# NOVEC Weather-Normalized Forecasting Model

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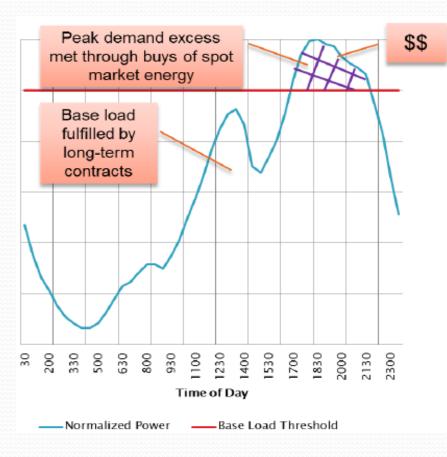
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# NOVEC Background (1 of 2)

- Northern Virginia Electric Cooperative (NOVEC) is a distributor of energy to 6 counties in Northern Virginia.
  - Nearly 150,000 customers.
  - Mandated to meet all energy requests in pre-specified zones of obligation.
  - Primary means to service communities is through bulk energy market purchases.

# NOVEC Background (2 of 2)

- Energy Purchases:
  - 1) Bulk purchases via contracts 1 month to 3 years prior to delivery.
  - 2) Spot purchases as needed to meet peak demand up to one day prior to delivery.



#### **Problem Statement**

- Warming trends have caused NOVEC to question whether the current weather-normalization methodology is still the best available model.
- NOVEC needs a new weather-normalization method that accounts for changing weather trends or a recommendation that the existing model is sufficient.

To what extent is the climate and its impact on energy demands changing?

## Purpose & Objectives

#### • Purpose:

- NOVEC needs to remove weather-effects from energy consumption to more accurately inform bulk purchases.
- Explore and recommend a methodology to normalize monthly energy purchases.

#### Objectives:

- Characterize the relationship between economic variables, weather, customer-base, and energy consumption.
- Develop a normalization procedure to remove weather effects from energy demand.

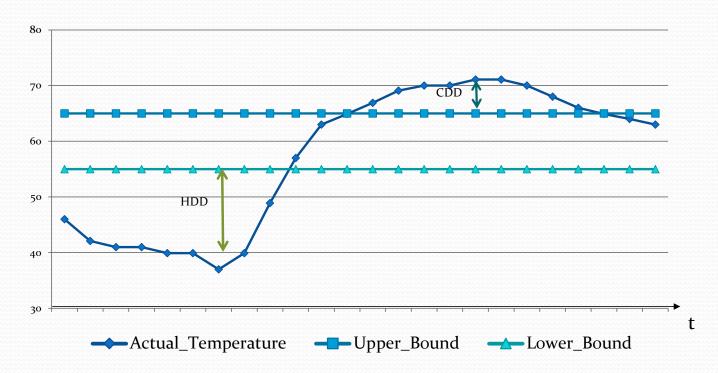
Recommendation for improvement to current weather-normalization methodology.

#### Scope

- Data:
  - NOVEC monthly energy purchases data since 1983.
  - Dulles weather data since 1963.
  - Historic economic factors data since 1980s.
  - 30 years of forecasted economic factors.
- Model:
  - Parameters: historic energy purchases, weather data, economics, and customer-base.
  - Predictions for energy consumption over a 30-year horizon.
  - Regression: characterize dynamics between parameters.
  - Weather-normalization: remove seasonal weather impacts on NOVEC's load.
  - Forecast: facilitate testing of varied normalization methodologies.
  - Ensure synergy with NOVEC's existing suite of models (regression, weather-normalization, forecast).

# **Key Definitions**

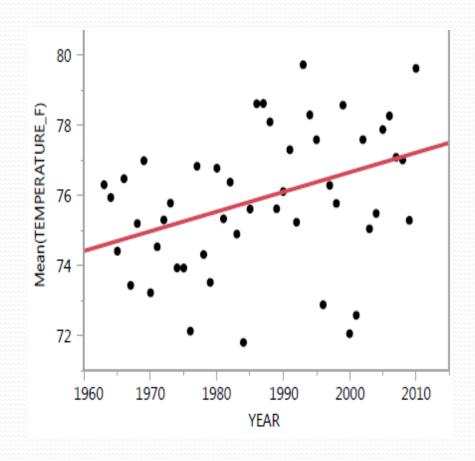
- CDD: Cooling Degree-Day = MAX(ActualDegree UpperBound, o) \* Duration.
- HDD: Heating Degree-Day = MAX(LowerBound ActualDegree, o) \* Duration.
- Neutral zone: Upper and lower bounds for temperatures that do not impact load.



