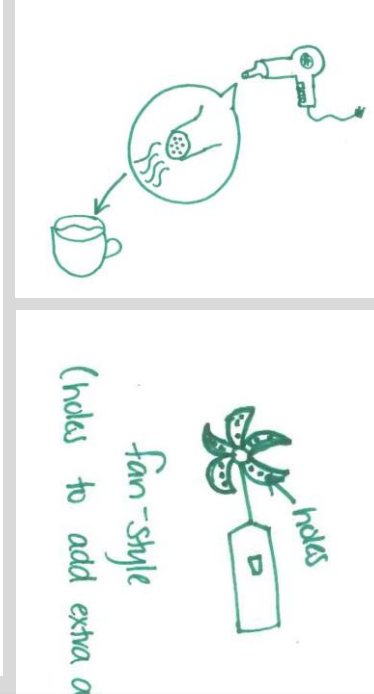
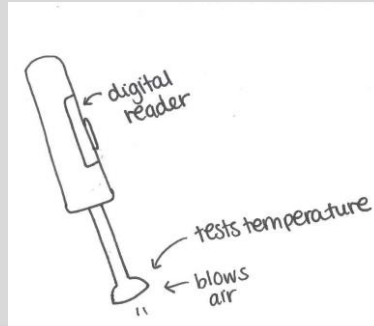



Ikea Milk Frother 303.011.67,  
Black by IKEA  
\$6.35 ✓Prime  
★★★★☆ 266




Norpro Milk Frother Deluxe 16 oz Glass Cappuccino/Latte Froth Master 16 Ounces  
\$12.25 ✓Prime  
★★★★☆ 682




**PennState**  
and Heater Carafe  
\$41.55 \$69.95 ✓Prime  
★★★★☆ 3,098

'17 International Design Eng. Technical Conference— ASME  
**DETC-67622**

# Linking Creativity Measurements to Product Market Favorability: A Data-mining Approach

**Christian Lopez<sup>1</sup>, Xuan Zheng<sup>1</sup>, & Dr. Scarlett Miller<sup>1,2</sup>**

<sup>1</sup> Department of Industrial and Manufacturing Engineering,

<sup>2</sup> School of Engineering Design Technology and Professional Programs  
The Pennsylvania State University, University Park

# Creative products that go beyond the expectation of functionality are more appealing to consumers

[Oman et al. 2013]





