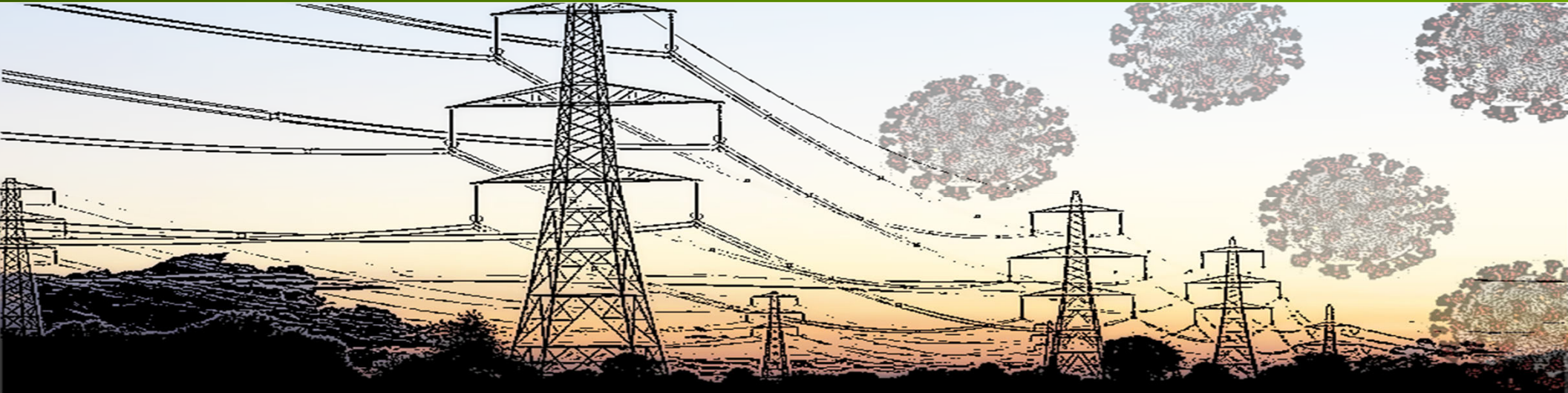


# Energy Lessons from the COVID-19 Pandemic in Los Angeles



**Presented by: Michael Klopfer, Ph.D. | Joy Pixley, Ph.D. | Prof. G.P. Li**

**California Plug Load Research Center**

**California Institute for Telecommunications and Information Technology**

**Prepared in collaboration with LADWP's ESE group**

**November 16, 2020 | CalPlug Workshop #16**

**[www.calplug.org](http://www.calplug.org)**

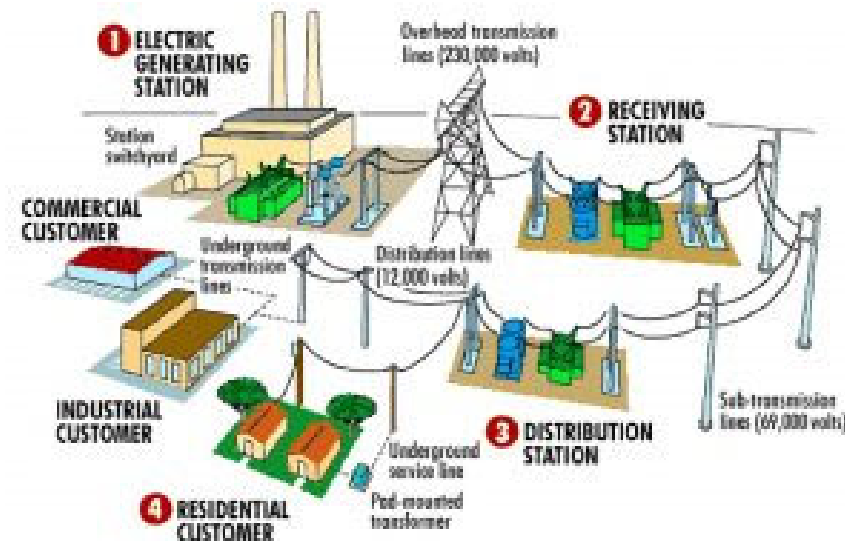


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# Fundamental Questions

- What has the COVID-19 pandemic had on residential energy demand?  
*Utility Impacts: forecasting, programs, direct customer cost, non-payment rate*
- Where or what is the localization of the impact?
- What are the likely behavioral underpinnings of the impact?
- Can we estimate energy usage based on general classes of loads?
- What are forward facing lessons, considerations?
- Can any/all of these be done with existing, aggregated distribution SCADA data in a transferrable method?



Source: <http://www.consultant.sunway.com/electrical/electricalprinciples.gif>



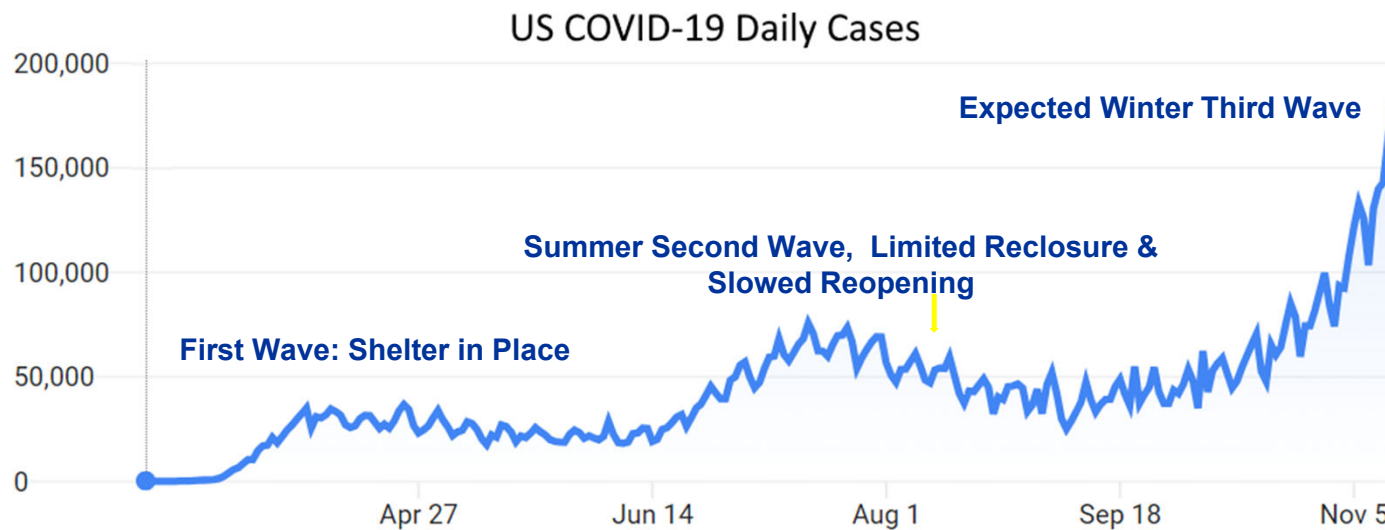
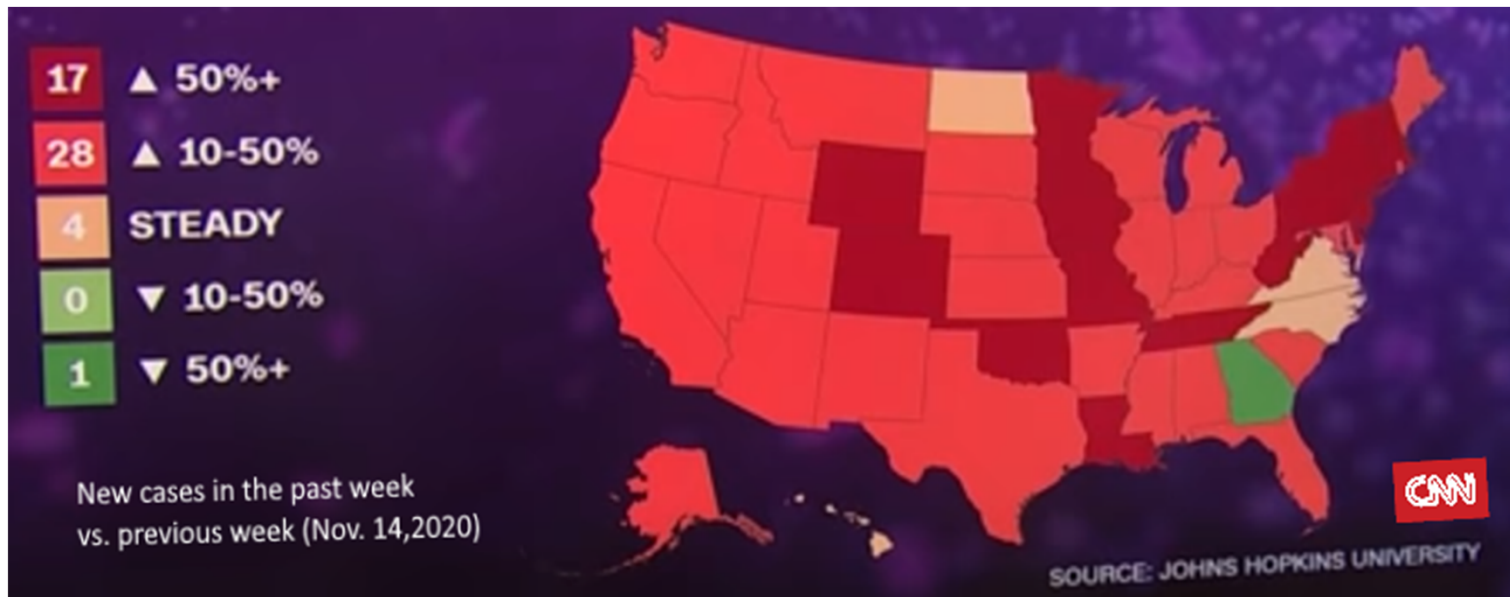
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# **Introduction:** **The COVID-19 Pandemic Sequence of Events and Population Impacts**



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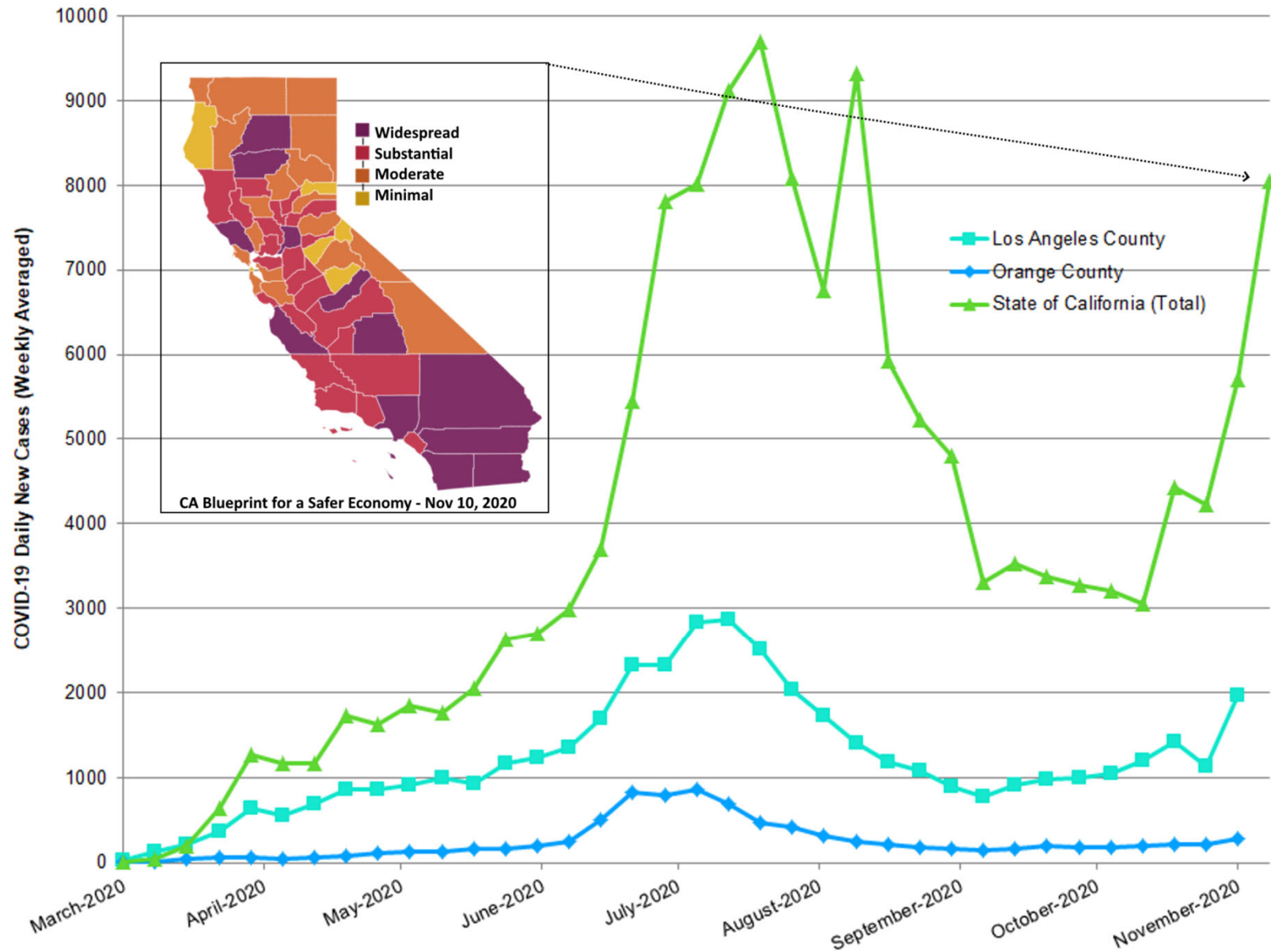
# Nationwide Third COVID-19 Wave



