

## ----- Standardized Data -----

Obs	school	x1	x2	x3	x4	x5	x6
1	Harvard	1.23256	0.74715	-1.27742	-0.42288	0.84139	1.13494
2	Princeto	1.00185	0.74715	-1.27742	-1.16046	0.19633	0.91413
3	Yale	1.00185	0.95297	-1.02396	-0.42288	1.11793	1.02453
4	Stanford	0.86342	0.69569	-0.97327	-0.17702	0.62822	0.69333
5	MIT	1.04799	0.90152	-0.46636	-0.66874	0.51869	0.47252
6	Duke	0.44814	0.69569	-0.46636	-0.17702	0.29096	0.91413
7	CalTech	1.37099	1.21026	-0.71981	-1.65218	2.50865	-0.63150
8	Dartmout	0.67885	0.64423	-0.82120	-0.66874	0.33096	0.91413
9	Brown	0.40199	0.64423	-0.87189	0.06884	-0.32472	0.80373
10	JohnsHop	0.35585	-0.07616	0.24332	-1.40632	2.17007	0.03091
11	UChicago	0.21742	-0.07616	0.54746	0.06884	0.76202	0.03091
12	UPenn	0.17128	0.18113	-0.16221	-0.42288	0.01144	0.36212
13	Cornell	0.12514	0.33550	-0.31429	0.06884	-0.38295	0.36212
14	Northwes	-0.05943	0.43841	-0.01014	-0.42288	0.04603	0.25172
15	Columbia	0.40199	-0.02470	-0.77051	-0.17702	0.28576	0.14132
16	NotreDam	-0.10557	0.23258	0.14194	0.06884	-0.85034	0.80373
17	UVir	-0.38243	0.02676	0.24332	0.31470	-0.97325	0.58292
18	Georgeto	-0.10557	-0.12761	-0.77051	-0.17702	-0.50344	0.58292
19	Carnegie	-0.05943	-0.74509	1.00368	-0.91460	-0.16374	-1.62512
20	UMichiga	-0.79771	-0.59072	1.45991	0.80642	-0.82621	-0.18989
21	UCBerkel	-0.24400	0.95297	0.04055	1.05228	-0.84909	-0.96271
22	UWiscons	-1.67442	-1.87713	1.51060	0.56056	-1.07668	-1.73553
23	PennStat	-1.71134	-1.98004	0.75023	1.29814	-1.19259	-0.74190
24	Purdue	-2.41270	-2.49461	2.57511	1.54400	-1.27017	-1.95633
25	TexasA&M	-1.76671	-1.41402	1.40921	3.01917	-1.29526	-2.17713

## ----- Part A: Hierarchical Clustering With Average Linkage -----

**The CLUSTER Procedure**  
**Average Linkage Cluster Analysis**

Eigenvalues of the Covariance Matrix				
	Eigenvalue	Difference	Proportion	Cumulative
1	4.61208506	3.82526891	0.7687	0.7687
2	0.78681615	0.50025429	0.1311	0.8998
3	0.28656186	0.12278175	0.0478	0.9476
4	0.16378011	0.03947391	0.0273	0.9749
5	0.12430620	0.09785557	0.0207	0.9956
6	0.02645063		0.0044	1.0000

