## **Electricity Consumption in Households**

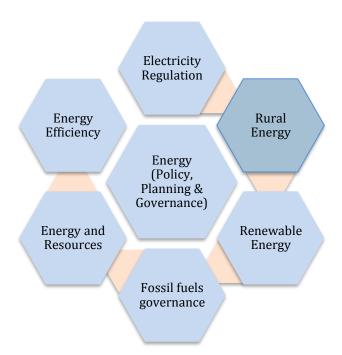
Insights from urban, semi-urban and rural Maharashtra and Uttar Pradesh

Shweta Kulkarni, Aditya Chunekar Prayas (Energy Group)



#### Prayas (Energy Group)

- Not-for-profit organization founded in 1994
- Analysis based policy advocacy for promoting public interest.
- Focus on governance aspects & policy innovation
- Extensive engagement with civil society groups, peoples' movements, consumers groups and media.





# About eMARC Monitoring and Analysis of Residential Electricity Consumption

#### Need to better understand Residential Electricity Consumption...

Residential Electricity consumption has tripled since 2000 and contributes to a quarter of total electricity consumption. Understanding consumer behaviour and its response to energy efficiency programs is important to design them.

- A better way to manage the rising demand for electricity cost-effectively is to understand the current consumption patterns for it.
- This household level data on consumption is currently unavailable.
- eMARC records the actual load and consumption patterns of households across various socio-economic/geographic/climatic strata
- Records the actual load and consumption patterns of selected appliances: Refrigerator
- Generates publicly available datasets emarc.watchyourpower.org
- Current expanse in 125 households across Urban, Semi-Urban and Rural, Maharashtra and Uttar Pradesh



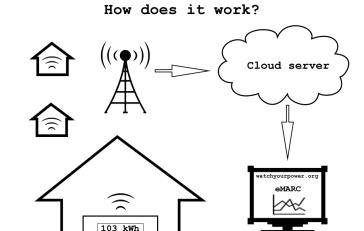
#### How does eMARC Work?

Advanced energy meters deployed at consumer premises in urban and rural areas, which record minute by minute voltage, current, power, energy and PF data and entire data is made available at emarc.watchyourpower.org











eMARC 2

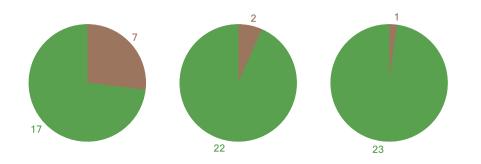




#### eMARC expanse

State	District
Uttar Pradesh	Gonda
	Kanpur Dehat
Maharashtra	Pune
	Aurangabad

Uttar Pradesh Maharashtra Pune city



eMARC locations
42 Households in Pune City

Data collection from January 2018

60 Households in Semi Urban and Rural Maharashtra

Data collection from June 2019

35 Households in Semi urban and rural Uttar Pradesh

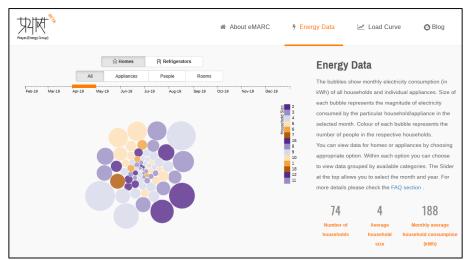
Data collection from June 2019



## Website overview



#### **Energy Consumption Data**



Monthly energy consumption data for all refrigerators allows sort by

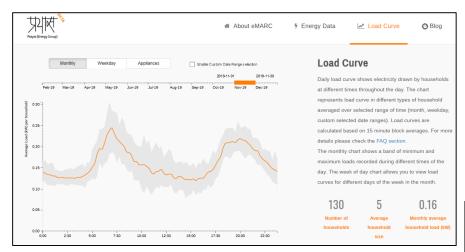
- Technology of appliance
- Size of appliance
- Age of appliance
- Household size

Monthly energy consumption data for all households made public allows sort by

- Type of appliances owned
- Household size
- Number of rooms



#### **Load Curves**



Average monthly load curve data for all households allows to view data

- By type of appliances owned
- Weekday and weekend curve

Average monthly load curve data for all households made public allows to view data