**Brainstorming**

**Design by Analogy**

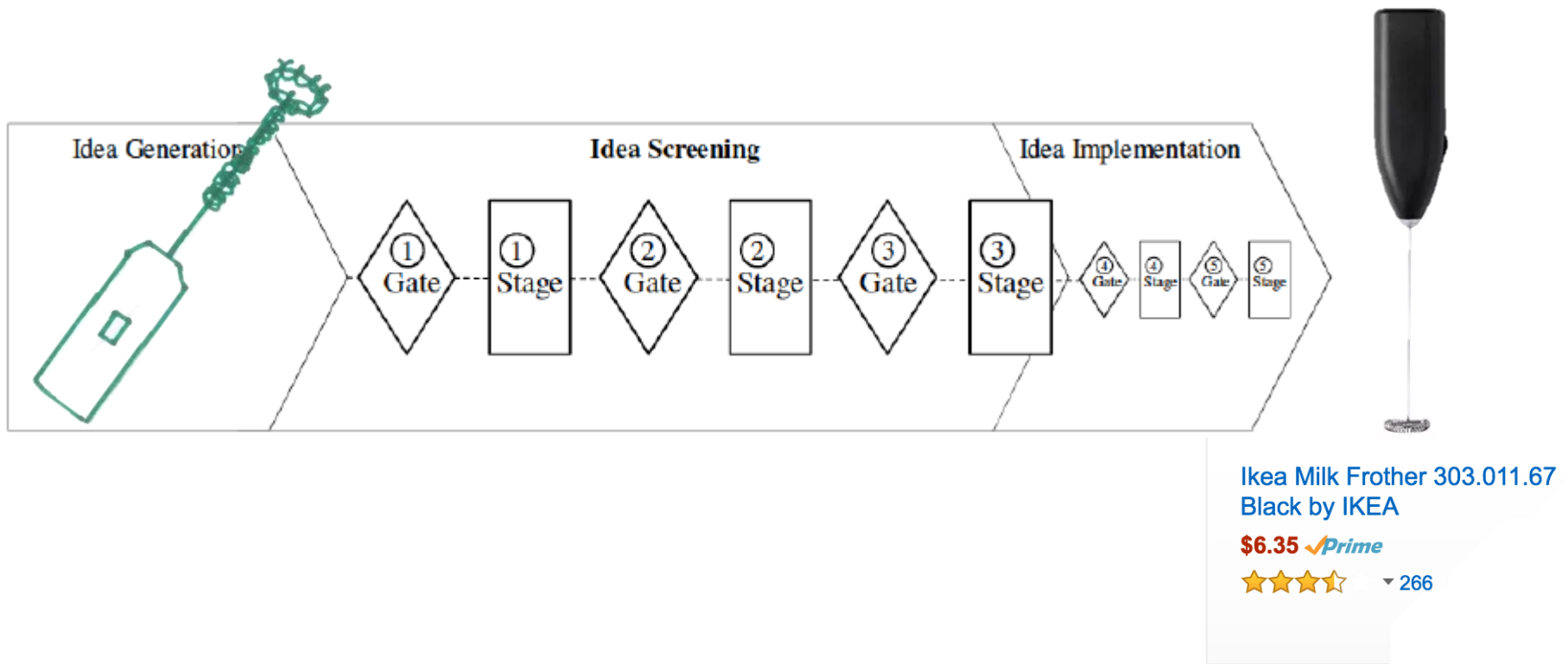
**Gallery**

**C-Sketch**

**TRIZ**

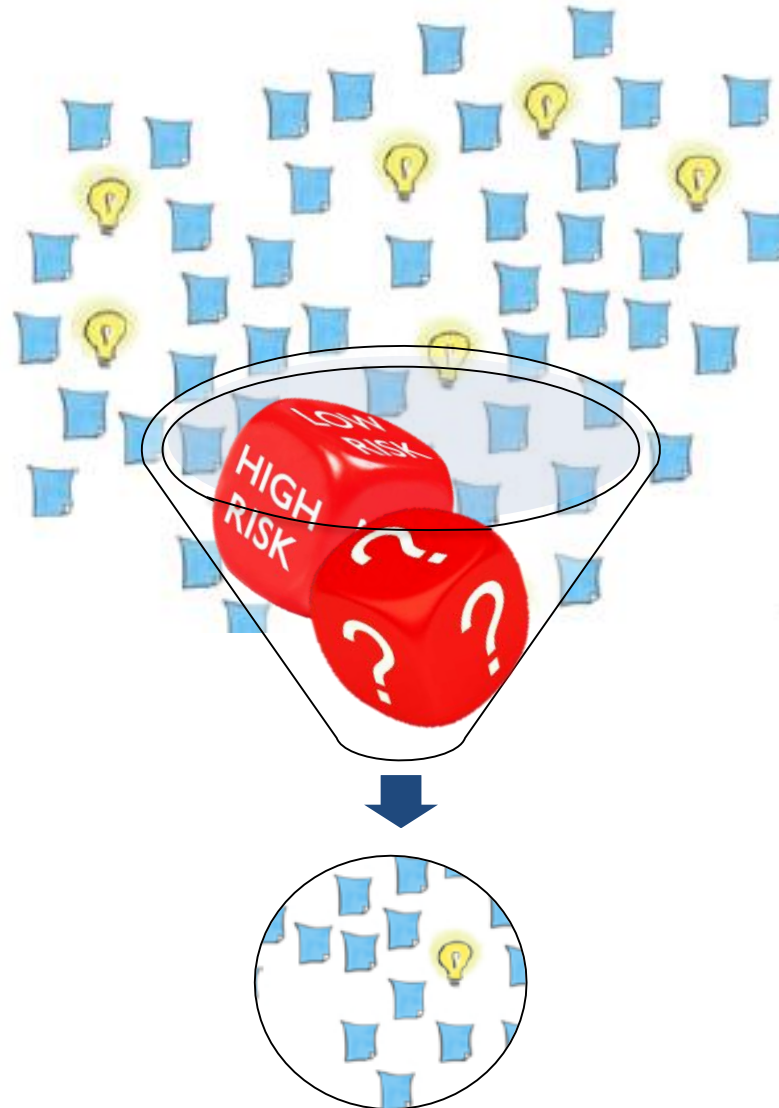
Researchers have focused on developing methods for increasing creativity during idea generation