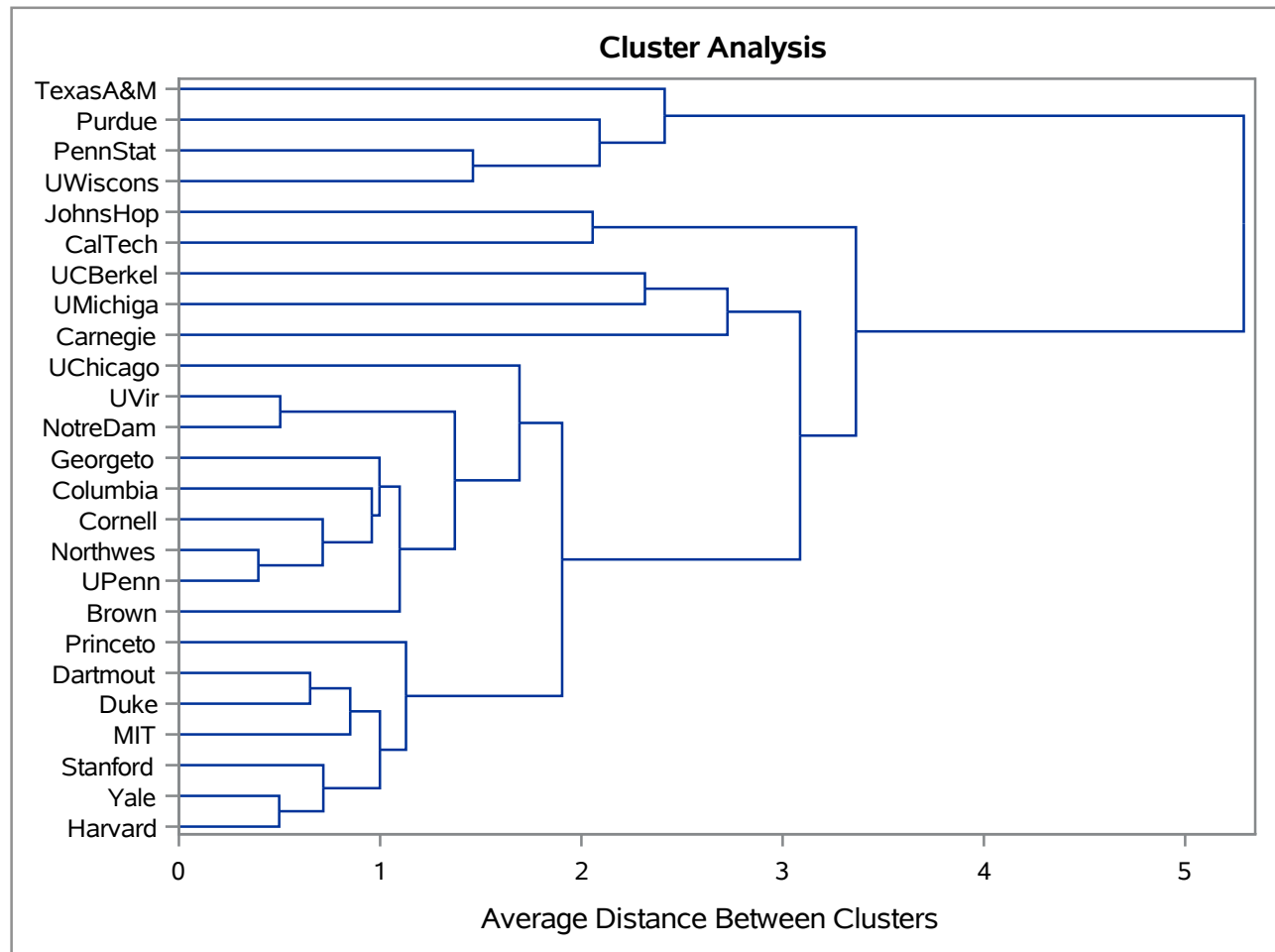
Root-Mean-Square Total-Sample Standard Deviation	1
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Cluster History					
Number of Clusters	Clusters Joined		Freq	RMS Distance	Tie
24	UPenn	Northwes	2	0.3949	
23	Harvard	Yale	2	0.4985	
22	NotreDam	UVir	2	0.5036	
21	Duke	Dartmout	2	0.6521	
20	CL24	Cornell	3	0.7147	
19	CL23	Stanford	3	0.7177	
18	MIT	CL21	3	0.8513	
17	CL20	Columbia	4	0.9586	
16	CL17	Georgeto	5	0.9968	
15	CL19	CL18	6	0.999	
14	Brown	CL16	6	1.0972	
13	CL15	Princeto	7	1.1285	
12	CL14	CL22	8	1.3712	
11	UWiscons	PennStat	2	1.4611	
10	CL12	UChicago	9	1.6924	
9	CL13	CL10	16	1.9044	
8	CalTech	JohnsHop	2	2.0559	
7	CL11	Purdue	3	2.0906	
6	UMichiga	UCBerkel	2	2.3157	
5	CL7	TexasA&M	4	2.4139	
4	Carnegie	CL6	3	2.7258	
3	CL9	CL4	19	3.0866	