- Over a month
- Across multiple days
- For a day



# Snapshots of analysis using eMARC Data Pune City



#### Analysis presented includes...

- Monitoring data for Pune households for a period of 1 year
   April 2018 March 2019
- Household data is segregated by appliances owned

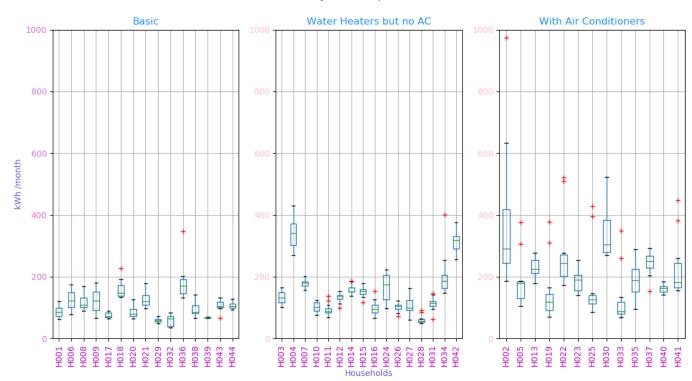
Basic: Households owning basic set of appliances like lights ,fans, refrigerators
With water heaters: Households owning basic set of appliances + water heaters
With Air conditioners: Households owning basic set of appliances + water heaters +ACs

- Energy consumption by households
- Energy consumption by refrigerators
- Load curves for households
- Load duration curves for households
- Preliminary analysis of semi-urban, rural households



## **Electricity Consumption across households**

#### Annual Electricity Consumption in Households

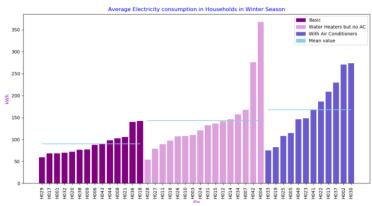


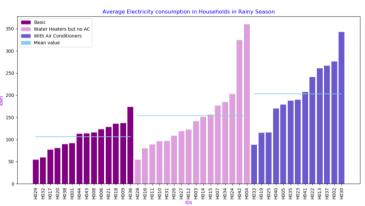
On an average most basic households consume less than 200 units.

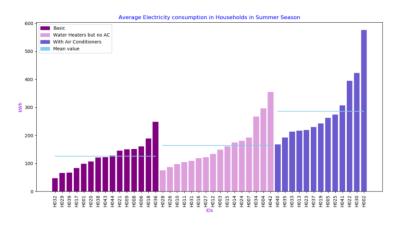
The range of consumption varies significantly in Households with ACs



#### Variation in consumption across seasons





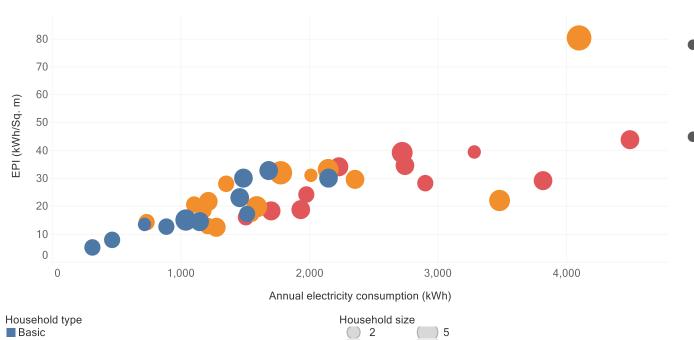


#### **Energy consumption**

- Remains almost consistent through the year in households with water heaters
- Increases only slightly in households having only basic appliances



