#### Discussion:

## Driven by Fear? The Tail Risk Premium in the Crude Oil Futures Market by Reinhard Ellwanger

Emil Siriwardane Harvard Business School

2016 Volatility Institute Conference

#### This Paper High-level summary

- How much are investors willing to pay for insurance against increases in oil price volatility?
  - · This determines the swap rate in a variance swap

#### This Paper High-level summary

- How much are investors willing to pay for insurance against increases in oil price volatility?
  - This determines the swap rate in a variance swap
- Volatility can come from two sources:
  - Continuous price movements and jumps

#### This Paper High-level summary

- How much are investors willing to pay for insurance against increases in oil price volatility?
  - This determines the swap rate in a variance swap
- Volatility can come from two sources:
  - Continuous price movements and jumps
- This paper: how much are investors willing to pay for insurance against increases in oil price volatility *that come from big jumps*?

## This Paper

High-level summary

- How much are investors willing to pay for insurance against increases in oil price volatility?
  - This determines the swap rate in a variance swap
- Volatility can come from two sources:
  - Continuous price movements and jumps
- This paper: how much are investors willing to pay for insurance against increases in oil price volatility *that come from big jumps*?
- Main findings:
  - A lot and time varying
  - Not all vol is the same
  - Predicts oil returns

#### **Big Picture Comments**

- 1. Is Oil Special?
  - We know there is a large variance risk premium (VRP) for the S&P 500
  - Also know that a fair amount of this comes from tail movements
  - Does oil just load up on the market volatility factor?

### **Big Picture Comments**

- 1. Is Oil Special?
  - We know there is a large variance risk premium (VRP) for the S&P 500
  - Also know that a fair amount of this comes from tail movements
  - Does oil just load up on the market volatility factor?
- 2. The link between expected oil future returns and tail-induced VRP
  - What type of model would deliver these forecasting results?
  - Do we learn anything about the term structure of uncertainty insurance?

#### Some Structure

Futures dynamics:

$$\frac{dF_t}{F_{t-}} = \operatorname{drift} + \sigma_t dW_t + \int_{\mathbb{R}} (e^{x} - 1)\widetilde{\mu}(dt, dx)$$

#### Some Structure

Futures dynamics:

$$\frac{dF_t}{F_{t-}} = \operatorname{drift} + \sigma_t dW_t + \int_{\mathbb{R}} (e^{x} - 1)\widetilde{\mu}(dt, dx)$$

Quadratic variation:

$$QV(t,T) = \underbrace{\int_{t}^{T} \sigma_{s}^{2} ds}_{\text{Continuous Variation}} + \underbrace{\int_{t}^{T} \int_{\mathbb{R}} x^{2} \mu(ds, dx)}_{\text{Jump-induced Variation}}$$

#### Some Structure

Futures dynamics:

$$\frac{dF_t}{F_{t-}} = \operatorname{drift} + \sigma_t dW_t + \int_{\mathbb{R}} (e^{x} - 1)\widetilde{\mu}(dt, dx)$$

Quadratic variation:

$$QV(t,T) = \underbrace{\int_{t}^{T} \sigma_{s}^{2} ds}_{\text{Continuous Variation}} + \underbrace{\int_{t}^{T} \int_{\mathbb{R}} x^{2} \mu(ds, dx)}_{\text{Jump-induced Variation}}$$

- Two types of risk:
  - Underlying risk in the futures contract
  - The risk that risk will change

Defining Jump-Induced Volatility Risk

Variance risk premium:

 $VRP(t, T) = \mathbb{E}^{\mathbb{P}} [QV(t, T)] - \mathbb{E}^{\mathbb{Q}} [QV(t, T)]$ = Premium for Bearing Continuous Vol Risk + Premium for Bearing Jump-Induced Vol Risk Defining Jump-Induced Volatility Risk

Variance risk premium:

 $VRP(t, T) = \mathbb{E}^{\mathbb{P}} [QV(t, T)] - \mathbb{E}^{\mathbb{Q}} [QV(t, T)]$ = Premium for Bearing Continuous Vol Risk + Premium for Bearing Jump-Induced Vol Risk

