



Toy Horse Conjoint Analysis

Xinran Xu

Key Insights & Recommendation

- All segments of customers prefer **low price** products
- Model based on Cluster Analysis at **k=3**
- A Priori Segmentation based on **Age, Gender**

Interact with 4 Attributes: **Price, Size, Motion, Style**

- Suggestion for new product line: **Product 4, 16**

Product 4: 26'' Racing Bouncing Horse priced at \$119.99

Product 16: 26'' Glamour Rocking Horse priced at \$119.99

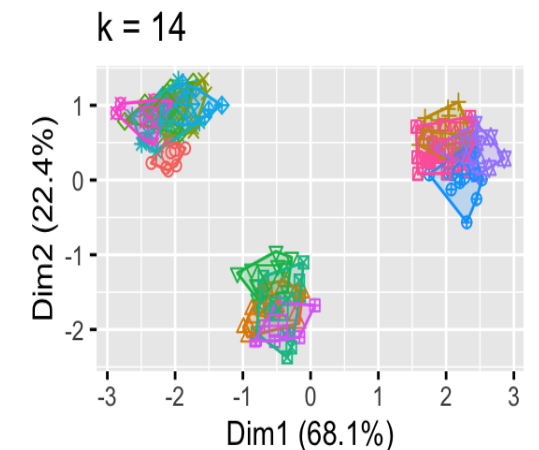
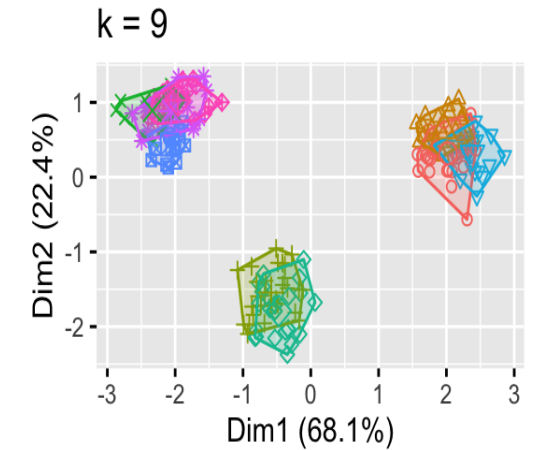
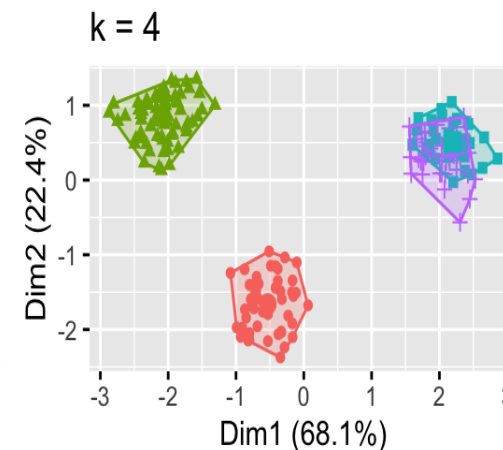
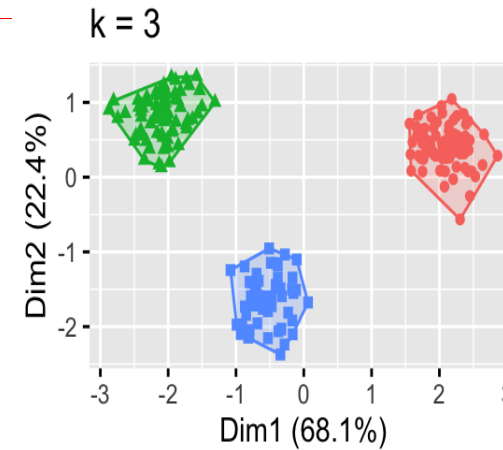
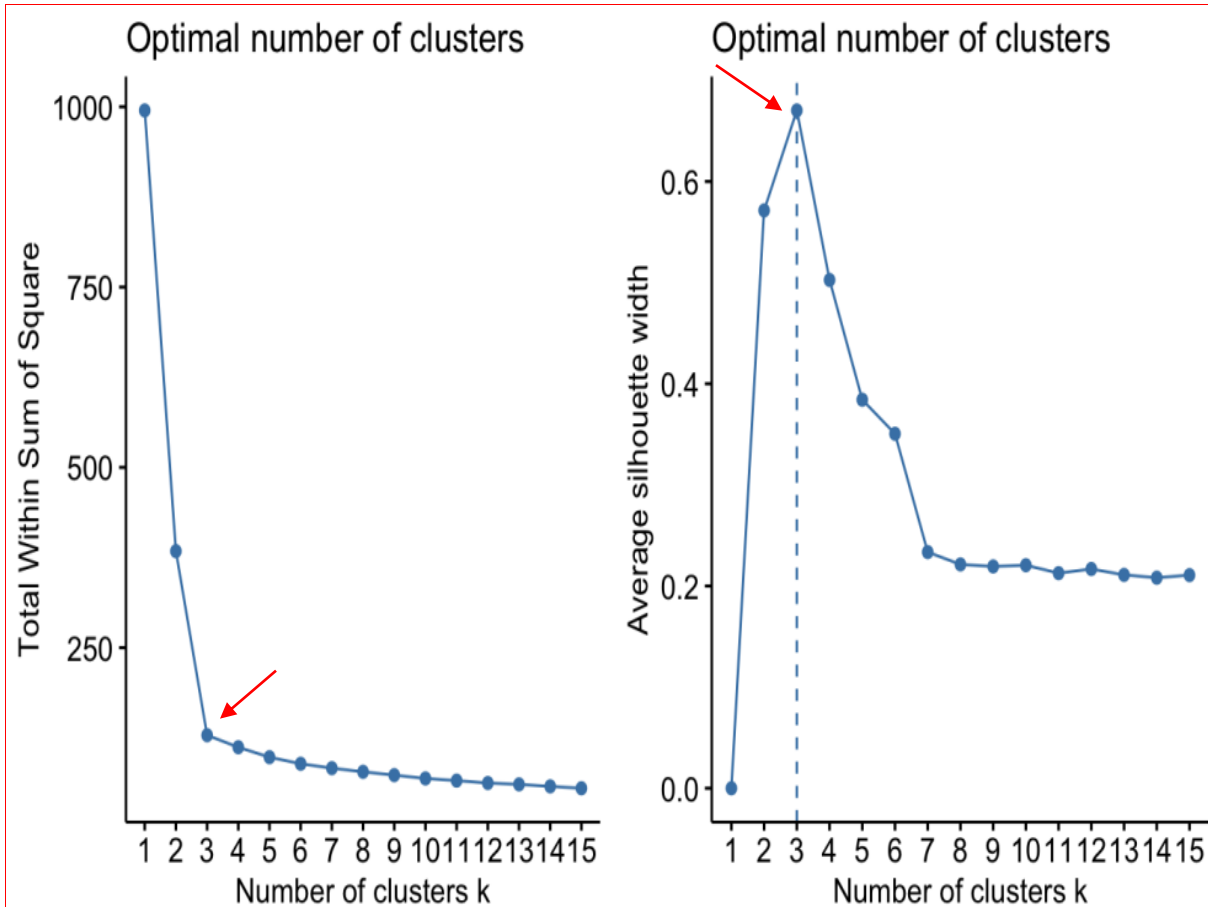


