



# Modeling Canadian Heavy Crude Congestion Pricing

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# OUTLINE

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3 Result

4 Future work

# Introduction-Spatial price integration

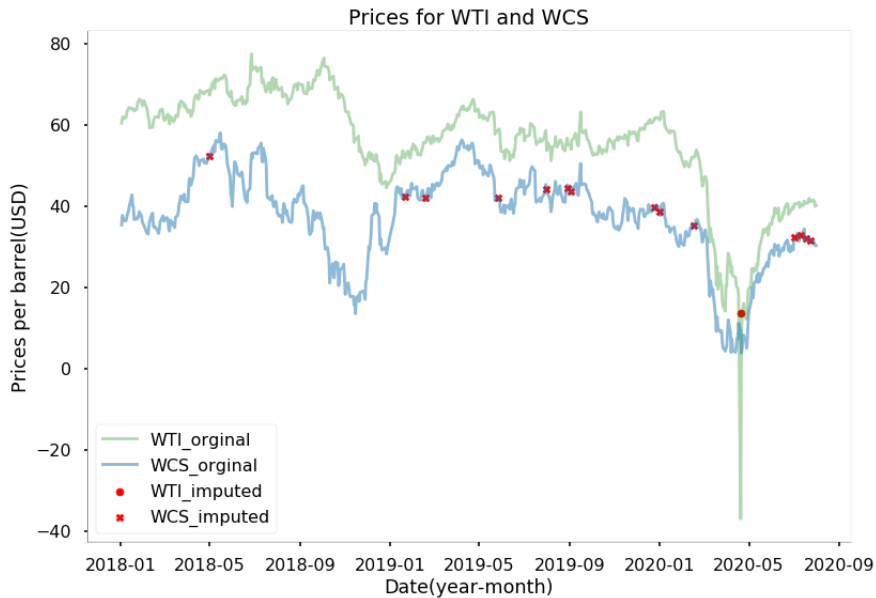
- Crude oil classification: Lighter oils are higher in price due to an easier cheaper process in refineries rather than heavy oils
- Location of extraction: It needs to be transported to the point of refinery
- Transportation capacity: Type of transportation and their capacitance, either pipelines or trains

# Introduction - Oil price benchmarks

- West Texas Intermediate(WTI)
- West Canada Select (WCS)
- Alberta produces 4MM barrels per day. Two-thirds of the WCS production is consumed in United States.
- The spread between WTI and WCS is estimated about \$5 US due to the different oil classification

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# Model - Price decomposition of the spread

This model is based off of the work of Birge et al., *Spatial price integration in commodity markets with capacitated transportation networks*, 2020.

For a network with fixed costs and fixed network structure, we decompose the equilibrium of the WTI–WCS price spread  $\lambda^t$  as follows:

$$\lambda^t = \rho + \varepsilon^t + \omega^t$$

where

- 1  $\lambda^t$ : the WTI–WCS price spread at time  $t$ ;
- 2  $\rho$ : the transportation cost;
- 3  $\varepsilon^t$ : a baseline equilibrium value;
- 4  $\omega^t$ : the congestion surcharge at time  $t$ .

# Model - The neutral band

## Uniqueness

In general, equilibrium prices are NOT unique in a transportation network.

## Example

The price of a bottle of olive oil is \$15 in Vancouver (YVR) and \$20 in Calgary (YYC). It costs \$8 to transport each bottle between YVR and YYC.

Is there arbitrage?



# Model - The neutral band

## Uniqueness

In general, equilibrium prices are NOT unique in a transportation network.

## Example

The price of a bottle of olive oil is \$15 in Vancouver (YVR) and \$20 in Calgary (YYC). It costs \$8 to transport each bottle between YVR and YYC.

Is there arbitrage?

No. For any price at YVR in the interval [\$12, \$28] and there will be no arbitrage. We call this the *neutral band*.

# Model - A one node model

minimize:  $\alpha$

subject to:  $\lambda^t = \rho + \varepsilon^t + \omega^t, \quad \forall t \in \mathcal{T},$

$$-\alpha \leq \varepsilon^t \leq \alpha, \quad \forall t \in \mathcal{T}$$

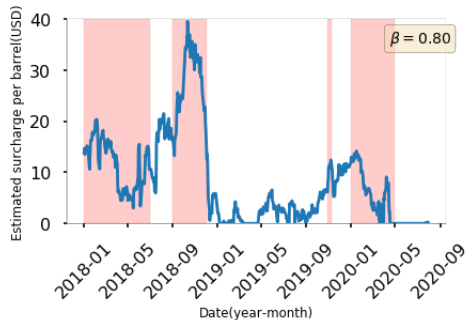
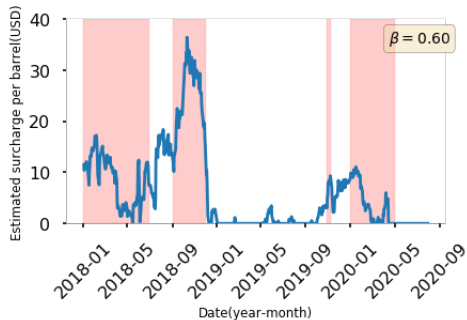
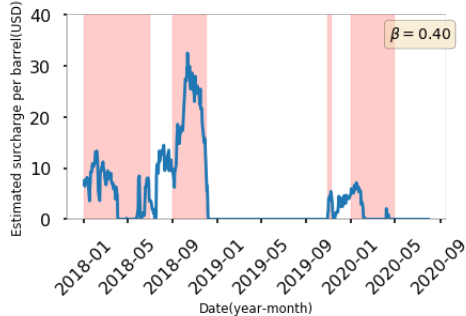
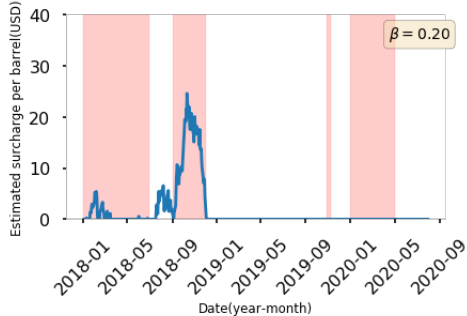
$$0 \leq \omega^t \leq \psi^t M, \quad \forall t \in \mathcal{T}$$