----- Part A: Hierarchical Clustering With Average Linkage -----

**The CLUSTER Procedure**  
**Average Linkage Cluster Analysis**

Cluster History					
Number of Clusters	Clusters Joined		Freq	RMS Distance	Tie
2	CL3	CL8	21	3.3643	
1	CL2	CL5	25	5.2914	



----- PCA to see how many cluster to use for k-mean clustering -----

The PRINCOMP Procedure

Observations	25
Variables	6

Simple Statistics						
	x1	x2	x3	x4	x5	x6
Mean	0.000000000	0.000000000	0.000000000	0.000000000	0.000000000	0.000000000
Std	1.000000000	1.000000000	1.000000000	1.000000000	1.000000000	1.000000000

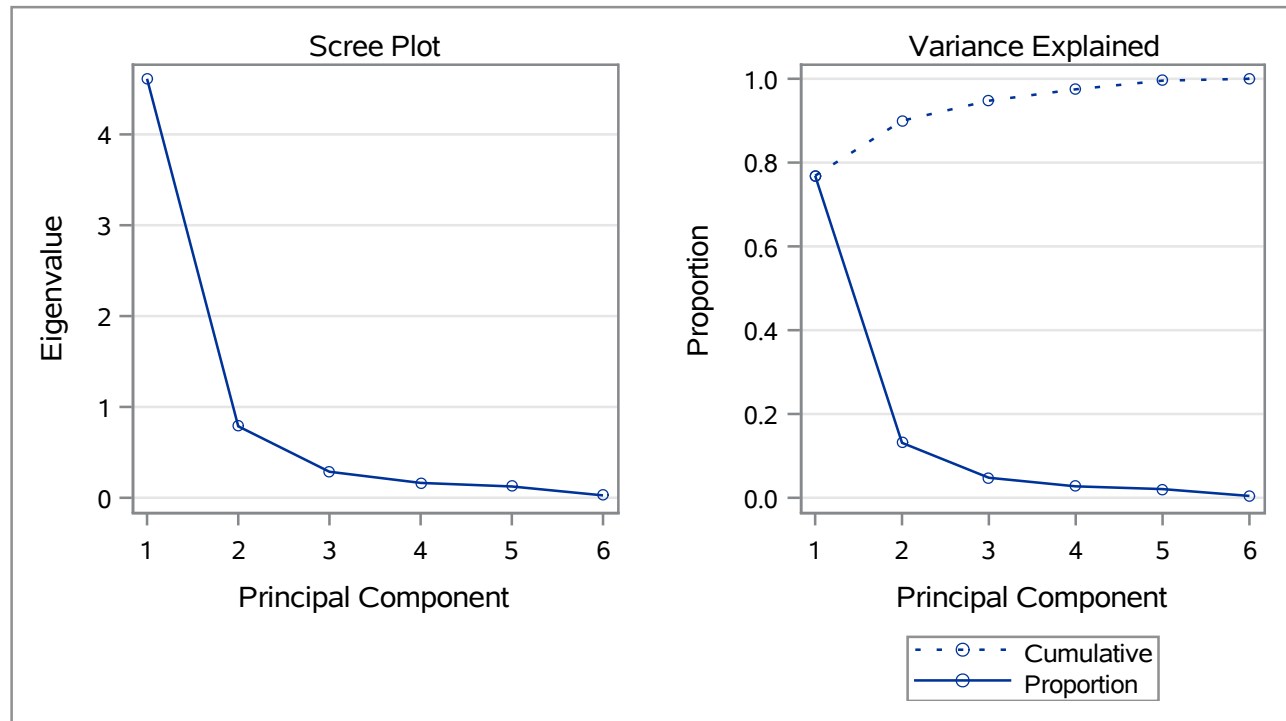
Correlation Matrix							
		x1	x2	x3	x4	x5	x6
x1	Average SAT	1.0000	0.9225	-.8858	-.8126	0.7790	0.7477
x2	Top 10%	0.9225	1.0000	-.8592	-.6434	0.6115	0.7459
x3	% Accepted	-.8858	-.8592	1.0000	0.6317	-.5584	-.8195
x4	Student Faculty Ratio	-.8126	-.6434	0.6317	1.0000	-.7818	-.5609
x5	Estimated Annual Expense	0.7790	0.6115	-.5584	-.7818	1.0000	0.3936
x6	Graduation Rate %	0.7477	0.7459	-.8195	-.5609	0.3936	1.0000