#### EPI of households



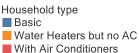


4 Star 29 < EPI < 37 5 Star EPI < 29

#### Observed

Basic <29

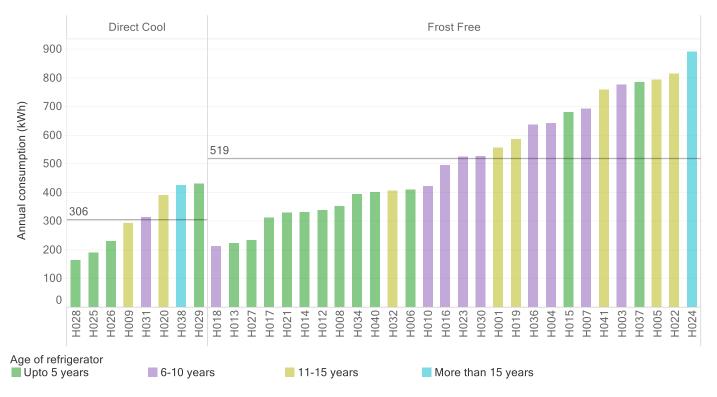
*With water heaters <30 With Air Conditioner < 40* 





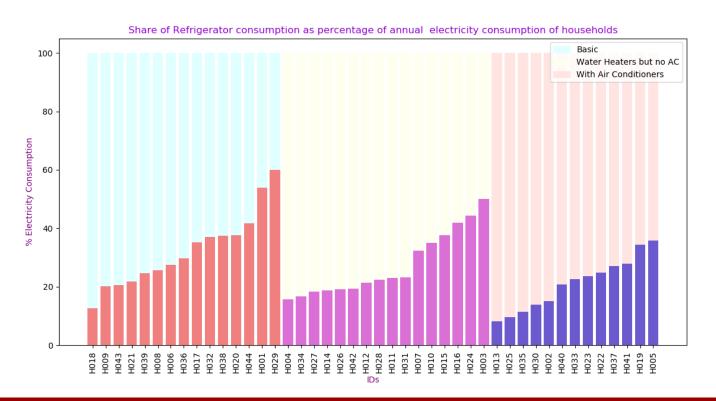


## Annual Electricity Consumption of Refrigerators



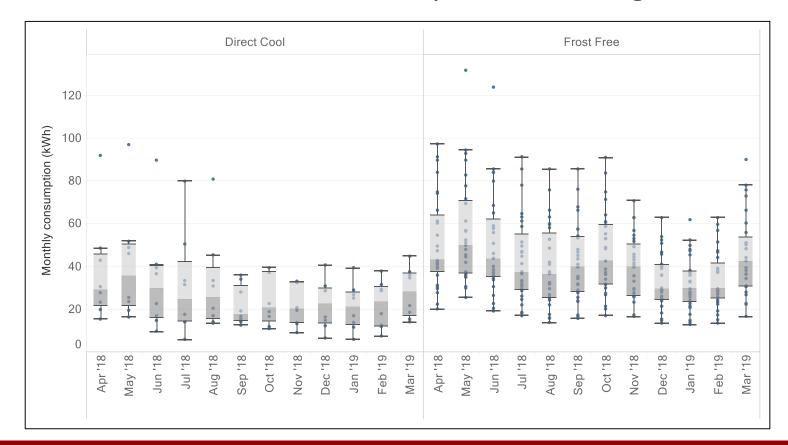


## Refrigerator electricity consumption





### Seasonal variation of consumption in Refrigerators



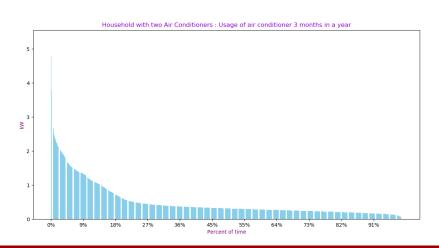


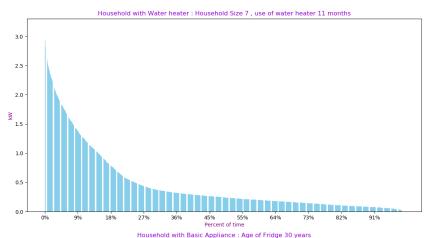
## **Load Patterns**

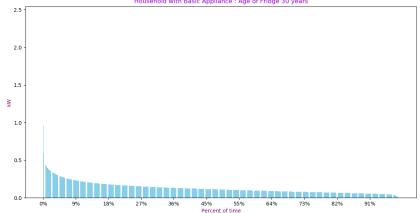


#### Load duration curve

#### Sample Households





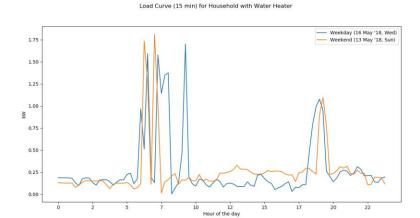




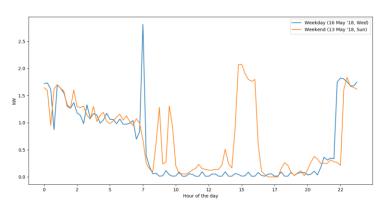
# Variation in Load Curves Weekend vs. Weekday

