  906
                                                                                        826
   [2073]
                                    837
##
            837
                  837
                        921
                              826
                                          991
                                               837
                                                     850
                                                           991
                                                                 850
                                                                       932
                                                                            946
                                                                                  850
                                                                                        867
                                                                            896
## [2087]
            921
                  850
                        867
                              932
                                    994
                                         850
                                               886
                                                     837
                                                           867
                                                                 850
                                                                       850
                                                                                  880
                                                                                        850
## [2101]
                                                                                        880
            850
                  867
                        850
                              867
                                    850
                                         850
                                               969
                                                     850
                                                           932
                                                                 867
                                                                       867
                                                                            867
                                                                                  867
## [2115]
            958
                  886
                        867
                              886
                                    867
                                          921
                                               880
                                                     867
                                                           886
                                                                 906
                                                                       880
                                                                            984
                                                                                  946
                                                                                        886
## [2129]
            906
                  969
                        886
                              906
                                    896
                                          906
                                               896
                                                     906
                                                           906
                                                                 906
                                                                       946
                                                                            896
                                                                                  906
                                                                                        896
## [2143]
            896
                        906
                              946
                                    981
                                         989
                                                     906
                                                           932
                                                                 921
                                                                       906
                                                                                  984
                                                                                        921
                  946
                                               958
                                                                            906
## [2157]
            932
                  932
                        921
                              946
                                    921
                                          921
                                               932
                                                     932
                                                           932
                                                                 932