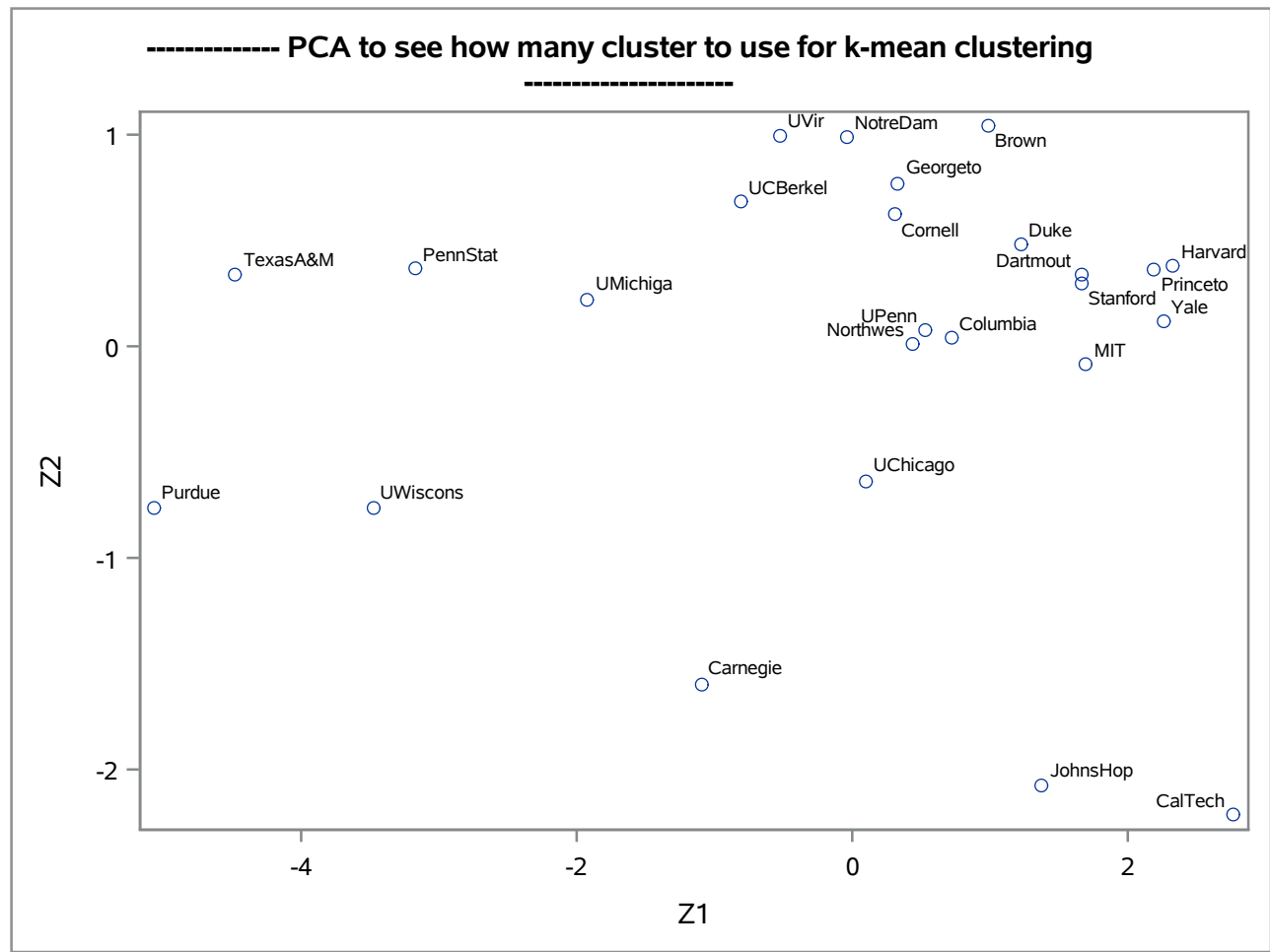
Eigenvalues of the Correlation Matrix				
	Eigenvalue	Difference	Proportion	Cumulative
1	4.61208506	3.82526891	0.7687	0.7687
2	0.78681615	0.50025429	0.1311	0.8998
3	0.28656186	0.12278175	0.0478	0.9476
4	0.16378011	0.03947391	0.0273	0.9749
5	0.12430620	0.09785557	0.0207	0.9956
6	0.02645063		0.0044	1.0000