Shift in peak consumption by few hours over weekday and weekend

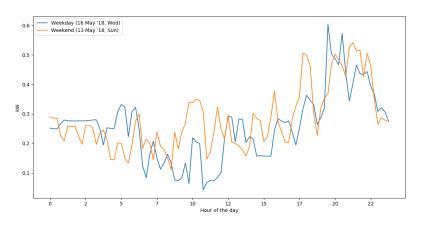
Use of air conditioner during day-time on weekends



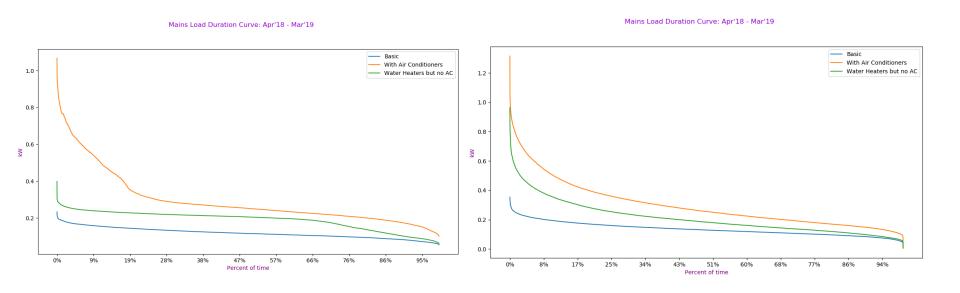




Load Curve (15 min) for Basic type Household

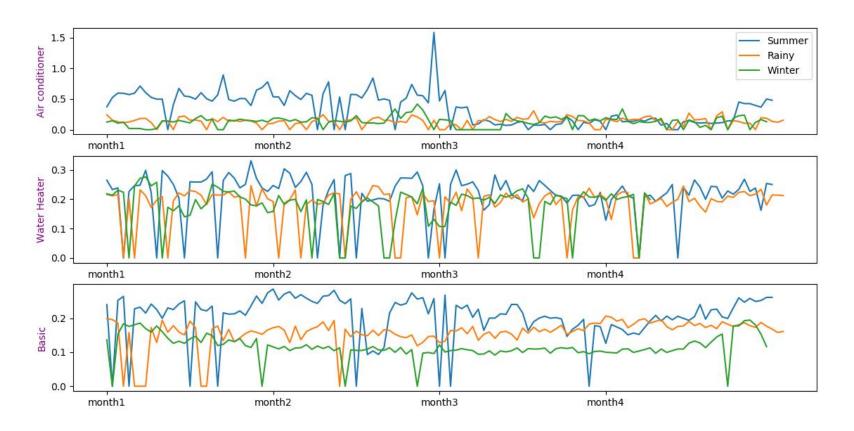


## Load Duration Curve: Hourly resolution vs. 15 min resolution



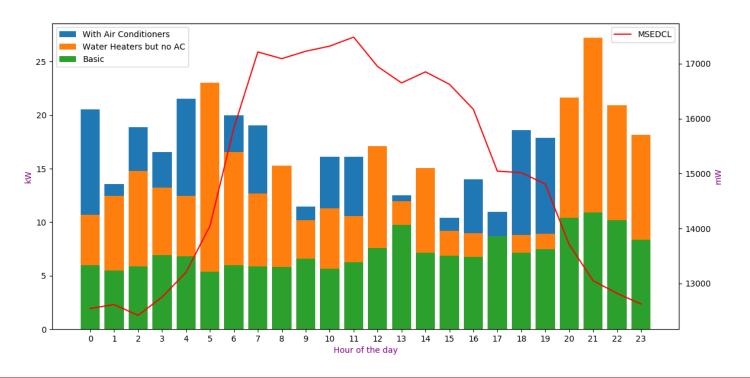


#### Seasonwise Load Curve (kW) for different household types



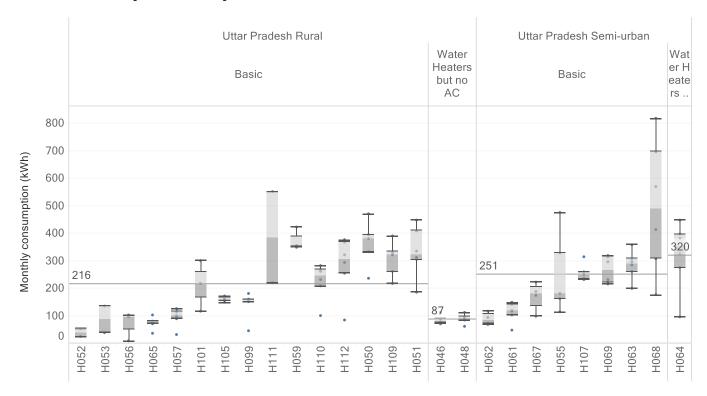
#### MSEDCL Load curve and eMARC household curves

Load Curve for 1st Oct'18



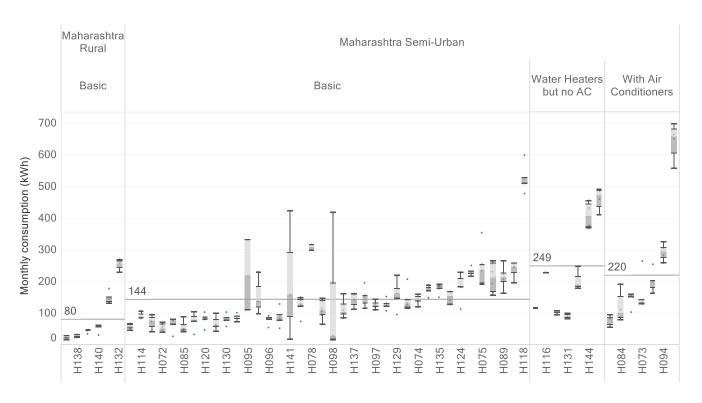


## Preliminary analysis: Uttar Pradesh





## Preliminary analysis: Maharashtra





#### **Observations**

- Load patterns that can help identify theft
- Need to assess use of inverters adding to household energy consumption