# Concept selection methods need to provide decision-makers with valuable information



# Creative ideas are often rapidly filtered out during the concept selection process

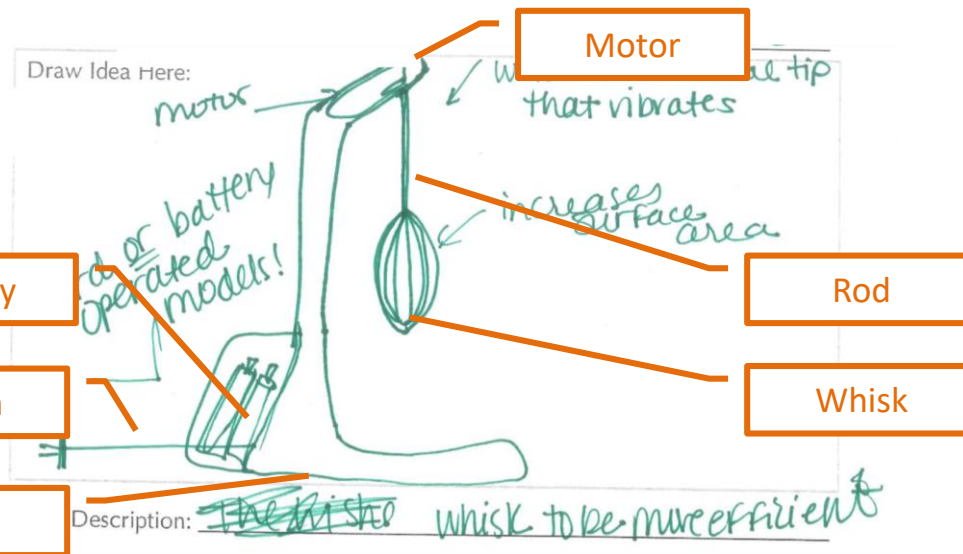
[Rietzschel et al. 2006]



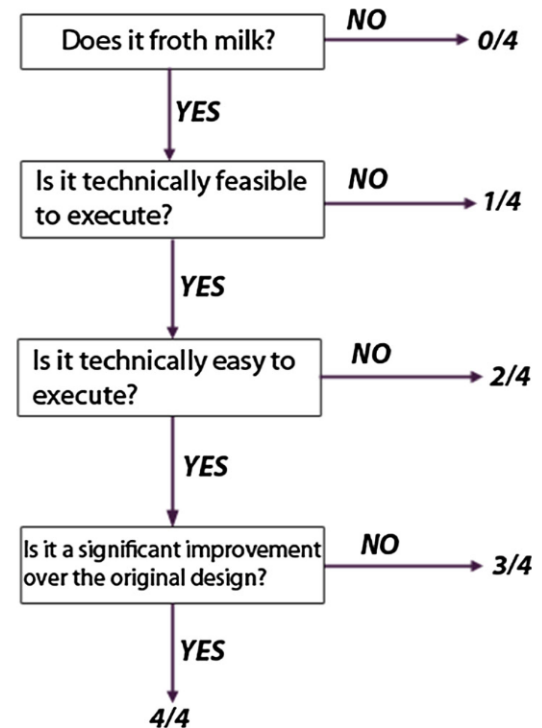
There is a need for more  
**effective mechanisms to inform**  
decision makers and to support the  
flow high-potential ideas

# The Shah, Vargas-Hernandez, and Smith (SVS) method measures the relative creativity of ideas

[Shah, et al. 2003]



