

Automated Data Analysis Report

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1. Clustering Results

Best Parameters: {'epsilon': 4.935886088617702, 'min_samples': 4, 'silhouette': 0.740598372599426},
Best Silhouette Score: 0.741

Train Silhouette Score: 0.376, Test Silhouette Score: 0.676

2. ANOVA Results

Results for capital-gain: F-value = 102723.863, P-value = 0.000

Tukey-HSD Test Results: Multiple Comparison of Means - Tukey HSD, FWER=0.05

```
===== group1 group2 meandiff p-adj
lower upper reject ----- -1 1 13.6783 0.0 13.506 13.8506 True -1 2
0.0 1.0 -0.1629 0.1629 False -1 4 1.0492 0.0 0.8858 1.2127 True -1 5 -0.0 1.0 -0.1638 0.1638 False -1
6 0.0 1.0 -0.3454 0.3454 False 1 2 -13.6783 0.0 -13.7348 -13.6218 True 1 4 -12.6291 0.0 -12.6871
-12.5711 True 1 5 -13.6783 0.0 -13.7374 -13.6192 True 1 6 -13.6783 0.0 -13.9881 -13.3685 True 2 4
1.0492 0.0 1.0347 1.0637 True 2 5 -0.0 1.0 -0.0183 0.0183 False 2 6 -0.0 1.0 -0.3047 0.3047 False 4 5
-1.0492 0.0 -1.0718 -1.0266 True 4 6 -1.0492 0.0 -1.3542 -0.7443 True 5 6 0.0 1.0 -0.3052 0.3052
False -----
```

Results for capital-loss: F-value = 140639.753, P-value = 0.000

Tukey-HSD Test Results: Multiple Comparison of Means - Tukey HSD, FWER=0.05

```
===== group1 group2 meandiff p-adj
lower upper reject ----- -1 1 -5.5055 0.0 -5.6536 -5.3573 True -1 2
-5.5055 0.0 -5.6455 -5.3654 True -1 4 -5.5055 0.0 -5.646 -5.3649 True -1 5 -0.953 0.0 -1.0939 -0.8121
True -1 6 3.9355 0.0 3.6385 4.2326 True 1 2 -0.0 1.0 -0.0486 0.0486 False 1 4 -0.0 1.0 -0.0499 0.0499
False 1 5 4.5525 0.0 4.5017 4.6033 True 1 6 9.441 0.0 9.1746 9.7074 True 2 4 -0.0 1.0 -0.0125 0.0125
False 2 5 4.5525 0.0 4.5367 4.5682 True 2 6 9.441 0.0 9.179 9.703 True 4 5 4.5525 0.0 4.533 4.5719
True 4 6 9.441 0.0 9.1787 9.7033 True 5 6 4.8885 0.0 4.6261 5.151 True
-----
```

Results for positive_capital_gain: F-value = inf, P-value = 0.000

Tukey-HSD Test Results: Multiple Comparison of Means - Tukey HSD, FWER=0.05

```
===== group1 group2 meandiff p-adj
lower upper reject ----- -1 1 3.6246 0.0 3.6246 3.6246 True -1 2 -0.0
0.0 -0.0 -0.0 True -1 4 3.6246 0.0 3.6246 3.6246 True -1 5 0.0 0.9968 -0.0 0.0 False -1 6 0.0 1.0 -0.0
0.0 False 1 2 -3.6246 0.0 -3.6246 -3.6246 True 1 4 0.0 0.0 0.0 0.0 True 1 5 -3.6246 0.0 -3.6246 -3.6246
True 1 6 -3.6246 0.0 -3.6246 -3.6246 True 2 4 3.6246 0.0 3.6246 3.6246 True 2 5 0.0 0.0 0.0 0.0 True
2 6 0.0 0.0 0.0 0.0 True 4 5 -3.6246 0.0 -3.6246 -3.6246 True 4 6 -3.6246 0.0 -3.6246 -3.6246 True 5 6
-0.0 0.9998 -0.0 0.0 False -----
```

