

# Building a business case for data science

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Fall 2021 E Source Marketing and Communications  
Leadership Council



# Agenda

- Why you should embrace the shift to data-driven decision-making
- Case study: Data-driven customer cohorts in a demand-response program
- How to apply data science in a marketing campaign
- Q&A

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# Industry in transition

Decarbonization

Safety, reliability, resilience

Downward cost pressure

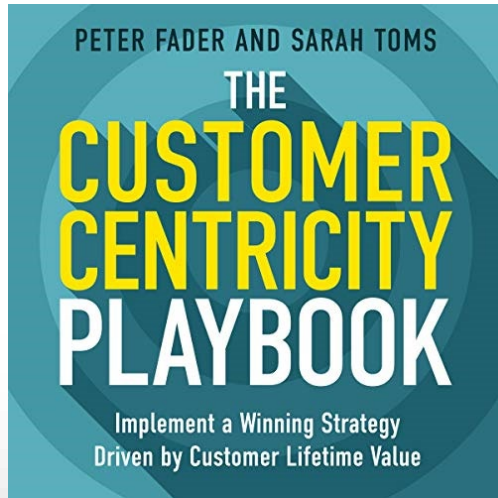
Customer equity

Smart collaboration

Speed  
to  
value



# Rethinking customer offers and engagement



## See your customers as individuals to maximize customer lifetime value

Stop wasting resources by chasing down average consumers.

Maximize customers' long-term financial value to the utility by focusing on those aligned with your priorities.

### 1. Digital customer replica

- Advanced metering infrastructure (AMI) energy profile
- Behavioral profile

### 2. Best customers identified

- Individual customer assessments
- Artificial intelligence–derived microcohorts of best fit

### 3. Best customer personas

- Key attributes identified
- Ethnography/voice of the customer

### 4. Precision simulations

- Customer specific
- Grid specific

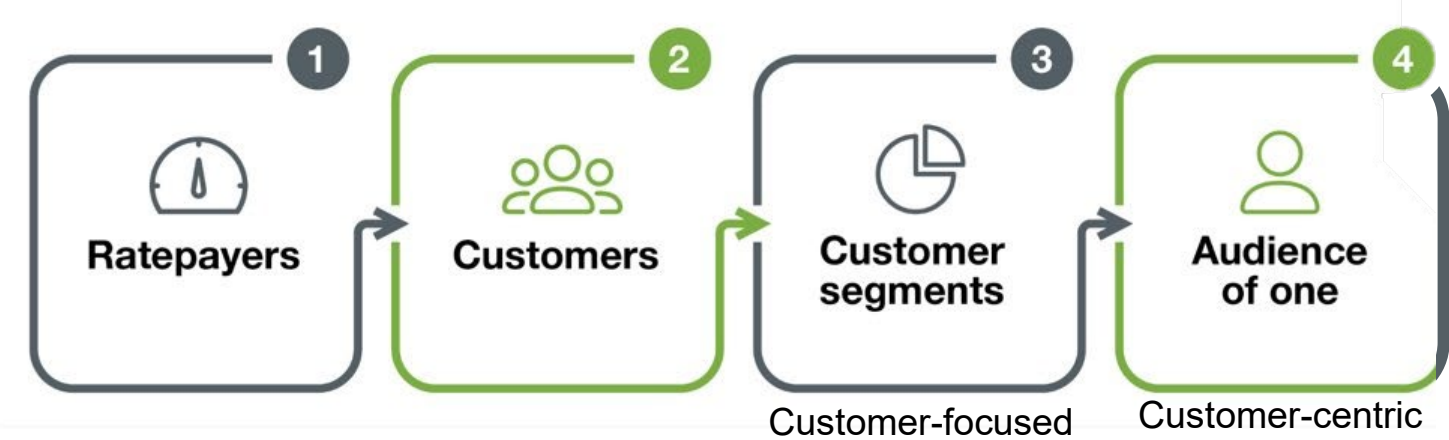
### 5. Engage best customers

- Personalized engagement
- Engagement feedback



**Audience of One**

# Utility customer journey



# Case study: Data-driven customer cohorts

## Utility's static persona segments

Percentage of residential customers



Savings per customer



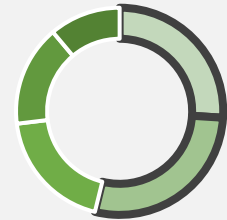
Static personas created different groupings but without any impact or differentiation between segments.

