

# Water Heater Demand Response : Evaluation Plan and Analytics

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# Background

- There are not many established best practices when it comes to measuring demand response impacts
- There is no “right way” to measure impacts
- Our approach was to estimate impacts in several ways to see how they agree or disagree with one another
- If they come to same answer great, if not then judgement is required

# Roles & Responsibilities

- BPA developed evaluation plan and methodology
- PNNL is implementing analytics plan and will estimate impacts in an evaluation after events are no longer being called
- BPA independent evaluator has reviewed methodology and will review evaluation

# Sampling

- Unscientific recruitment using heat pump water heater rebate participants
- Resistance tank recruitment plan through plumbers was difficult, Tacoma getting some MF low income sites
- Currently 163 heat pump water heaters & 83 resistance tanks

# Surveys

- For evaluation purposes we asked participants to fill out a survey with questions about home characteristics, household size, water heater characteristics and location
- Every month (or so) we field a very short satisfaction survey to gauge if people are having issues with not enough hot water



# How to measure results?

- We measure results using 4 different methods:
  - Randomized Control Trial
  - Week before
  - All Weekdays/Weekends before
  - Regression Model

# Randomized Control Trial

- Treatment and control group switching week to week
- Challenge is to create groups that are balanced among numerous variables
  - Total kWh
  - Minutes > 1000 watts (resistance element usage)
  - Morning Use
  - Evening Use
  - HPWH (GE or AO Smith)
  - Location of HPWH

# Balancing the Groups

- Using 6 variables create a k-means clustering model
- Clustering creates homogeneous groups based on data given
- Try different numbers of clusters
- When a final clustering model is selected, distribute the tanks randomly in each group into two different groups

