

Treasury Yield Implied Volatility and Real Activity

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Research question:

- What information from financial markets predicts level and volatility of real activity?
- Intuition: Financial markets are forward-looking – potentially capture future economic expectation
- Important for policymakers: Incorporate financial market variables in early warning systems
- Important for investors: Could inform asset prices

Not the first to ask this question:

- Many papers examining link between stock / bond markets and future real activity
- Comprehensive literature review: Stock and Watson (2003):
 - More than 100 papers
 - Over past 15 years
 - More than 43 financial variables
 - Many samples – 17 different countries

Variables tried with varying degree of success:

Table: Ability of variables to predict real activity

Variable	Paper	GDP	$\sigma(GDP)$	IND	$\sigma(IND)$	CON	$\sigma(CON)$	EMP	$\sigma(EMP)$
Term spread	Ang/Piazzesi (2003)	Green	Red	Green	Red	Green	Red	Green	Red
Stock returns	Schwert; Fama (1990)	Red	Green	Red	Green	Red	Green	Red	Red
VIX	Bekaert/Hoerova (2014)	Red	Green	Red	Green	Red	Green	Red	Red
Bond returns	Connolly/Stivers/Sun (2006)	Red	Red	Red	Red	Green	Red	Red	Red
Commodity	Stock/Watson (2013)	Yellow	White	White	White	White	White	White	White
Forex returns	Stock/Watson (2013)	White	White	White	White	White	White	White	White

Notes: GDP is gross domestic product; IND is industrial production; CON is consumption; EMP is non-farm payroll

This paper: A new variable:

Table: Implied volatility from Treasury markets works well

Variable	Paper	GDP	$\sigma(GDP)$	IND	$\sigma(IND)$	CON	$\sigma(CON)$	EMP	$\sigma(EMP)$
Term spread	Ang/Piazzesi (2003)	Green	Red	Green	Red	Green	Red	Green	Red
Stock returns	Schwert; Fama (1990)	Green	Red	Green	Red	Green	Red	Green	Red
VIX	Bekaert/Hoerova (2014)	Red	Green	Red	Green	Red	Green	Red	Red
Bond returns	Connolly/Stivers/Sun (2006)	Red	Red	Red	Red	Green	Red	Red	Red
Commodity	Stock/Watson (2013)	Yellow	White	White	White	White	White	White	White
Forex returns	Stock/Watson (2013)	White	White	White	White	White	White	White	White
YIV	THIS PAPER!	Green	Green	Green	Green	Green	Green	Green	Green

Notes: GDP is gross domestic product; IND is industrial production; CON is consumption; EMP is non-farm payroll

- Part I: Show YIV predicts level and volatility of real activity
- Part II: Investigate mechanism

YIV is a good candidate variable:

- Intuitive reason: Market for Treasury bonds and notes and related options and futures is largest / most liquid
- Theoretical reason: Models (Bansal / Zhou (2005); Ang / Bekaert (2002); Dai / Singleton (2002); Dai / Singleton / Yang (2007) etc.) suggest interest rate volatility varies over the business cycles
- Surprisingly limited research that uses interest rate uncertainty!

Getting IV for Treasuries:

- Options on T bonds and notes do not exist – Use options on Treasury futures
- Daily data on options on Treasury futures from CME
- Select close to at-the-money call and put options on 5-years futures contract
- Back out implied vol using Black (1976) commodity option pricing model
- Weighted average (by money-ness) of implied volatilities – Call it 5-year YIV
- 5-year YIV captures both interest rate uncertainty and variance risk premia (control for latter)

Summary statistics and correlations:

Table: 1, 2: Summary statistics and correlations.

