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An intra-day analysis of electricity forward premia

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About the Presenter

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Previous studies

- Kun Li et al. “The Significance of Calendar Effects in the Electricity Market”, *Applied Energy*, 2019, volume 235, pages 487-494. ([DOI: 10.1016/j.apenergy.2018.10.124](https://doi.org/10.1016/j.apenergy.2018.10.124))
- Kun Li et al. “Principal Component Analysis of Price Fluctuation in the Smart Grid Electricity Market”, *Sustainability*, 2018, volume 10, issue 11, 4019. ([DOI: 10.3390/su10114019](https://doi.org/10.3390/su10114019))

Motivation

- An extended model based on Bessembinder & Lemmon (2002) with theoretical proof in behavioral finance.
- Include risk factors that account for significant forward premium in the multi-line electricity market.
- Conduct an empirical test in the Pennsylvania–New Jersey–Maryland (PJM) wholesale electricity market.

Three options to have electric power

When have the electricity power at day $t+1$

1. buy at the spot price at day t , and hold it to day $t+1$.
2. buy at the forward price at day t for day $t+1$.
3. buy at the spot price at day $t+1$ directly.



Three options to have electric power

- The settled price
 - $F_{t,t+1}$ is the forward price observed on day t for delivery on day $t+1$;
 - S_t is the spot price on day t
 - S_{t+1} is the spot price on day $t+1$

	day t	day $t+1$
Option 1	S_t	
Option 2	$F_{t,t+1}$	$F_{t,t+1}$
Option 3		S_{t+1}



Three options to have electric power

- The settled price, and the estimated value for transaction
 - $E_t[S_{t+1}]$ is the estimated spot price on day $t+1$ given information available on day t
 - u is the inventory cost, and y is the convenience yield

	day t	day $t+1$
Option 1	S_t	$S_t e^{r_f + u - y}$
Option 2	$F_{t,t+1}$	$F_{t,t+1}$
Option 3	$E_t[S_{t+1}]$	S_{t+1}

Efficient Market

- Perfect Hedge: all three options have the same value at day $t+1$,

$$S_t e^{r_f + u - y} = F_{t,t+1} = S_{t+1}$$

- According to Fama (1970), Pindyck (2001), Hull (2006), at day t , we should also have

$$E_t[S_{t+1}] = S_t$$

- at day t ,

$$\begin{aligned}E_t[S_{t+1}] &= S_t \\E_t[S_t e^{r_f + u - y}] &= S_t \\S_t E_t[e^{r_f + u - y}] &= S_t\end{aligned}$$

- Offset S_t

$$\begin{aligned}E_t[e^{r_f + u - y}] &= 1 \\e^{r_f + E(u) - E(y)} &= 1\end{aligned}$$

- So the arbitrage-free condition

$$r_f + E(u) - E(y) = 0$$

- So the arbitrage-free condition

$$r_f + E(u) - E(y) = 0$$

- Rewritten into the generalized format of APT multifactor model about opportunity cost, inventory cost, and non-monetary benefits of holding an asset.

$$r = r_f + E(u) - E(y)$$

Or

$$r_i = r_f + \beta_1 u_i + \beta_2 y_i + e_i$$

Forward Premium

- Bessembinder & Lemmon (2002), Longstaff & Wang (2004), Haugom & Ullrich (2012)

- The ex ante (day t) forward premium as

$$FP^{EA} = F_{t,t+1} - E_t[S_{t+1}]$$

- The alternative ex post (day t+1) forward premium

$$FP^{EP} = F_{t,t+1} - S_{t+1}$$

Forward Premium

- The ex post forward premium

$$\begin{aligned} FP^{EP} &= F_{t,t+1} - S_{t+1} \\ &= (F_{t,t+1} - E_t[S_{t+1}]) + (E_t[S_{t+1}] - S_{t+1}) \\ &= FP^{EA} + FE_{t,t+1} \end{aligned}$$

- Where $FE_{t,t+1} = E_t[S_{t+1}] - S_{t+1}$ is the forecast error, and $E_t[S_{t+1}] - S_{t+1}$ is a function of r_f , u and y .
- So the forward premium FP^{EP} is a function of r_f , u and y .

Bessembinder & Lemmon (2002)

- Equilibrium Forward Price

$$F_{t,t+1} = E_t[S_{t+1}] + b \text{Var}(S_{t+1}) + c \text{Skew}(S_{t+1})$$

- Input $FP^{EA} = F_{t,t+1} - E_t[S_{t+1}]$ and
 $FP^{EP} = FP^{EA} + FE_{t,t+1}$

$$FP^{EP} = b \text{Var}(S_{t+1}) + c \text{Skew}(S_{t+1}) + FE_{t,t+1}$$

- So we need to include variables related to $FE_{t,t+1}$.