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# COVID-19 in California & Los Angeles, Orange Counties



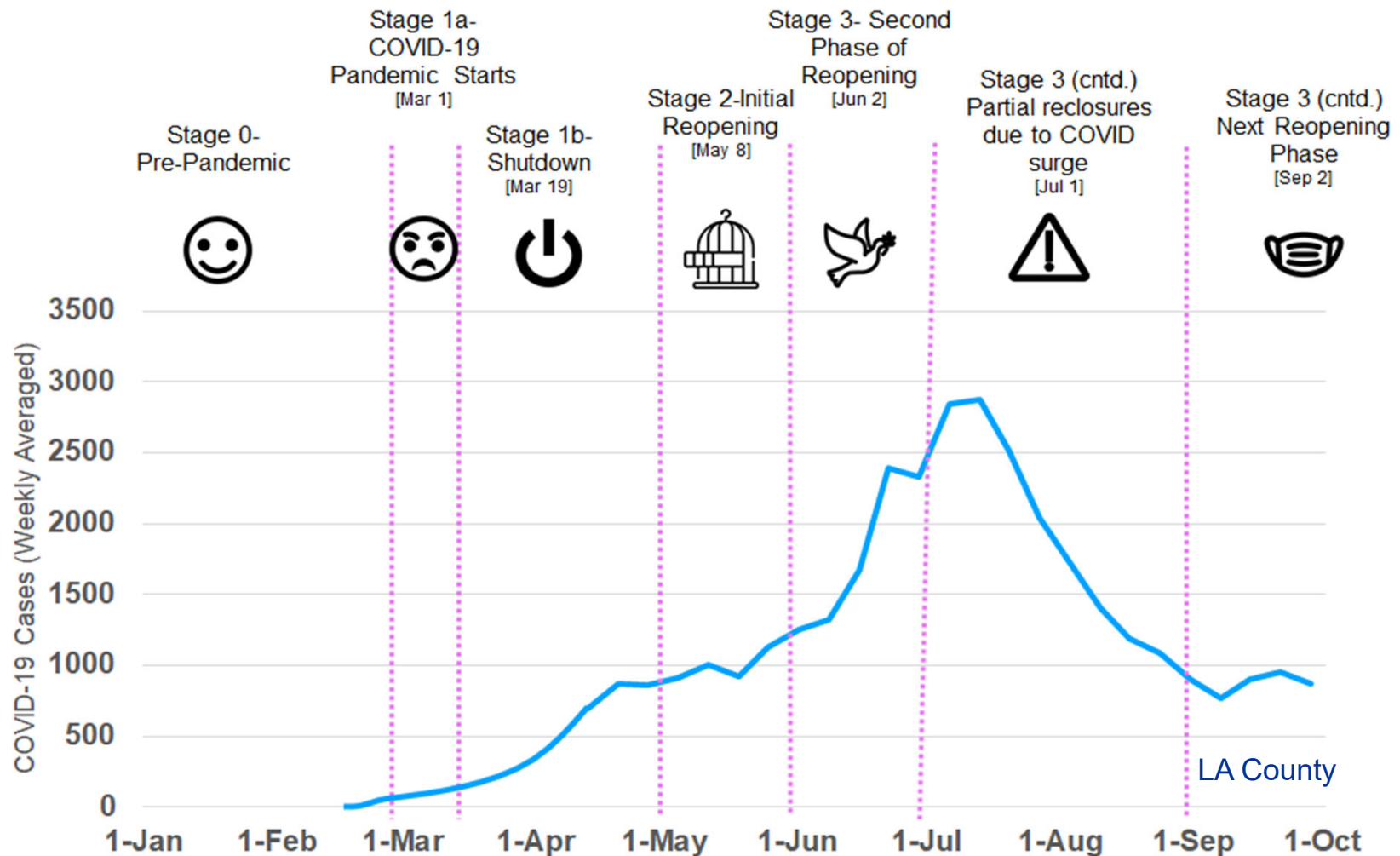
Data Sources: LA County DHS, Orange County DH, New York Times / Johns Hopkins University / Alphabet (Google), Inc.



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# California Sequence of Events

## The COVID-19 pandemic is an ongoing sequence of events



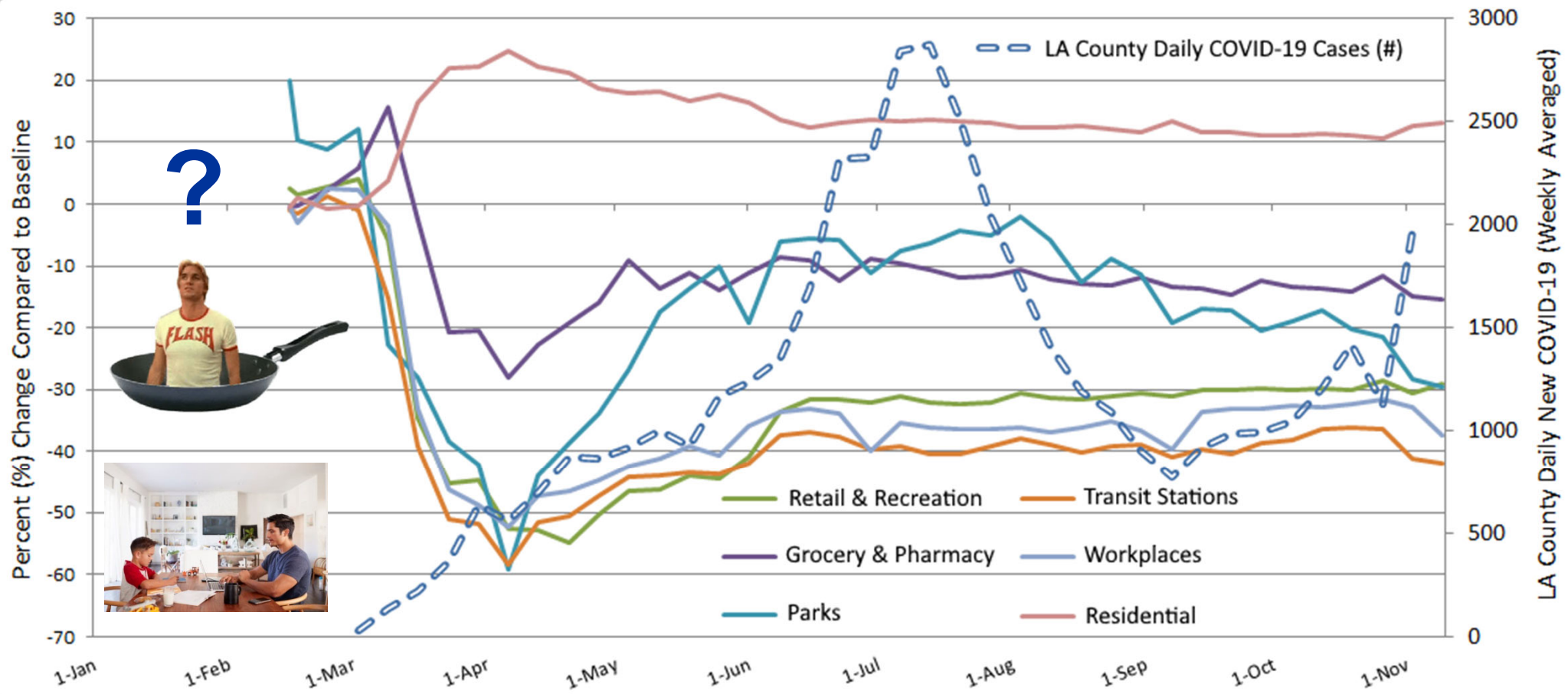
Data Source: Los Angeles DHS, Image Component Source: flaticon.com



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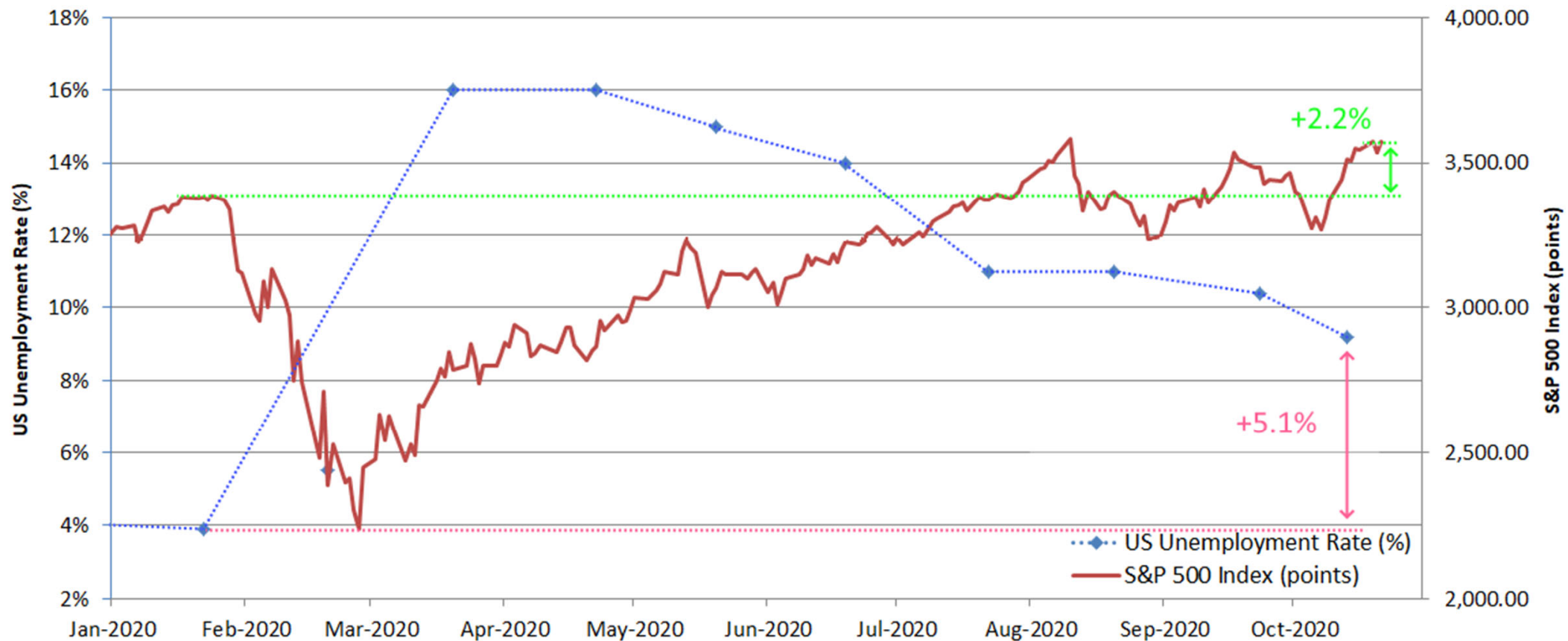
# Impact on Locations Visited (LA County)

- Greatest overall impact was during mid-March through late-April
- Initial recovery and initial stabilization by mid-June



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# Lasting Economic Disparity



Data Sources: Bureau of Labor Statistics, S&P 500.