	Mean	σ	Min	25 th	Median	75 th	Max	ρ
5-year YIV	3.38	1.17	1.37	2.71	3.12	3.67	9.21	0.71

	GDP	IND	CON	EMP	TRM	ΔSY	ITB	VIX	UNC
5-year YIV	-0.54***	-0.45***	-0.41***	-0.57***	0.18***	-0.12**	0.04	0.49***	0.12**

Notes: Summary statistics for the YIV; GDP is gross domestic product; IND is industrial production; CON is consumption; EMP is non-farm payroll; TRM is term spread; ΔSY is short-rate; ITB is Treasury bond returns; VIX is value-weighted stock returns; VIX is the CBOE Volatility Index; UNC Bloom/Baker/Davis (2015) uncertainty index; Monthly data except for GDP (quarterly); Monthly data, 1990 - 2015.

Empirical framework: Predictive regressions:

$$\sum_{j=1}^{j=H} \log(1 + \text{MACRO}_{i,t+j})/H = \alpha_H + \beta_H YIV + \text{Controls} + \epsilon_{t+H}$$

- Horizons of 1 - 36 months
- Newey-West / Hansen-Hodrick standard errors (1 - 36) lags
- Control for lags as well as standard predictor variables (term-spread, short rate, VIX, bond returns, stock returns, etc.)

YIV predicts real activity:

Table: 4, A3, A4, A5, A6: Predicting real activity: Coefficient on YIV

$H =$	12	18	24	30	36
GDP	-0.08*** (-3.61)	-0.07*** (-3.46)	-0.05*** (-3.83)	-0.05*** (-3.99)	-0.04*** (-3.72)
R^2	34.42	26.80	20.72	17.12	14.72
IND	-0.17*** (-2.90)	-0.12*** (-2.61)	-0.09*** (-2.66)	-0.06*** (-2.48)	-0.05** (-2.00)
R^2	32.13	20.47	11.75	7.20	4.87
CON	-0.09*** (-3.31)	-0.07*** (-3.19)	-0.06*** (-3.36)	-0.05*** (-3.52)	-0.05*** (-3.76)
R^2	34.48	27.76	21.63	17.58	16.11
EMP	-0.09*** (-6.25)	-0.08*** (-5.36)	-0.07*** (-4.97)	-0.05*** (-4.71)	-0.04*** (-4.06)
R^2	44.77	38.55	29.40	21.78	15.52

Notes: Dependent is year-on-year growth rate in the GDP, IND, CON, EMP; Controls include the term spread; changes in short-rate; Treasury bond returns; Corporate bonds returns; Stock index returns; CBOE Volatility Index; Economic uncertainty from Baker/Bloom/Davis (2015); Quarterly or monthly data, 1990 - 2016.

YIV predicts volatility of real activity:

Table: 5, A7, A8, A9, A10: Predicting GDP, IP, CON, EMP volatility: Coefficient on YIV

$H =$	12	18	24	30	36
GDP	0.25*** (2.95)	0.30*** (2.71)	0.30** (2.30)	0.26** (2.12)	0.20** (2.03)
R^2	25.35	26.99	27.45	29.19	30.60
IND	0.82*** (3.60)	1.06*** (3.31)	1.14*** (3.04)	1.02*** (2.84)	0.82*** (2.49)
R^2	36.33	34.29	31.41	23.86	16.21
CON	0.28*** (4.06)	0.33*** (3.37)	0.33*** (3.08)	0.30*** (2.90)	0.26*** (2.53)
R^2	30.69	25.53	20.34	16.58	13.10
EMP	0.22*** (5.04)	0.26*** (4.19)	0.29*** (3.74)	0.29*** (3.52)	0.27*** (3.13)
R^2	35.48	29.74	24.36	20.34	16.47

Notes: Dependent is year-on-year volatility of IP, CON, EMP; Quarterly or monthly data, 1990 - 2016.

Results robust to a battery of tests:

- Predict over short- and long-term
- Not driven by variance risk premia
- Using non-overlapping data
- Excluding financial crisis
- Out of sample forecasts

Obvious question: Why does this work so well?

