



Lawrence Berkeley National Laboratory  
Environmental Energy Technologies  
Division **Behavior Analytics**  
*Providing insights that enable evidence-based, data-driven decisions*

Behavior Analytics Webinar Series

## Uses for Smart Meter Data

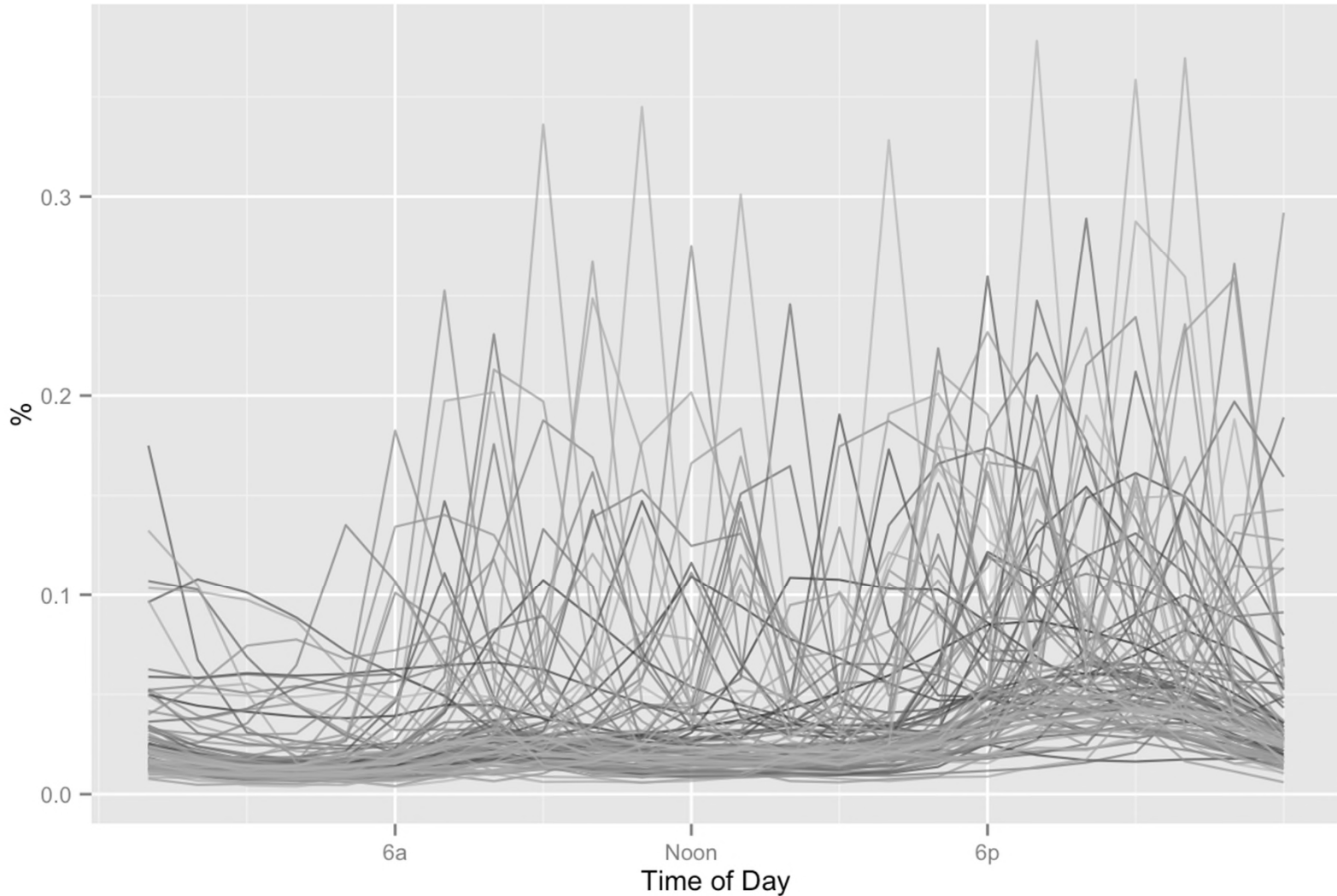
*Topic #3: Customer Segmentation Applications  
in Existing Rates and Programs*

Peter Cappers, Annika Todd & Greg Leventis

December 13, 2018

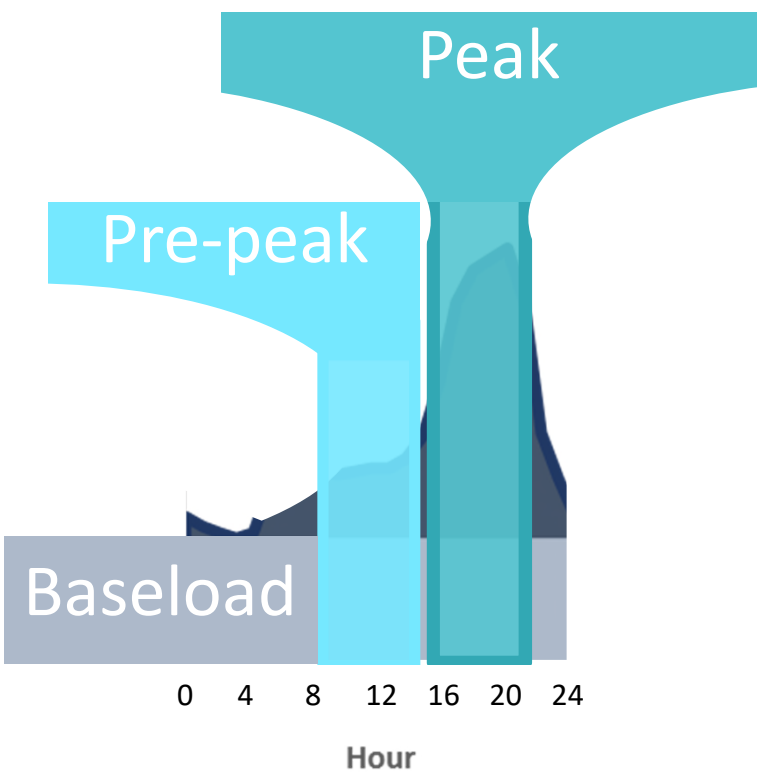
Research team also includes: C. Anna Spurlock, Ling Jin, Sam  
Borgeson, Dan Fredman