<sup>\*</sup> Analysis will explore varied upper/lower bounds for temperature

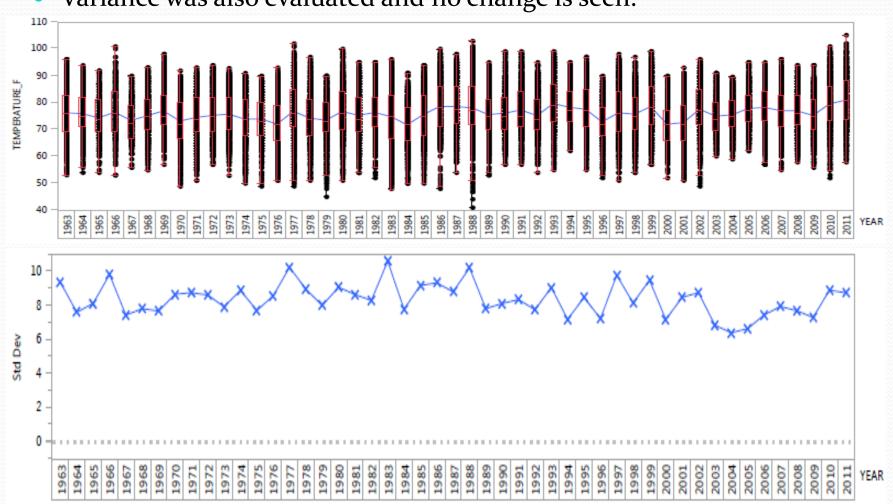
#### Weather Data Visualization (1 of 2)

- Historic weather data was analyzed by average temperature per month to view trends.
- Average temperature trending upwards from 1960 to the present for each month (graph is for July).



#### Weather Data Visualization (2 of 2)

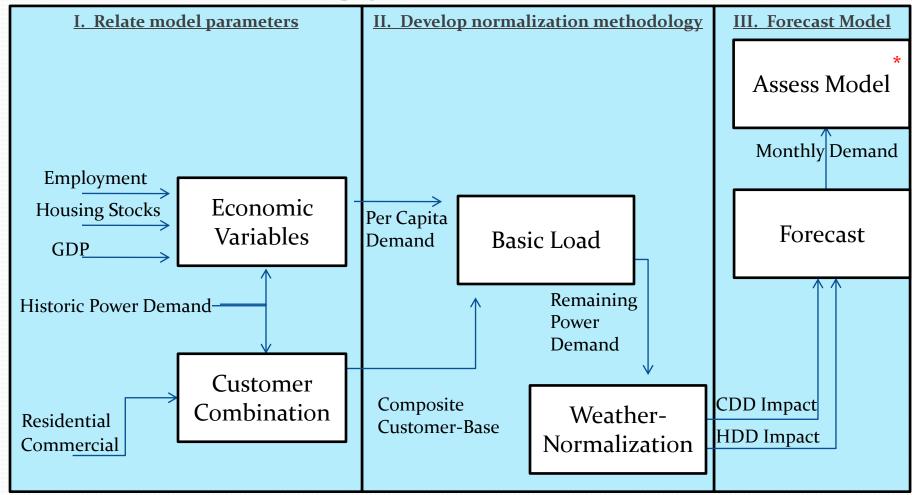
Variance was also evaluated and no change is seen.



# Essential Elements of Analysis & Measures of Effectiveness

- EEA 1: What is the rate of climate change?
  - MoE 1.1: Seasonal trends and variability.
  - MoE 1.2: Rate of climate change.
- EEA2: What econ-model best predicts NOVEC's customer-base?
  - MOE 2.1: Best subset of econometrics to gauge service demand.
  - MOE 2.2: Goodness of fit test for selected model.
- EEA3: What impact does weather have on energy demand?
  - MOE 3.1: Relationship between weather and load beyond base demand.
  - MOE 3.2: Changes in climate compared to per capita consumption.
  - MOE<sub>3.3</sub>: Goodness of fit test for selected model.