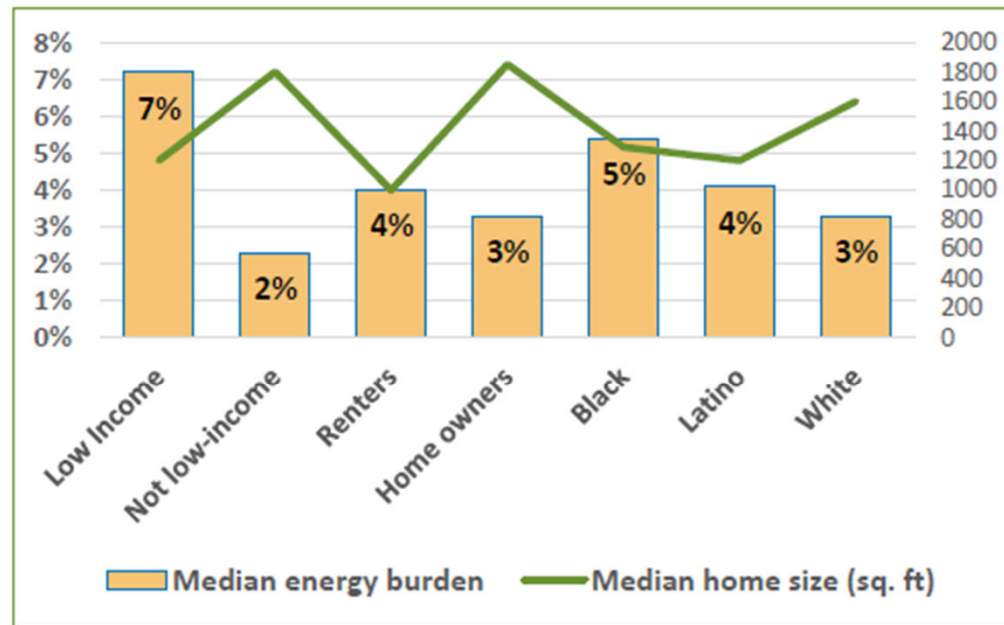
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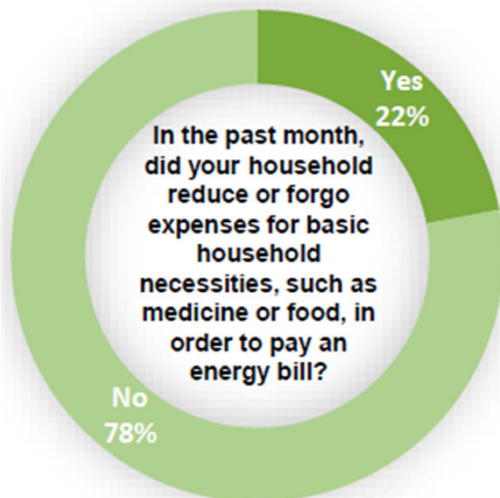


# Income and Community Burden

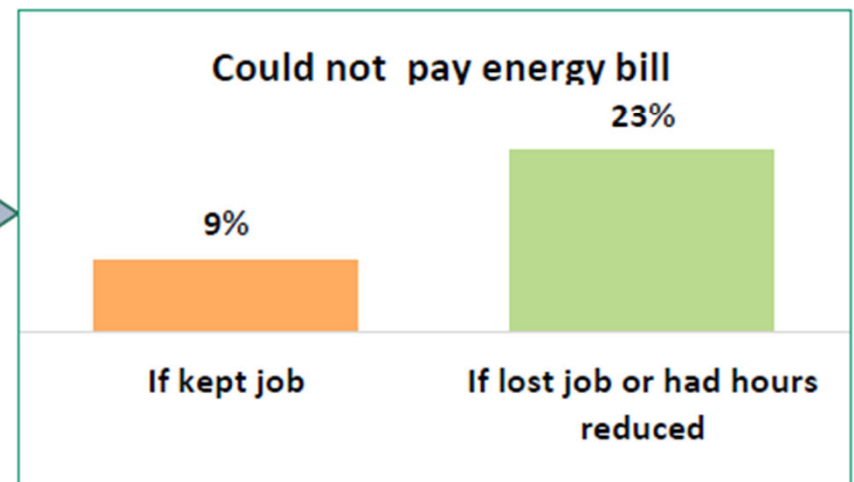
- Disadvantaged Angelenos already had a higher “energy burden” – that is, the percent of their household income spent on energy bills.
- As a result, both the loss of jobs and the increase in energy bills hits hardest for those who are already doing the worst.
- In a national survey of lower-income respondents April 30 to May 25, nearly 13% reported that they couldn’t pay an energy bill, and over 9% received a shut-off notice.



Disadvantaged groups (low-income, renters, and people of color) have smaller homes but still pay a larger proportion of their income on energy bills.



Respondents who had lost a job or had their hours cut due to COVID-19 had significantly more problems paying their energy bills.



Data Source: David Konisky and Sanya Carley, June 2020, “Survey of Household Energy Insecurity in Time of COVID: Preliminary Results of Wave 1,” Indiana University.



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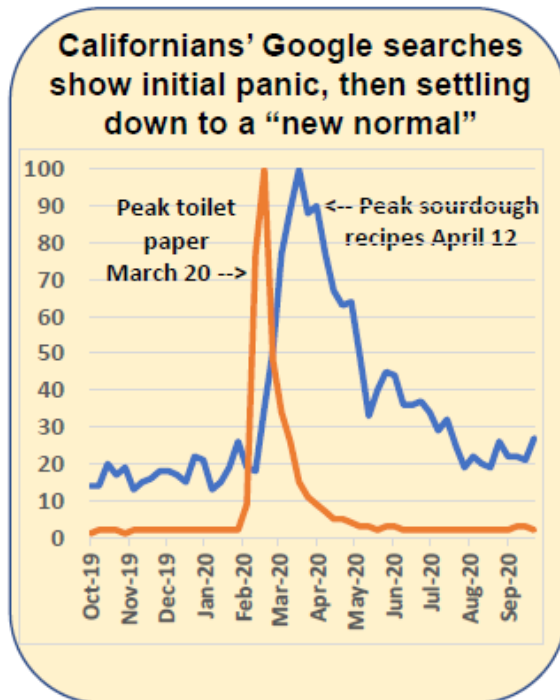
# Changes in Habits at Home During SIP

## Pecan Street's Shelter-In-Place (SIP) Survey:

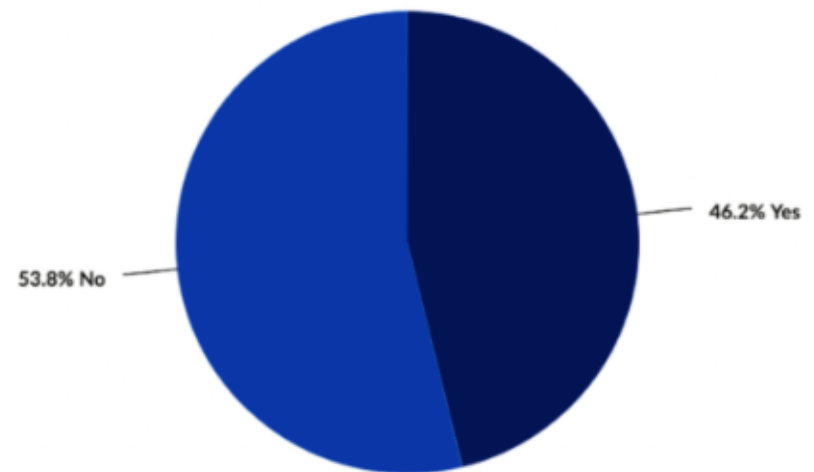
76% reported changes in cooking habits

69% indicated more individual home during the day than before SIP

Majority of homes have children 0-12 or 13-17



Are you sleeping in or getting up later?



Figure, Data Source: R. Jenkins, C Johnson "Unlocking Insights: How COVID-19 & SIP are Shifting Behaviors & Home Energy Use." Pecan Street. June, 2020. | Google Trends



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## **Materials and Methods: Evaluation of Energy Impact in Los Angeles**

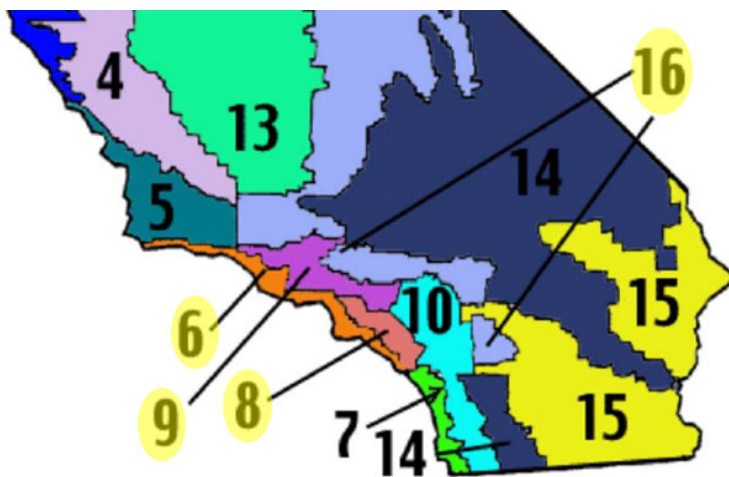


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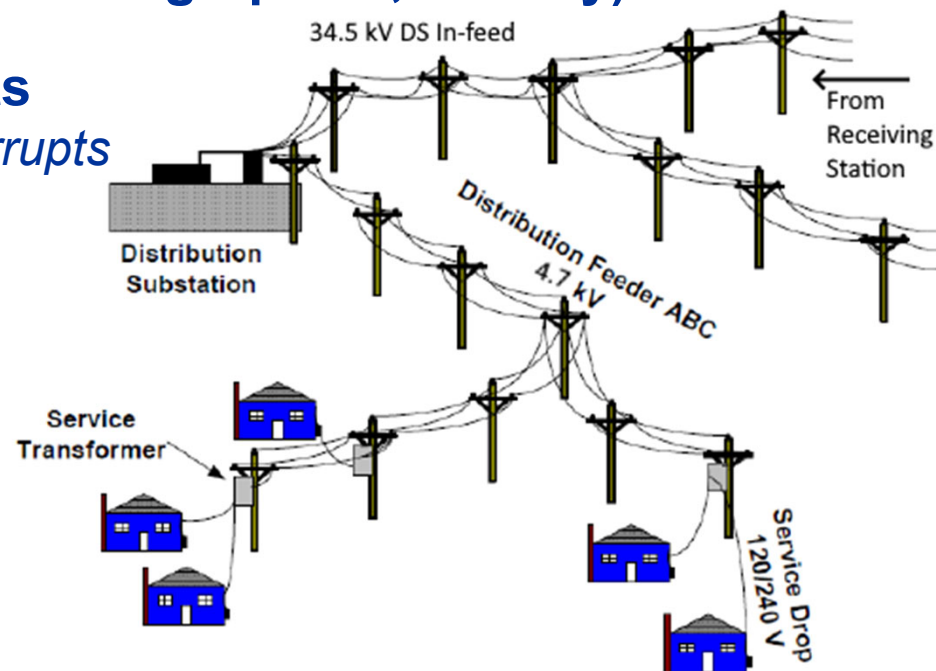
# Data Selection / Analysis Approach

Feeders from LADWP DS stations were chosen, considering:

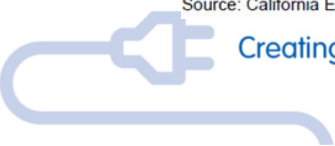
- High (<90%) residential service
- Homogeneous service population
- Semi-homogeneous building type
- Representative locations (climate zone, demographics, density)
- Data free of major non-reparable defects  
*M&V errors, recalibration, reconfiguration, interrupts*



Source: California Energy Commission staff



Source: Pepco Holdings



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# Analysis Approach: Selected Communities