► Goal = isolate the premium for bearing (large) jump-induced vol risk

Defining Jump-Induced Volatility Risk

Variance risk premium:

 $VRP(t, T) = \mathbb{E}^{\mathbb{P}} [QV(t, T)] - \mathbb{E}^{\mathbb{Q}} [QV(t, T)]$ = Premium for Bearing Continuous Vol Risk + Premium for Bearing Jump-Induced Vol Risk

- Goal = isolate the premium for bearing (large) jump-induced vol risk
- Use the methodology from Bollerslev, Todorov, and Xu (2014) applied to oil futures and options:
  - Short dated options for the Q-measure
  - High-frequency future prices for the  $\mathbb P\text{-measure}$

## The Price of Insurance and Forecasting

Data from Table 1 and Table 3

- On average, for \$100 of insurance, investors are willing to pay:
  - \$2.32 to hedge against volatility risk coming from left-tail events
  - \$0.79 to hedge against volatility risk coming from right-tail events

## The Price of Insurance and Forecasting

Data from Table 1 and Table 3

- On average, for \$100 of insurance, investors are willing to pay:
  - \$2.32 to hedge against volatility risk coming from left-tail events
  - \$0.79 to hedge against volatility risk coming from right-tail events
- Not all vol is the same

## The Price of Insurance and Forecasting

Data from Table 1 and Table 3

- On average, for \$100 of insurance, investors are willing to pay:
  - \$2.32 to hedge against volatility risk coming from left-tail events
  - \$0.79 to hedge against volatility risk coming from right-tail events
- Not all vol is the same
- Forecasting results:
  - When premium for right-tail induced volatility risk is high, subsequent spot/future returns are low
  - Opposite is true for left-tail induced vol risk

What is special about oil?

#### • Oil could just be loading up on market-wide volatility risk

What is special about oil?

- Oil could just be loading up on market-wide volatility risk
- Is estimated premium for oil just a byproduct of this exposure?

What is special about oil?

- Oil could just be loading up on market-wide volatility risk
- Is estimated premium for oil just a byproduct of this exposure?
- One way to get at this:
  - The alpha in a time-series regression with standard factors + market-wide vol factor (Carr and Wu (2009))

What is special about oil?

- Oil could just be loading up on market-wide volatility risk
- Is estimated premium for oil just a byproduct of this exposure?
- One way to get at this:
  - The alpha in a time-series regression with standard factors + market-wide vol factor (Carr and Wu (2009))
- If not, one reasonable alternative is that oil market is segmented:
  - Variation driven by capital of insurance providers
  - Who is on the other side of the swap?

## Second Comment

Forecasting results are intriguing, but need more interpreting

- What model would predict the obtained signs in the forecasting regressions of oil returns?
  - VRP (from tails) ≠ Futures risk premium

## Second Comment

Forecasting results are intriguing, but need more interpreting

- What model would predict the obtained signs in the forecasting regressions of oil returns?
  - VRP (from tails) ≠ Futures risk premium
- One natural idea:
  - Arbitrager capital dictates expected oil returns (Acharya, Lochstoer, and Ramadorai (2013))
  - Volatility insurance premium also reflects their capital

## Second Comment

Forecasting results are intriguing, but need more interpreting

- What model would predict the obtained signs in the forecasting regressions of oil returns?
  - VRP (from tails) ≠ Futures risk premium
- One natural idea:
  - Arbitrager capital dictates expected oil returns (Acharya, Lochstoer, and Ramadorai (2013))
  - Volatility insurance premium also reflects their capital
- Timing mismatch:
  - · Jump-risk measures use short-dated options
  - Forecasting regressions go all the way up to 6 months
  - Results suggest a term-structure (Aït-Sahalia, Karaman, Mancini (2015))

#### **Final Thoughts**

- Interesting and topical market, fun to think about
- Forecasting results seem promising
- A lot of moving parts
- Would benefit with some more economic structure and interpretation

# Thank You!

#### **Other Issues**

- In absolute value, the VRP should be bigger than the LJP + the RJP, right?
- ► Table 1 should have *t*-statistics, so we can make sure the means are reliably different than zero
- Should use Hodrick standard errors for forecasting regressions