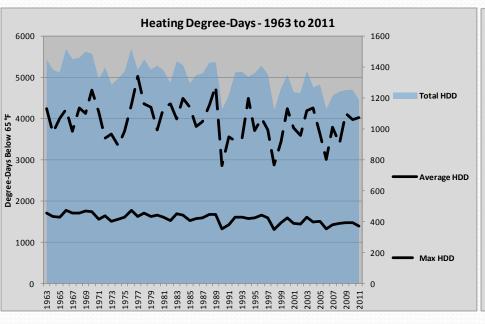
# Methodology

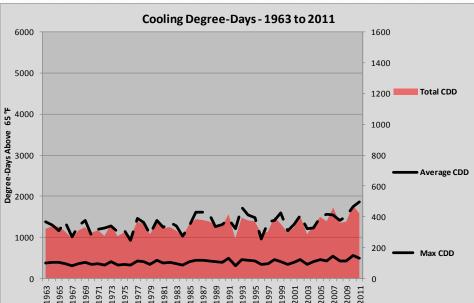


<sup>\*</sup> Model forecast will be verified against 2012-2013 power demand and compared to existing model's accuracy.

# **EEA1:** Rate of Climate Change

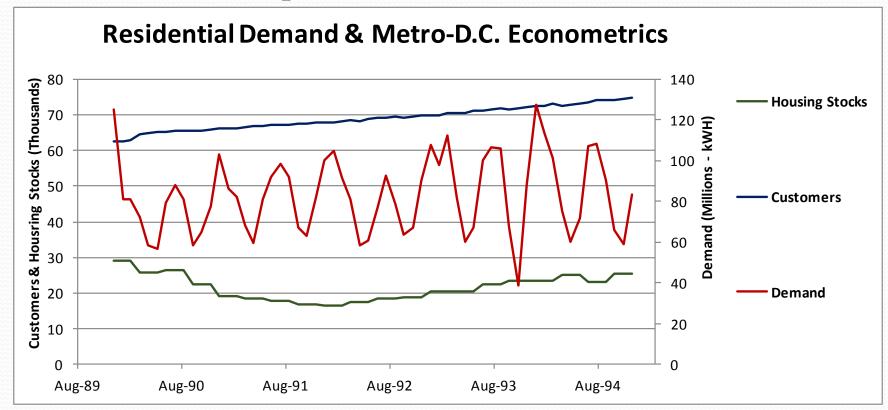
- Historic weather data was analyzed to determine trends:
  - Seasonal fluctuations.
  - Overall rate of change.
  - Characterize uncertainty/variability.





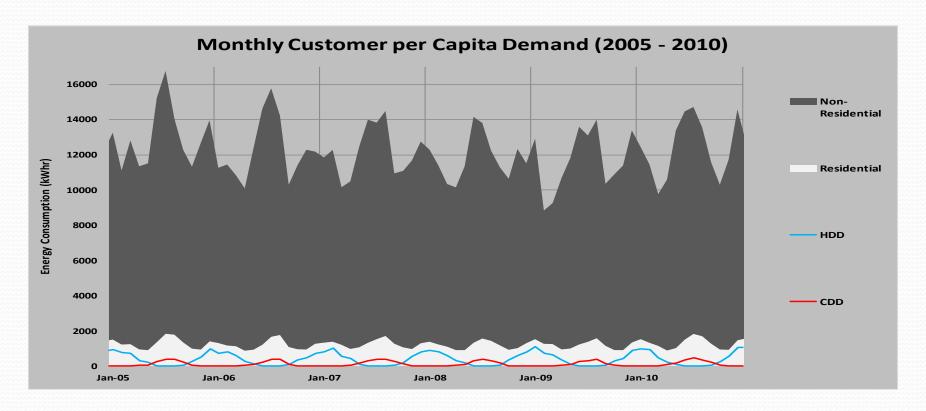
#### **EEA2: Economics Model**

 Model to associate economic factors to customer-base in under development.



# EEA3: Impact of Weather

 Changes to per capita energy demand by customer type: residential and non-residential.