# Wide Variety of Load Shapes Exist Across Customers Within the Same Class



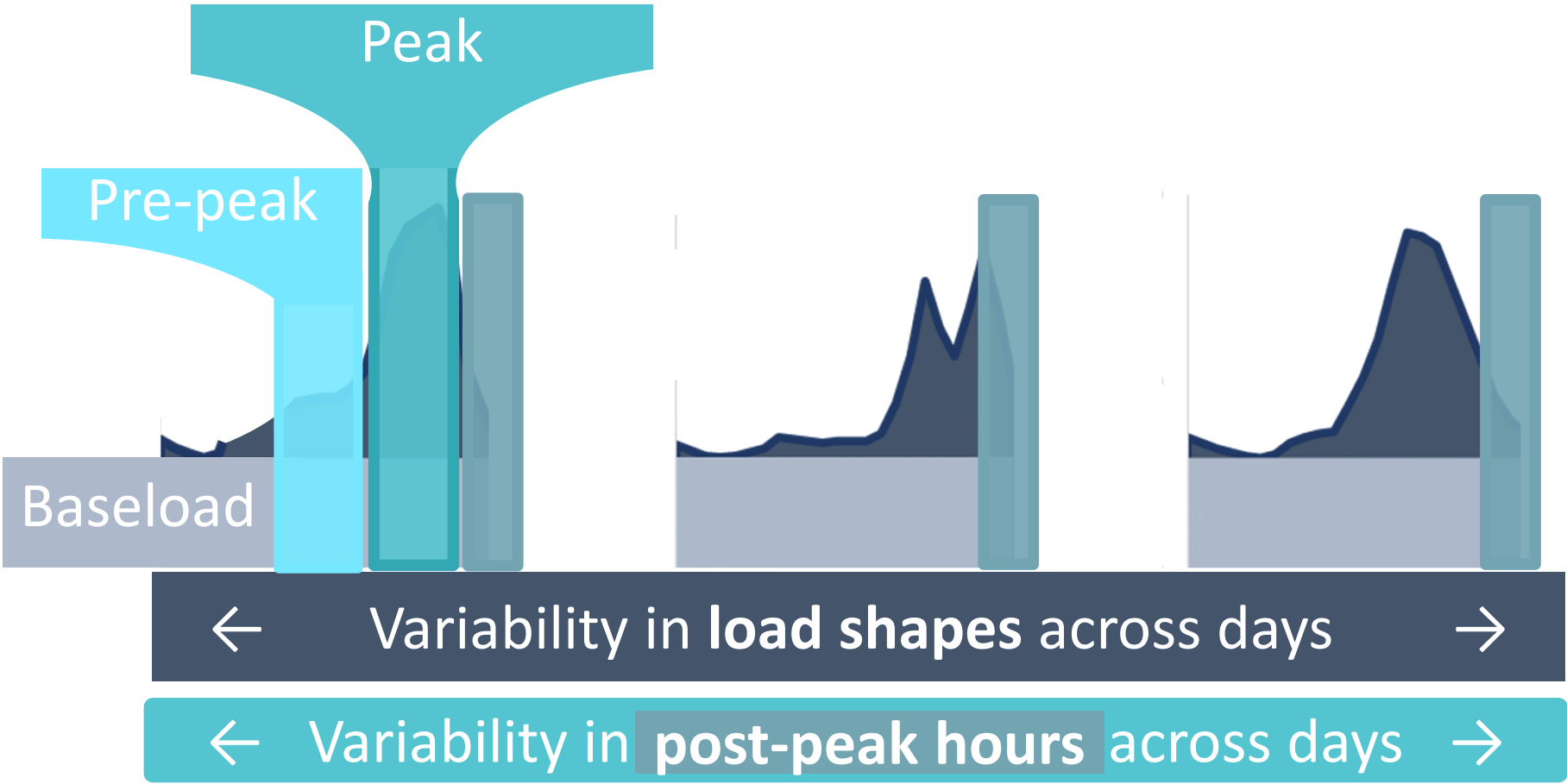


# Load Shape Characteristics that we found are important for clustering households into groups



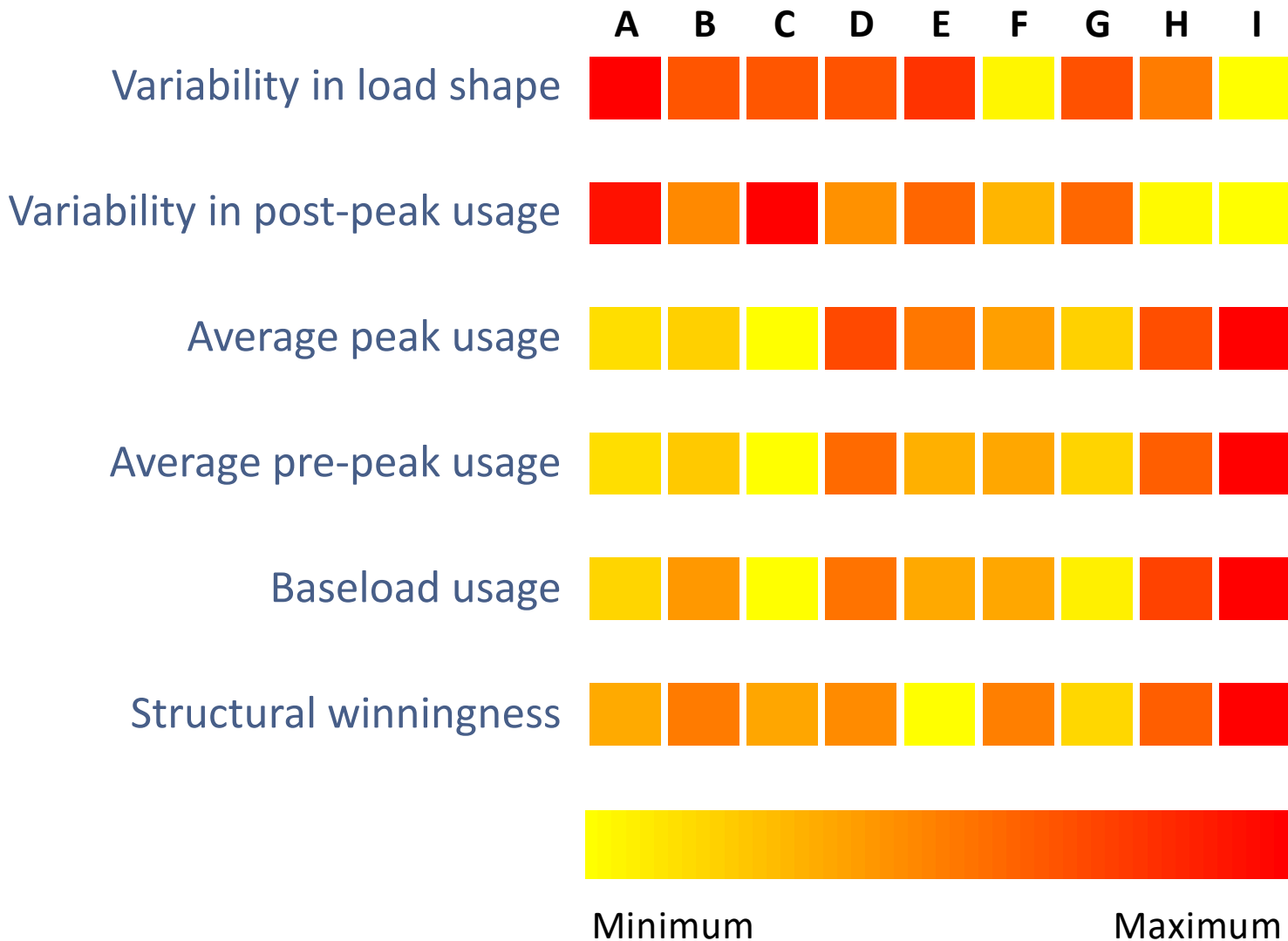


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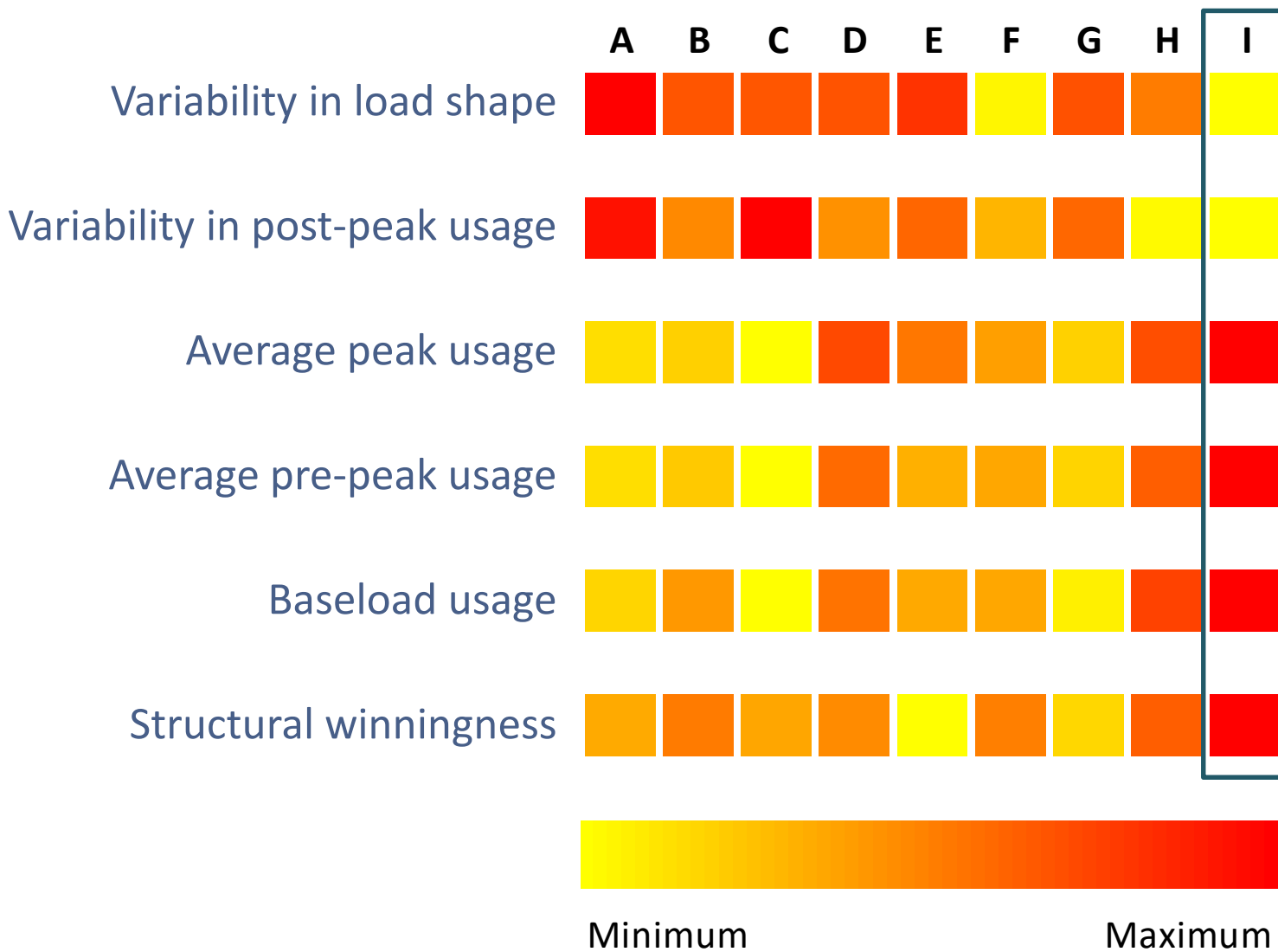