Eigenvectors							
		Prin1	Prin2	Prin3	Prin4	Prin5	Prin6
x1	Average SAT	0.457749	-.039680	0.187039	-.131240	0.020646	0.858055
x2	Top 10%	0.427144	0.199932	0.497809	-.374896	0.482016	-.396075
x3	% Accepted	-.424308	-.320893	-.156279	-.061287	0.801094	0.216934
x4	Student Faculty Ratio	-.390648	0.432564	0.606081	0.507391	0.076824	0.172048
x5	Estimated Annual Expense	0.362523	-.634486	0.204741	0.623401	0.072548	-.173763
x6	Graduation Rate %	0.379404	0.515554	-.532473	0.438633	0.338110	-.003538

----- PCA to see how many cluster to use for k-mean clustering -----

The PRINCOMP Procedure





## ----- Part B: K-mean Clustering, Seeds=first 3 observations with Radius r=1.5 -----

**The FASTCLUS Procedure**  
**Replace=NONE Radius=1.5 Maxclusters=3 Maxiter=10 Converge=0.02**

Initial Seeds						
Cluster	x1	x2	x3	x4	x5	x6
1	1.232560743	0.747147830	-1.277417094	-0.422879796	0.841393297	1.134936246
2	1.370988499	1.210255988	-0.719814394	-1.652181530	2.508651168	-0.631501491
3	0.401994205	0.644234905	-0.871887858	0.068840897	-0.324716668	0.803729170

Minimum Distance Between Initial Seeds =	1.60505
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Iteration History				
Iteration	Criterion	Relative Change in Cluster Seeds		
		1	2	3
1	1.0566	0.3528	0.6405	1.3235
2	0.7228	0.2147	0	0.2621
3	0.6772	0.2498	0	0.4461
4	0.6121	0.1140	0	0.3330
5	0.5837	0.0715	0	0.2120
6	0.5730	0.0916	0	0.2764
7	0.5639	0	0	0

Convergence criterion is satisfied.
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Criterion Based on Final Seeds =	0.5639
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Cluster Summary						
Cluster	Frequency	RMS Std Deviation	Maximum Distance from Seed to Observation	Radius Exceeded	Nearest Cluster	Distance Between Cluster Centroids
1	17	0.5116	2.3526	> Radius	2	2.8166
2	2	0.5935	1.0280		1	2.8166
3	6	0.8258	2.6781	> Radius	1	4.1582

Statistics for Variables				
Variable	Total STD	Within STD	R-Square	RSQ/(1-RSQ)
x1	1.00000	0.60488	0.664607	1.981578
x2	1.00000	0.51417	0.757661	3.126453
x3	1.00000	0.57444	0.697514	2.305942
x4	1.00000	0.74026	0.497680	0.990762

## ----- Part B: K-mean Clustering, Seeds=first 3 observations with Radius r=1.5 -----

The FASTCLUS Procedure  
 Replace=NONE Radius=1.5 Maxclusters=3 Maxiter=10 Converge=0.02

Statistics for Variables				
Variable	Total STD	Within STD	R-Square	RSQ/(1-RSQ)
x5	1.00000	0.57695	0.694871	2.277300
x6	1.00000	0.57185	0.700242	2.336026
OVER-ALL	1.00000	0.60112	0.668763	2.018982