                                                                       946
                                                                            994
                                                                                  932
                                                                                        946
## [2171]
            958
                                                                       969
                  932
                        984
                              975
                                    999
                                         946
                                               969
                                                     958
                                                           946
                                                                 946
                                                                            958
                                                                                  975
                                                                                        958
## [2185]
            991
                  975
                        958
                              958
                                    958
                                         958
                                               984
                                                     969
                                                           998
                                                                 975
                                                                       994
                                                                            969
                                                                                  981
                                                                                        975
## [2199]
            975
                  981
# Recode "Year" into categories (e.g., "New", "Middle-aged", "Old")
df$YearGroup <- cut(df$year, breaks = c(0, 2014, 2016, Inf), labels = c("Old", "Middle-aged", "New"))
df$YearGroup
                                                                                 Old
##
       [1] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
##
       [7] 01d
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
      [13] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
      [19] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
      [25] 01d
                         01d
                                       01d
                                                     01d
                                                                   Old
                                                                                 Old
##
      [31] Old
                                       01d
                                                     01d
                         01d
                                                                   Old
                                                                                 01d
##
      [37] 01d
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
      [43] 01d
##
                         01d
                                       01d
                                                     01d
                                                                   Old
                                                                                 Old
##
      [49] 01d
                         Old
                                       01d
                                                     01d
                                                                   Old
                                                                                 Old
##
      [55] Old
                         01d
                                       Old
                                                     01d
                                                                   01d
                                                                                 01d
      [61] Old
##
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
      [67] Old
##
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
      [73] Old
                                       01d
                                                     01d
                         01d
                                                                   01d
                                                                                 01d
##
      [79] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
      [85] Old
                         01d
                                       Old
                                                     01d
                                                                   01d
                                                                                 01d
##
      [91] Old
                                       01d
                                                     01d
                                                                                 01d
                         01d