# Comparing Load Shape Metrics Across Customer Cluster Groups



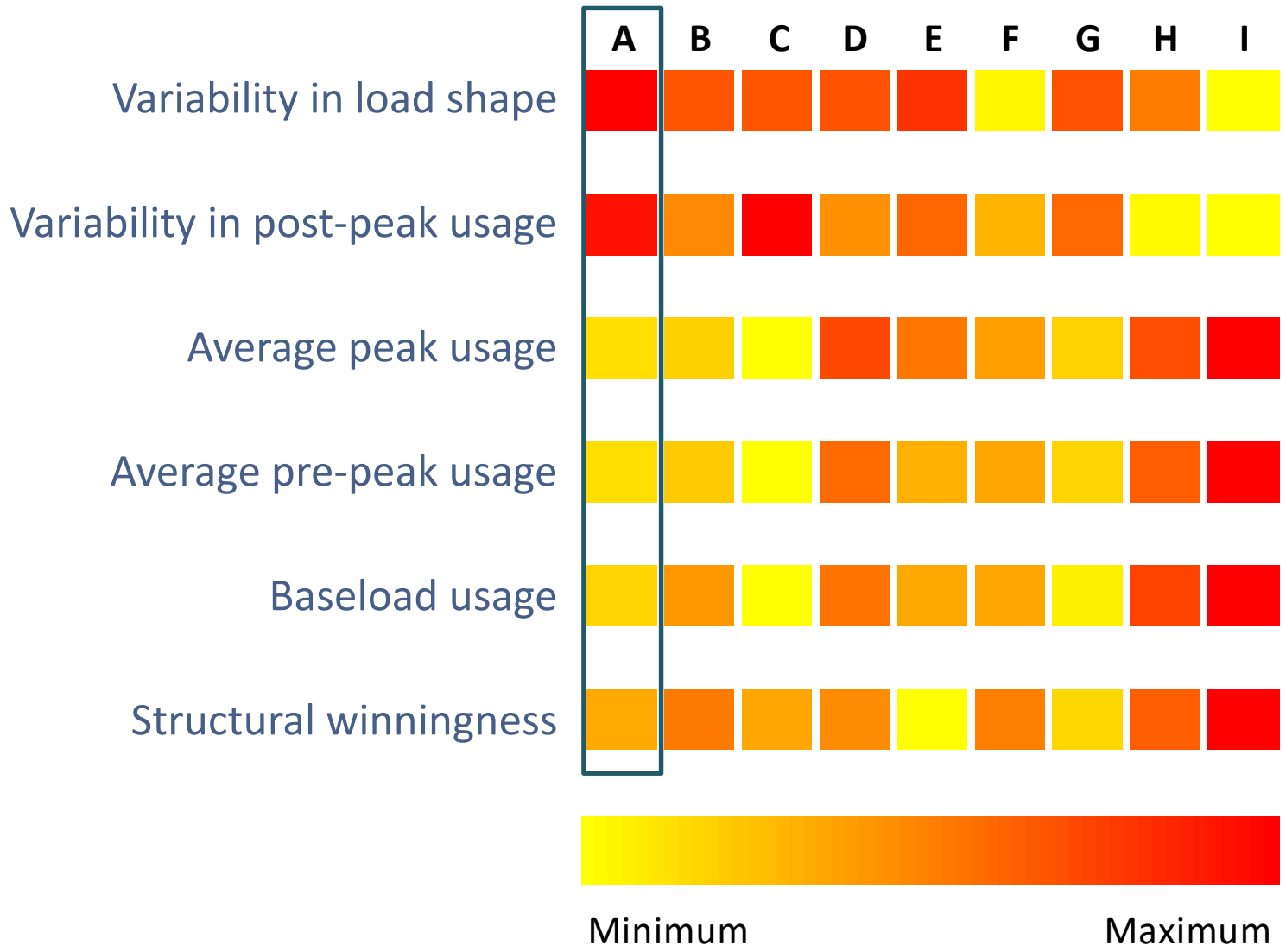


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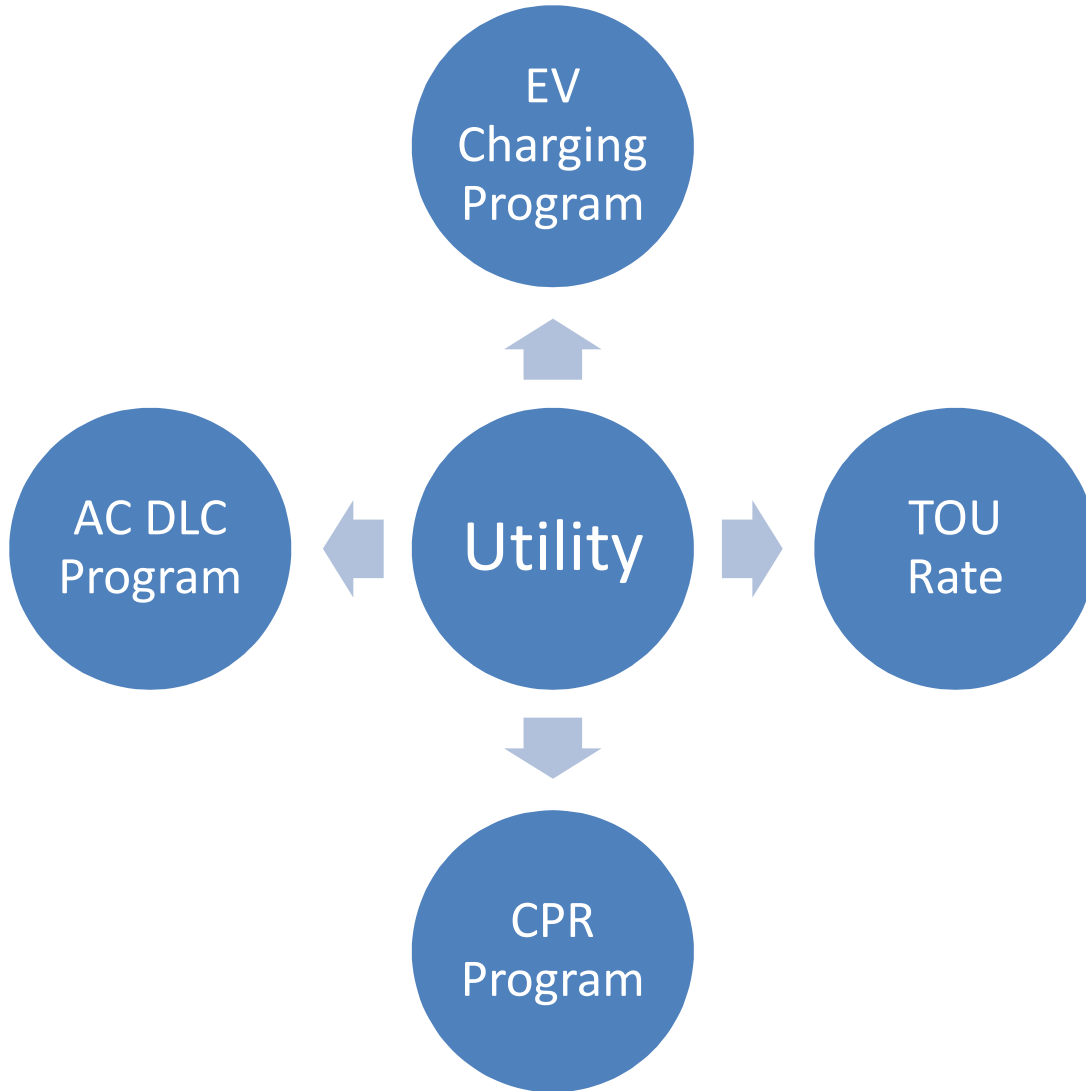