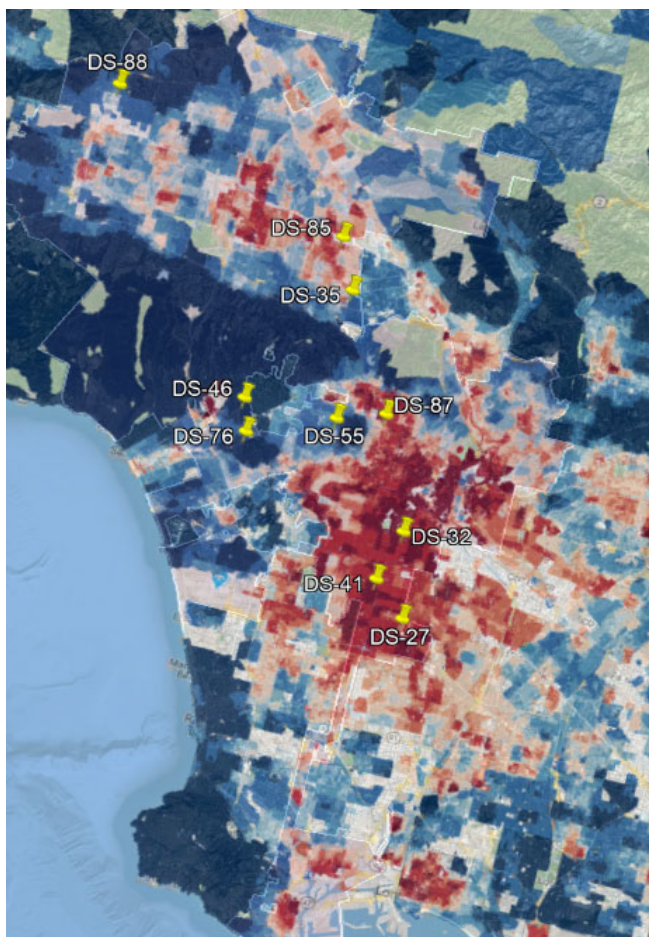
7 Residential Feeders  
1 Commercial Feeder



2 Climate Zones  
Multiple LA regions:  
(valley, downtown, mid-city, south)



Each selected feeder  
controlled for population  
homogeneity



<u>Feeder</u>	<u>Community</u>	<u>Feeder Residential Customer Percentage</u>	<u>CEC Climate Zone / Sunset Planting Zone</u>	<u>Structure Types</u>	<u>ZCTA / Approximate Feeder Area Community Median Income</u>
Feeder A	Watts (90059)	91.18%	8 / 22	Section 8 apartment housing	\$51,635 / \$24,720
Feeder B	Southeast LA (90037)	90.10%	8 / 22	Majority single family homes	\$44,965 / \$31,738
Feeder C	Hancock Park (90004)	92.75%	9 / 22	Single family and small apartments mixed	\$82,746 / \$40,374
Feeder D	Toluca Lake (91602)	96.50%	9 / 20	Mixed single family homes and apartments	\$109,254 / \$49,039
Feeder E	Burbank (91601)	89.14%	9 / 20	Single family homes, small apartments	\$72,868 / \$58,570
Feeder F	Chatsworth (91377)	86.83%	9 / 18	Apartments with mixed small businesses	\$112,763 / \$110,300
Feeder G	Central Wilshire (90036)	94.62%	9 / 22	Low-rise buildings and community grounds in large apartment community	\$117,596 / \$111,910
Feeder H*	Downtown LA (90014)	0% - Commercial service/office building	9 / 22	Pair of mid-rise commercial/retail office buildings in downtown LA	N/A

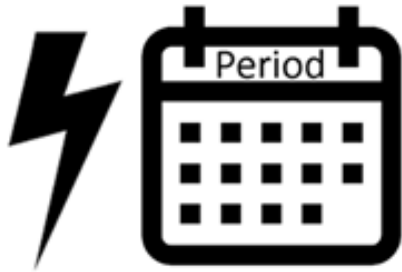
\* Non-residential feeder, not averaged with residential feeders

ZCTA - Zip Code Tabulation Area: Census-focused approximation of area of a corresponding postal zip code route, median income for ZCTA areas is shown in addition to the approximated feeder tract area corresponding to the specific feeder service area community.



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# Analysis Approach



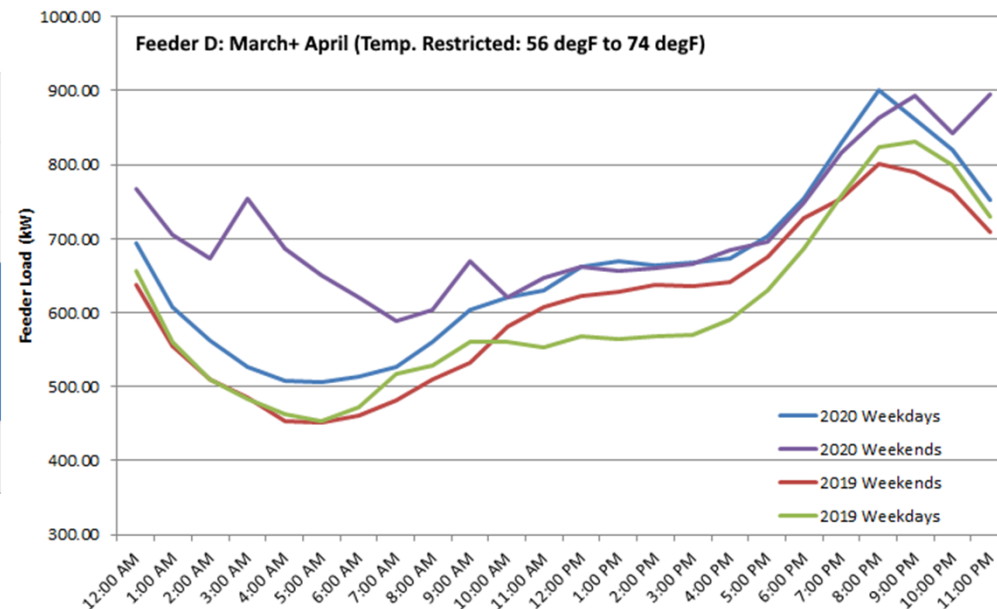
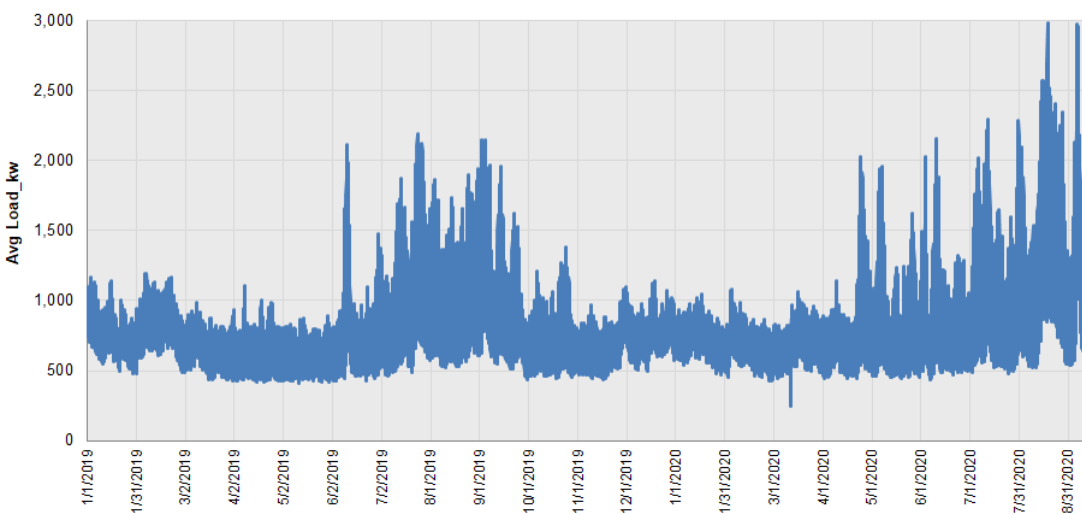
## Analysis Type 1: Total energy use during a time period

Analysis of average total energy usage during select periods (e.g., a specific month) compared to the corresponding 2019 period, used as baseline consumption.



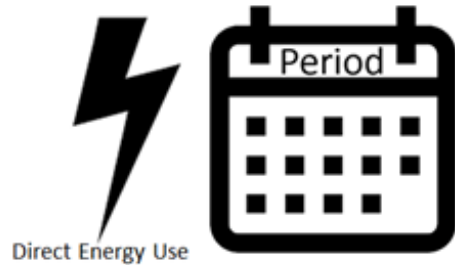
## Analysis Type 2: Evaluation of energy use on a day-type basis

Analysis of averaged patterns of energy usage on an hourly basis over the course of a day during selected analysis period, either overall or for a selected day type (weekdays vs. weekends), again compared to an average baselines of the corresponding time period in the prior year.



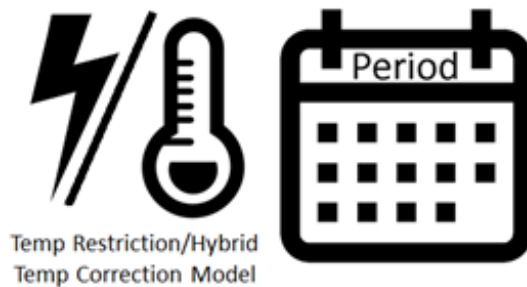
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# Analysis Approach: Methods



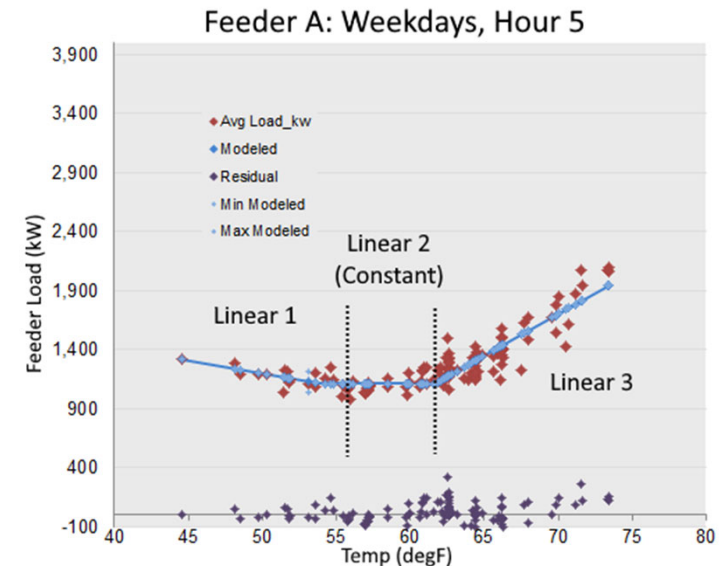
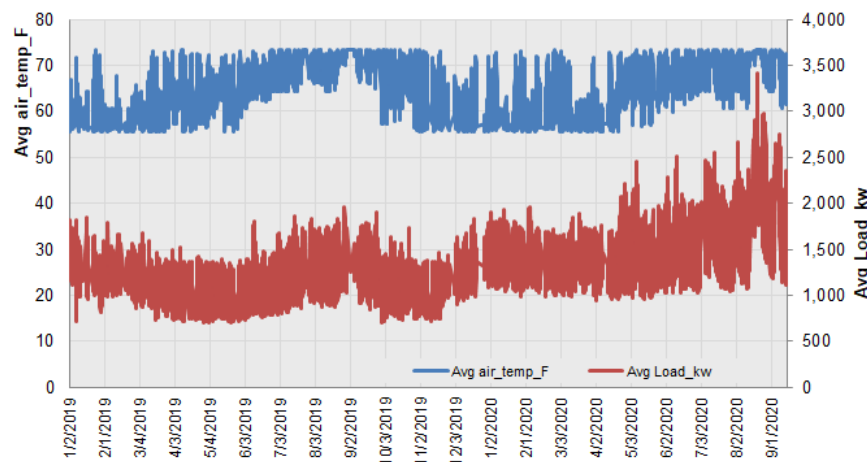
## Method 1: Direct Evaluation

Use of raw electrical energy usage in 2020 compared to 2019 to estimate total billing impact due to the events related to the COVID-19 on served customers. This provides a comparison to what was used the year before without direct assessment of weather changes.