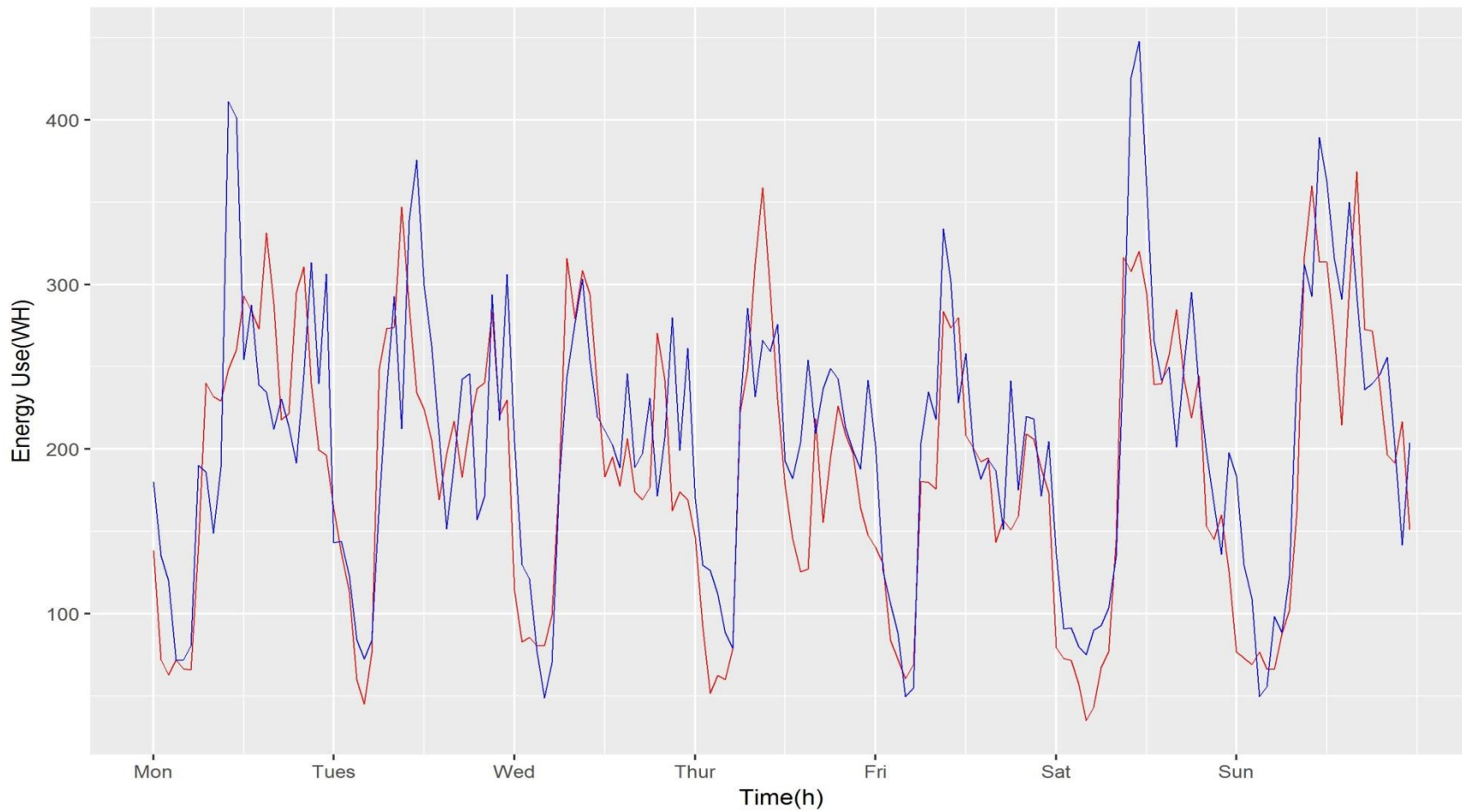


# Are The Groups Balanced?

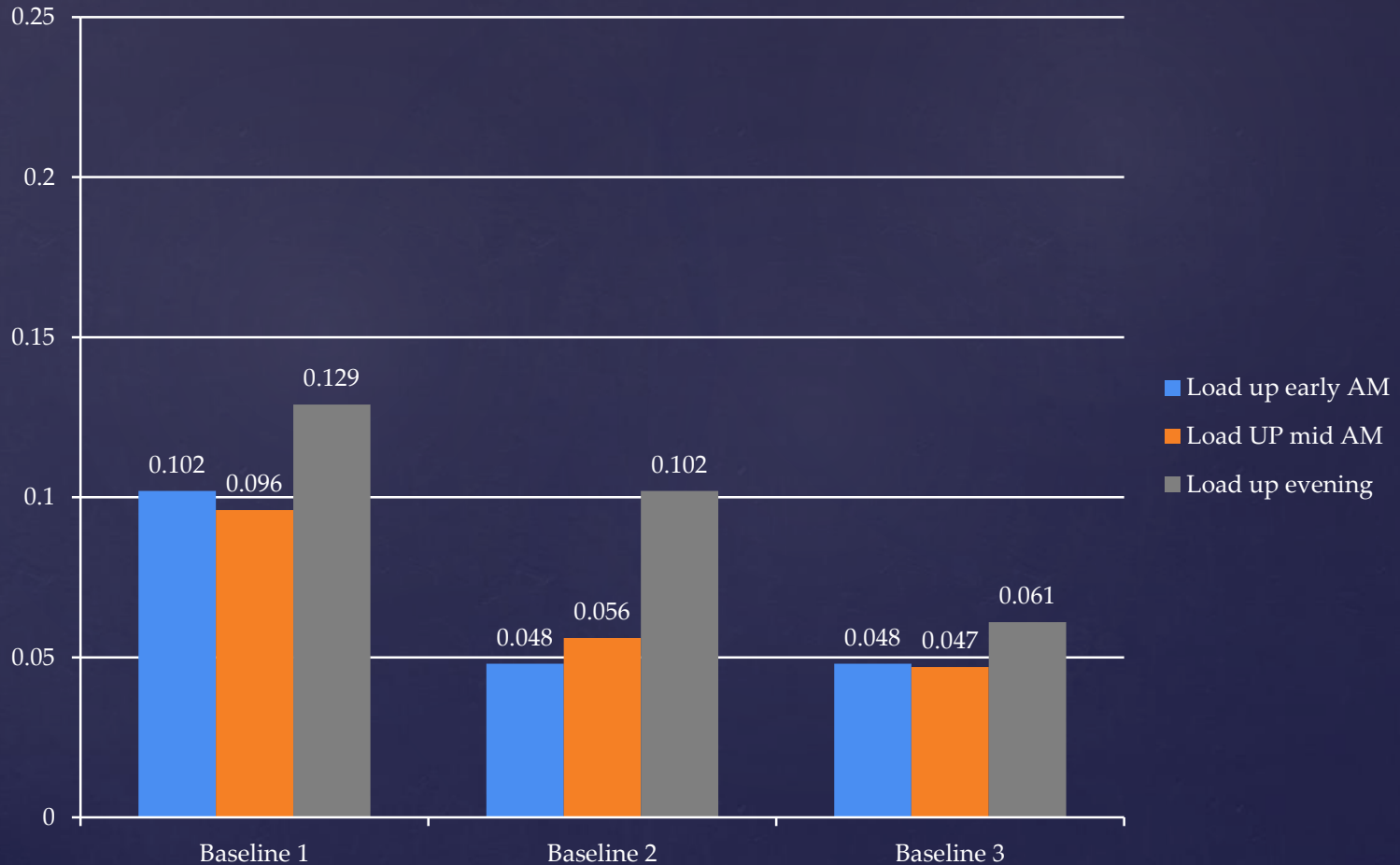
Group	Statistic	Total Use	Minutes > 1000 W	AM Use	PM Use
13	Min	5.84	0.00	193.33	298.43
	Mean	<b>26.97</b>	<b>168.66</b>	<b>2040.47</b>	<b>2414.13</b>
	Max	87.32	958.26	7923.37	7746.98
14	Min	3.20	0.00	360.21	428.09
	Mean	<b>30.03</b>	<b>203.60</b>	<b>1999.20</b>	<b>2611.49</b>
	Max	214.37	2998.50	10232.55	11561.14