# Comparing Characteristics Across Customer Cluster Groups





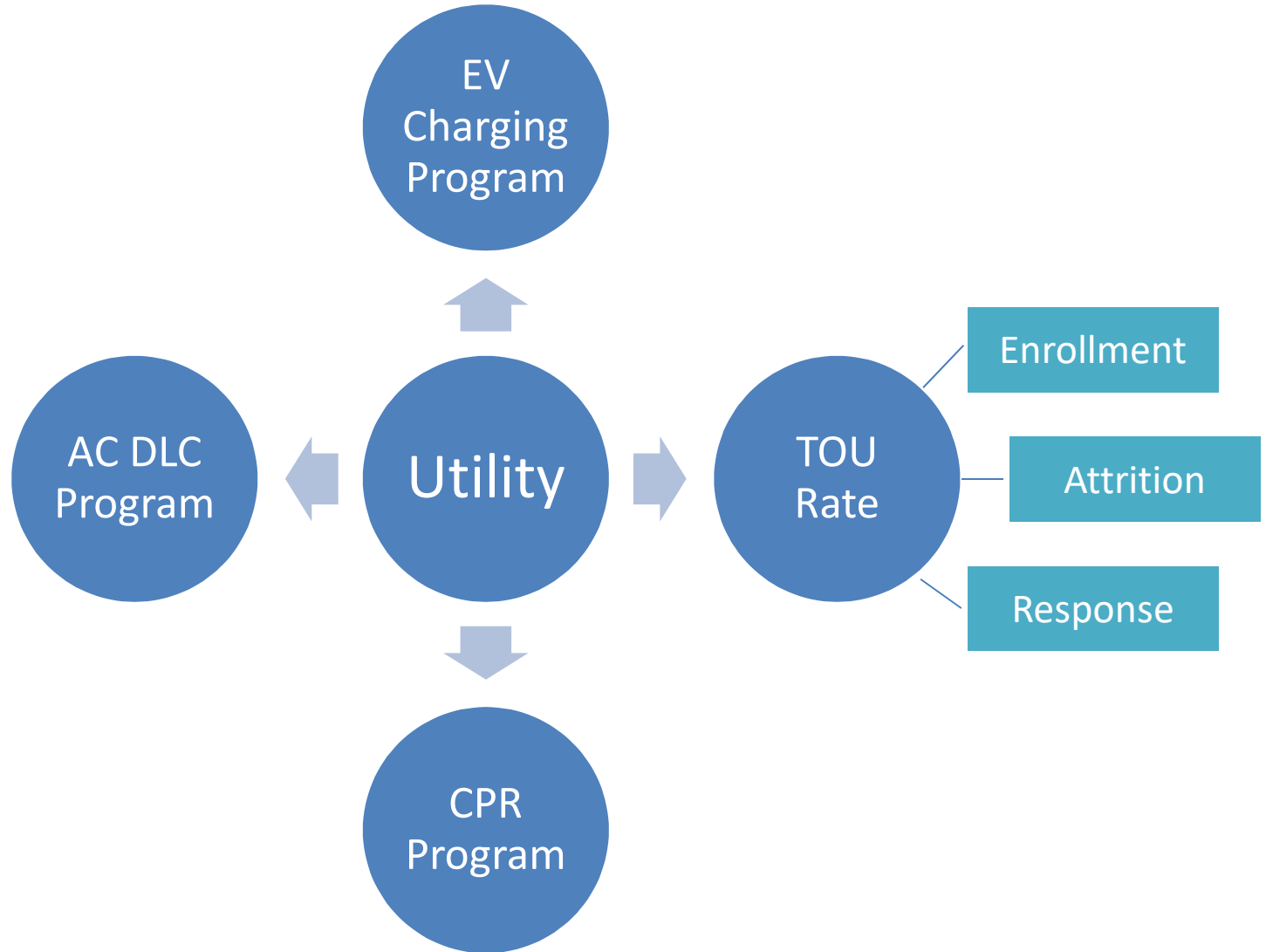
# Analyze Cluster Groups to Better Understand Existing Rate or Program Offerings