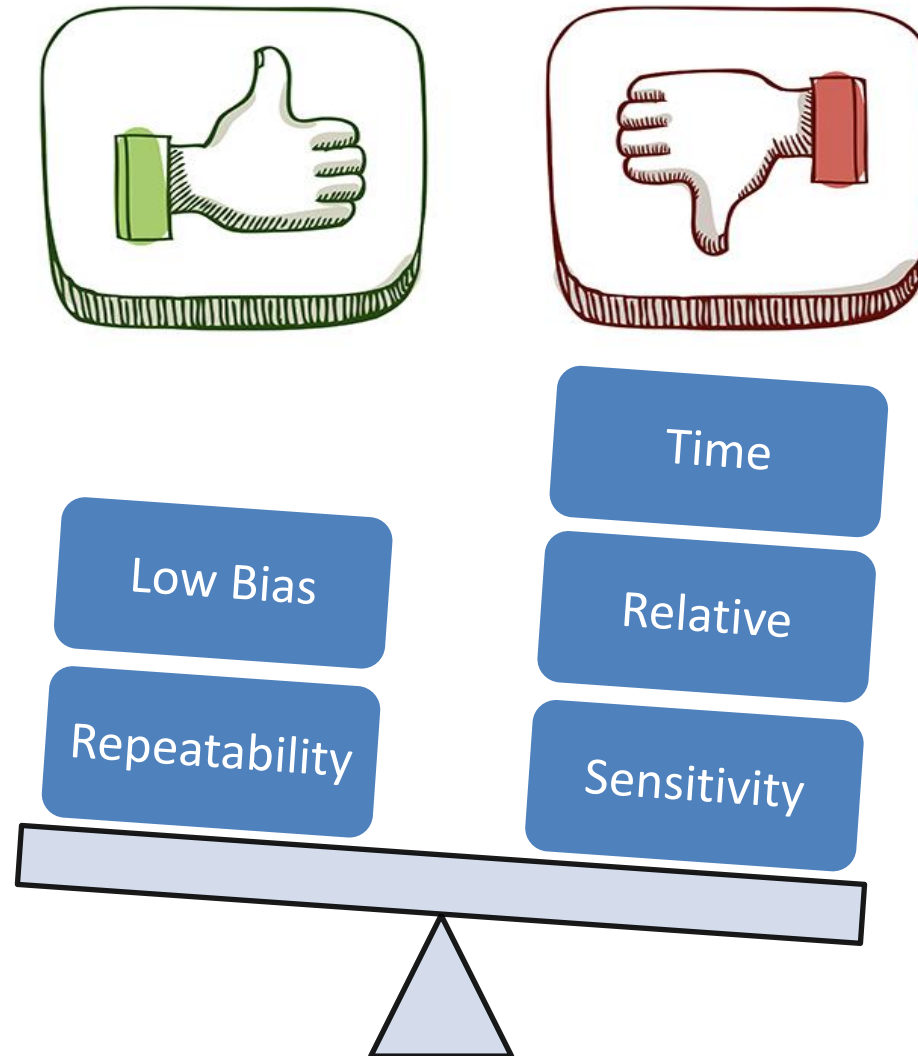
**Novelty**



**Quality**

# Feature-tree analysis has become widely used in engineering design

[Srivathsavai et al. 2010]





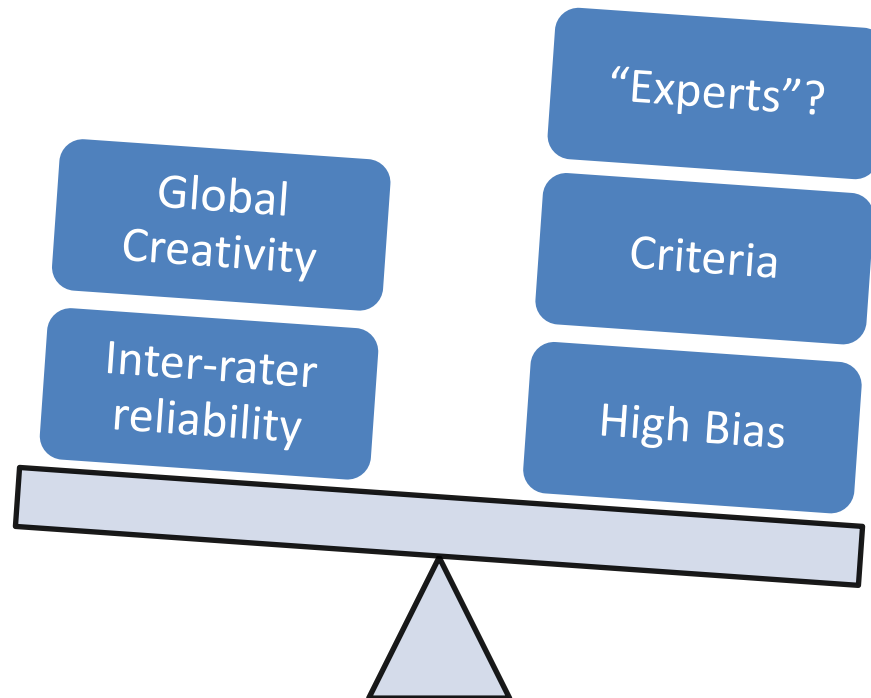
# Amabile's Consensual Assessment Technique (CAT) measure global creativity of ideas.