Pseudo F Statistic =	22.21
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Approximate Expected Over-All R-Squared =	0.34659
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Cubic Clustering Criterion =	12.073
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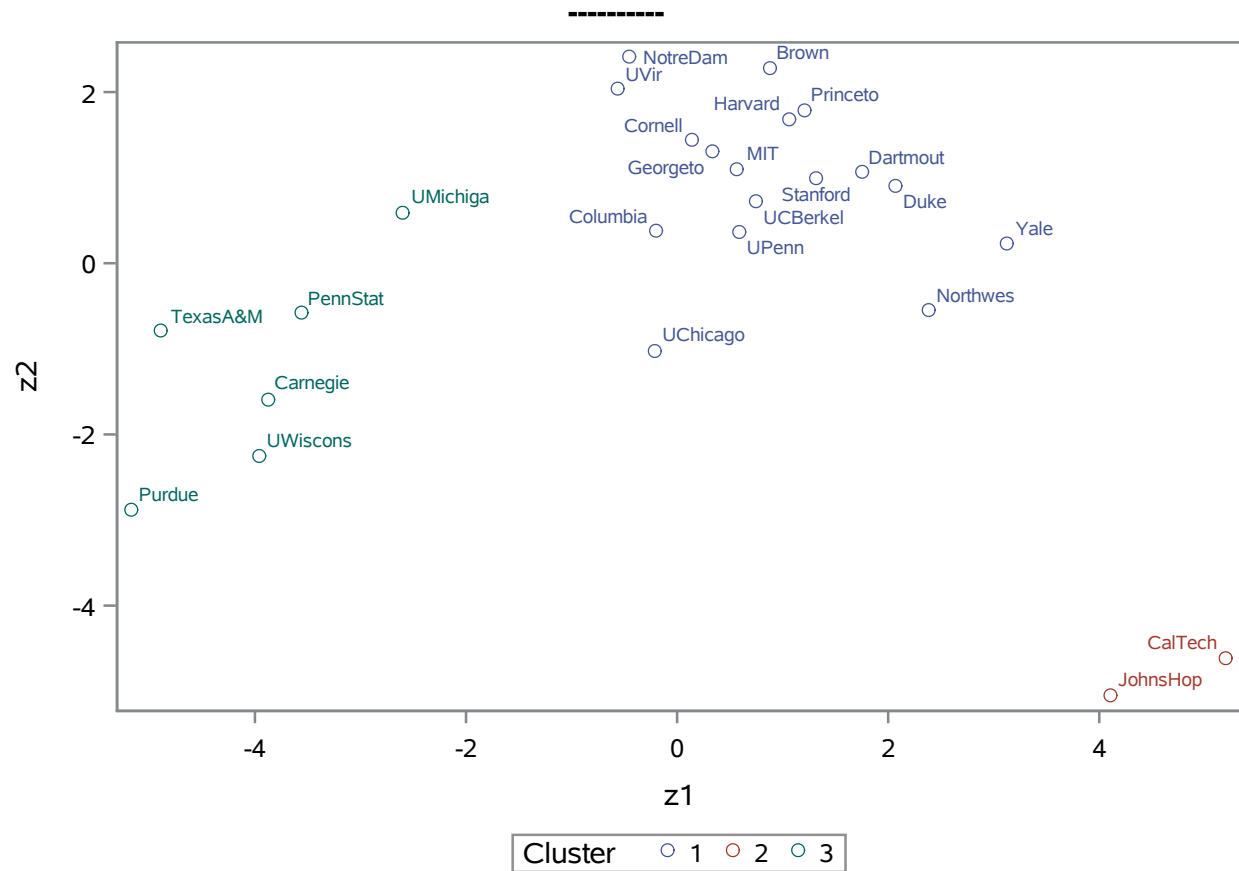
**WARNING: The two values above are invalid for correlated variables.**

Cluster Means						
Cluster	x1	x2	x3	x4	x5	x6
1	0.393851395	0.468677564	-0.484249617	-0.191481823	0.067408029	0.530970402
2	0.863420059	0.567050212	-0.238248426	-1.529251357	2.339360369	-0.300294415
3	-1.403718973	-1.516936502	1.451456725	1.052282284	-0.970776205	-1.404318001