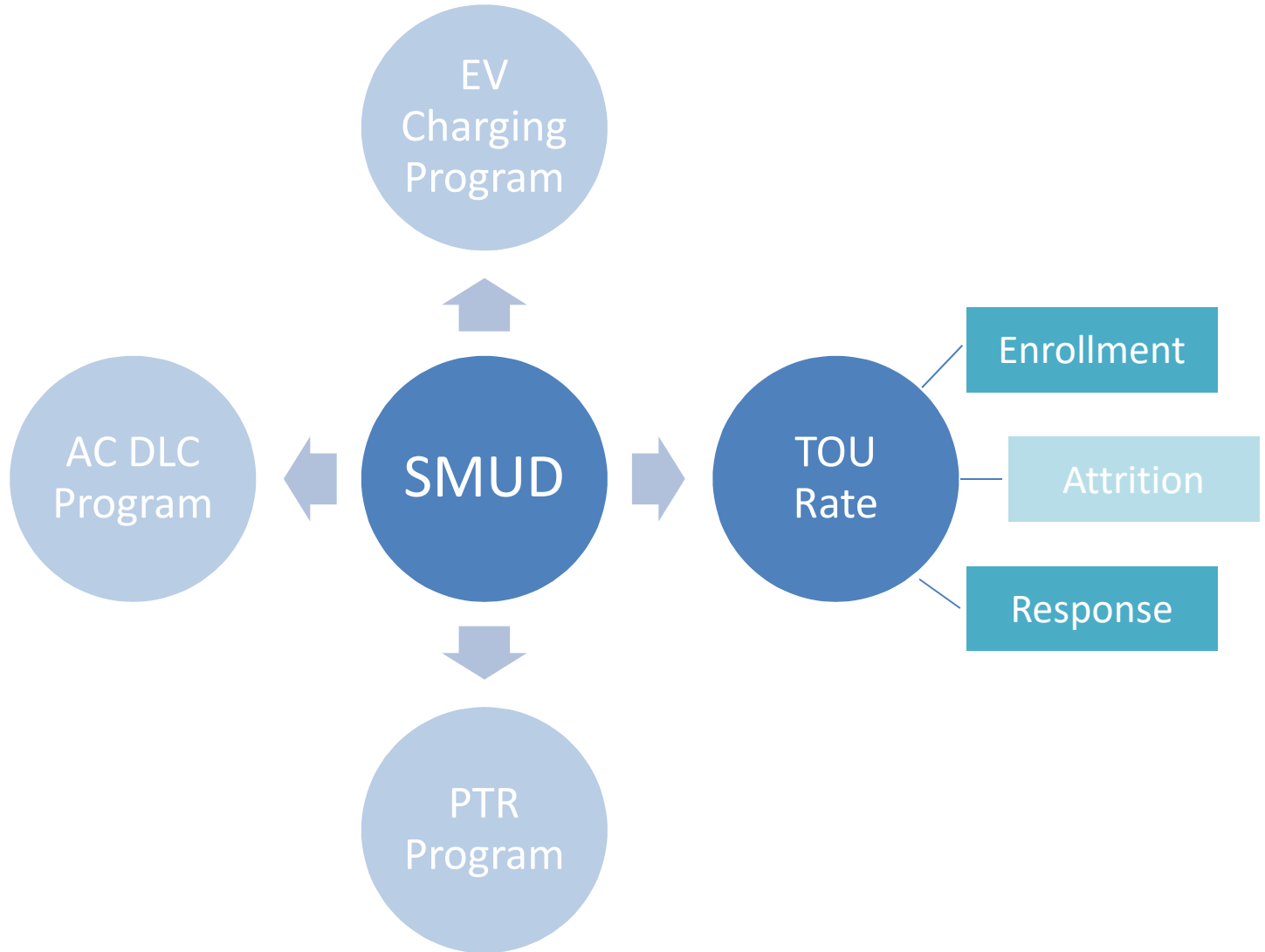


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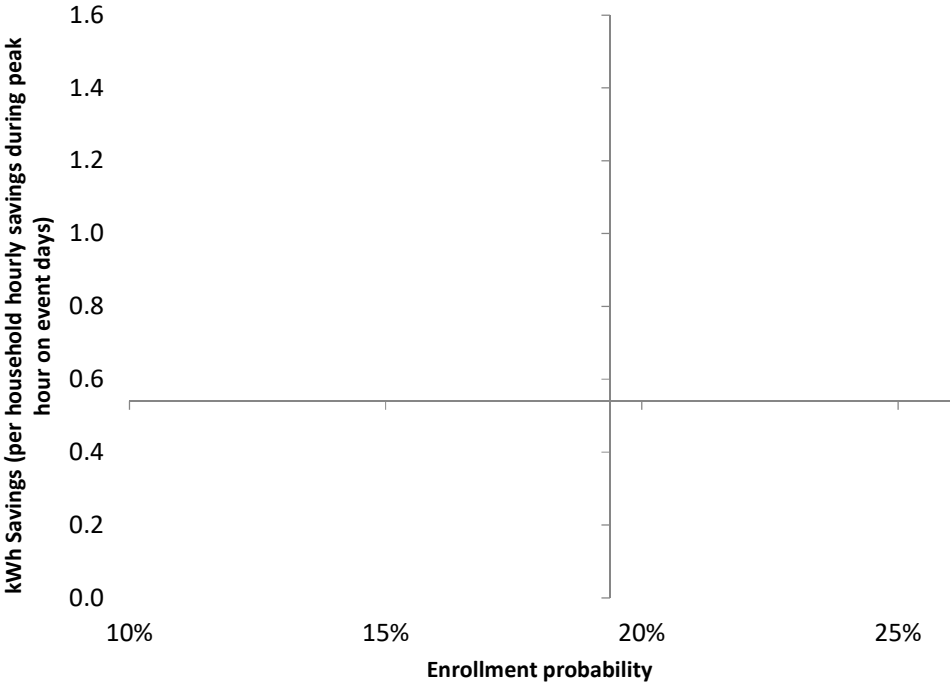
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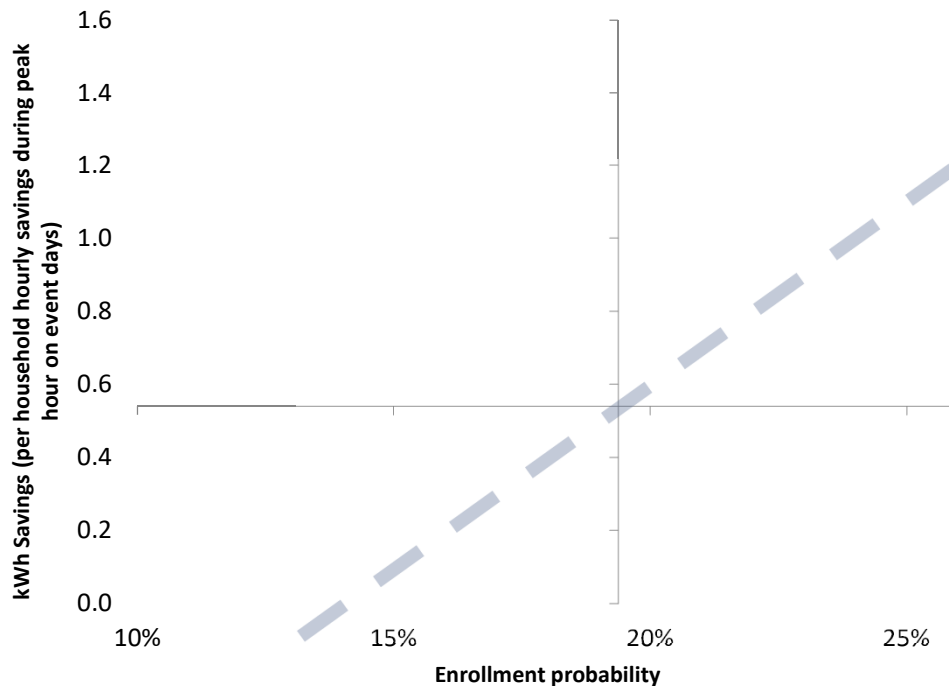


# Customer Cluster Groups

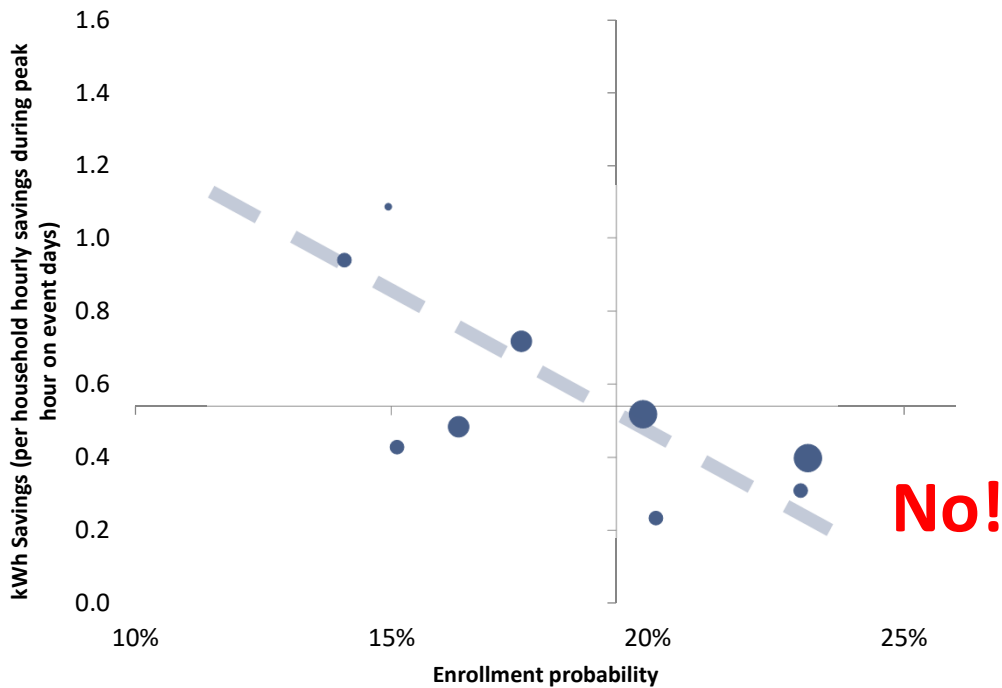
## TOU Enrollment vs. Response



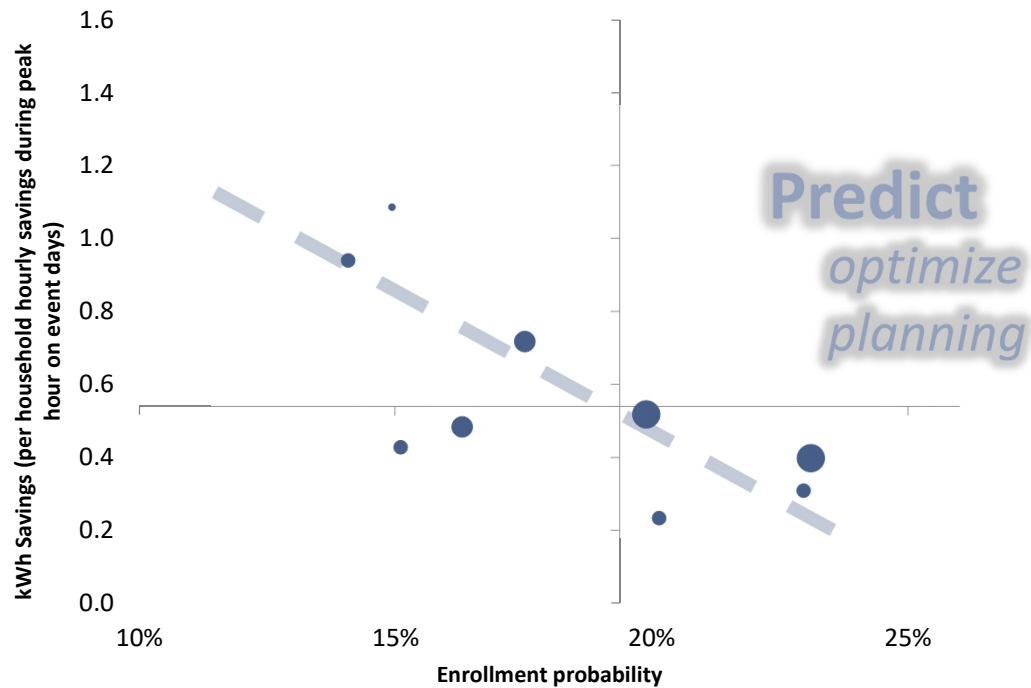
# Do Customers who are More Likely to Enroll Also Provide Greater Load Response?