Cluster Plots

Optimal Num of Cluster : **k = 3**



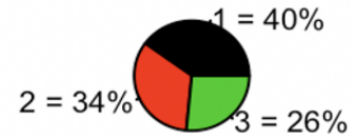
page 1 of 1



K = 3 looks reasonable

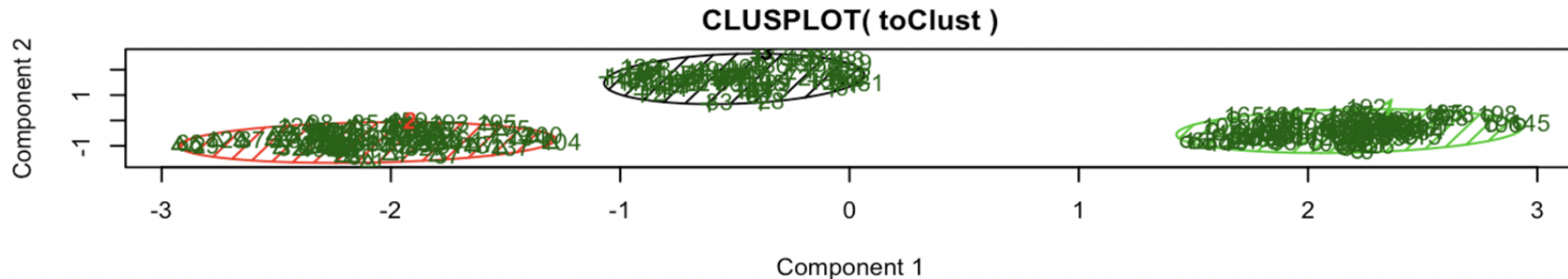
K = 4, 9, 14: Clusters have a lot of overlap

Cluster Analysis with k=3

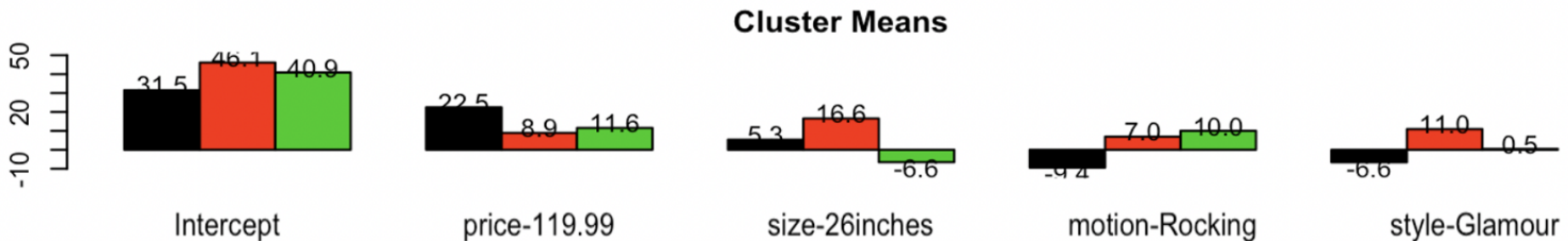


Cluster Insights:

- Black: 26" Racing Bouncing Horse at \$119.99
- Red: 26" Rocking Glamour Horse at \$119.99
- Green: 18" Rocking Glamour Horse at \$119.99



These two components explain 75.88 % of the point variability.





A Priori Segmentation

- **Variables:** Gender , Age

Segment	Intercept	Price - \$119.99	Size - 26 inches	Motion - Rocking	Style - Glamour
Male	36.57	16.86	3.85	-0.76	-1.89
Female	40.87	13.51	7.76	2.91	3.73
2 Years Old	39.55	14.41	3.85	2.80	1.19
3-4 Years Old	38.25	15.67	8.02	-0.32	1.10

Ideal Product for Segments:

- **Male** – 26'' Racing Bouncing Horse priced at \$119.99.
- **Female** – 26'' Glamour Rocking Horse priced at \$119.99
- **2 Year Old Children** – 26'' Glamour Rocking Horse priced at \$119.99
- **3-4 Year Old Children** – 26'' Glamour Bouncing Horse priced at \$119.99



Market Simulation Under Scenarios

Assumption:

- Currently, our competitor launched a product priced at \$139.99.
- In order to gain market share, competitor will lower price to \$119.99
- Competitor would switch from Profile 7 to **Profile 8**

Current Market:

- Product line with Profile 5 & Profile 13.