Data

- the wholesale Pennsylvania, New Jersey and Maryland (PJM) electricity market
- Covers 13 states and Washington D.C.
- 12,000 transmission lines (Pnodes) in areas served by PJM
- Market clearing price: for each Pnode, Hourly locational marginal price (LMP) , for both forward and spot prices, between 2013-16

Summary statistics: ex post premia

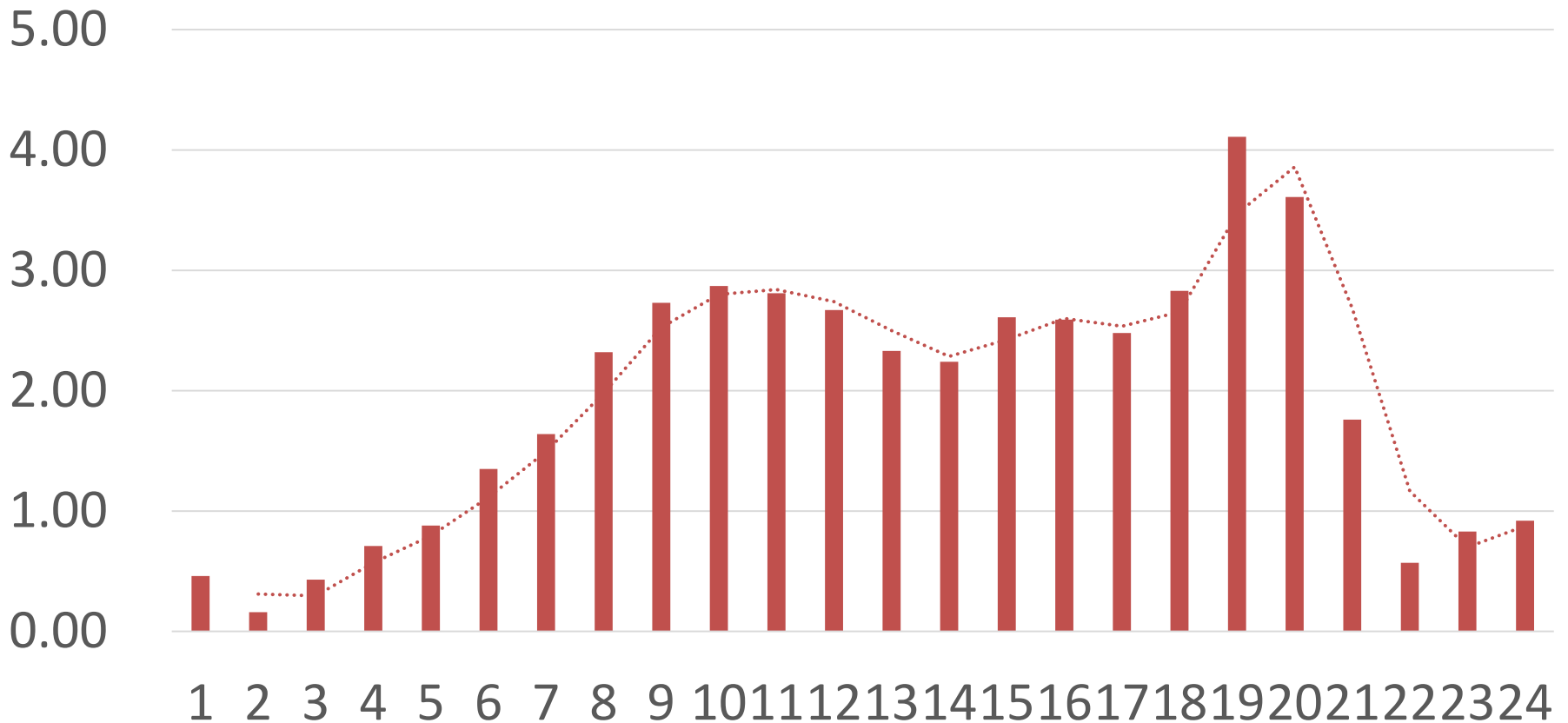
Over 390 million observations

mean	p50	sd	min	max	t- statistic
0.77	1.63	34.91	-4508	2272	437.18

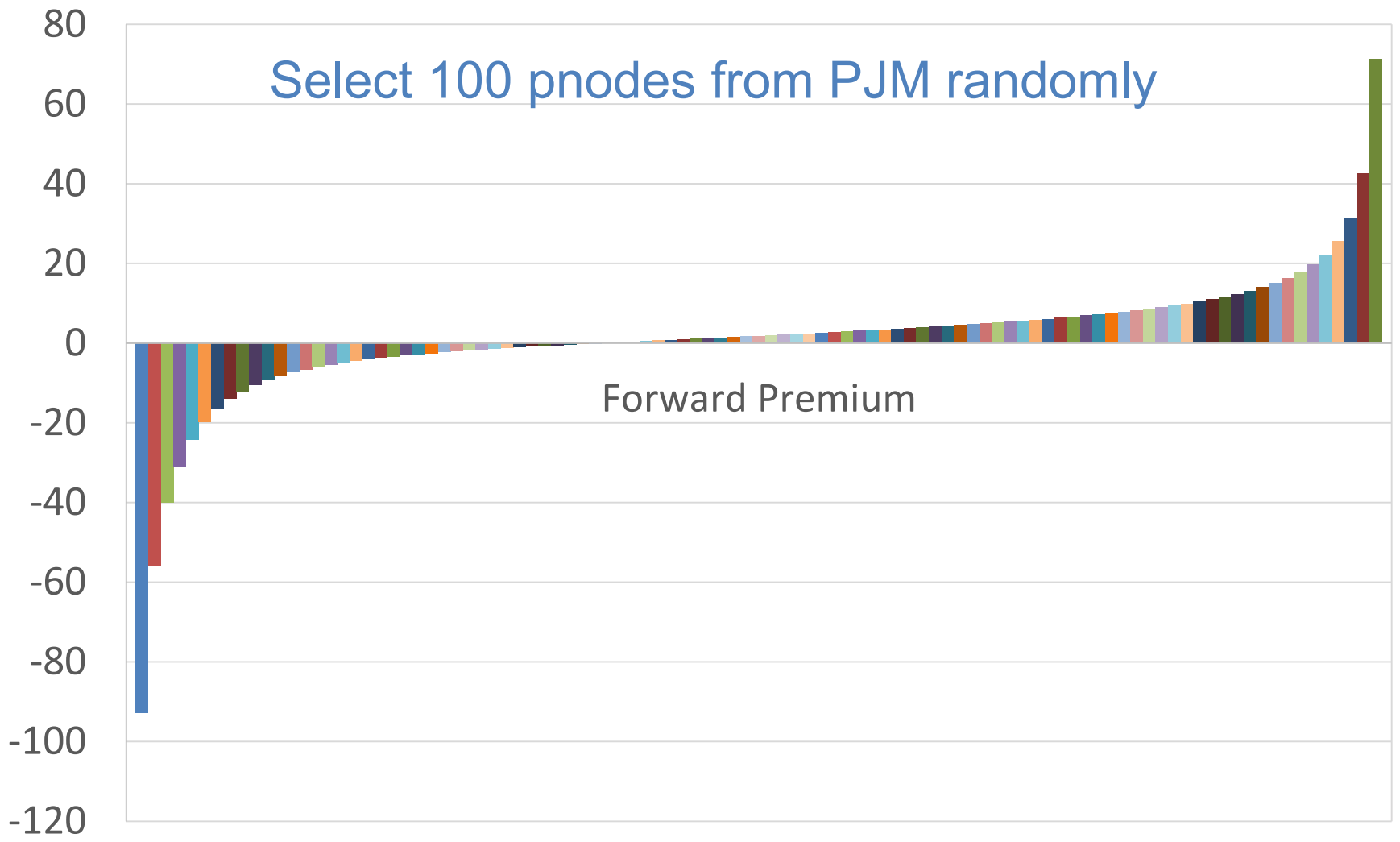


ex post premia by Hour-of-the-day

Median of ex post premia



Forward premia in percentile



Cross-sectional Analysis

- Typical B-L Model: for each Pnode x at hour h

$$FP_{t,t+1}^{EP}$$

$$= a_x + a_h + b \text{Var}(S_{t+1}) + c \text{Skew}(S_{t+1})$$

- Revised Model: add congestion cost and marginal loss as $FE_{t,t+1}$

$$FP_{t,t+1}^{EP}$$

$$= a_x + a_h + b \text{Var}(S_{t+1}) + c \text{Skew}(S_{t+1}) \\ + d \text{Congestion}_{t+1} + e \text{Marginal}_{t+1}$$

Empirical Results

	B-L	Revised
$Var(S_{t+1})$	-0.21	-0.30
$Skew(S_{t+1})$	0.03	0.01
$Congestion_{t+1}$		0.44
$Marginal_{t+1}$		-0.07
Num	3,500,400	3,500,400
R	0.0426	0.3291

Implications

- Congestion: corresponds to u , since the inventory cost can be adjusted due to the different settled prices on date t or $t+1$
- Marginal: corresponds to y , since the transmission loss is mainly due to the producers' motivations and locations.
- These results are consistent with B-L model (2002).

Summary

- We theoretically explain the components of the forecast error in B-L, and prove them as the critical conditions for the model.
- Use PJM dataset to testify the theoretical proof
 - Suggest qualified measures for empirical tests