## Method 2: Temperature-based energy evaluation

Use of a temperature sensitivity model for correcting or restricting method to normalize the impact of temperature to compare yearly energy usage. The two methods used provide a means to directly estimate the impact in the change of use for temperature insensitive loads and changes in the impact for temperature sensitive loads.



# Temperature Baseline Considerations



2019

Δ ↓

2020

## Year Summary:

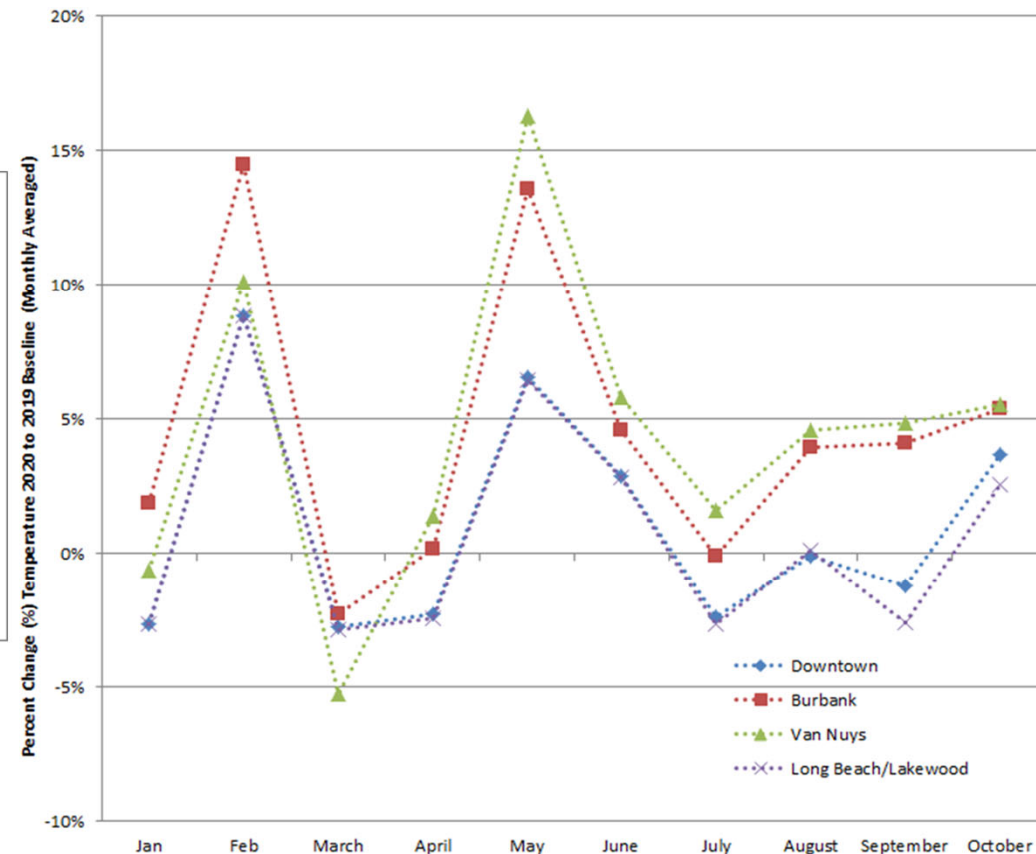
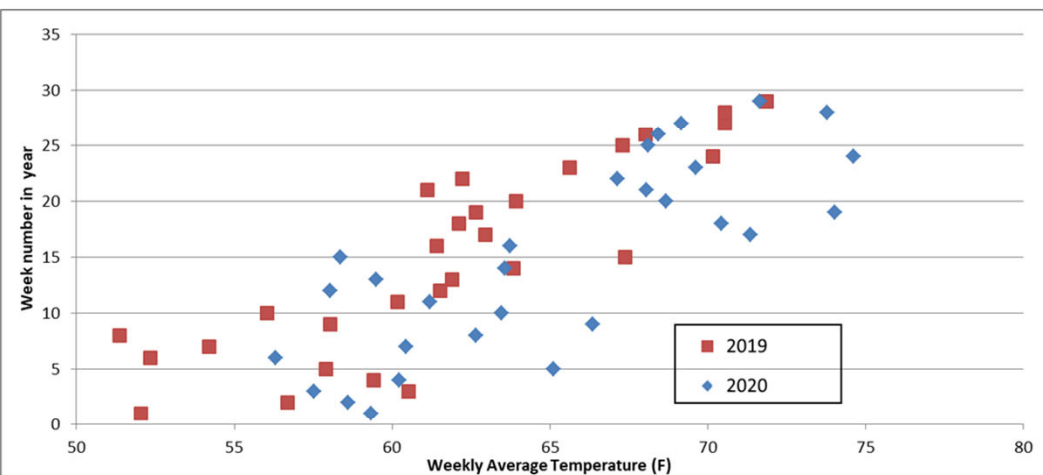
Downtown: +0.92% (+0.25°F)

Burbank: +4.38% (+2.31°F)

Van Nuys: +4.31% (+2.43°F)

South LA (Long Beach/Lakewood): +0.04% (+0.59°F)

Jan through Oct



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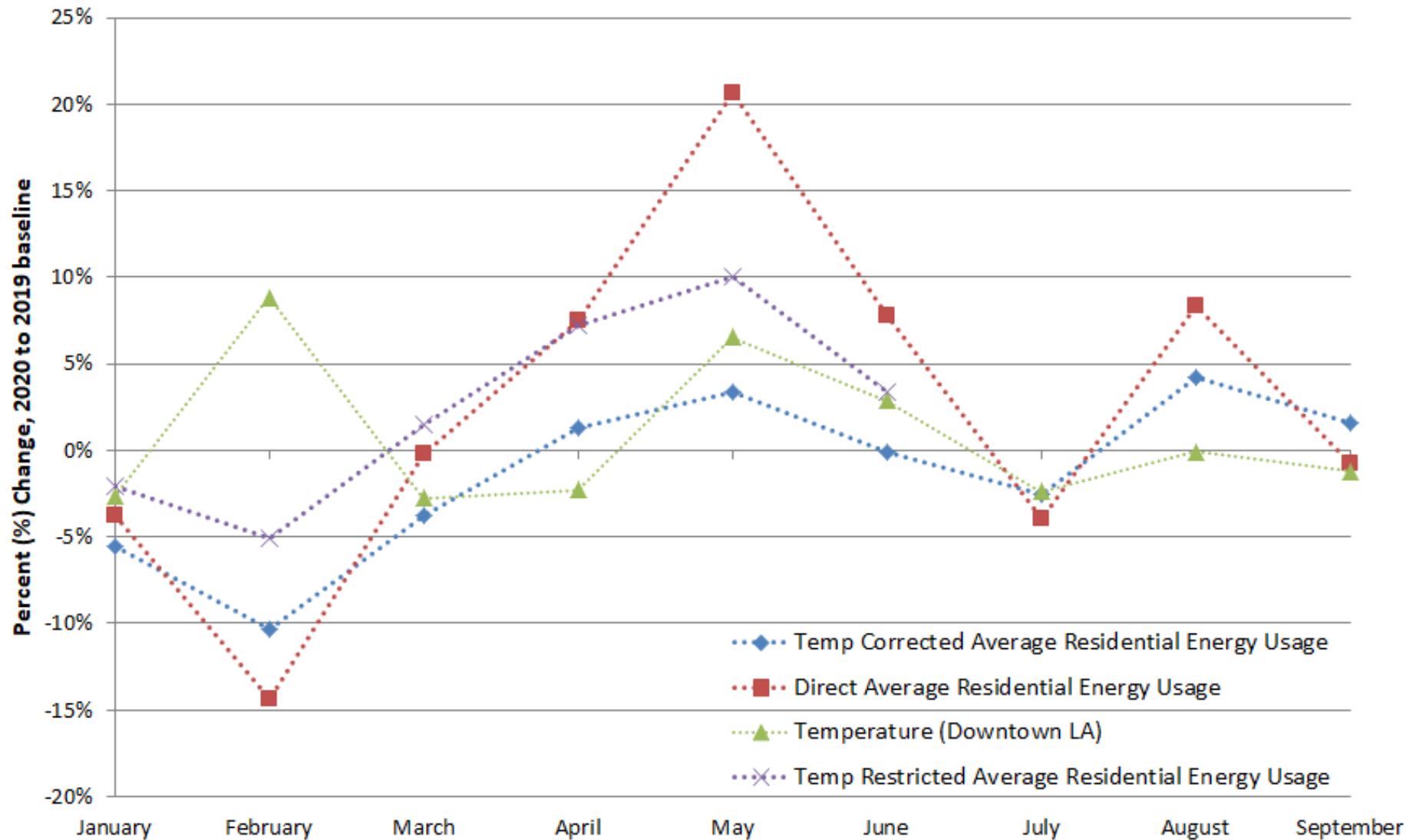


## **Results: Evaluation of Energy Impact in Los Angeles**



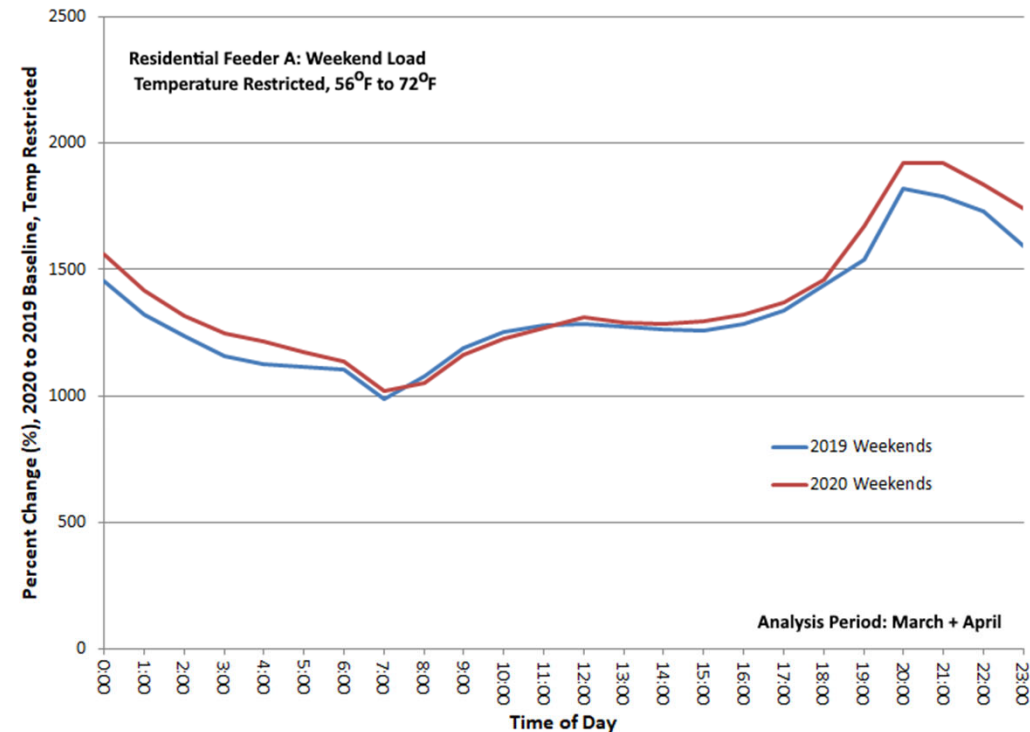
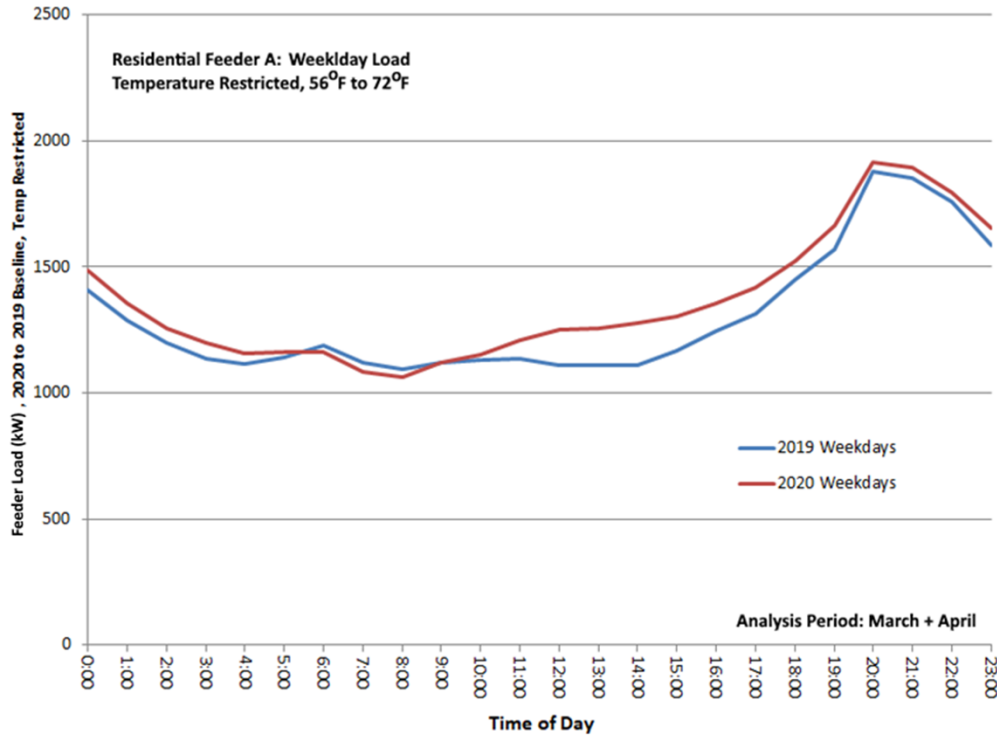
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# Monthly Energy Usage: Estimation Bounds