YIV captures interest rate volatility (uncertainty) I:

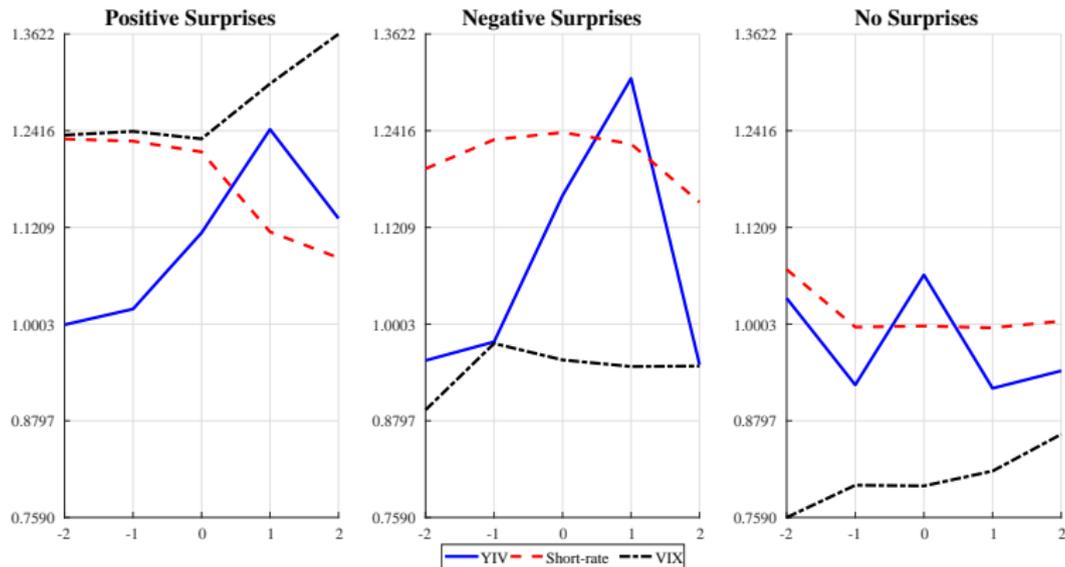
Table 3: Predicts interest rate volatility

$H =$	12	18	24	30	36
2-year rates	1.45** (1.98)	1.06* (1.75)	0.63 (0.84)	0.27 (0.29)	-0.26 (-0.23)
$R^2 - ord$	6.02	2.33	0.61	0.09	0.07
5-year rates	1.22*** (2.33)	1.11** (2.24)	1.02** (2.06)	1.34*** (2.43)	1.66*** (2.49)
$R^2 - ord$	8.01	6.01	4.71	7.43	10.08
10-year rates	0.63 (1.57)	0.66 (1.38)	0.72 (1.48)	1.17** (2.23)	1.73*** (3.20)
$R^2 - ord$	4.28	3.75	3.91	9.12	17.91

Notes: Dependent is realized future volatility of 2-, 5-, 10-year rates.

YIV captures interest rate volatility (uncertainty) II:

Figure 2: Response of YIV to monetary policy surprises



Notes: YIV, the short rate, and the term spread over a 5-day window around Fed's announcements regarding changes in the Federal Funds rate; Daily data, 1990 - 2016.

- YIV increases on both unexpected rate cuts and increases

Mechanism: YIV impacts real activity via bank balance sheets:

Figure: One possible mechanism



Bank centric view of interest rate risk:

- Banks' core activities deposits-taking and loans exposes their balance sheets to interest rate risk
- Banks cannot completely immunize themselves from interest rate uncertainty / risk
- Interest rate uncertainty impacts bank liabilities \rightarrow assets \rightarrow net worth \rightarrow real activity
- Drechsler/Savov/Schnabl (2017): Monetary policy affects real activity via bank deposits
- Haddad/Sraer (2017): Bank interest rate exposure forecasts bond returns

Support for our mechanism:

- Evidence 1: YIV forecasts lower (higher) demand (volatility) for deposits from banks
- Evidence 2: YIV forecasts cost of capital of banks
- Evidence 3: YIV forecasts level and volatility of bank credit
- Evidence 4: Stronger forecasts for banks more exposed to IR risk
- Evidence 5: YIV forecasts investment for bank dependent firms