Cluster Standard Deviations						
Cluster	x1	x2	x3	x4	x5	x6
1	0.502624751	0.372863597	0.549754036	0.479826153	0.629396603	0.500047199
2	0.717810172	0.909630332	0.681037123	0.173849518	0.239413344	0.468397538
3	0.835711735	0.743541426	0.626126394	1.291644595	0.430706882	0.771237721



----- Part B: K-mean Clustering, Seeds=first 3 observations with Radius  $r=1.5$



----- Part B: K-mean Clustering, Seeds=first 3 observations with Radius  $r=1.5$  -----

Obs	school	CLUSTER	DISTANCE
1	Duke	1	0.50179
2	UPenn	1	0.56667
3	Cornell	1	0.64648
4	Brown	1	0.69071
5	Columbia	1	0.72467
6	Northwes	1	0.75043
7	Dartmout	1	0.81831
8	Stanford	1	0.92317
9	Georgeto	1	1.00782
10	MIT	1	1.02490
11	NotreDam	1	1.29680
12	Princeto	1	1.47603
13	UChicago	1	1.48078
14	Yale	1	1.51533
15	Harvard	1	1.55803
16	UVir	1	1.63375
17	UCBerkel	1	2.35262
18	CalTech	2	1.02797
19	JohnsHop	2	1.02797
20	UWiscons	3	0.75447
21	PennStat	3	1.16158
22	UMichiga	3	1.66774
23	Purdue	3	1.96790
24	TexasA&M	3	2.17147
25	Carnegie	3	2.67807

----- Part C: Use Average Linkage to get cluster centroids as seeds -----

Obs	school	CLUSTER
1	UPenn	1
2	Northwes	1
3	Harvard	1
4	Yale	1
5	NotreDam	1
6	UVir	1
7	Duke	1
8	Dartmout	1
9	Cornell	1
10	Stanford	1
11	MIT	1
12	Columbia	1
13	Georgeto	1
14	Brown	1
15	Princeto	1
16	UChicago	1
17	UMichiga	1
18	UCBerkel	1
19	Carnegie	1
20	UWiscons	2
21	PennStat	2
22	Purdue	2
23	TexasA&M	2
24	CalTech	3
25	JohnsHop	3

## ----- Part C: Use Average Linkage to get cluster centroids as seeds -----

## The MEANS Procedure

## CLUSTER=1

Variable	Label	N	Mean	Std Dev	Minimum	Maximum
x1	Average SAT	19	0.3072805	0.5540257	-0.7977130	1.2325607
x2	Top 10%	19	0.3490373	0.5026612	-0.7450896	0.9529737
x3	% Accepted	19	-0.3036133	0.7531194	-1.2774171	1.4599053
x4	Student Faculty Ratio	19	-0.1770194	0.5374047	-1.1604608	1.0522823
x5	Estimated Annual Expense	19	0.0082095	0.6290930	-0.9732488	1.1179293
x6	Graduation Rate %	19	0.3795517	0.6965594	-1.6251227	1.1349362

## CLUSTER=2

Variable	Label	N	Mean	Std Dev	Minimum	Maximum
x1	Average SAT	4	-1.8912923	0.3496703	-2.4127035	-1.6744221
x2	Top 10%	4	-1.9414523	0.4433923	-2.4946093	-1.4140236
x3	% Accepted	4	1.5612876	0.7552812	0.7502291	2.5751107
x4	Student Faculty Ratio	4	1.6054681	1.0309535	0.5605616	3.0191651
x5	Estimated Annual Expense	4	-1.2086753	0.0982505	-1.2952618	-1.0766812
x6	Graduation Rate %	4	-1.6527233	0.6334120	-2.1771345	-0.7419038

## CLUSTER=3

Variable	Label	N	Mean	Std Dev	Minimum	Maximum
x1	Average SAT	2	0.8634201	0.7178102	0.3558516	1.3709885
x2	Top 10%	2	0.5670502	0.9096303	-0.0761556	1.2102560
x3	% Accepted	2	-0.2382484	0.6810371	-0.7198144	0.2433175
x4	Student Faculty Ratio	2	-1.5292514	0.1738495	-1.6521815	-1.4063212
x5	Estimated Annual Expense	2	2.3393604	0.2394133	2.1700696	2.5086512
x6	Graduation Rate %	2	-0.3002944	0.4683975	-0.6315015	0.0309127