## E Source cohorts: Peak-time rebate

Percentage of residential customers



Savings per customer



Machine-driven cohorts identified best customers who represented a disproportionately high load shift based on individual energy and behavioral profiles.

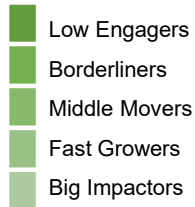
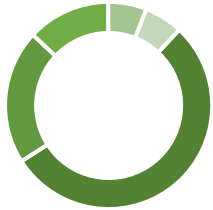
# Data-drive customer cohorts

- Innovative Investors
- Totally Tech
- Sensible Savers
- Continually Connected
- Simply Service



Factor	Big Impactors (BI)	Fast Growers (FG)	Middle Movers (MM)	Borderliners (B)	Low Engagers (LE)
Billing	Almost 4 times more in billing metrics of LE, ~2 times more than FG	Mirrors patterns of MM	Mean value for "AvgBillAmt12Mo" ~\$140, this is 2.5 times as much as LE ~\$68	Marginally less than MM in metrics, but 2 times more than LE	"KWH_NORMAL" ~ 655, "BILL_AMT_12MO" ~ \$808
Direct media over digital	Proportionally in the middle rank of engagement	Least likely to engage in direct media marketing	Ranked slightly less than FG engagement	Ranked slightly less likely than LE	Most likely to respond to mail, newspaper ads
Financials	Largest magnitude across all variables, indicating largest revolving credit and investment opportunity	Metrics reflect those of BI very closely	Metrics are ~25% higher than B and LE	Performs ~20% above LE	Weakest financial metrics
Home metrics	These are bigger/better measures, of which BI has the largest values	Uniformly larger values than MM, but ~15% less than BI	Middle of the road values against other personas	Square foot values not very different from FG, but ~10% less on market value	Proportionally, LE metrics are the lowest among each variable
Keeping busy	Among this factor, BI are most on the move and responsive to subscription services	Tracks very closely to BI, except in "Satellite. Radio Subscriptions"	~15% more likely than FG, but ~15% less likely than BI and FG	~15% more likely when compared to LE	Least likely to be travelling and engaging in subscriptions
Purchase style	Representing the middle persona, however, is second to MM in "Web And Brick Mortar"	Uniformly most likely to engage in online activities	About ~10% less engagement online from FG, and ~30% more active than LE	About ~12.5% more engaged online over LE	Lowest online activities

# Data-driven customer cohorts



- **Big Impactors:** Larger single-family dwellings, with high income ranges and subsequent billing metrics; busy and likely have digital subscription activity
- **Fast Growers:** Tend to track tightly with Big Impactors, except are the most engaged with technology behaviors
- **Middle Movers:** Will track with Fast Growers; proportionally lower values on housing sizes, income, notably close with respect to technology
- **Borderliners:** Individuals in this group are split; some may tend by value to lean into Low Engagers, while some are lined more with Middle Movers; a key may be viewing this group as potential Middle Movers; tend to rent
- **Low Engagers:** Most likely to interact with newspapers, flyers, and traditional media; least technologically, tendencies to live, and smaller square foot housing; lower household income and comparatively older demographic



# Questions and considerations

- What utility customer data is needed?
- Do I need AMI data?
- What do I do with my existing customer personas?

# Key takeaways

- As the industry is transitioning, utilities need to get more customer-centric in order to hit big goals
- A data-driven approach to understanding your customers can improve program performance while supporting key strategic initiatives:
  - Decarbonization
  - Equity
  - Reduced costs

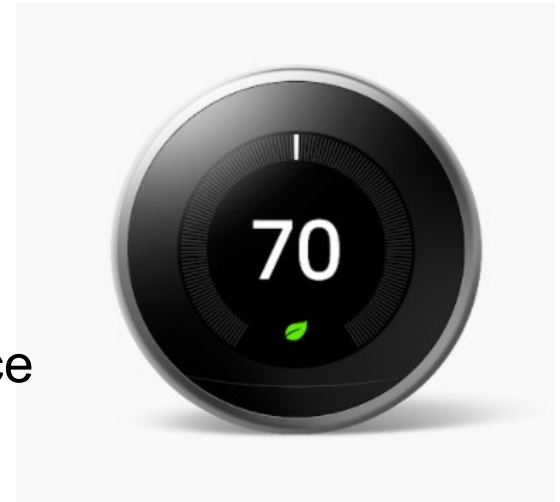


A nighttime aerial view of a city with illuminated buildings and a complex highway interchange. The top of the image is a dark blue gradient.