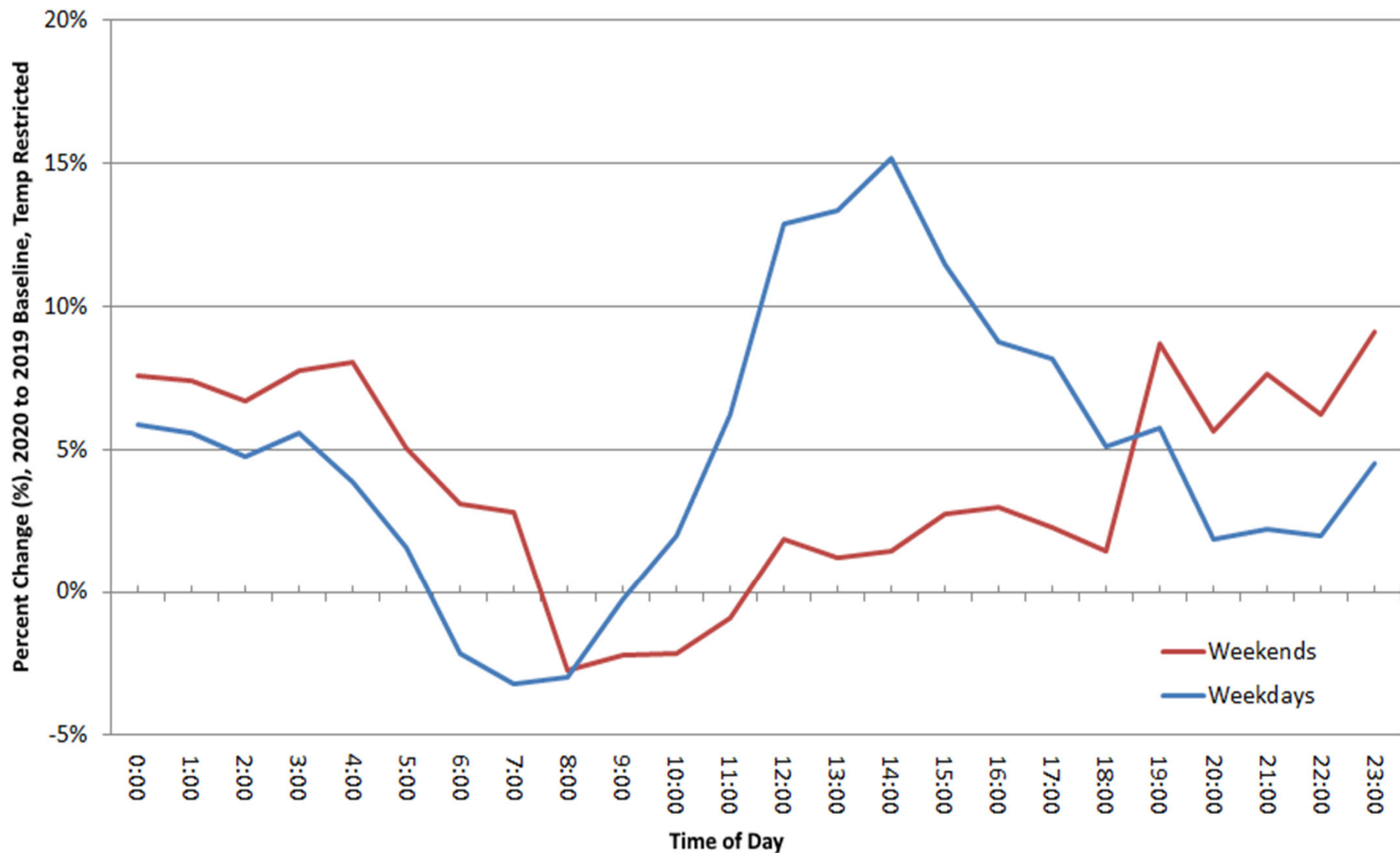
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# Daily Energy Use Changes: Feeder A Example



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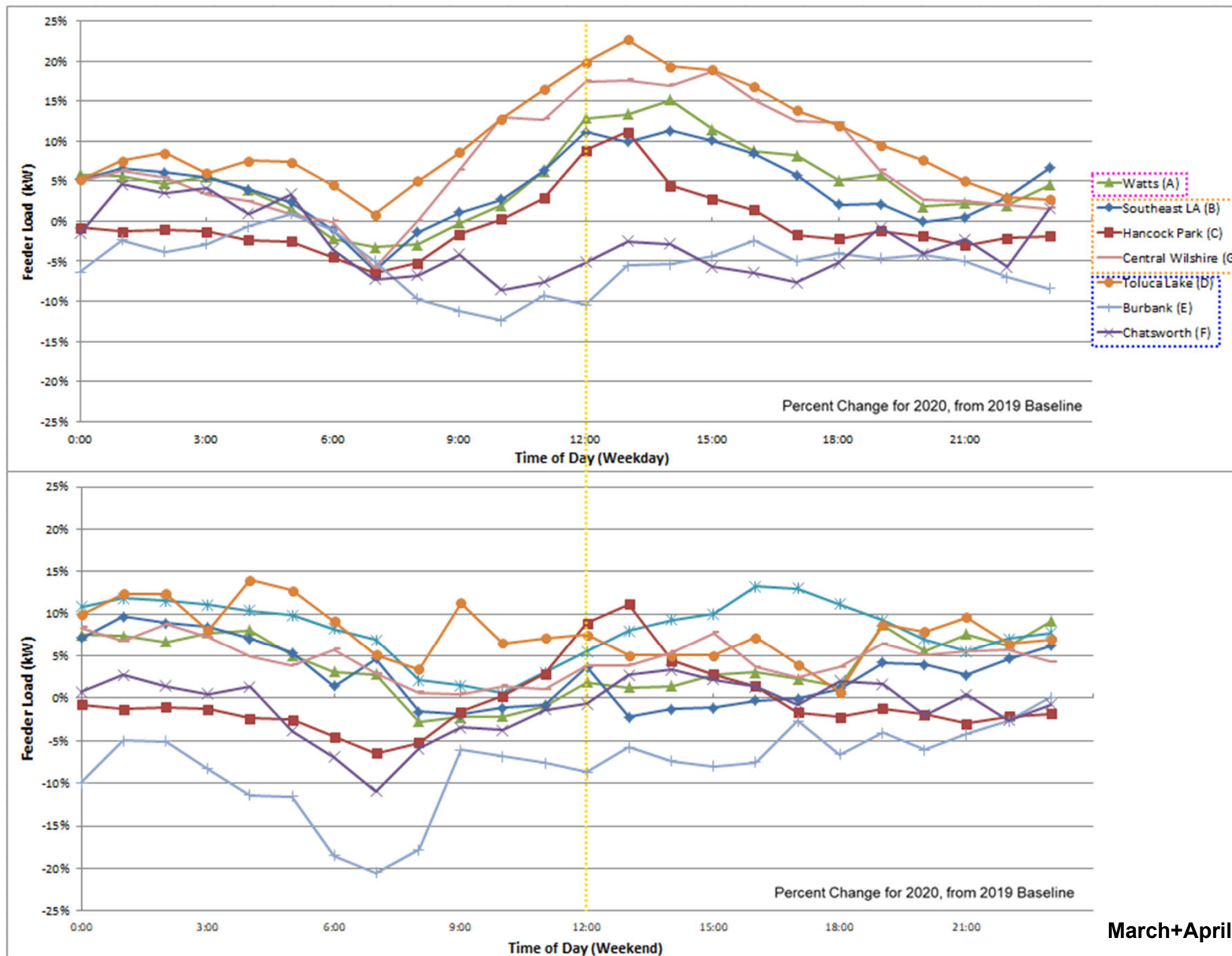
# Example Monthly Energy Usage Change: Feeder A Example



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# Daily Energy Use Changes: Peak SIP



**22% Max  
Mid-day  
Change,  
Weekdays**

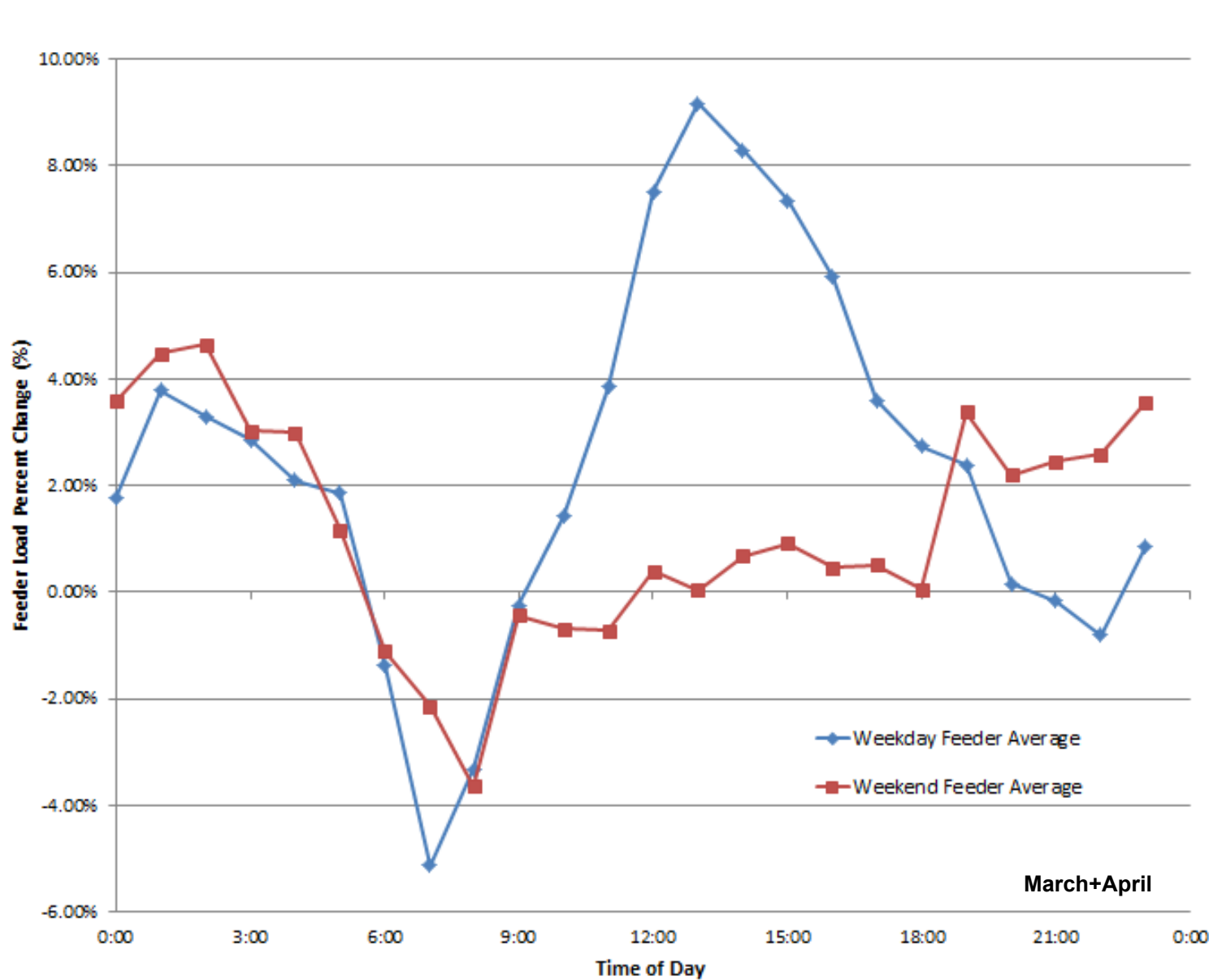
**-5.5% Min.  
“Morning  
Peak”  
Change,  
Weekdays**