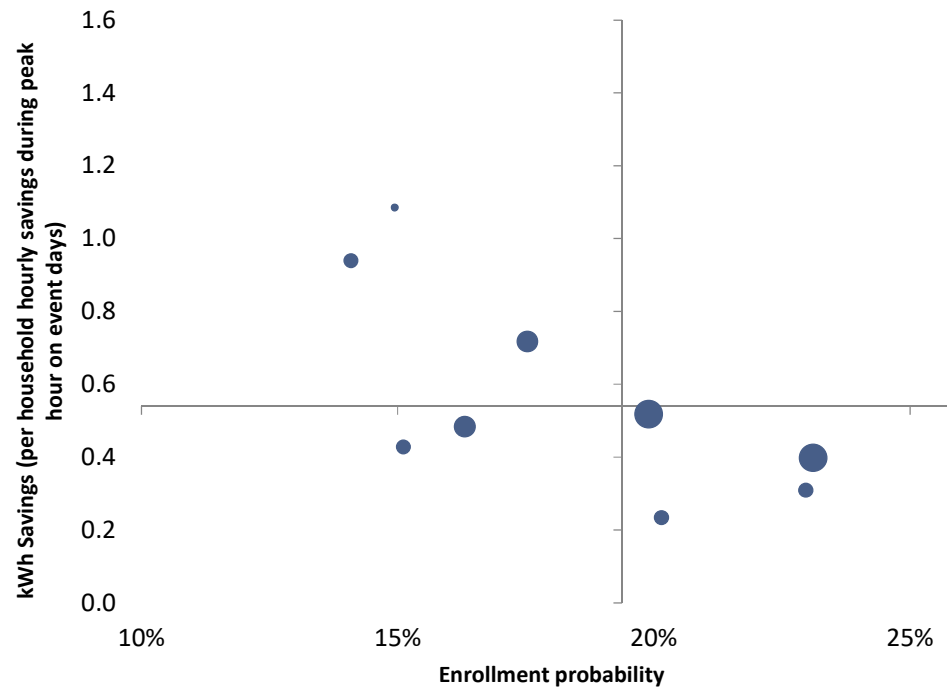
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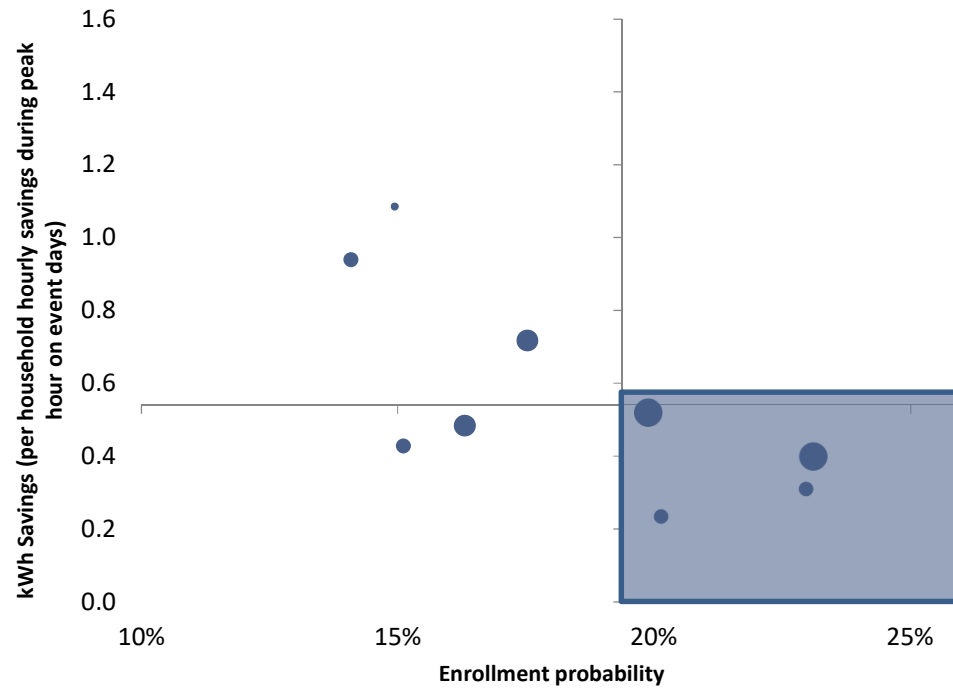
# Set More Reasonable and Achievable Enrollment and Response Goals



# Do Structural Winners Provide Less Load Response?

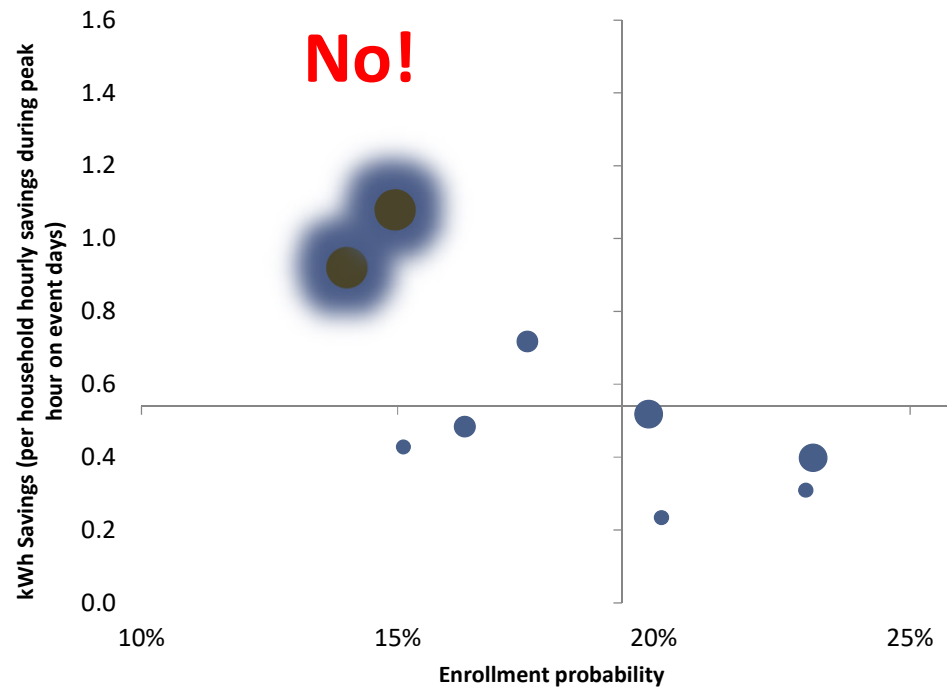


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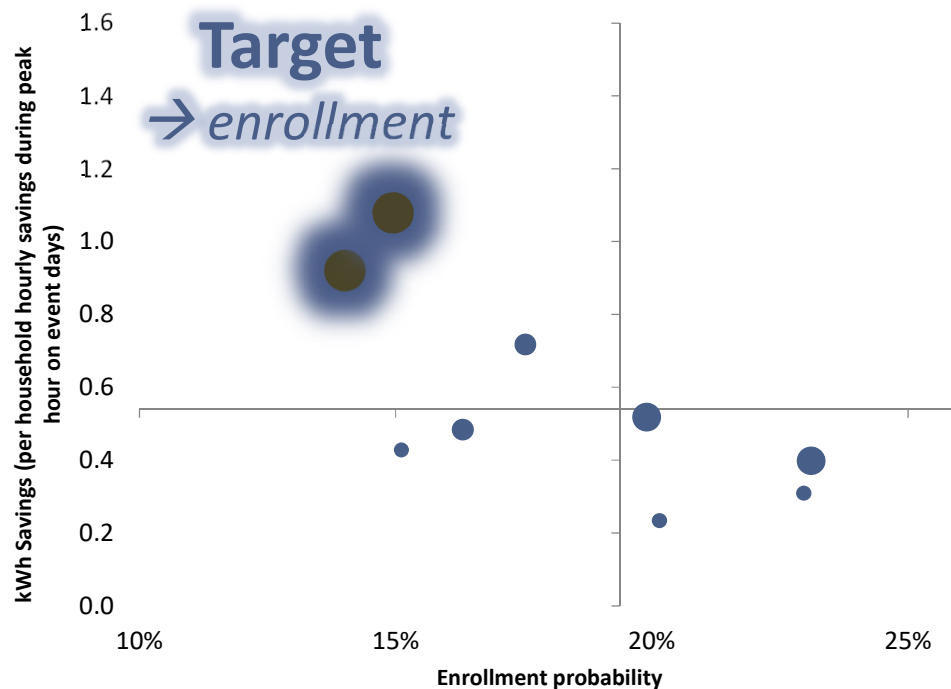