                                                                   01d
##
      [97] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
##
     [103] Old
                                       01d
                                                     01d
                                                                                 01d
                         Old
                                                                   Old
##
    [109] Old
                         01d
                                       01d
                                                     01d
                                                                   01d
                                                                                 01d
```

01d

01d

01d

01d

01d

Old

01d

01d

01d

01d

01d

01d

##

##

[115] Old

[121] Old

[127] Old

01d

01d

01d

##	[133]	014	Old	Old	Old	Old	01d
##	[139]	Old	Old	Old	Old	Old	Old
##	[145]	Old	Old	Old	Old	Old	Old
##	[151]	Old	Old	Old	Old	Old	Old
##	[157]	Old	Old	Old	Old	Old	01d
##	[163]	Old	Old	Old	Old	Old	Old
##	[169]	Old	Old	Old	Old	Old	01d
##	[175]	Old	Old	Old	Old	Old	01d
##	[181]	Old	Old	Old	Old	Old	01d
##		Old	Old	Old	Old	Old	01d
##	[193]	Old	Old	Old	Old	Old	01d
##	[199]	Old	Old	Old	Old	Old	01d
##	[205]	01d	01d	01d	Old	01d	Old
##	[211]	01d	01d	Old	Old	01d	01d
##	[217]	01d	01d	Old	Old	01d	01d
##	[223]	Old	Old	Old	Old	Old	01d
##	[229]	Old	Old	Old	Old	Old	Old
##	[235]	Old	Old	Old	Old	Old	Old
##	[241]	Old	Old	Old	Old	Old	01d
##	[247]	Old	Old	Old	Old	Old	Old
##	[253]	Old	Old	Old	Old	Old	01d
##	[259]	Old	Old	Old	Old	Old	01d
##	[265]	01d	01d	01d	Old	01d	Old
##	[271]	01d	01d	01d	01d	01d	Old
##	[277]	Old	Old	Old	Old	Old	01d
##	[283]	Old	Old	Old	Old	Old	01d
##	[289]	01d	Old	Old	Old	Old	01d
##	[295]	01d	Old	Old	Old	Old	01d
##	[301]	01d	Old	Old	Old	Old	01d
##	[307]	01d	Old	Old	Old	Old	01d
##	[313]	01d	Old	01d	01d	Old	01d
##	[319]	01d	01d	01d	01d	01d	01d
##	[325]	01d	01d	01d	01d	01d	01d
##	[331]	01d	01d	01d	01d	01d	01d
##	[337]	01d	01d	01d	01d	01d	01d
##	[343]	01d	01d	01d	01d	01d	01d
##		01d	01d	01d	01d	01d	01d
##		01d	01d	01d	01d	01d	01d
##	[361]		01d	01d	01d	01d	01d
##	[367]		01d	01d	01d	01d	01d
##	[373]		01d	01d	01d	01d	01d
##	[379] [385]		01d 01d	01d 01d	01d 01d	01d 01d	01d 01d
## ##	[391]	01d	Old	Old	Old	Old	01d
##	[397]		Old	Old	Old	Old	01d
##	[403]		Old	Old	Old	Old	01d
##	[409]		Old	Old	Old	Old	01d
##		Old	Old	Old	Old	Old	01d
##	[421]		Old	Old	Old	Old	Old
##	[427]		Old	Old	Old	Old	01d
##	[433]		Old	Old	Old	Old	Old
##	[439]		Old	Old	Old	Old	01d
##		Old	01d	01d	Old	01d	Old
##	[451]	Old	Old	Old	01d	Old	01d

##	[457]	014	Old	Old	Old	Old	Old
##	[463]	Old	Old	Old	Old	Old	Old
##	[469]	Old	Old	Old	Old	Old	Old
##	[475]	Old	Old	Old	Old	Old	Old
##	[481]	Old	Old	Old	Old	Old	01d
##	[487]	Old	Old	Old	Old	Old	Old
##	[493]	Old	Old	Old	Old	Old	01d
##	[499]	Old	Old	Old	Old	Old	01d
##	[505]	Old	Old	Old	Old	Old	01d
##		Old	Old	Old	Old	Old	Old
##		Old	Old	Old	Old	Old	01d
##	[523]	Old	Old	Old	Old	Old	01d
##	[529]	Old	Old	Old	Old	Old	01d
##	[535]	Old	Old	Old	Old	Old	01d
##	[541]	Old	Old	Old	Old	Old	01d
##	[547]	Old	Old	Old	Old	Old	01d
##	[553]	Old	Old	Old	Old	Old	01d
##	[559]	Old	Old	Old	Old	Old	01d
##	[565]	01d	01d	01d	01d	01d	Old
##	[571]	01d	01d	01d	01d	01d	01d
##	[577]	01d	01d	01d	01d	01d	01d
##	[583]	Old	Old	Old	Old	Old	01d
##	[589]	Old	Old	Old	Old	Old	01d
##	[595]	Old	Old	Old	Old	Old	Old
##	[601]	Old	Old	Old	Old	Old	01d
##	[607]	01d	01d	Old	01d	01d	01d
##	[613]	01d	01d	01d	01d	01d	Old
##	[619]	01d	01d	01d	01d	01d	Old
##	[625]	01d	01d	01d	01d	01d	Old
##	[631]	Old	01d	01d	Old	Old	01d
##	[637]	Old	Old	Old	Old	Old	01d
##	[643]	Old	Old	Old	Old	Old	01d
##	[649]	Old	Old	Old	Old	Old	01d
##	[655]	Old	Old	Old	Old	Old	01d
##	[661]	Old	Old	Old	Old	Old	01d
##	[667]	Old	Old	Old	Old	Old	01d
##		Old	Old	Old	Old	Old	Old
##	[679]		Old	Old	Old	Old	01d
##	[685]		Old	01d	01d	01d	01d
##	[691]		Old	01d	01d	01d	01d
##	[697]		01d	01d	01d	01d	01d
##	[703]		01d	01d	01d	01d	01d
##	[709]		01d	01d	01d	01d	01d
##	[715]		01d	01d	01d	01d	01d
##		01d	01d 01d	01d 01d	01d 01d	01d 01d	01d 01d
##		01d	Old	Old	Old	Old	Old
## ##	[739]	01d	Old	Old	Old	Old	Old
##		Old	Old	Old	Old	Old	Old
##	[751]		Old	Old	Old	Old	01d
##	[757]		Old	Old	Old	Old	01d
##	[763]		Old	Old	Old	Old	01d
##	[769]		Old	Old	Old	Old	Old
##	[775]		Old	Old	Old	Old	Old

##	[781]		Old	01d	01d	Old	01d
##	[787]	Old	Old	Old	Old	Old	01d
##	[793]	Old	Old	Old	01d	01d	01d
##	[799]	Old	Old	Old	Old	Old	01d
##	[805]	Old	Old	Old	01d	01d	Old
##	[811]	Old	Old	Old	Old	Old	01d
##	[817]	01d	Old	Old	Old	Old	01d
##	[823]	Old	Old	Old	Old	01d	Old
##	[829]	Old	Old	Old	01d	Old	01d
##	[835]	Old	Old	Old	Old	Old	Old
##	[841]	Old	Old	Old	Old	Old	01d
##	[847]	Old	Old	Old	Old	Old	01d
##	[853]	Old	Old	Old	Old	Old	01d
##	[859]	Old	Old	Old	Old	Old	Old
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## Levels: Old Middle-aged New
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```
# Transform "Points" by squaring each value
df$Squared <- df$broad_impact^2
df$broad_impact</pre>
```

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##	[1093]	849	897	849	849	849	869	956	849	979	874	849	849	889	869