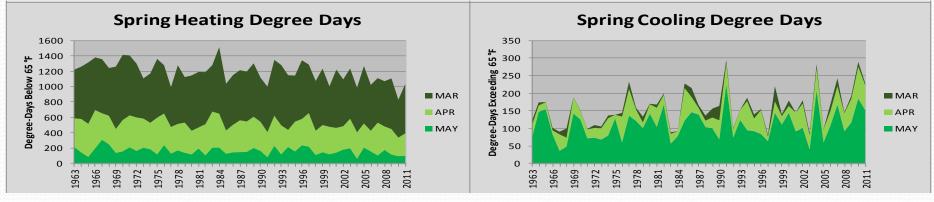


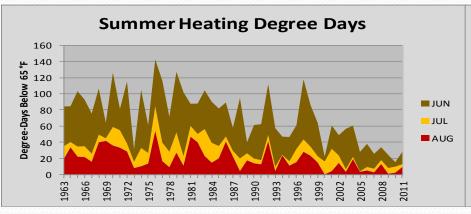
## Model Development

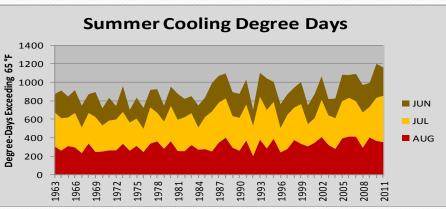
- Pre-processing: Excel Workbook with VBA Macros.
  - Automated computations of HDD and CDD.
    - Allows user-defined "neutral" boundaries for calculating.
    - Ingests data as currently maintained by sponsor.
  - Automated linear transformations for regression models.
    - GUI design facilitates some simple regression models germane to VBA; limited capability.
    - Launch and export conditioned data to R; expanded capability.
- Statistical Modeling in R: Executable file for regression analysis and improved visualization.

# **Preliminary Results**

- Variability in yearly weather patters doesn't appear to change.
- Climate change is more apparent in winter and summer than fall and spring.





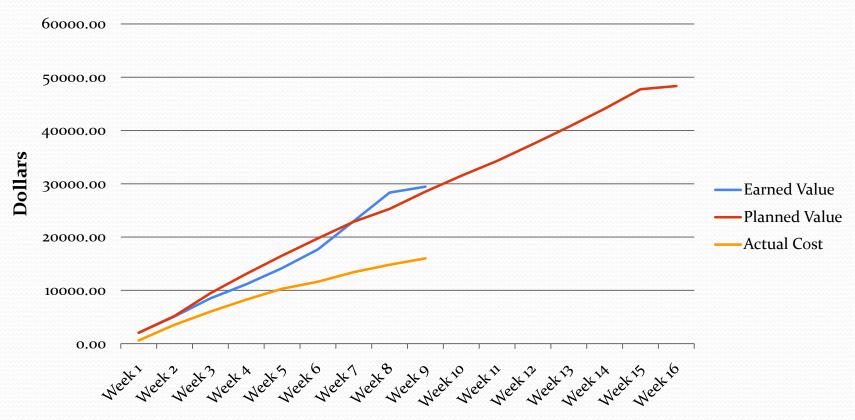


### Way Forward & Risks

- Data visualization and preliminary analysis completed.
- Website design completed. Still need to finalize content.
- Model design/creation under construction. Major focus over next couple of weeks.
  - Excel calling R needs to be completed.
  - Customer transformation
  - Final model fitting
  - Forecast

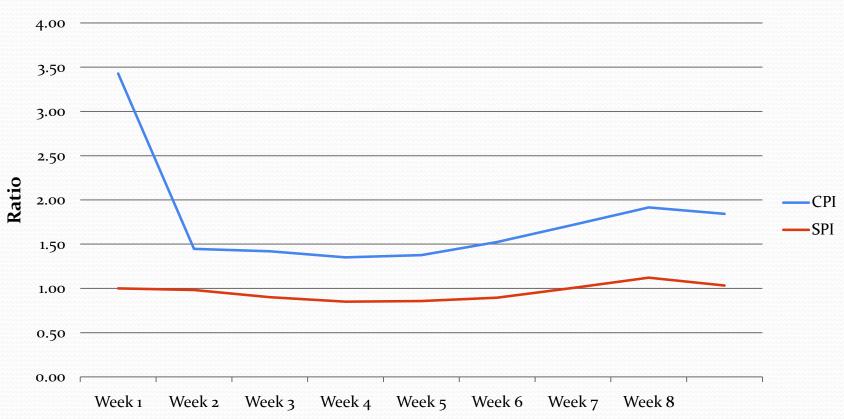
#### **Earned Value**

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#### CPI & SPI





#### References

- www.novec.com
- NOVEC 25<sup>th</sup> Anniversary History Film <a href="http://www.youtube.com/watch?v=2qfeOKnPPGg">http://www.youtube.com/watch?v=2qfeOKnPPGg</a>
- "Improving Load Management Control for NOVEC"; Kozera, Lohr, McInerney, and Pane. http://seor.gmu.edu/projects/SEOR-Spring12/NOVECLoadManagement/team.html