Evidence 1: YIV and bank deposits:

Table: 6: Predicting bank deposits

$H =$	12	18	24	30	36
Bank deposit	-0.25*** (-3.31)	-0.27*** (-4.19)	-0.28*** (-4.70)	-0.28*** (-4.66)	-0.29*** (-4.36)
Bank deposit volatility	0.62*** (2.64)	0.45*** (2.68)	0.25* (1.64)	0.18 (0.98)	0.12 (0.62)

Notes: Dependent is bank deposit growth and bank deposit volatility; Monthly data, 1990 - 2016.

Evidence 2: YIV and bank cost of capital:

Table 7: Predicting bank cost of capital

$H =$	12	18	24	30	36
Libor-OIS spread	0.30** (2.00)	0.24* (1.82)	0.15 (0.99)	0.05 (0.28)	-0.07 (-0.29)
Bank $E[R]$	0.07 (1.06)	0.12 (1.39)	0.21* (1.87)	0.27** (2.06)	0.32** (2.25)

Notes: Dependent is Libor-OIS spread or dividend yield on bank stocks or dividend yield for stock market; Monthly data, 1990 - 2016.

Evidence 3: YIV and bank credit:

Table 8: Predicting bank credit

$H =$	12	18	24	30	36
Bank credit	-0.13*** (-3.07)	-0.14*** (-4.30)	-0.14*** (-4.42)	-0.14*** (-4.51)	-0.14*** (-5.06)
Bank credit volatility	0.61*** (7.02)	0.73*** (5.47)	0.60*** (4.75)	0.46*** (4.51)	0.33*** (3.52)

Notes: Dependent is bank credit growth and bank credit volatility; Monthly data, 1990 - 2016.

Evidence 4: YIV and bank credit by exposure to IR risk:

Table: 9: Predicting bank credit by exposure to interest rate risk

$H =$	12	18	24	30	36
Small banks, Low Exp.	-0.26*** (-2.79)	-0.28*** (-3.90)	-0.28*** (-4.40)	-0.28*** (-4.90)	-0.25*** (-4.16)
Small banks, High Exp.	-1.66** (-2.01)	-1.99** (-1.99)	-2.16** (-2.08)	-2.36** (-2.20)	-2.56** (-2.35)
Large banks, Low Exp.	-0.18 (-0.59)	-0.07 (-0.28)	-0.01 (-0.01)	-0.02 (-0.09)	0.01 (0.03)
Large banks, High Exp.	-0.31*** (-2.59)	-0.37*** (-2.76)	-0.39*** (-2.60)	-0.38*** (-2.46)	-0.35** (-2.16)

Notes: IR derivatives held for trading used to compute IR exposure (Purnanandam(2007)); Dependent is bank credit growth; Quarterly data, 1990 - 2016.

Evidence 5: YIV and investment growth:

Table 10: Predicting firm investment by bank dependence

$H =$	12	18	24	30	36
Bank dependent firms	-0.28* (-1.80)	-0.22 (-1.44)	-0.22 (-1.48)	-0.34* (-1.72)	-0.31* (-1.47)
Non-bank dependent firms	0.00 (0.00)	0.00 (0.01)	-0.01 (-0.14)	-0.03 (-0.37)	-0.05 (-0.48)

Notes: Dependent is capex growth; Quarterly data, 1990 - 2016.

- Interest rate uncertainty predicts aggregate capex (Mueller / Vedolin (2017))

Key results:

- I: A simple measure of uncertainty from Treasury derivatives markets predicts level and volatility of macroeconomic activity
- II: Over horizons of 1 - 36 months
- III: Robust to a variety of specifications

Contribution:

- Variable captures interest rate uncertainty
- Directly impacts balance sheet of banks
- Establish a link between time-varying uncertainty in US Treasury markets and balance sheet of banks that impacts real activity