March+April



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# Daily Energy Use Changes: Averaged Peak SIP

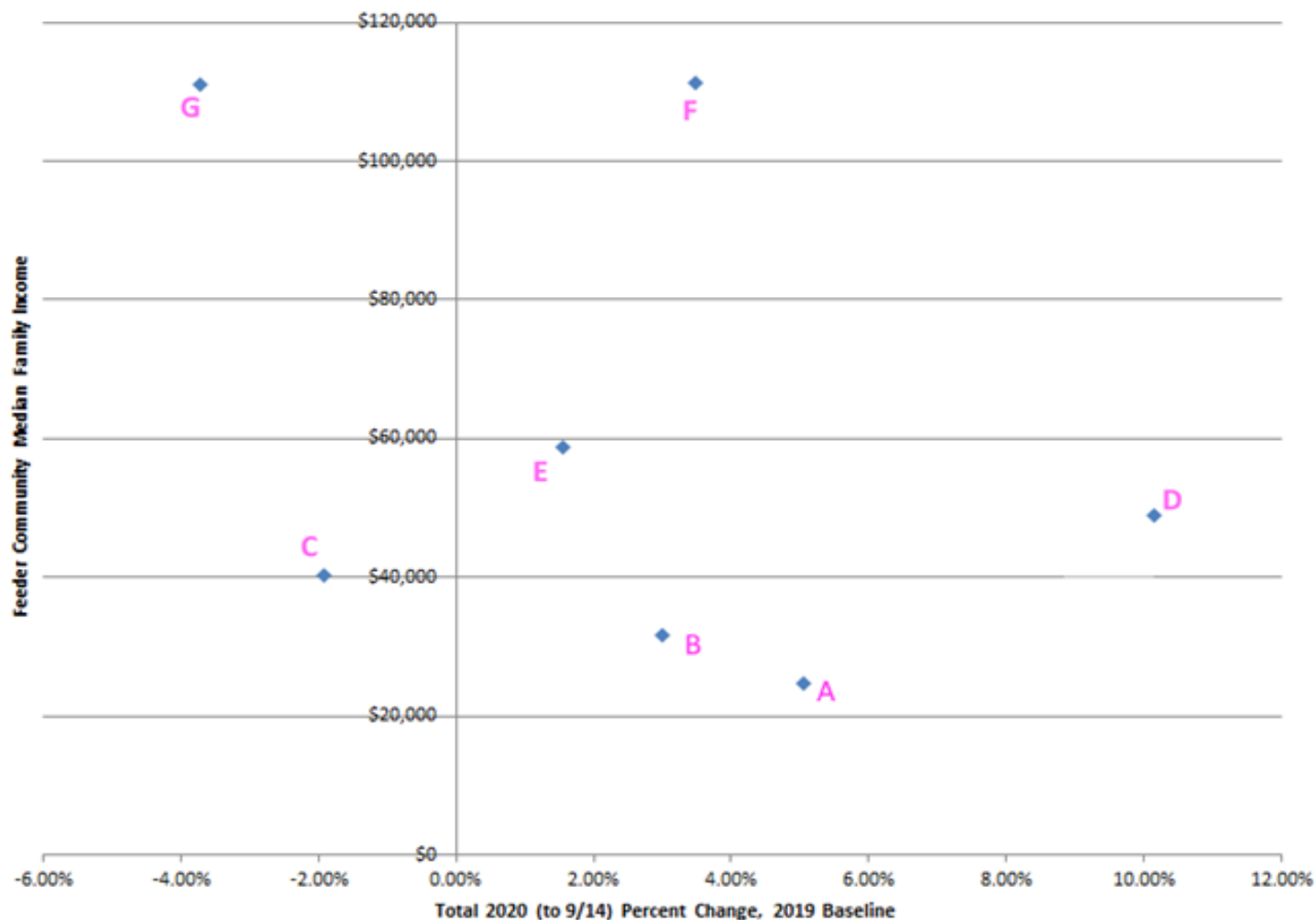


9.2% Avg.  
Mid-day  
Change,  
Weekdays



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# Income Impact on Yearly 2020 Energy Use

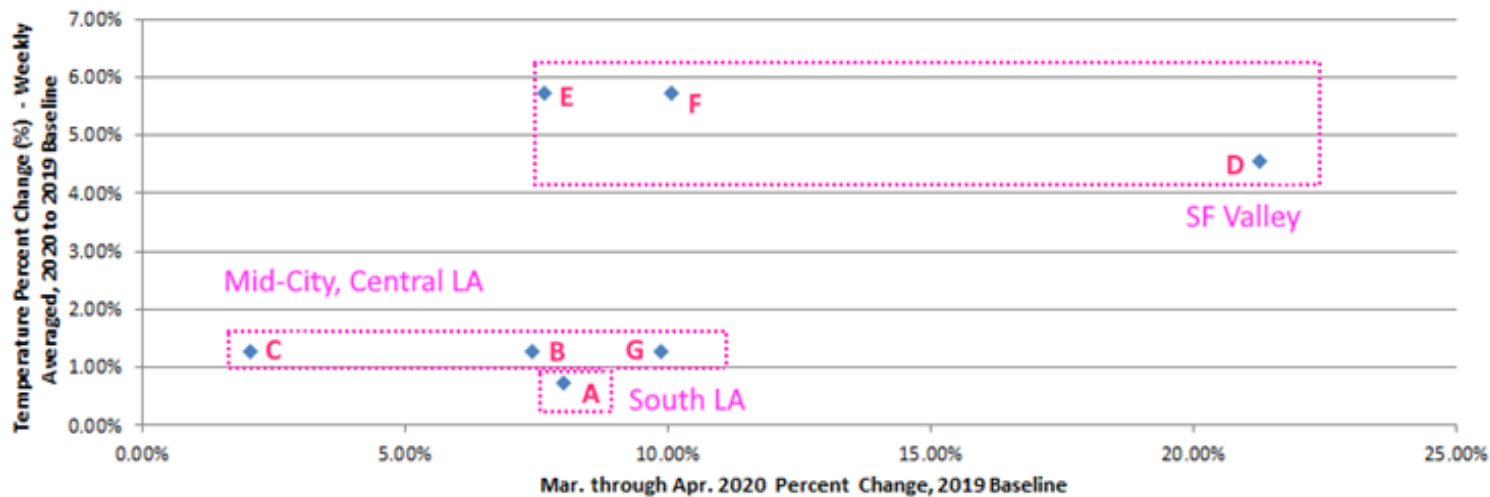
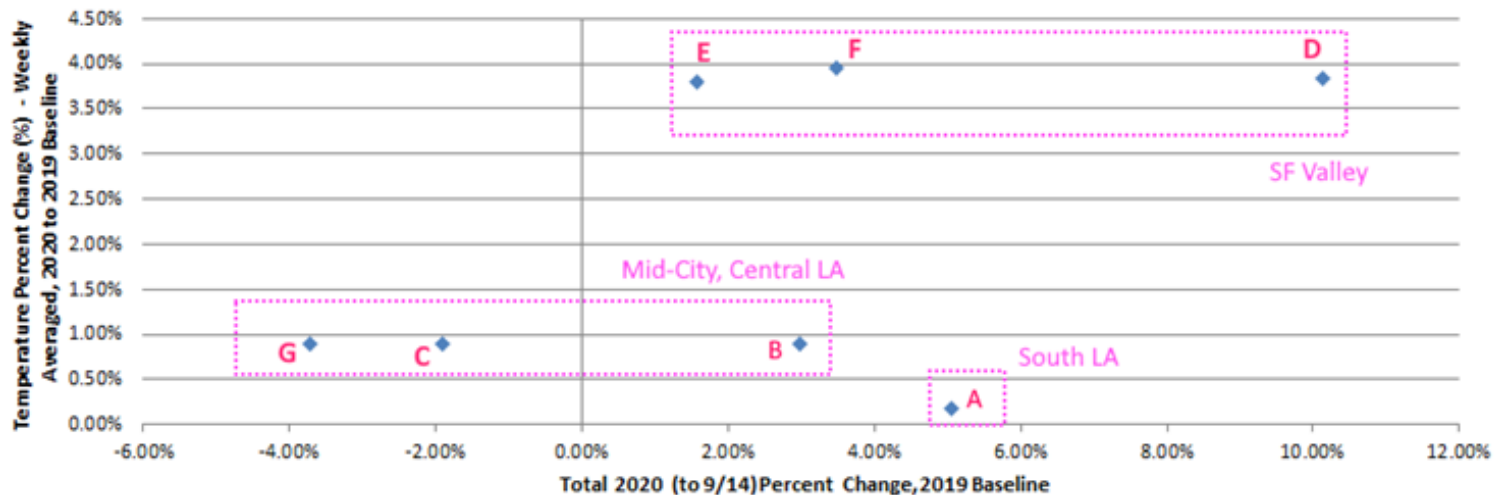


Energy usage percent change in 2020 compared to 2019 baseline versus mean income for each evaluated residential feeder.



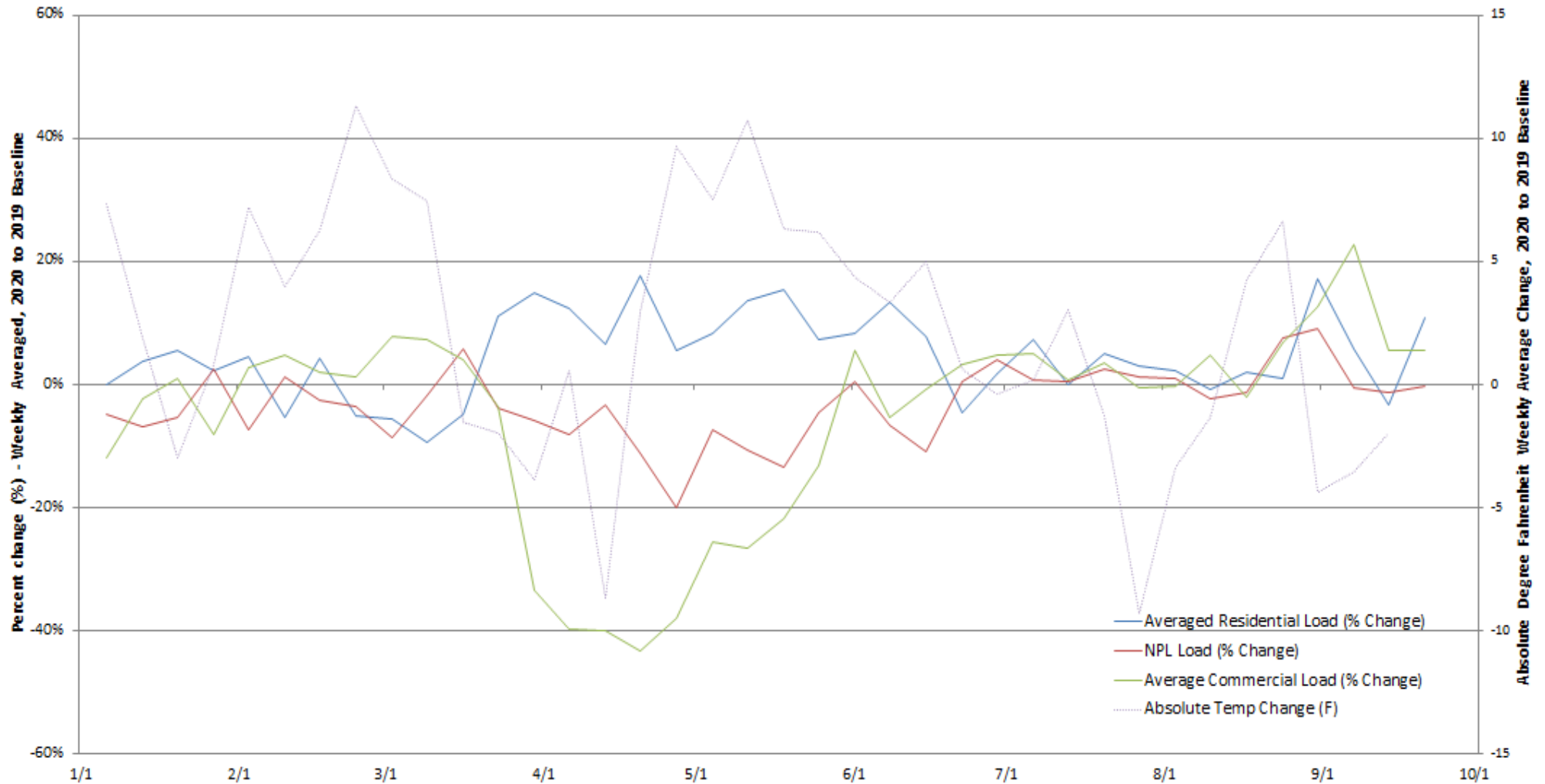
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# Daily Energy Use Changes: Peak SIP