[Amabile, 1982]



# The CAT has been called the “gold standard” of creativity assessment

[Baer et al. 2009]



# Online customer reviews have been used to inspire new product development and modification.

[Park & Lee, 2011; Decker & Trusov, 2010]

★★★★★ **Frother from Heaven**  
By [Amazon Customer](#) on September 24, 2016  
Size: Pack of 1 | **Verified Purchase**

okay this little Ikea Frother is the Bomb!! I so love it to death lol. I would truly recommend this to anyone out there that is just starting to make froth and learning because it works so good. I give this as a gift as well. Great product

▶ [Comment](#) | Was this review helpful to you?   Report abuse

★★★★★ **cheap but works perfect**  
By [Raul Frances, MD](#) on September 23, 2016  
Size: Pack of 1 | **Verified Purchase**

When I bought it, I doubted it works well because of the cheap price. After a couple of weeks of using it, I can say that it works very well.

▶ [Comment](#) | Was this review helpful to you?   Report abuse

★☆☆☆☆ **Broke after one week. Only used maybe 3 times ...**  
By [Tracy Schwandt](#) on September 22, 2016  
Size: Pack of 1 | **Verified Purchase**

Broke after one week. Only used maybe 3 times for frothing coffee, went to pick it up by the metal end and it just fell apart!

▶ [Comment](#) | Was this review helpful to you?   Report abuse

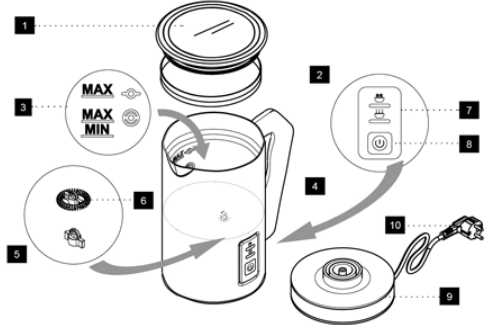
★★★★★ **Five Stars**  
By [Amazon Customer](#) on September 22, 2016  
Size: Pack of 1 | **Verified Purchase**

pretty good. It needs 2 AA batteries.