- Group 13
- Group 14

Group 13 vs. Group 14



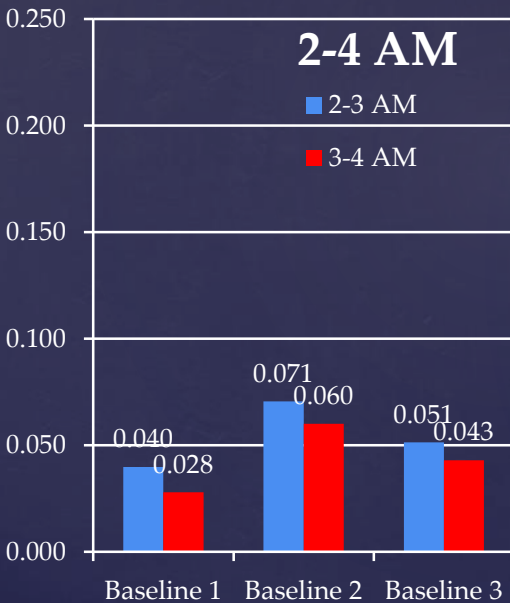
# Results – Week of 2/5



# Results Week of 2/5

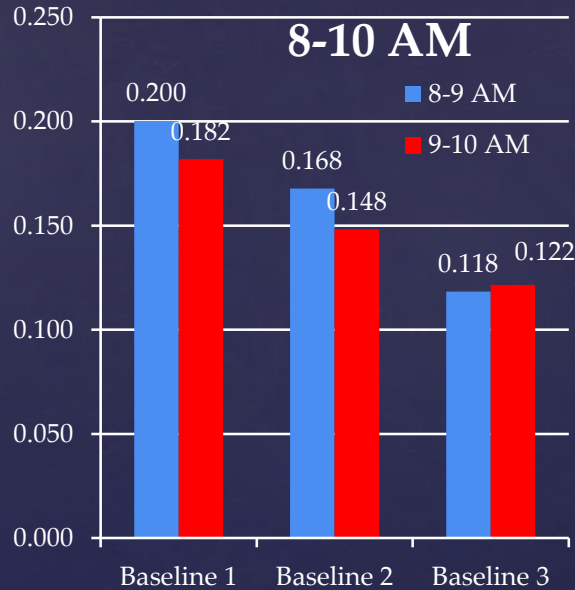