Results for positive_capital_loss: F-value = inf, P-value = 0.000

Tukey-HSD Test Results: Multiple Comparison of Means - Tukey HSD, FWER=0.05

```
===== group1 group2 meandiff p-adj
lower upper reject ----- -1 1 -4.6702 0.0 -4.6702 -4.6702 True -1 2
-4.6702 0.0 -4.6702 -4.6702 True -1 4 -4.6702 0.0 -4.6702 -4.6702 True -1 5 0.0 0.6037 -0.0 0.0 False
-1 6 -0.0 1.0 -0.0 0.0 False 1 2 0.0 0.0 0.0 0.0 True 1 4 -0.0 0.0 -0.0 -0.0 True 1 5 4.6702 0.0 4.6702
4.6702 True 1 6 4.6702 0.0 4.6702 4.6702 True 2 4 -0.0 0.0 -0.0 -0.0 True 2 5 4.6702 0.0 4.6702
4.6702 True 2 6 4.6702 0.0 4.6702 4.6702 True 4 5 4.6702 0.0 4.6702 4.6702 True 4 6 4.6702 0.0
4.6702 4.6702 True 5 6 -0.0 0.894 -0.0 0.0 False -----
```

Results for age_education_interaction: F-value = 216.320, P-value = 0.000

Tukey-HSD Test Results: Multiple Comparison of Means - Tukey HSD, FWER=0.05

```
===== group1 group2 meandiff p-adj
lower upper reject ----- -1 1 0.2784 0.9162 -0.5105 1.0673 False -1
2 -1.0722 0.0006 -1.818 -0.3264 True -1 4 -0.4826 0.4411 -1.2308 0.2657 False -1 5 -0.5824 0.2316
-1.3324 0.1676 False -1 6 -1.5797 0.0505 -3.1612 0.0019 False 1 2 -1.3506 0.0 -1.6092 -1.092 True 1
4 -0.761 0.0 -1.0266 -0.4954 True 1 5 -0.8608 0.0 -1.1314 -0.5903 True 1 6 -1.8581 0.0026 -3.2766
-0.4397 True 2 4 0.5896 0.0 0.5232 0.656 True 2 5 0.4897 0.0 0.4059 0.5736 True 2 6 -0.5075 0.9056
-1.9025 0.8874 False 4 5 -0.0998 0.0661 -0.2033 0.0037 False 4 6 -1.0971 0.2197 -2.4933 0.2992
False 5 6 -0.9973 0.3228 -2.3945 0.3999 False -----
```

3. Cluster Variability

	antecedent support	consequent support	support confidence \
count	83.000000	83.000000	83.000000
mean	0.104125	0.263196	0.059184
std	0.069965	0.080833	0.036020
min	0.029569	0.145504	0.025451
25%	0.051160	0.212501	0.031744
50%	0.075933	0.223496	0.044119
75%	0.139164	0.345373	0.068635
max	0.345373	0.438523	0.143165

	lift	leverage	conviction	zhangs_metric	total_items	coverage
count	83.000000	83.000000	83.000000	83.000000	83.000000	83.000000
mean	2.388806	0.033406	5.282772	0.636931	2.903614	0.104125
std	0.450555	0.021110	12.445754	0.098381	0.296913	0.069965
min	1.755118	0.011927	1.292688	0.467623	2.000000	0.029569
25%	2.045526	0.018618	1.444429	0.570716	3.000000	0.051160
50%	2.311114	0.023478	1.702638	0.613188	3.000000	0.075933
75%	2.621471	0.041407	2.998351	0.711009	3.000000	0.139164
2 max	4.112995	0.087515	63.727590	0.933793	3.000000	0.345373

	antecedent support	consequent support	support	confidence \
count	147.000000	147.000000	147.000000	147.000000
mean	0.075314	0.256720	0.048884	0.703390
std	0.050836	0.082657	0.028067	0.170253
min	0.025707	0.073693	0.025707	0.436620
25%	0.040274	0.200514	0.030848	0.571429
50%	0.059126	0.215938	0.036847	0.679245
75%	0.093402	0.302485	0.058269	0.852755
max	0.215938	0.399314	0.125107	1.000000

	lift	leverage	conviction	zhangs_metric	total_items \
count	147.000000	147.000000	147.000000	147.000000	147.000000
mean	2.909279	0.030786	inf	0.682048	2.918367
std	0.925584	0.018445	NaN	0.103968	0.274740
min	2.009260	0.013895	1.405398	0.534357	2.000000
25%	2.215313	0.018680	1.747030	0.593385	3.000000
50%	2.504292	0.022603	2.640592	0.622558	3.000000
75%	3.506888	0.035780	4.641011	0.790896	3.000000
max	7.681000	0.081808	inf	0.911191	3.000000