# How to build marketing campaigns with data science

# Smart thermostat campaign example

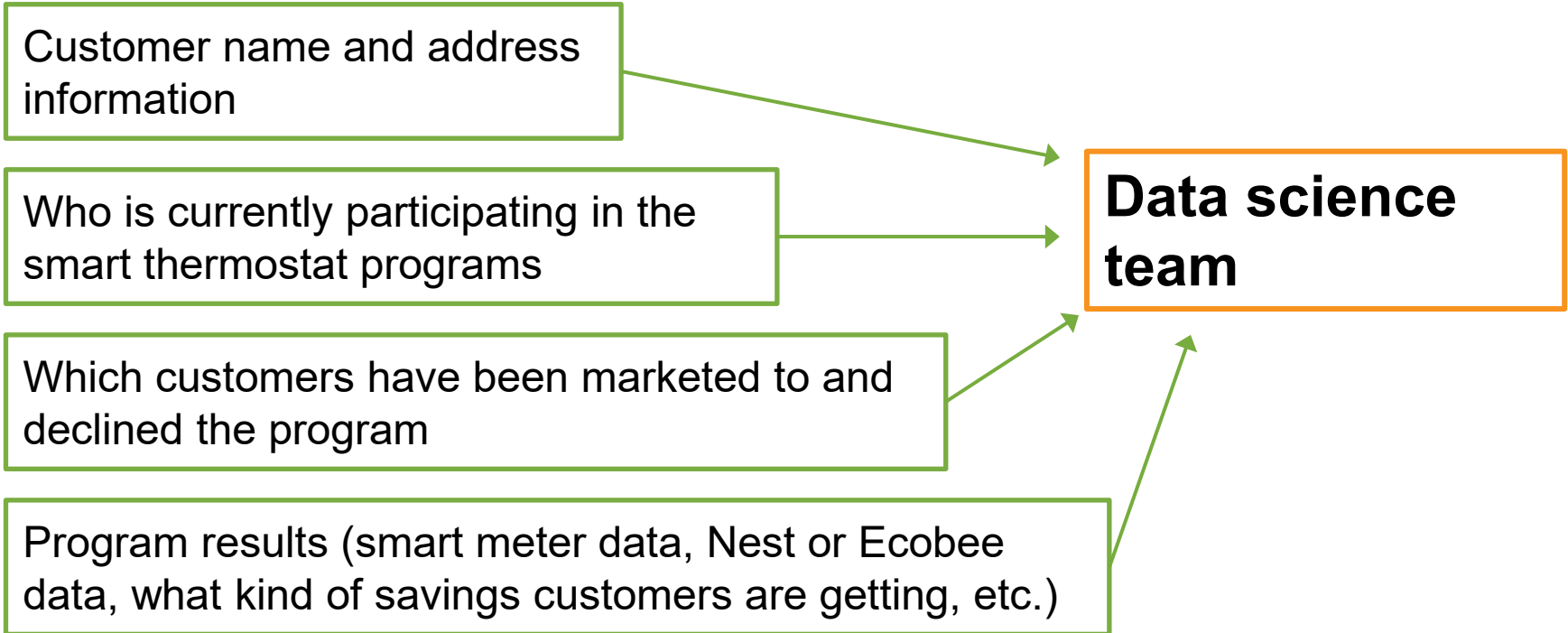
- Friendly Power wants to increase participation in their smart thermostat program
- The program has a limited budget, so they can't mass market to all residential customers
- Friendly Power's marketing team uses data science to find the best customers to target



Source: Nest Thermostat

# Data process: Information utilities share

## Utility information



# Data process: Custom data science analysis

- E Source Data Science appends hundreds of data points to understand which customers are most likely to participate
  - Look at past participants to see who has been a successful smart thermostat program participant
  - Cross reference the groups most likely to participate with the attributes of those that are successful program participants to find the next program superstars
  - The team then scores these customers and ranks them in priority of who marketing teams should target