## 2-4 AM

■ 2-3 AM  
■ 3-4 AM



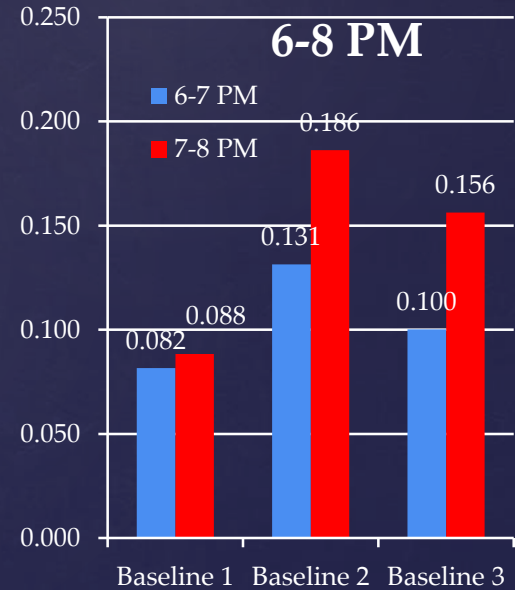
## 8-10 AM

■ 8-9 AM  
■ 9-10 AM

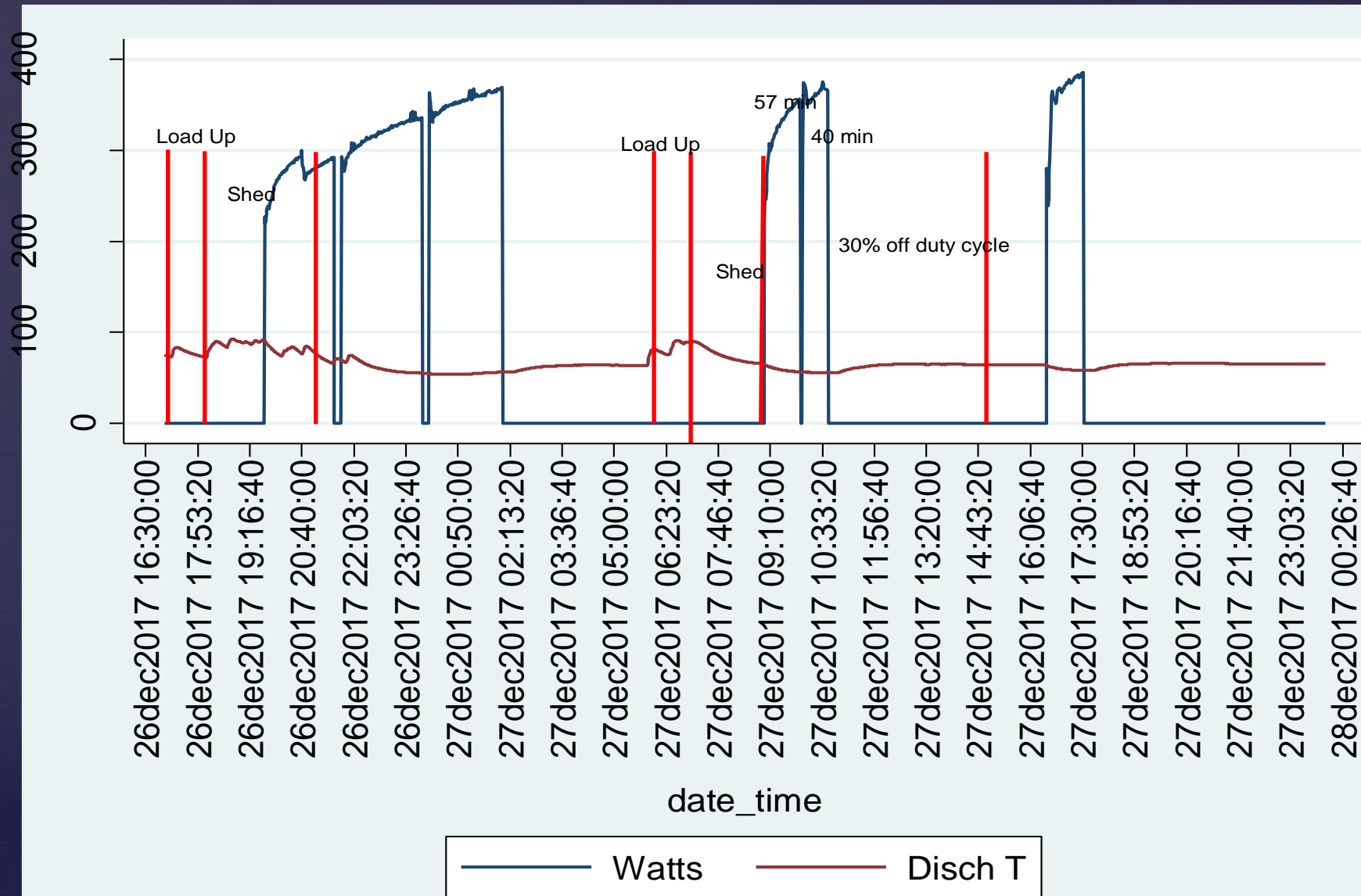


## 6-8 PM

■ 6-7 PM  
■ 7-8 PM