	coverage
count	147.000000
mean	0.075314
std	0.050836
min	0.025707
25%	0.040274
50%	0.059126
75%	0.093402
max	0.215938

	antecedent support	consequent support	support	confidence \
count	113.000000	113.000000	113.000000	113.000000
mean	0.085664	0.248119	0.051897	0.652948
std	0.048383	0.093110	0.024983	0.149541
min	0.030649	0.131429	0.027532	0.437838
25%	0.044156	0.180260	0.032727	0.495536
50%	0.066494	0.206234	0.040000	0.637755
75%	0.112208	0.301299	0.064935	0.795918
max	0.194805	0.417662	0.108052	0.932203

	lift	leverage	conviction	zhangs_metric	total_items \
count	113.000000	113.000000	113.000000	113.000000	113.000000
mean	2.874718	0.031921	2.667643	0.674165	2.929204
std	0.969473	0.017330	1.293131	0.129059	0.257627
min	1.853723	0.014725	1.365784	0.487838	2.000000
25%	2.021835	0.019518	1.552536	0.552853	3.000000
50%	2.362268	0.025944	2.215947	0.641679	3.000000
75%	3.422222	0.037441	3.472403	0.793776	3.000000
max	5.350195	0.074657	8.589481	0.879032	3.000000

	coverage
count	113.000000
mean	0.085664
std	0.048383
min	0.030649
25%	0.044156
50%	0.066494
75%	0.112208
max	0.194805

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	antecedent support	consequent support	support	confidence \
count	22.000000	22.000000	22.000000	22.000000
mean	0.058275	0.112277	0.043901	0.760823
std	0.006262	0.047937	0.003002	0.089156
min	0.042735	0.068376	0.042735	0.714286
25%	0.059829	0.085470	0.042735	0.714286
50%	0.059829	0.102564	0.042735	0.714286
75%	0.059829	0.128205	0.042735	0.750000
max	0.068376	0.307692	0.051282	1.000000

	lift	leverage	conviction	zhangs_metric	total_items	coverage
count	22.000000	22.000000	22.000000	22.000000	22.000000	22.000000
mean	7.344746	0.037515	inf	0.907050	2.863636	0.058275
std	1.756132	0.003530	NaN	0.050948	0.351250	0.006262
min	3.250000	0.029586	3.021368	0.723214	2.000000	0.042735
25%	5.785714	0.035320	3.118590	0.877518	3.000000	0.059829
50%	7.644886	0.037548	3.200855	0.925465	3.000000	0.059829
75%	8.357143	0.038133	3.615385	0.936364	3.000000	0.059829
max	10.446429	0.045146	inf	0.961818	3.000000	0.068376

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	antecedent support	consequent support	support	confidence \
count	2.340000e+02	2.340000e+02	2.340000e+02	234.0
mean	7.142857e-02	7.142857e-02	7.142857e-02	1.0
std	2.781507e-17	2.781507e-17	2.781507e-17	0.0
min	7.142857e-02	7.142857e-02	7.142857e-02	1.0
25%	7.142857e-02	7.142857e-02	7.142857e-02	1.0
50%	7.142857e-02	7.142857e-02	7.142857e-02	1.0
75%	7.142857e-02	7.142857e-02	7.142857e-02	1.0
max	7.142857e-02	7.142857e-02	7.142857e-02	1.0

	lift	leverage	conviction	zhangs_metric	total_items \
count	234.0	2.340000e+02	234.0	2.340000e+02	234.000000
mean	14.0	6.632653e-02	inf	1.000000e+00	2.982906
std	0.0	1.390754e-17	NaN	1.112603e-16	0.129900
min	14.0	6.632653e-02	inf	1.000000e+00	2.000000
25%	14.0	6.632653e-02	NaN	1.000000e+00	3.000000
50%	14.0	6.632653e-02	NaN	1.000000e+00	3.000000
75%	14.0	6.632653e-02	NaN	1.000000e+00	3.000000
max	14.0	6.632653e-02	inf	1.000000e+00	3.000000

	coverage
count	2.340000e+02
mean	7.142857e-02
std	2.781507e-17
min	7.142857e-02
25%	7.142857e-02
50%	7.142857e-02
75%	7.142857e-02
max	7.142857e-02