# Final deliverable

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V	W	X	Y	Z	AA	AB	AC
1	Customer_ID	Propensity	Impact	MicroPersona	Low/moderate income	Non-English	Age	Income	Renter	Shops at Big Box Stores	Uses Streaming Services																		
2	2471218110	0.83230889	High-Impact	Big Impactors			39	154916			1	0																	
3	3233639208	0.67143804	High-Impact	Big Impactors			34	187004			0	1																	
4	2693701447	0.81166522	High-Impact	Big Impactors			39	163143			0	0																	
5	491542467.2	0.51840808	High-Impact	Big Impactors			64	194403			0	0																	
6	2630446291	0.78760874	High-Impact	Big Impactors			51	164163			1	0																	
7	699885491.5	0.89538562	High-Impact	Big Impactors			60	129736			1	1																	
8	1632399431	0.78450733	High-Impact	Big Impactors			47	98639			1	0																	
9	2566726166	0.19121002	Standard-Impact	Borderliners	x	x	29	120574	x		0	1																	
10	3836609072	0.20227744	Standard-Impact	Borderliners			77	185774	x		0	0																	
11	2789664704	0.19338884	Standard-Impact	Borderliners			62	161581			1	1																	
12	1281868352	0.22968456	Standard-Impact	Borderliners			55	109030			0	0																	
13	3784472931	0.22346106	Standard-Impact	Borderliners	x		76	101547			0	0																	
14	493298384.1	0.23534998	Standard-Impact	Borderliners			31	195891			0	1																	
15	524356943.9	0.17362981	Standard-Impact	Borderliners			79	82895			0	0																	
16	1131396472	0.16488446	Standard-Impact	Borderliners			46	134334			1	0																	
17	3082900988	0.187916	Standard-Impact	Borderliners	x		73	121872	x		1	1																	
18	39882519.66	0.1928928	Standard-Impact	Borderliners			60	196879			1	0																	
19	3602984337	0.14356078	Standard-Impact	Borderliners			25	185615			0	0																	
20	25310895.2	0.22895847	Standard-Impact	Borderliners			37	105056	x		1	1																	
21	4094998652	0.15422432	Standard-Impact	Borderliners			34	158341			0	0																	
22	1249270862	0.1764251	Standard-Impact	Borderliners			64	193371	x		0	1																	
23	95433349.88	0.14987199	Standard-Impact	Borderliners	x	x	30	197144			0	0																	
24	535068751.4	0.20439835	Standard-Impact	Borderliners			23	100868			1	0																	
25	800945673.4	0.14571443	Standard-Impact	Borderliners			70	135577	x		1	0																	
26	1137195963	0.17911781	Standard-Impact	Borderliners			48	128856			0	0																	
27	36097933.54	0.16688769	Standard-Impact	Borderliners			28	128856			0	0																	
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46	3430393360	0.20599864	Standard-Impact	Borderliners		x	33	147124			0	1																	
47	3658636560	0.21665519	Standard-Impact	Borderliners			42	141930	x		1	0																	
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54	667025773	0.23236573	Standard-Impact	Borderliners		x	82	196086			1	0																	
55	3251576028	0.14252545	Standard-Impact	Borderliners			67	157149			0	0																	

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# Final deliverable

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8	1632399431	0.784507334	High-Impact	Big Impactors			47	98639			0
9	2566726166	0.191210017	Standard-Impact	Borderliners	x	x	29	120574	x		1
10	3836609072	0.202277437	Standard-Impact	Borderliners			77	185774	x		0
11	2789664704	0.193388402	Standard-Impact	Borderliners			62	161581			1
12	1281868252	0.229684561	Standard-Impact	Borderliners			55	109020			0
13	3784472931	0.223461062	Standard-Impact	Borderliners	x		76	101547			0
14	493298384.1	0.235349983	Standard-Impact	Borderliners			31	195891			1
15	524356943.9	0.173629805	Standard-Impact	Borderliners			79	82895			0
16	1131396472	0.164884463	Standard-Impact	Borderliners			46	134334			1
17	3082900988	0.187915996	Standard-Impact	Borderliners	x		73	121872	x		1
18	39882519.66	0.19283928	Standard-Impact	Borderliners			60	196879			0
19	3602984837	0.143560782	Standard-Impact	Borderliners			25	185615			0
20	253108955.2	0.228958473	Standard-Impact	Borderliners			37	105056	x		1
21	4094998652	0.154224321	Standard-Impact	Borderliners			34	158341			0
22	1249270862	0.176425099	Standard-Impact	Borderliners			64	193371	x		1
23	95433349.88	0.14987199	Standard-Impact	Borderliners	x	x	30	197144			0
24	535068751.4	0.204398349	Standard-Impact	Borderliners			23	100868			1
25	800945673.4	0.145714432	Standard-Impact	Borderliners			70	135577	x		0
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28	1136104622	0.217746988	Standard-Impact	Borderliners	x		58	91792			1



# Sample marketing process using this data



1. First target my two best customer groups (highest likelihood to participate in the smart thermostat program and have highest savings):
  - Fast Grower
  - Big Impactor
2. I want to make sure we have good representation of low-income customers in my smart thermostat program
  - Find low-income customers in the Fast Grower or Big Impactor groups and create special messages for them


# Creating the smart thermostat campaign

**Big Impactors:** Larger single-family dwellings, with high income ranges, and subsequent billing metrics; busy and likely have digital subscription activity.

