

Short-Term Load Forecasting

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Load Forecasting at PJM

	PJM Planning Forecast (PJM Manual 19)	PJM Operations Forecasts	
	Long-Term	Short-Term	Very Short-Term
Forecast	Monthly peaks for next 15 years	Hourly averages for next 7 days	5-minute averages for next 6 hours
Posting location	PJM.com > Library > Reports & Notices	Data Miner 2 and Data Viewer	Data Miner 2



Why is Short-Term Load Forecasting Important?

From Dispatch LoadCast tool, load forecast is used for...



Multitude of PJM's core functions drive need for accurate short-term load forecast



Inputs to Short-Term Load Forecast

Short-Term (7-Day) Forecast Inputs

Temporal

- Season
- Day of week
- Time of day
- Holidays

Weather

- Temperature
- Cloud cover
- Wind
- Humidity

Load

- Measured load
- Similar historical days

Solar

 Forecasted behind-themeter solar output

Current and next day forecasts are modified by PJM operators based on experience and judgement



Neural Networks

Machine learning algorithms

- Temperature-Based: uses historical load and temperature and forecasted temps
- Weather-Indexed: uses THI / effective temp instead of temperature
- Weather Optimized: optimized for sudden changes in weather patterns
- Backfill: configuration to handle sudden changes in weather patterns

Pattern Matching Algorithms

Load Forecast Models

Looks for similar historical days

- Similar Day: uses weather pattern matching
- Similar Day Lookup: suggests a number of similar days from which operator can choose

Blended Models

"Best weighted most" average

- Ensemble: uses vendor-provided forecasts
- Mix: uses PJM forecasts



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Best performing

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Reconstituted Load Process

RECONSTITUTED LOAD METHOD





Automated Hourly Load Forecast Process



Collect new load measurements Collect new weather measurements and forecasts Collect new behind-themeter solar estimates Run load forecast models, provide output to operators Daily

Run backcast using weather measurements

1	pjm	Day-A	head Forecast Timeline
	18:88 A.M.	1:30 P.M.	5:00 P.M.
	Initial Load Forecast is completed	Updates made to Load Forecast	Becomes "Original" forecast in Dataviewer
	10:15 a.m.: Forecast posted externally	1:30-2:15 p.m.: Re-Bid Period	Final Load Forecast updates made
	11:00 a.m.: Day-Ahead Market closes	2:15 p.m.: Run RAC with updated forecast, posted in time for Intraday 2	6:00 p.m.: RAC re-run if inputs have changed, posted in time for Intraday 3



Causes of Load Forecast Error

- Errors in weather forecasts
- Extreme/unseasonable temperatures
- Storms
- Holidays
- Daylight Savings Time
- Low visibility into sources of load and human behavior