▶ [Comment](#) | Was this review helpful to you?   Report abuse

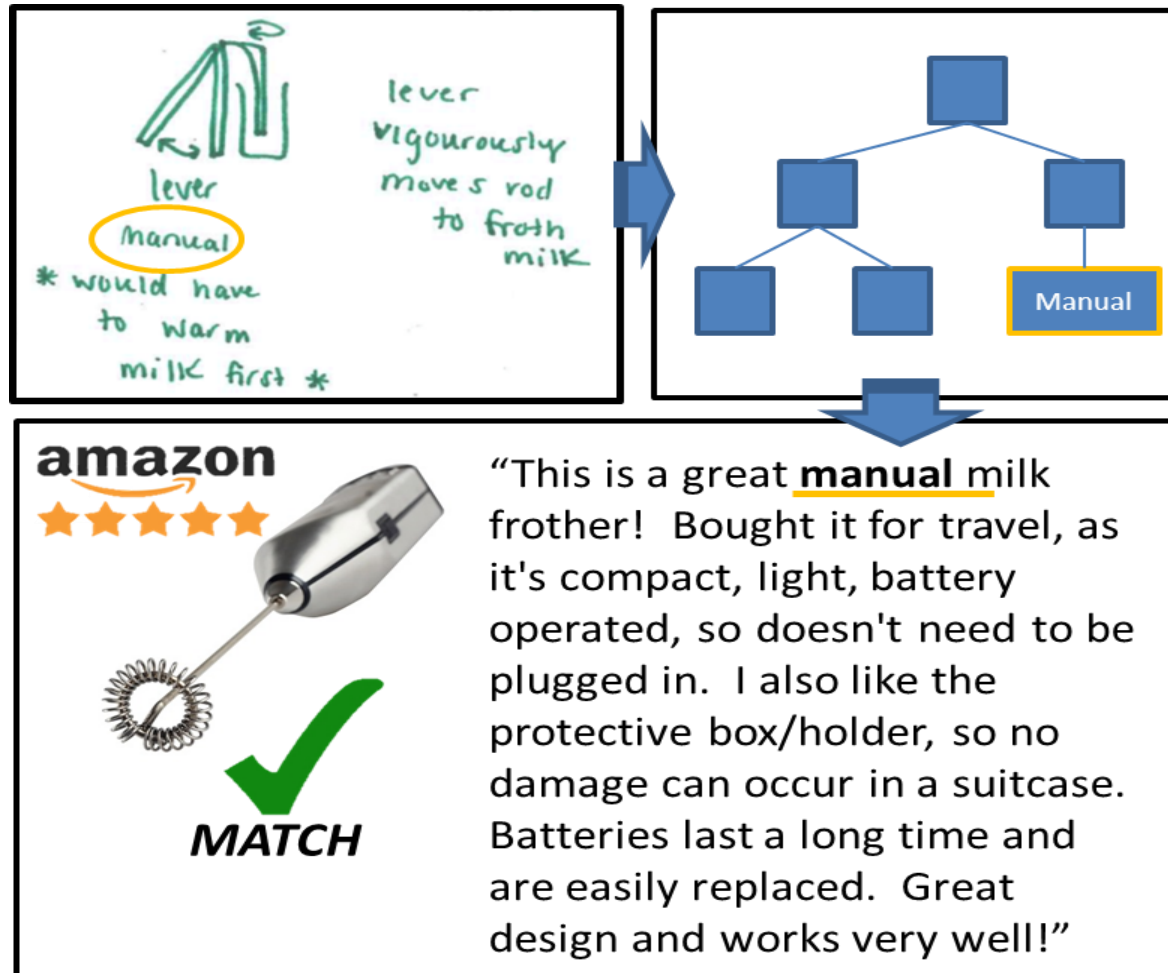


**Target Customers**



**Future Product Features**

# New Product Favorability is estimated from online customers' reviews of existing products that shared similar features.



*“You may not like a recipe, but you like **some of the ingredients** in the recipe. So you **take what you like**, maybe add in some new ingredients **and create a new recipe.**”*