- Regular use of water heaters a very urban phenomenon
- Usage of refrigerators ;different across Maharashtra and Uttar Pradesh



#### What next ...

- Working on clustering based algorithms to test accuracy of pattern identification and classification of households
- Working on testing Load disaggregation techniques to identify appliance signatures which can give more insights on efficiency of appliances
- Some machine learning based techniques which can be used for load forecasting and further demand estimation
- We hope to plug this information into larger grid modelling and energy economy modelling exercises

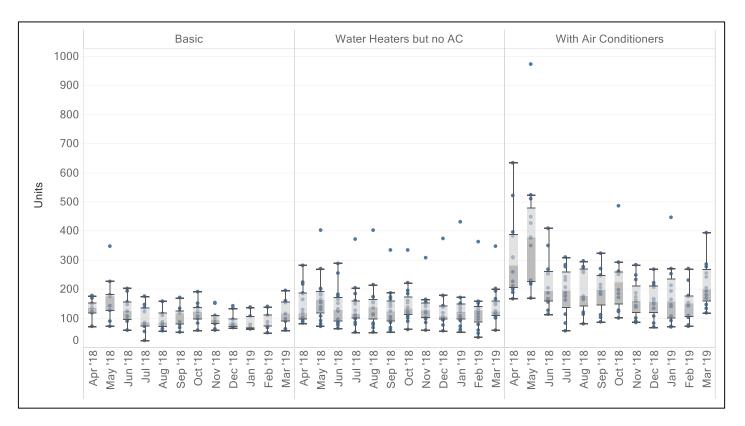


# Thank you!

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#### Energy consumption variation across months



Increase in consumption is coincidental with hot weather