- Average age: 47
- Don't rent their homes
- Often shop at big-box stores
- Rarely use streaming services

**Fast Growers:** Tend to track tightly with Big Impactors, except they are the most engaged with technology behaviors.

- Average age: 34
- Primarily renters
- Roughly 50% shop at big-box stores
- Most using streaming services



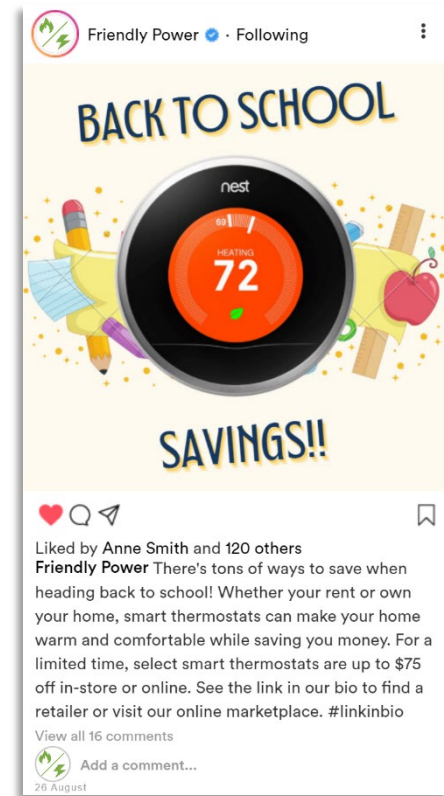
With data science, you can add tons of other data attributes!

# Creating the campaign (stage 1)

## Big Impactors

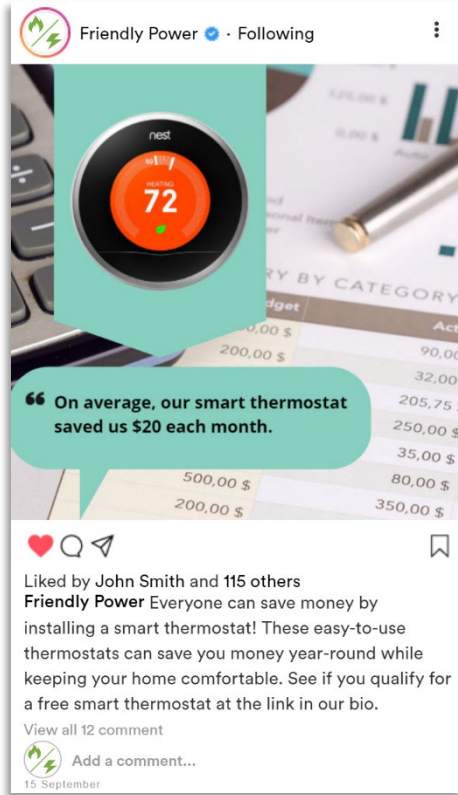


## Fast Growers



# Creating the campaign (stage 2)

**Big Impactors**  
Low income



Friendly Power · Following

On average, our smart thermostat saved us \$20 each month.

Liked by John Smith and 115 others  
Friendly Power Everyone can save money by installing a smart thermostat! These easy-to-use thermostats can save you money year-round while keeping your home comfortable. See if you qualify for a free smart thermostat at the link in our bio.

View all 12 comment

Add a comment...

15 September

**Fast Growers**  
Low income



Friendly Power · Following

BACK TO SCHOOL SAVINGS!!

Liked by Anne Smith and 120 others  
Friendly Power Back to school shopping can be expensive, but your energy bills don't have to be! Smart thermostats are an easy way to help make your home comfortable without breaking the bank. See if you qualify for a free smart thermostat at the link in our bio.

View all 16 comments

Add a comment...

15 August

# Post-campaign benefits

- Once you have completed your campaign, you can feed the results back into the model to improve future outreach lists
- Depending on the frequency of the campaign, you can either receive an interactive data dashboard or a new spreadsheet when you're ready for your next campaign

# Q&A



# Contact us



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