##	[1107]	917	849	849	849	849	849	849	869	948	994	874	874	923	985
##	[1121]	909	937	923	897	889	874	874	956	889	874	889	909	889	889
		555	551	020	001	555	0,1	011	550	555	0,1	555	555	550	550

##	[1135]	897	897	917	909	909	948	985	923	917	948	973	909	985	923
##	[1149]	917	923	956	917	923	923	923	923	937	923	937	997	937	923
##	[1163]	923	937	937	937	937	937	937	948	966	956	948	948	956	956
##	[1177]	956	956	956	985	966	966	966	970	973	979	973	973	973	979
##	[1191]	979	998	989	989	989	989	994	994	999	1000	1	4	2	13
##	[1205]	9	12	7	22	33	22	20	25	29	9	6	3	60	32
##	[1219]	14	79	15	26	143	112	27	11	18	16	70	71	5	8
##	[1233]	74	270	19	295	295	388	143	21	90	34	117	154	67	24
##	[1247]	38	28	38	89	56	17	52	74	43	125	204	97	344	59
##	[1261]	150	34	63	55	90	34	53	49	41	90	34	67	119	31
##	[1275]	40	46	235	156	51	106	79	46	99	41	44	154	46	84
##	[1289]	54	29	110	79	71	74	85	56	140	235	102	200	95	143
##	[1303]	99	906	74	190	103	56	190	67	65	130	204	60	273	83
##	[1317]	60	111	119	130	44	95	106	103	195	318	66	87	79	164
##	[1331]	97	164	190	74	204	209	112	134	49	140	112	646	63	289
##	[1345]	161	71	90	130	447	87	90	138	85	99	134	115	127	150
##	[1359]	125	130	150	127	170	122	281	105	127	179	119	147	109	106
##	[1373]	147	216	116	124	184	251	188	209	147	219	122	349	204	117
##	[1387]	184	170	176	164	265	396	134	242	204	235	161	256	174	159
##	[1401]	170	235	179	134	174	197	184	161	138	195	270	159	247	169
##	[1415]	143	179	156	190	200	209	150	256	200	184	156	388	219	335
##	[1429]	200	219	213	242	164	140	179	188	197	247	247	170	213	176
##	[1443]	273	265	318	164	227	265	190	1000	178	225	308	179	247	285
##	[1457]	251	273	213	235	242	242	361	511	197	256	231	227	292	227
##	[1471]	231	251	235	330	362	235	285	209	590	231	292	292	227	281
##	[1485]	225	273	219	216	590	273	216	219	308	256	255	265	219	300
##	[1499]	251	273	273	242	231	262	409	486	413	341	281	529	558	265
##	[1513]	409	311	334	335	262	270	300	335	300	381	260	285	300	402
##	[1527]	273	289	260	285	606	353	295	330	318	313	388	503	295	262
##	[1541]	781	281	313	289	388	300	311	318	381	362	850	300	358	375
##	[1555]	324	295	313	313	362	511	339	324	373	330	565	300	344	344
##	[1569]	300	540	308	318	339	413	318	388	313	324	796	362	349	324
##	[1583]	330	437	437	413	324	353	606	457	375	335	503	381	324	480
##	[1597]	503	529	344	480	558	349	424	388	353	754	375	358	471	437
##	[1611]	341	471	409	388	396	353	590	362	409	671	424	646	358	341
##	[1625]	424	369	424	590	344	388	424	349	671	606	770	402	353	558
##	[1639]	471	437	437	362	480	659	781	369	375	447	402	373	375	503
##	[1653]	486	381	457	381	381	495	381	565	369	437	495	369	362	457
##	[1667]	424	447	511	659	413	437	637	471	420	375	471	579	447	715
##	[1681]	457	809	396	471	480	529	420	457	396	402	540	457	402	424
##	[1695]	424	896	413	741	402	396	413	413	396	457	424	511	424	402
##	[1709]	457	503	590	529	520	457	420	437	424	809	424	447	495	424
##	[1723]	447	420	549	549	447	437	486	886	457	447	606	796	471	457
##	[1737]	457	754	447	447	457	495	606	606	880	437	495	958	606	520
##	[1751]	471	457	529	471	480	495	590	503	495	997	486	511	520	520
##	[1765]	520	565	540	529	837	486	486	480	579	486	486	486	796	565
##	[1779]	529	646	921	495	529	511	503	622	511	646	520	520	520	606
##	[1793]	549	770	549	699	540	686	565	503	540	686	529	511	540	637
##	[1807]	754	590	511	989	529	540	565	686	565	558	529	520	715	622
##	[1821]	558	540	558	606	754	565	590	622	606	540	549	671	558	549
##	[1835]	549	622	565	565	549	549	565	715	671	579	579	579	671	826
##	[1849]	565	579	590	837	659	590	579	590	732	579	622	590	741	565
##	[1863]	622	671	565	646	590	637	622	606	622	579	579	606	671	579
##	[1877]	590	741	741	590	686	880	732	622	590	622	622	606	732	606

##	[1891]	606	637	781	646	659	606	732	622	637	686	622	622	646	946
##	[1905]	770	671	715	671	646	671	646	622	637	715	671	646	896	826
##	[1919]	699	754	826	637	637	659	699	715	699	637	699	699	659	646
##	[1933]	699	659	646	741	686	671	646	686	659	699	659	686	686	741
##	[1947]	659	715	699	659	781	659	796	671	671	886	699	671	715	686
##	[1961]	741	732	686	699	699	686	699	770	699	867	699	732	715	837
##	[1975]	686	754	715	715	699	741	741	896	837	754	732	741	715	741
##	[1989]	715	741	715	770	715	826	754	781	754	732	781	715	732	715
##	[2003]	781	826	754	809	781	741	781	932	932	781	809	754	796	770
##	[2017]	754	754	781	754	886	826	770	754	796	770	921	770	770	754
##	[2031]	809	809	770	896	809	781	781	781	826	906	850	796	850	796
##	[2045]	796	809	984	809	796	826	781	809	809	796	796	796	809	837
##	[2059]	809	921	809	837	826	850	809	837	809	837	809	886	906	826
##	[2073]	837	837	921	826	837	991	837	850	991	850	932	946	850	867
##	[2087]	921	850	867	932	994	850	886	837	867	850	850	896	880	850
##	[2101]	850	867	850	867	850	850	969	850	932	867	867	867	867	880
##	[2115]	958	886	867	886	867	921	880	867	886	906	880	984	946	886
##	[2129]	906	969	886	906	896	906	896	906	906	906	946	896	906	896
##	[2143]	896	946	906	946	981	989	958	906	932	921	906	906	984	921
##	[2157]	932	932	921	946	921	921	932	932	932	932	946	994	932	946
##	[2171]	958	932	984	975	999	946	969	958	946	946	969	958	975	958
##	[2185]	991	975	958	958	958	958	984	969	998	975	994	969	981	975
##	[2199]	975	981												