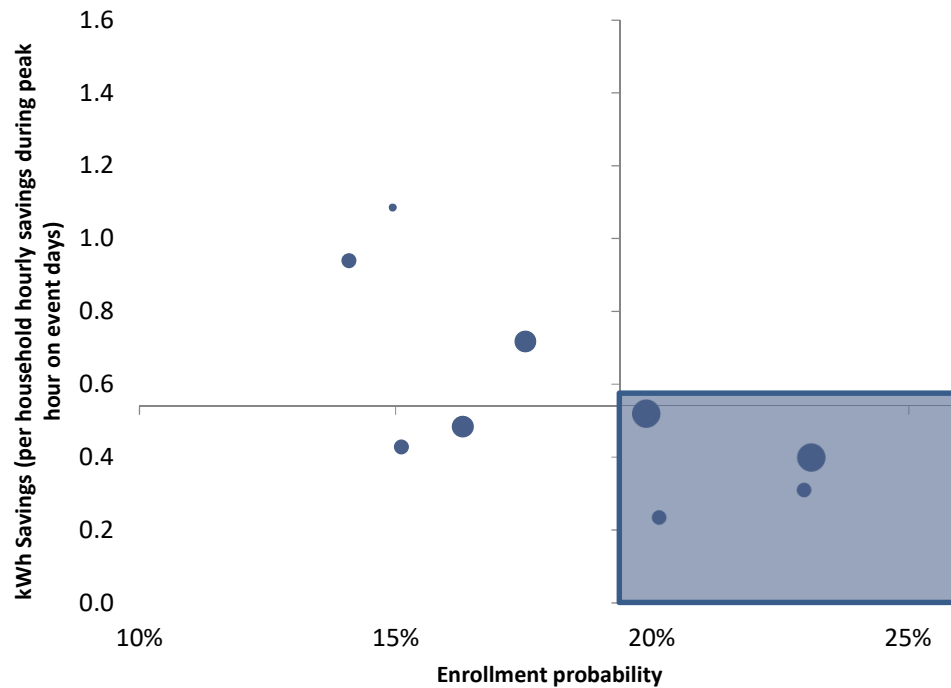
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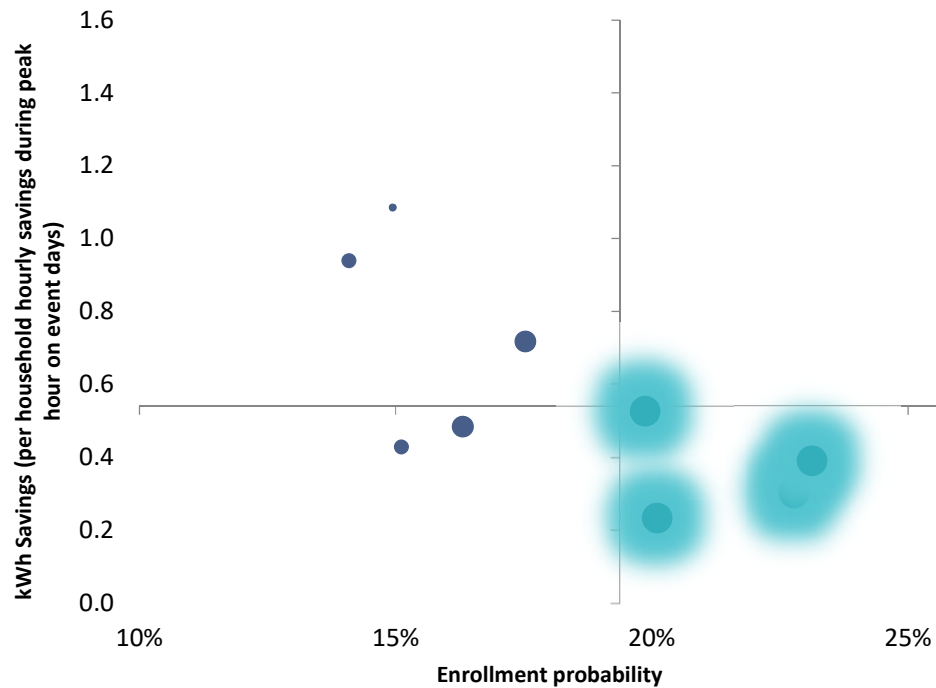
# Target Market to the Most Responsive Customer Cluster Groups