-1

	antecedent support	consequent support	support	confidence	lift \
count	212.00	212.00	212.00	212.0	212.0
mean	0.25	0.25	0.25	1.0	4.0
std	0.00	0.00	0.00	0.0	0.0
min	0.25	0.25	0.25	1.0	4.0
25%	0.25	0.25	0.25	1.0	4.0
50%	0.25	0.25	0.25	1.0	4.0
75%	0.25	0.25	0.25	1.0	4.0
max	0.25	0.25	0.25	1.0	4.0

	leverage	conviction	zhangs_metric	total_items	coverage
count	212.0000	212.0	212.0	212.000000	212.00
mean	0.1875	inf	1.0	2.933962	0.25
std	0.0000	NaN	0.0	0.248936	0.00
min	0.1875	inf	1.0	2.000000	0.25
25%	0.1875	NaN	1.0	3.000000	0.25
50%	0.1875	NaN	1.0	3.000000	0.25
75%	0.1875	NaN	1.0	3.000000	0.25
max	0.1875	inf	1.0	3.000000	0.25

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4. Rule Metrics Comparison

mean	std	min	25%	50%	75%
71477424500899	0.18764582612303182	0.3993103448275862	0.44063303817731947	0.5650438946528332	0.75740418118
33898210509437	0.1702528482568039	0.4366197183098592	0.5714285714285715	0.6792452830188679	0.852755194218
52947757603941	0.14954099490694897	0.4378378378378378	0.4955357142857143	0.6377551020408162	0.795918367346
60822510822511	0.089155921603344	0.7142857142857143	0.7142857142857143	0.7142857142857143	0.749999999999
1.0	0.0	1.0	1.0	1.0	1.0
1.0	0.0	1.0	1.0	1.0	1.0
58966153085457	0.07743962136650274	0.6116504854368933	0.6736051193557664	0.745942217172537	0.786338740257

5. Top Unique Rules per Cluster

Cluster 2:

Rule: frozenset({'relationship_Wife'}) -> frozenset({'marital-status_Married-civ-spouse'}) (Support: 0.042, Confidence: 0.991, Lift: 2.260)
Rule: frozenset({'race_White', 'relationship_Wife'}) -> frozenset({'marital-status_Married-civ-spouse'}) (Support: 0.035, Confidence: 0.991, Lift: 2.259)
Rule: frozenset({'workclass_Private', 'relationship_Wife'}) -> frozenset({'marital-status_Married-civ-spouse'}) (Support: 0.029, Confidence: 0.991, Lift: 2.259)
Rule: frozenset({'native_country_aggregated_United-States', 'relationship_Wife'}) -> frozenset({'marital-status_Married-civ-spouse'}) (Support: 0.036, Confidence: 0.990, Lift: 2.257)
Rule: frozenset({'relationship_Own-child', 'hours_per_week_binned_21-30'}) -> frozenset({'marital-status_Never-married'}) (Support: 0.029, Confidence: 0.957, Lift: 2.770)

Cluster 5:

Rule: frozenset({'education_Doctorate', 'marital-status_Married-civ-spouse'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.031, Confidence: 1.000, Lift: 2.504)
Rule: frozenset({'education_Doctorate', 'sex_Male'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.027, Confidence: 1.000, Lift: 2.504)
Rule: frozenset({'occupation_aggregated_Prof-specialty', 'education_Doctorate'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.026, Confidence: 1.000, Lift: 2.504)
Rule: frozenset({'education_Doctorate', 'native_country_aggregated_United-States'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.030, Confidence: 1.000, Lift: 2.504)
Rule: frozenset({'education_Doctorate', 'race_White'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.033, Confidence: 1.000, Lift: 2.504)

Cluster 4:

Rule: frozenset({'workclass_Private', 'education_Masters'}) -> frozenset({'age_education_interaction_(494.0, 1350.0]'}) (Support: 0.041, Confidence: 0.788, Lift: 1.886)

Rule: frozenset({'hours_per_week_binned_51+', 'relationship_Not-in-family'}) -> frozenset({'marital-status_Never-married'}) (Support: 0.033, Confidence: 0.583, Lift: 3.403)
 Rule: frozenset({'workclass_Self-emp-inc', 'native_country_aggregated_United-States'}) -> frozenset({'hours_per_week_binned_51+'}) (Support: 0.035, Confidence: 0.563, Lift: 1.869)
 Rule: frozenset({'workclass_Self-emp-inc', 'marital-status_Married-civ-spouse'}) -> frozenset({'hours_per_week_binned_51+'}) (Support: 0.033, Confidence: 0.562, Lift: 1.867)
 Rule: frozenset({'occupation_aggregated_Craft-repair', 'hours_per_week_binned_41-50'}) -> frozenset({'education_HS-grad'}) (Support: 0.043, Confidence: 0.497, Lift: 1.906)

