

# IEPEC 2015

## Long Beach, California

Practical Guidance for Selecting Opt-In  
Research Designs: Addressing Methodological  
Trade-offs and Avoiding Common Pitfalls



Lucy Morris and Brian A. Smith  
Pacific Gas and Electric Company



## In Pursuit of the Counterfactual...

*“Good experimental design is separable from the use of statistical tests of significance. It is the art of achieving interpretable comparisons...Use of significance tests presumes but does not prove or supply the comparability of the comparison groups or the interpretability of the difference found.”*

Campbell and Stanley, 1963 (underlining added)



## Opt-in EE Behavior Programs = a unique challenge!

- **EE Behavior** = typically small effect sizes that aren't time/day specific
  - Hard to spot in whole home billing data
- **Solutions** = Powerful analysis (i.e. experimental design) and large sample sizes!

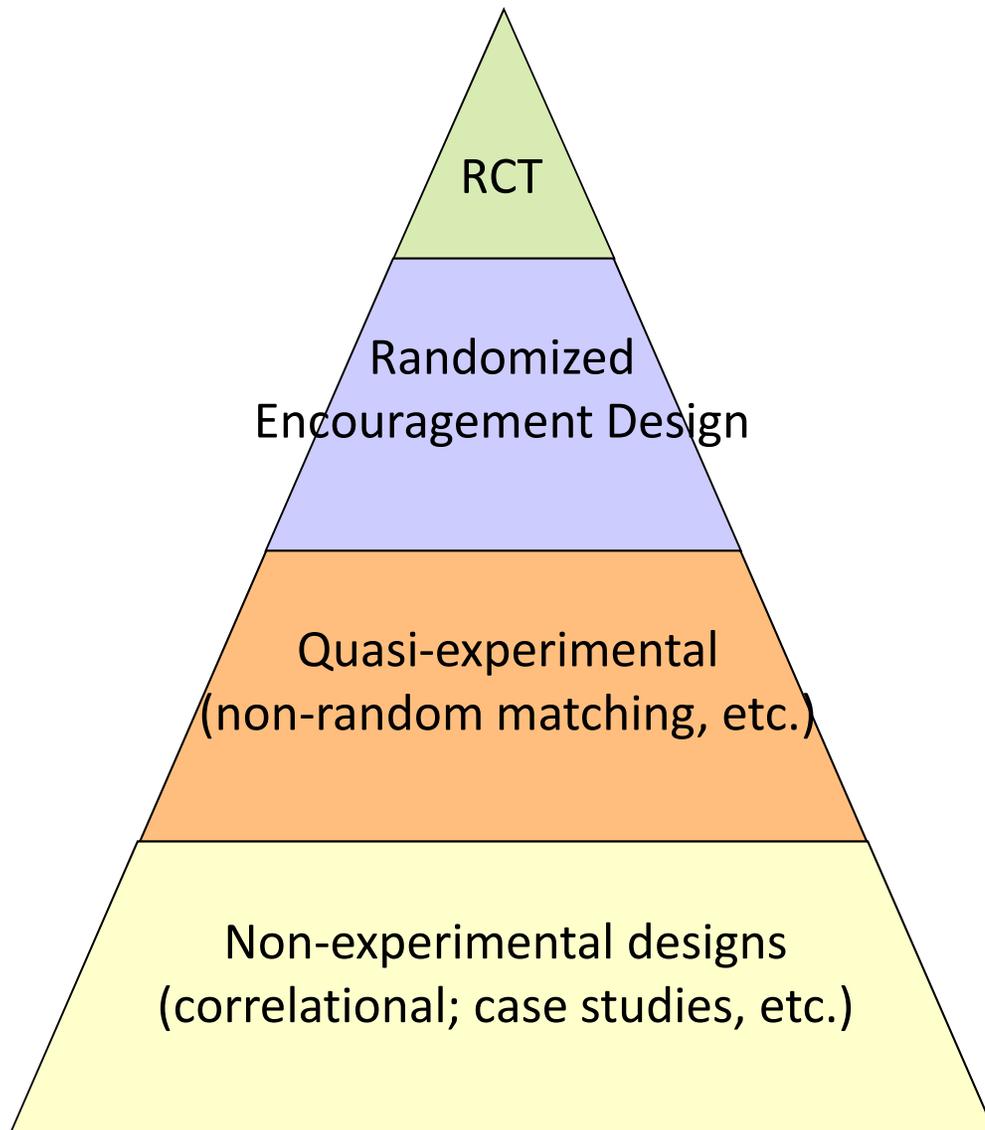


**Needle?  
Haystack??**

**But what if a program doesn't lend itself to these solutions??**



# Ideal Methodology vs. Real World Constraints



## Real world considerations

- Budget? Time?
- Expected effect size?
- Rigor needs/requirements?
- Customer experience?
  - Deny/delay treatment
- Data for strategic sampling?