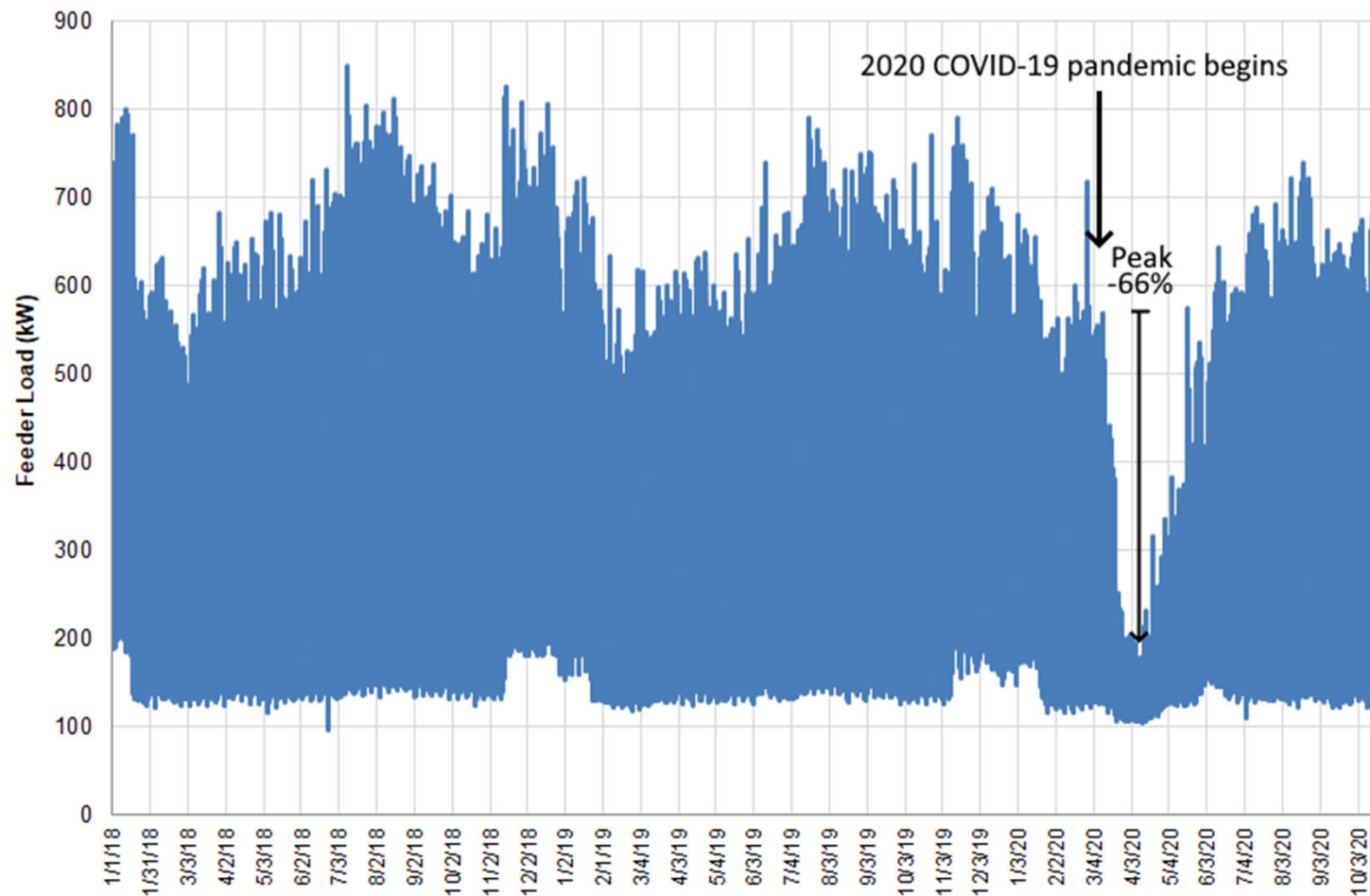


# Extended Impact On LADWP System Load

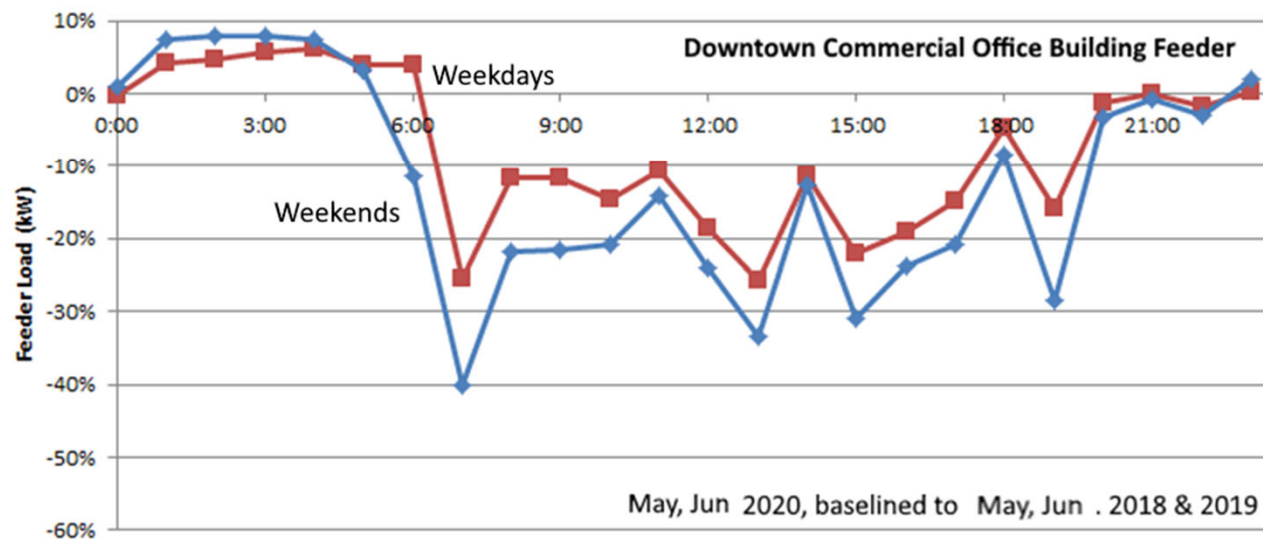
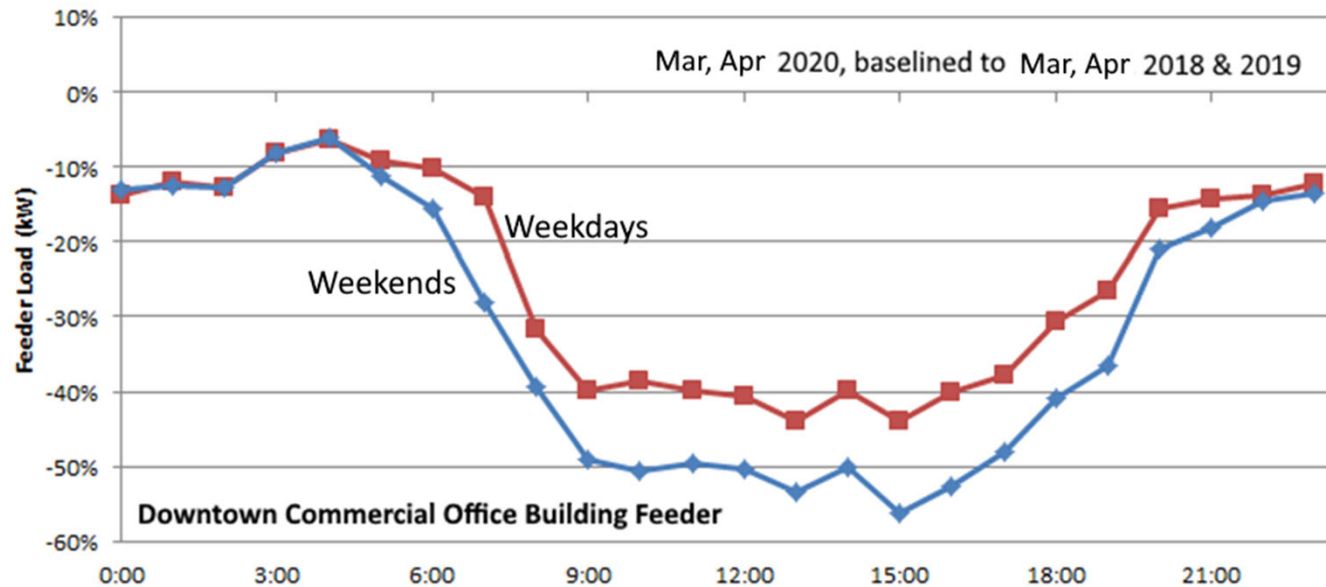


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# Commercial Example: Daily Load



# Commercial Example: Daily Load



# Major Conclusions

- Major rapid-onset societal impact due to COVID-19 pandemic + SIP
- Long term equilibrium holding largely irrespective of COVID-19 case numbers
- Expected continued trend, spare major SIP order
- Commercial peak and average substantially stronger than residential
- Change in daily usage patterns still present, temperature sensitive impact is main driver, long term plug load trends possible.



# Acknowledgements

**Preparation assistance provided by:**

**Sabine Kunrath, M.S. | Katie Gladych | Mahejabeen Kauser  
California Plug Load Research Center**

**Major development effort provided by:**

**Armen Saiyan, PE, Jeremiah Valera, Luke Sun, Mehdi**

**Shafaghi, Miguel Malabanan, James Kemper, and Amir Tabakh, USM, PE, David Jacot, PE  
from LADWP Efficiency Solutions Engineering (ESE) and DWP La Kretz Labs**





# Thank You!



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# Backup Slides



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# Results Summary



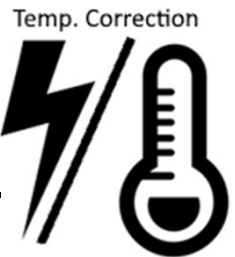
## Residential Energy Change During Shelter-in-Place



**+14.2% Average Total Residential Energy Usage Increase**



**+3.2% to 8.9% Average Normalized Total Increase**  
**(+0.23 to 5.5% Non-Temperature Sensitive)**



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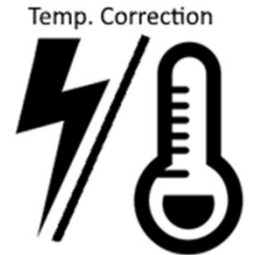
# Results Summary



## Residential Energy Change During Summer 2020



**+2.8% Average Normalized Total Increase**  
**(-0.2% Non-Temperature Sensitive)**



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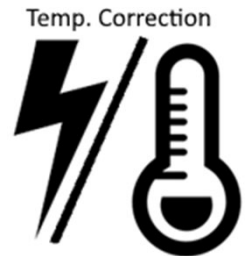
# Results Summary



## Residential Energy Change During Summer 2020



**12-1 PM year to year greatest change in usage, at (avg) 16.2%,  
+5.5% increase in late afternoon peak**



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