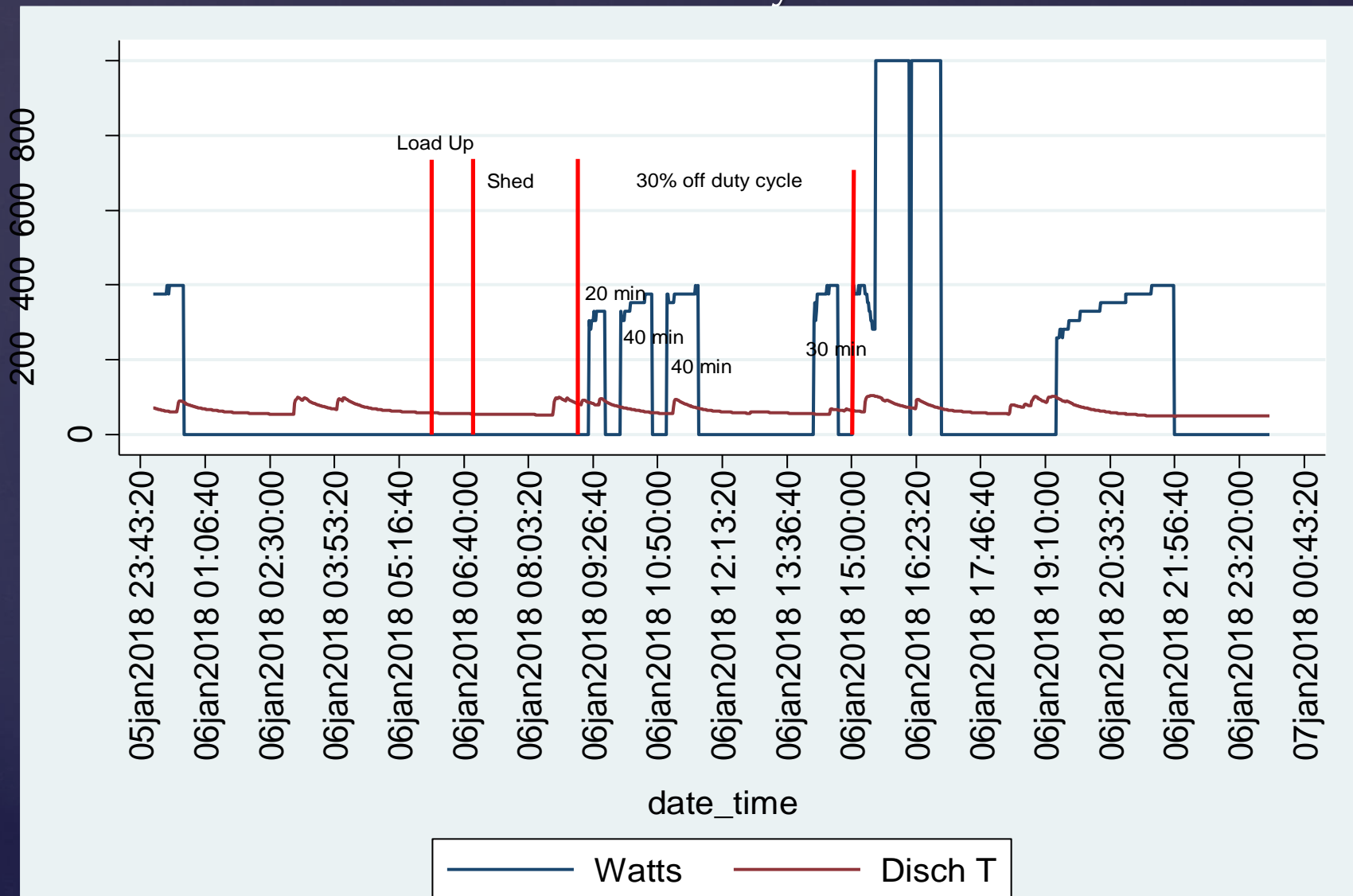


# GE Tank – Heat Pump Only Mode

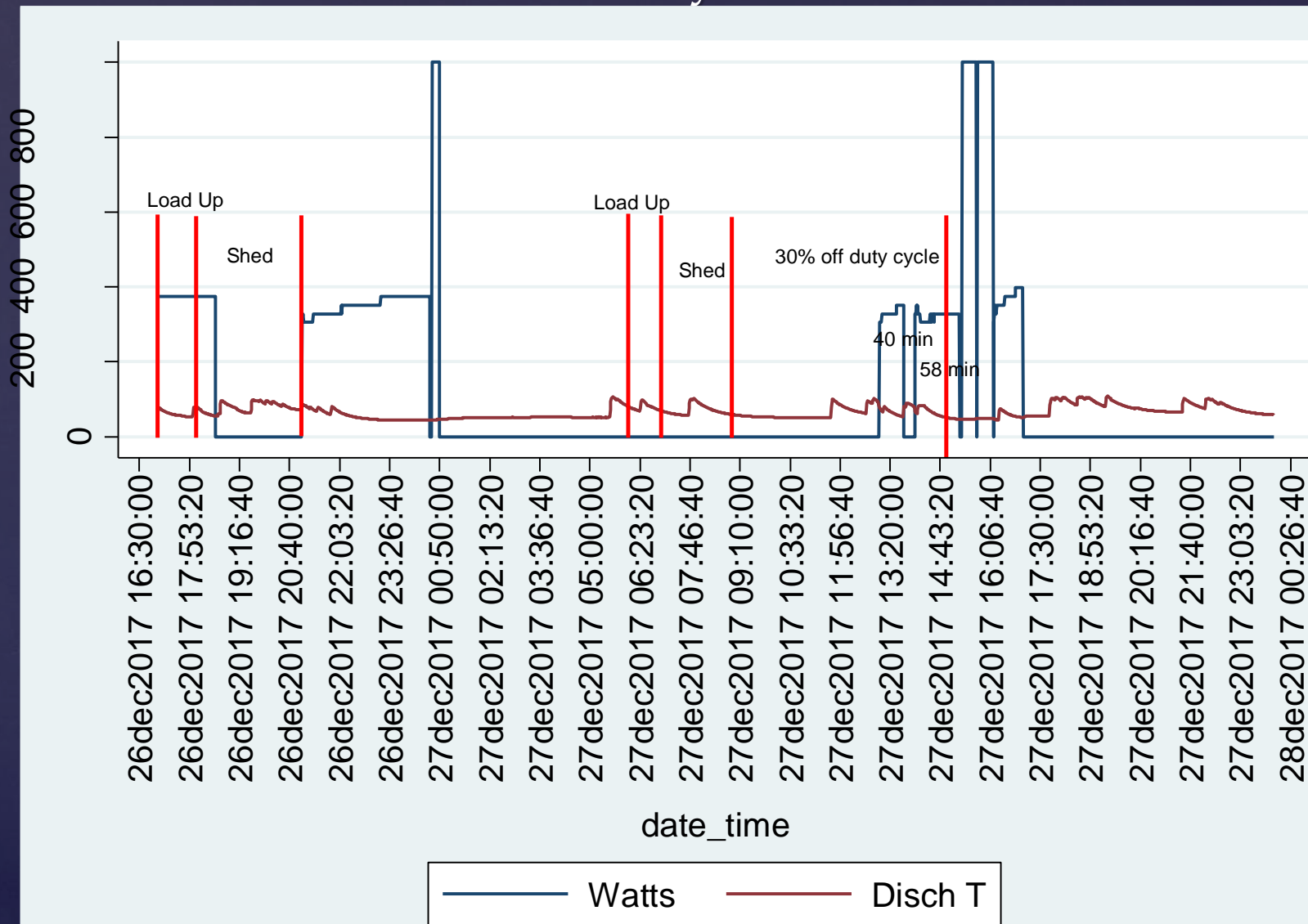




# AO Smith Tank – Hybrid Mode



# GE Tank – Hybrid Mode



# Resistance Tank