Current Market	5	13	7
Market Share	0.22	0.21	0.57
Price	111.99	111.99	139.99
Marginal Cost	33	33	41
Profit of Each Product	69511.2	66351.6	225697.2
Profit of Firm	95862.8		


Market Simulation Under Scenario

Scenario2	5	13	4	16	8	profitability
Market Share	0.02	0.025	0.355	0.43	0.17	0.34392066
Price	111.99	111.99	95.99	95.99		
Marginal Cost	33	33	29	41		
Profit of Each Product	6319.2	7899	95125.8	94582.8		
Profit of Firm	110593.467					

Scenario4	13	4	16	8		profitability
Market Share	0.035	0.355	0.44	0.17		0.40393469
Price	111.99	95.99	95.99			
Marginal Cost	33	29	41			
Profit of Each Product	11058.6	95125.8	96782.4			
Profit of Firm	129633.467					

- Based on A Priori Segmentation, we target at **male** and **female** customer: **Profile 4 & 16**.
- Because of low market share and cannibalization in Profile 5, we drop it.

Market Simulation Under Scenario

Scenario7	4	16	8			profitability
Market Share	0.355	0.465	0.18			0.45759933
Price	95.99	95.99				
Marginal Cost	29	41				
Profit of Each Product	95125.8	102281.4				
Profit of Firm	144073.867					

Scenario8	4	14	16	8		profitability
Market Share	0.355	0.22	0.34	0.085		0.41370259
Price	95.99	95.99	95.99			
Marginal Cost	29	33	41			
Profit of Each Product	95125.8	55431.2	74786.4			
Profit of Firm	145343.4					

- In order to gain more market share, we drop both existing products and only launch new product lines.
- Based on Cluster Analysis, we add **Profile 14** into scenario
- Scenario with **Profile 4, 16** is the **BEST** choice with highest profitability.

Appendix



Interaction Regression with Variable "Age"

Call:

```
lm(formula = ratings ~ (price + size + motion + style):age, data = ChildAttr)
```

Residuals:

Min	1Q	Median	3Q	Max
-47.606	-13.679	-1.305	12.770	46.668

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	47.6062	0.4676	101.803	< 2e-16	***
price:age	11.5636	0.9720	11.896	< 2e-16	***
size:age	5.0567	0.9746	5.189	2.30e-07	***
motion:age	-4.6606	0.9079	-5.133	3.08e-07	***
style:age	-3.2358	0.9079	-3.564	0.000372	***

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 17.65 on 2395 degrees of freedom

(800 observations deleted due to missingness)

Multiple R-squared: 0.0957, Adjusted R-squared: 0.09418

F-statistic: 63.36 on 4 and 2395 DF, p-value: < 2.2e-16

Appendix



Interaction Regression with Variable "Gender"

```
Call:
lm(formula = ratings ~ (price + size + motion + style):gender,
    data = ChildAttr)
```

Residuals:

Min	1Q	Median	3Q	Max
-45.016	-13.541	1.567	12.215	45.095

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	43.5724	0.4600	94.725	< 2e-16	***
price:gender	12.3222	0.9049	13.617	< 2e-16	***
size:gender	6.8987	0.9061	7.614	3.8e-14	***
motion:gender	1.6545	0.8458	1.956	0.05058	.
style:gender	2.4747	0.8458	2.926	0.00347	**

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 16.94 on 2395 degrees of freedom
(800 observations deleted due to missingness)

Multiple R-squared: 0.1665, Adjusted R-squared: 0.1652

F-statistic: 119.6 on 4 and 2395 DF, p-value: < 2.2e-16

Appendix



Interaction Regression with Variable "Gender - Male"

Call:

```
lm(formula = ratings ~ price + size + motion + style, data = gender_0)
```

Residuals:

Min	1Q	Median	3Q	Max
-33.917	-10.607	-2.351	7.762	47.017

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	36.5668	0.9821	37.233	< 2e-16	***
price	16.8573	0.9203	18.318	< 2e-16	***
size	3.8509	0.8811	4.371	1.36e-05	***
motion	-0.7601	0.8811	-0.863	0.3885	
style	-1.8895	0.8811	-2.145	0.0322	*

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 14.41 on 1099 degrees of freedom

(368 observations deleted due to missingness)