# Can I do an RCT?

## Yes, if:

- PA/Utility is okay with denial/delay of treatment to some
- Can avoid denial/delay by randomizing another factor
- No equity obligation/requirement
- Can maintain design integrity

If you can do an RCT, then do it



# If you can't, there are other experimental options

- **Randomized Encouragement Design (RED):**

- “RCT with encouragement” design
- Randomization precedes customer choice/opt-in
- Random assignment into “**encouraged**” group or “**unencouraged**” group
- No treatment denial or delay!

## Assumes 3 types of people:

- Never Takers (NT)

No way!

A blue speech bubble pointing to the 'Never Takers (NT)' category.

- Always Takers (AT)

I'll find it and get it!

A blue speech bubble pointing to the 'Always Takers (AT)' category.

- Comp

Okay, if you want me to then I'll do it

A blue speech bubble pointing to the 'Comp' category.

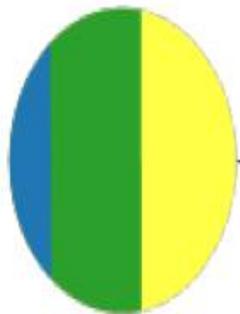


# Randomized Encouragement Design

Blue = Always Takers  
\*Green = Compliers\*  
Yellow = Never Takers

RED

Population of interest



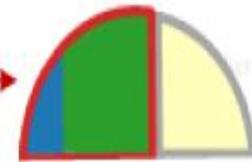
Data collected for every encouraged and not-encouraged customer

Treatment Group:  
Customers encouraged to sign up  
for the study



Sign up,  
receive treatment

Don't sign up,  
don't receive treatment



Control Group:  
Customers not encouraged to sign  
up for the study



Find out about  
treatment, sign up,  
receive treatment

Don't receive treatment



## Analysis of the local average treatment effect (LATE)

Compares the treatment group (that was encouraged) to the control group (that was not encouraged), scaled to account for the encouraged customers who did not sign up for the treatment and the not encouraged customers who did sign up for the treatment:

Source: Cappers et al. 2013



# RED Considerations

## **RED challenges:**

- Data Availability
- Effective Encouragement
- Marketing control and consistency with program

## **RED strengths:**

- High statistical power of an RCT without denial/delay
- Insight into natural market movement
- Accommodates reality of random assignment integrity
  - Treatment challenges mean an RCT can become an RED



## Another option: Quasi-experimental Approaches

Leave this to the experts to weigh the evidence:

- Matching to non-participants on long-term energy usage (ex: Itron, 2013 - sig. 3% of household usage)
  - But is there something “unmatchable” when people opt-in?
- Matching within opt-in participants (ex: Variance-in-Adoption)
  - But a number of requirements make it hard to do this well



**Jury?  
Jury?!**



# Summary and Conclusions

- Evaluation of opt-in behavior programs is challenging: **small effect sizes & risk of self-selection bias**
- Need **powerful evaluation designs!**
- If a PA is amenable to recruit-and-deny/delay, then an RCT is the best approach
- If not, assess whether **program design** and **available budget** can **support an RED** with sufficiently disparate uptake to enable a reliable analysis
- If a **true experimental approach is not possible**, use a **quasi-experimental approach** with **two comparison groups**: 1) program participants, and 2) matched non-participants

In all cases, the **best design** will reflect the program's **causal mechanisms**, **available data**, **budget**, and **PA/regulatory tolerance for type I and II errors**

# Questions?

## **Lucy Morris**

Measurement & Verification Evaluation Supervisor  
Pacific Gas and Electric Company  
[LLAA@pge.com](mailto:LLAA@pge.com)

## **Brian Arthur Smith**

Expert Strategic Analyst, Energy Efficiency  
Pacific Gas and Electric Company  
[b2sg@pge.com](mailto:b2sg@pge.com)