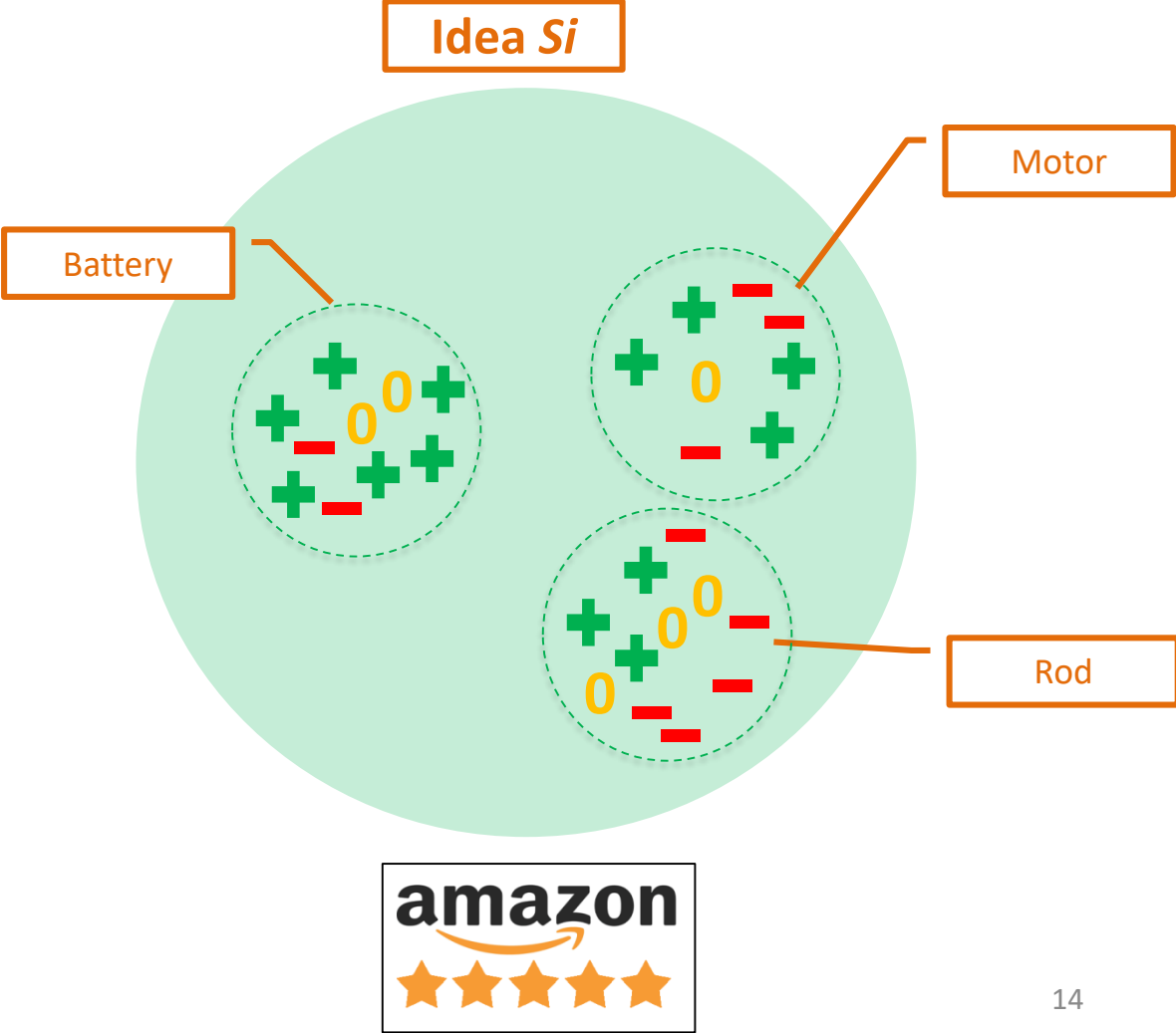
# The New Product Idea Favorability (NPF) is composed of three elements:

$$Popularity = \frac{\text{+} \quad \text{0}}{\sum \text{+} \quad \text{0} \quad \text{-}}$$

$$Polarity = \frac{\text{+}}{\text{+} \quad \text{-}}$$

$$Subjectivity = \frac{\text{+} \quad \text{-}}{\text{+} \quad \text{0} \quad \text{-}}$$