## ----- Part C: Use Average Linkage to get cluster centroids as seeds -----

**The FASTCLUS Procedure**  
**Replace=FULL Radius=0 Maxclusters=3 Maxiter=50 Converge=0.02**

Initial Seeds						
Cluster	x1	x2	x3	x4	x5	x6
1	0.307280476	0.349037307	-0.303613336	-0.177019450	0.008209498	0.379551687
2	-1.891292293	-1.941452315	1.561287560	1.605468064	-1.208675301	-1.652723308
3	0.863420059	0.567050212	-0.238248426	-1.529251357	2.339360369	-0.300294415

Minimum Distance Between Initial Seeds =	2.843603
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Iteration History				
Iteration	Criterion	Relative Change in Cluster Seeds		
		1	2	3
1	0.5733	0.0524	0.1716	0
2	0.5639	0	0	0

Convergence criterion is satisfied.
-------------------------------------

Criterion Based on Final Seeds =	0.5639
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Cluster Summary						
Cluster	Frequency	RMS Std Deviation	Maximum Distance from Seed to Observation	Radius Exceeded	Nearest Cluster	Distance Between Cluster Centroids
1	18	0.5751	2.8518		3	2.7765
2	5	0.7028	1.9523		1	4.4267
3	2	0.5935	1.0280		1	2.7765

Statistics for Variables				
Variable	Total STD	Within STD	R-Square	RSQ/(1-RSQ)
x1	1.00000	0.52548	0.746877	2.950651
x2	1.00000	0.54325	0.729474	2.696505
x3	1.00000	0.64350	0.620416	1.634466
x4	1.00000	0.59951	0.670534	2.035216
x5	1.00000	0.54739	0.725333	2.640773
x6	1.00000	0.72382	0.519743	1.082220
OVER-ALL	1.00000	0.60115	0.668730	2.018683

Pseudo F Statistic =	22.21
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## ----- Part C: Use Average Linkage to get cluster centroids as seeds -----

**The FASTCLUS Procedure**  
**Replace=FULL Radius=0 Maxclusters=3 Maxiter=50 Converge=0.02**

Approximate Expected Over-All R-Squared =	0.34659
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Cubic Clustering Criterion =	12.071
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**WARNING: The two values above are invalid for correlated variables.**

Cluster Means						
Cluster	x1	x2	x3	x4	x5	x6
1	0.368669004	0.401246057	-0.401586591	-0.231655082	0.054566204	0.411187451
2	-1.672576438	-1.671305889	1.541011098	1.445658839	-1.132182480	-1.360157058
3	0.863420059	0.567050212	-0.238248426	-1.529251357	2.339360369	-0.300294415

Cluster Standard Deviations						
Cluster	x1	x2	x3	x4	x5	x6
1	0.4991850421	0.4611890454	0.6383168971	0.4957217415	0.6130303011	0.7025679606
2	0.5752261367	0.7157813978	0.6556622100	0.9616880183	0.1910382923	0.8537465142
3	0.7178101718	0.9096303320	0.6810371232	0.1738495184	0.2394133443	0.4683975384

## ----- Part C: Use Average Linkage to get cluster centriods as seeds -----

Obs	school	CLUSTER	DISTANCE
1	UPenn	1	0.43075
2	Cornell	1	0.59614
3	Northwes	1	0.63242
4	Duke	1	0.63955
5	Columbia	1	0.66926
6	Brown	1	0.81828
7	Dartmout	1	0.92288
8	Georgeto	1	0.99224
9	Stanford	1	1.03439
10	MIT	1	1.06121
11	NotreDam	1	1.26965
12	UChicago	1	1.37364
13	Princeto	1	1.55672
14	UVir	1	1.58262
15	Yale	1	1.62363
16	Harvard	1	1.67705
17	UCBerkel	1	2.28647
18	Carnegie	1	2.85180
19	UWiscons	2	0.98523
20	PennStat	2	1.06292
21	Purdue	2	1.63680
22	TexasA&M	2	1.80621
23	UMichiga	2	1.95228
24	CalTech	3	1.02797
25	JohnsHop	3	1.02797