Multiple R-squared: 0.2862, Adjusted R-squared: 0.2836

F-statistic: 110.2 on 4 and 1099 DF, p-value: < 2.2e-16

Appendix



Interaction Regression with Variable "Gender - Female"

Call:

```
lm(formula = ratings ~ price + size + motion + style, data = gender_1)
```

Residuals:

Min	1Q	Median	3Q	Max
-45.675	-13.646	2.716	12.948	36.175

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	40.8701	1.0580	38.630	< 2e-16	***
price	13.5086	0.9914	13.626	< 2e-16	***
size	7.7555	0.9492	8.171	7.24e-16	***
motion	2.9068	0.9492	3.062	0.00224	**
style	3.7270	0.9492	3.927	9.07e-05	***

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 16.82 on 1291 degrees of freedom

(432 observations deleted due to missingness)

Multiple R-squared: 0.1902, Adjusted R-squared: 0.1877

F-statistic: 75.82 on 4 and 1291 DF, p-value: < 2.2e-16

Appendix



Interaction Regression with Variable “Age – 2 Years

Call:

```
lm(formula = ratings ~ price + size + motion + style, data = age_2yr)
```

Residuals:

Min	1Q	Median	3Q	Max
-43.528	-11.312	-0.598	9.857	43.040

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	39.5462	1.0164	38.909	< 2e-16	***
price	14.4133	0.9524	15.134	< 2e-16	***
size	3.8532	0.9118	4.226	2.57e-05	***
motion	2.7950	0.9118	3.065	0.00222	**
style	1.1867	0.9118	1.301	0.19338	

Signif. codes: 0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Residual standard error: 15.47 on 1183 degrees of freedom
(396 observations deleted due to missingness)

Multiple R-squared: 0.1912, Adjusted R-squared: 0.1884

F-statistic: 69.9 on 4 and 1183 DF, p-value: < 2.2e-16

Appendix



Interaction Regression with Variable “Age – 3~4 Years Old”

Call:

```
lm(formula = ratings ~ price + size + motion + style, data = age_3.4yr)
```

Residuals:

Min	1Q	Median	3Q	Max
-37.465	-14.368	-2.484	15.008	44.386

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	38.2480	1.1400	33.549	< 2e-16 ***
price	15.6721	1.0683	14.671	< 2e-16 ***
size	8.0239	1.0228	7.845	9.47e-15 ***
motion	-0.3238	1.0228	-0.317	0.752
style	1.1010	1.0228	1.076	0.282

Signif. codes: 0 ‘***’ 0.001 ‘**’ 0.01 ‘*’ 0.05 ‘.’ 0.1 ‘ ’ 1

Residual standard error: 17.53 on 1207 degrees of freedom

(404 observations deleted due to missingness)

Multiple R-squared: 0.2185, Adjusted R-squared: 0.2159

F-statistic: 84.37 on 4 and 1207 DF, p-value: < 2.2e-16

Appendix

The other scenarios I make

Scenario1	5	13	4	8		profitability
Market Share	0.03	0.045	0.415	0.51		0.35365187
Price	111.99	111.99	95.99			
Marginal Cost	33	33	29			
Profit of Each Product	9478.8	14218.2	111203.4			
Profit of Firm	68233.7333					

Scenario3	13	4	8			profitability
Market Share	0.065	0.415	0.52			0.45141554
Price	111.99	95.99				
Marginal Cost	33	29				
Profit of Each Product	20537.4	111203.4				
Profit of Firm	85074.1333					

Appendix

The other scenarios I make

Scenario5	5	4	8			profitability
Market Share	0.04	0.415	0.545			0.43537374
Price	111.99	95.99				
Marginal Cost	33	29				
Profit of Each Product	12638.4	111203.4				
Profit of Firm	77175.1333					

Scenario6	5	4	16	8		profitability
Market Share	0.02	0.355	0.45	0.175		0.39960656
Price	111.99	95.99	95.99			
Marginal Cost	33	29	41			
Profit of Each Product	6319.2	95125.8	98982			
Profit of Firm	127093.667					