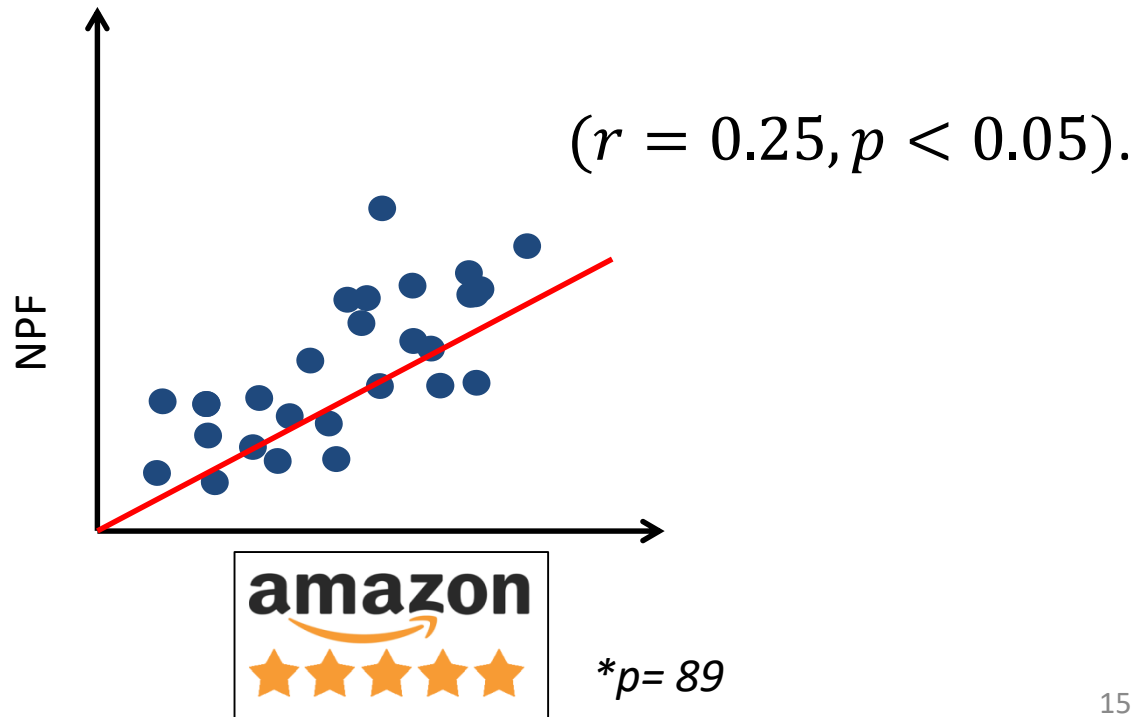
||  
NPF( $s_i$ )



# Case Study: Design of a novel and functional Milk Frother.

- $n=930$  Product Ideas
- $R=8,628$  Amazon customer reviews
- $p=166$  Milk frother products

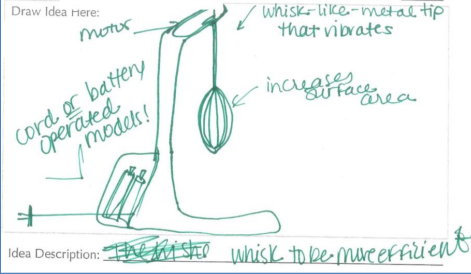
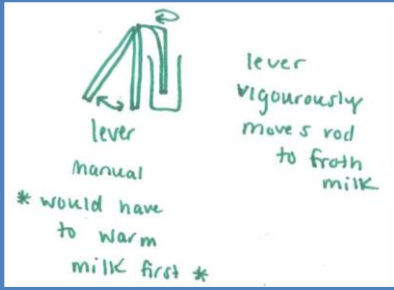
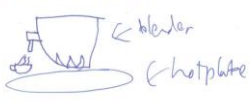

*NPF*  
Leave-one-out  
Validation



**RQ1:** Is there a relationship between the *SVS Novelty* and *Quality* score and the NPF?

**RQ2:** Is there a relationship between the *CAT Novelty* and *Quality* score and the NPF?



Idea	Num. of features	Sample features	SVS Novelty (r=0.35)	NPF
	16	Stand, whisker, battery,	0.88	0.0311
	8	<b>Rod</b> , Lever, <b>Manual</b>	0.82	0.0018
<p>10. <sup>idea</sup> milk that froths easily? Make the blender move as a washing machine? Oscillate directions?</p> <p>Nozzle on top to collect only foam</p> 	5	<b>Stirring</b> , <b>Heat</b>	0.59	0.0170
 <p><del>Dance</del> that shakes milk in all directions Dance</p>	1	Shaking	0.44	0.0002

*SVS*  
*Quality*  
r=0.08

*CAT*  
*Novelty*  
 $\tau=-0.08$

*CAT*  
*Quality*  
 $\tau=-0.06$

# Future work should focus on exploring other product features, task design, and concept selection methods.

- ✓ Customer Reviews can help inform decision-maker in the early stages of the product development process
- ✓ The NPF can measure the creativity and favorability of ideas
- ✓ Data-mining and sentiment analysis of customer reviews is a promising areas of future research

More Novel ?

# Thank you!



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