# Who are the Customers Most Likely to Enroll?

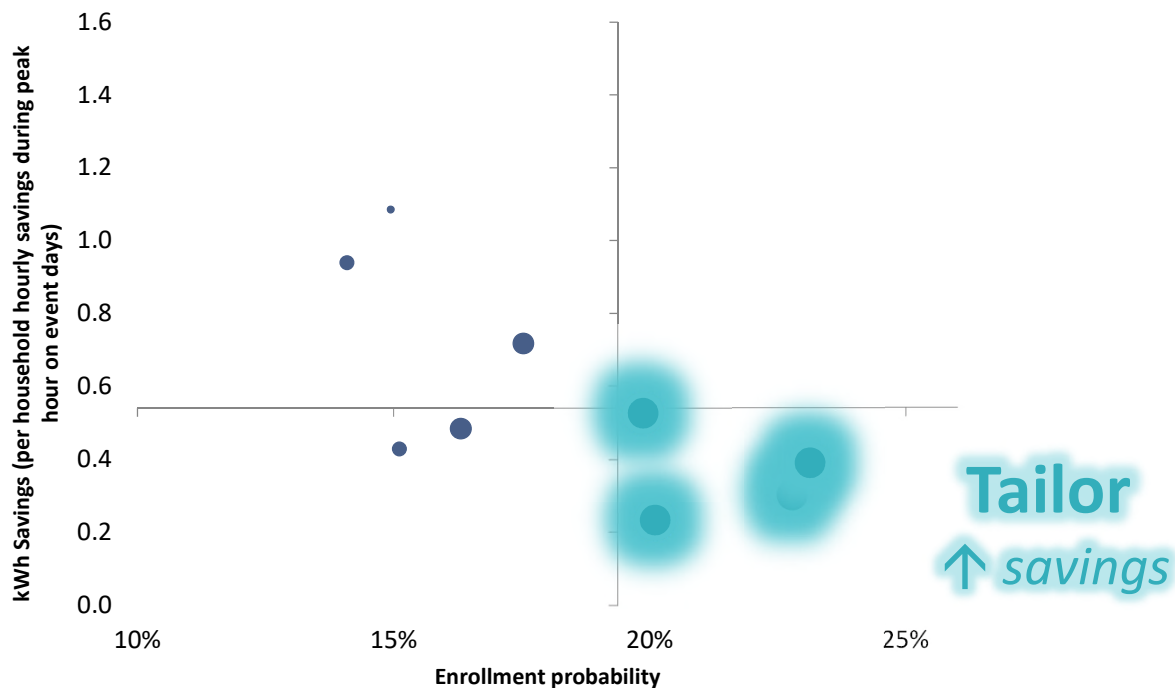


# Who are the Customers Most Likely to Enroll?



**Flexible with  
discretionary  
usage**

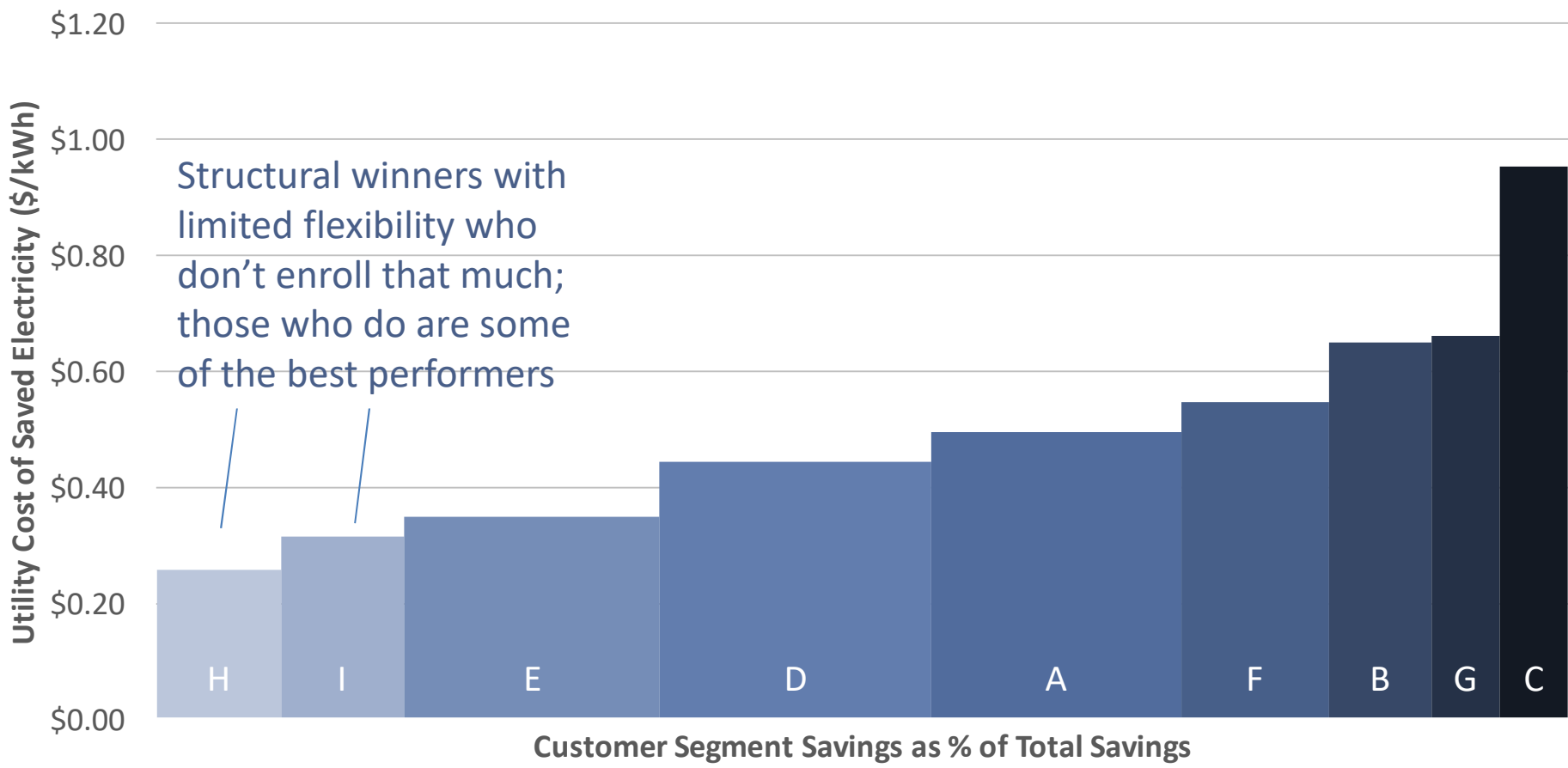
# Tailor Marketing and Education Material to Increase Responsiveness



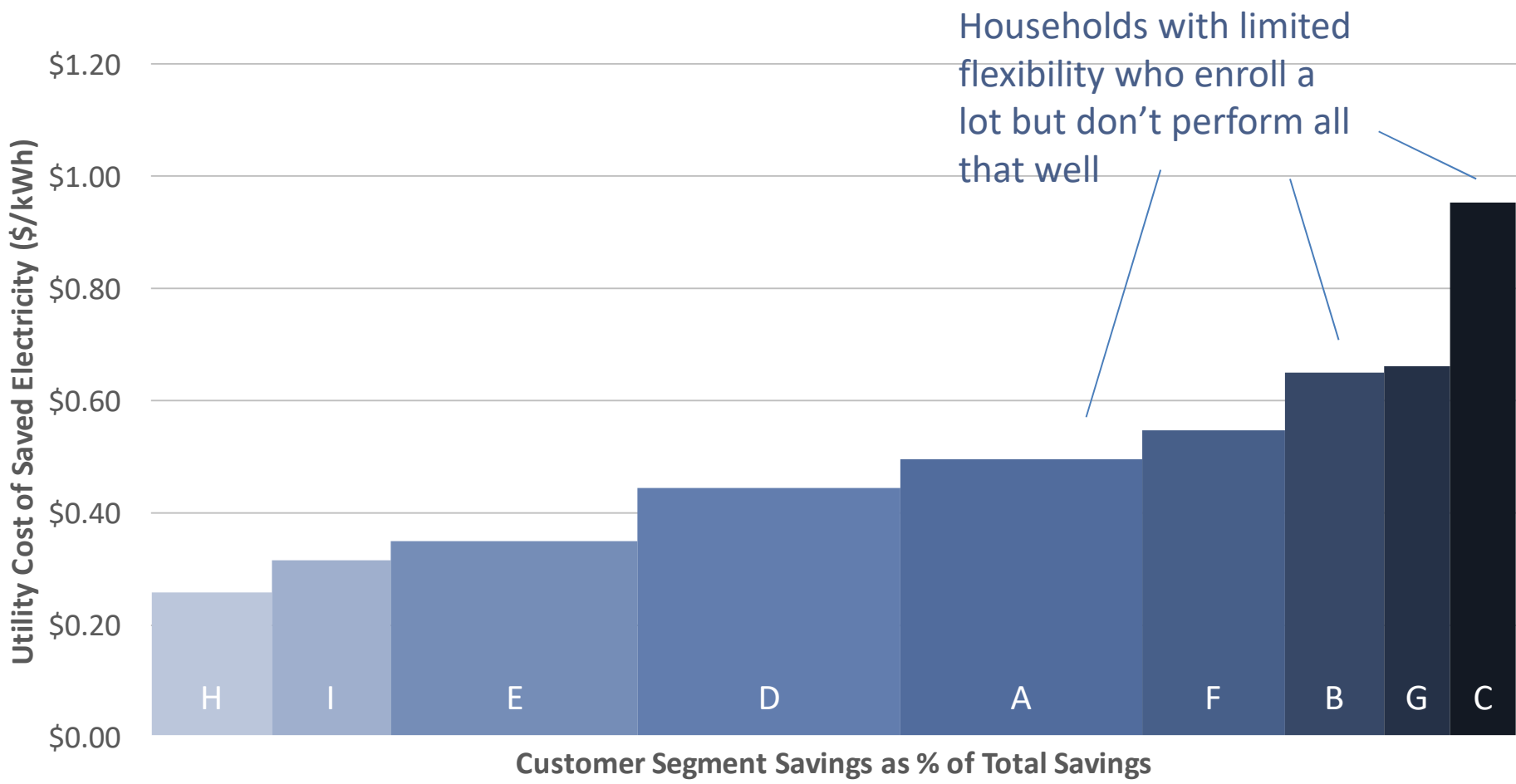
# Which Customers are More Cost Effective to Pursue?



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- By analyzing existing smart meter data, a utility can:
  - Better understand the diversity of customers in its service territory
  - Identify load shapes that may be more conducive than others for participation in some rate or program
  - Identify load shapes that may be more conducive than others for providing peak reductions (or more generally, energy demand smoothing)
  - Target customers with those load shapes for rate or program offerings, as well as education and outreach material specific to them
  - Identify load shapes that should be avoided when seeking participation in some rate or program
  - Be able to easily change program offerings as the grid expands and requires load reductions at different times (e.g., solar and wind power, EV charging, batteries, etc. might change what time the peak system load occurs)



## **Berkeley Lab - *Behavior Analytics***

Providing insights that enable evidence-based, data-driven decisions

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