Cluster 1:

Rule: frozenset({'occupation_aggregated_Prof-specialty', 'race_Asian-Pac-Islander'}) -> frozenset({'education_Prof-school'}) (Support: 0.043, Confidence: 1.000, Lift: 3.250)
 Rule: frozenset({'workclass_Private', 'race_Asian-Pac-Islander'}) -> frozenset({'native_country_aggregated_Other'}) (Support: 0.043, Confidence: 1.000, Lift: 9.750)
 Rule: frozenset({'marital-status_Married-civ-spouse', 'race_Asian-Pac-Islander'}) -> frozenset({'native_country_aggregated_Other'}) (Support: 0.051, Confidence: 0.857, Lift: 8.357)
 Rule: frozenset({'race_Asian-Pac-Islander', 'sex_Male'}) -> frozenset({'native_country_aggregated_Other'}) (Support: 0.043, Confidence: 0.833, Lift: 8.125)
 Rule: frozenset({'race_Asian-Pac-Islander'}) -> frozenset({'native_country_aggregated_Other'}) (Support: 0.051, Confidence: 0.750, Lift: 7.312)

Cluster -1:

Rule: frozenset({'occupation_aggregated_Other', 'marital-status_Married-civ-spouse'}) -> frozenset({'education_5th-6th'}) (Support: 0.071, Confidence: 1.000, Lift: 14.000)
 Rule: frozenset({'occupation_aggregated_Sales', 'age_education_interaction_(494.0, 1350.0]'}) -> frozenset({'marital-status_Separated'}) (Support: 0.071, Confidence: 1.000, Lift: 14.000)
 Rule: frozenset({'occupation_aggregated_Sales', 'race_Black'}) -> frozenset({'marital-status_Separated'}) (Support: 0.071, Confidence: 1.000, Lift: 14.000)
 Rule: frozenset({'marital-status_Separated'}) -> frozenset({'occupation_aggregated_Sales', 'race_Black'}) (Support: 0.071, Confidence: 1.000, Lift: 14.000)
 Rule: frozenset({'race_Black', 'education_Some-college'}) -> frozenset({'marital-status_Separated'}) (Support: 0.071, Confidence: 1.000, Lift: 14.000)

Cluster 6:

Rule: frozenset({'education_HS-grad'}) -> frozenset({'age_education_interaction_(261.0, 369.0]'}) (Support: 0.250, Confidence: 1.000, Lift: 4.000)
 Rule: frozenset({'native_country_aggregated_United-States', 'education_Some-college'}) -> frozenset({'age_education_interaction_(369.0, 494.0]'}) (Support: 0.250, Confidence: 1.000, Lift: 4.000)
 Rule: frozenset({'education_Some-college'}) -> frozenset({'marital-status_Separated', 'age_education_interaction_(369.0, 494.0]'}) (Support: 0.250, Confidence: 1.000, Lift: 4.000)
 Rule: frozenset({'Cluster_(2.0, 6.0]', 'education_Some-college'}) -> frozenset({'age_education_interaction_(369.0, 494.0]'}) (Support: 0.250, Confidence: 1.000, Lift: 4.000)
 Rule: frozenset({'Cluster_(2.0, 6.0]', 'age_education_interaction_(369.0, 494.0]'}) -> frozenset({'education_Some-college'}) (Support: 0.250, Confidence: 1.000, Lift: 4.000)

6. Top 10 Common Rules Sorted by Absolute Coverage Difference

Rule: frozenset({'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.294)

Rule: frozenset({'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.273)

Rule: frozenset({'native_country_aggregated_United-States', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.261)

Rule: frozenset({'native_country_aggregated_United-States', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.257)

Rule: frozenset({'workclass_Private', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.242)

Rule: frozenset({'race_White', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.241)

Rule: frozenset({'native_country_aggregated_United-States', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.237)

Rule: frozenset({'workclass_Private', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.236)

Rule: frozenset({'native_country_aggregated_United-States', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.236)

Rule: frozenset({'race_White', 'marital-status_Never-married', 'relationship_Own-child'}) (Abs Coverage Difference: 0.233)

7. Cluster Visualizations