$$\varepsilon^t \geq \alpha - (1 - \psi^t)M, \quad \forall t \in \mathcal{T}$$

$$\sum_t \psi^t \leq \beta T,$$

$$\psi^t \in \{0, 1\}, \quad \forall t \in \mathcal{T}.$$

Here  $\beta$  and  $M$  are constants where  $\beta \in [0, 1]$  and  $M$  is a sufficiently large upper bound for congestion.



# Model - A multi-node model

$$\text{minimize: } \sum_{s \in \mathcal{S}} \alpha_s$$

$$\text{subject to: } \lambda_s^t = \rho_s + \varepsilon_s^t + \omega_s^t, \quad \forall s \in \mathcal{S}, \forall t \in \mathcal{T},$$

$$-\alpha_s \leq \varepsilon_s^t \leq \alpha_s,$$

$$0 \leq \omega_s^t \leq \psi^t M,$$

$$\varepsilon_s^t \geq \alpha_s - (1 - \gamma_s^t) M,$$

$$\psi^t \leq \sum_s \gamma_s^t \leq |\mathcal{S}| \psi^t,$$

$$\sum_t \psi^t \leq \beta T,$$

$$\psi^t, \gamma_s^t \in \{0, 1\},$$

Here  $\beta$  and  $M$  are constants where  $\beta \in [0, 1]$  and  $M$  is a sufficiently large upper bound for congestion, and  $|\cdot|$  denotes the cardinality of a set.

# Model - Ornstein–Uhlenbeck process

$$dS_t = \alpha(\mu - S_t) dt + \sigma dW_t$$

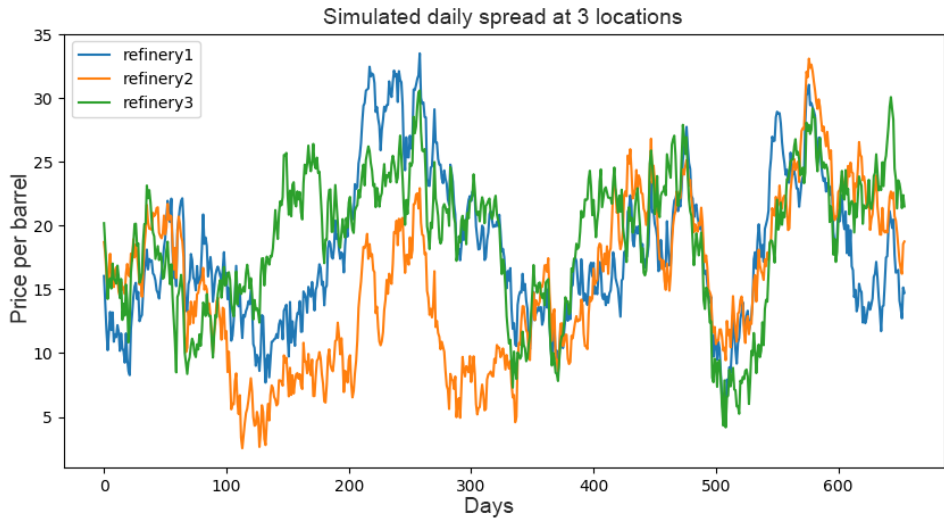
The SDE is calibrated to the WTI/WCS spread with parameters:

$$\alpha = 0.0119, \quad \mu = 16.3, \quad \sigma = 1.45.$$

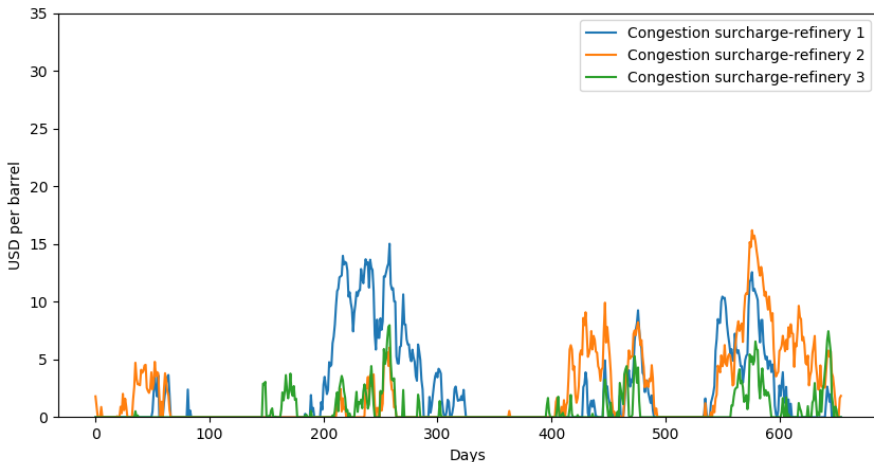
We simulate three paths using the correlation matrix:

$$\text{corr} = \begin{bmatrix} 1 & 0.8 & 0.7 \\ 0.8 & 1 & 0.56 \\ 0.7 & 0.56 & 1 \end{bmatrix}$$

# Simulated paths of the spread



# Estimated congestion surcharge for $\beta = 0.6$



Thank you for your attention.