The Stock-Bond Correlation: A Tale of Two Days in the U.S. Treasury Bond Market

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The Dual Role of U.S. Treasury in Global Markets

- U.S. Treasury Bonds: The deepest and single most important market in the world.
- As a destination of safety
 - ► Flights to safety (Baele, Bekaert, Inghelbrecht, and Wei 2019).
 - ▶ Global safety demand for UST (Jiang, Krishnamurthy, and Lustig 2023).
- As a source of risk
 - ▶ Interest rate risk 2013 taper tantrum and FOMC rate hikes.
 - ▶ Inflation risk 2021 inflation surge.
 - ▶ Dealer capacity risk 2020 dash for cash (Duffie, Jackson Hole 2023).
- While the notion of UST as the primary safe haven is widely accepted, concerns over its resilience have only begun in recent years.
 - ▶ A well functioning UST: important for global markets and essential for USA.
- Our paper: A measure to capture UST safety and, more importantly, its riskiness.

Part I: A Measure for Dual UST – Stock-Bond Correlation

• We use high-frequency SPX E-mini (SPX) and 10-Year T-Note (UST) futures to construct a daily stock-bond correlation measure. For day t,

$$\rho_t^{\mathsf{UST}} = \mathsf{corr}\left(R_{i,t}^{\mathsf{SPX}}, R_{i,t}^{\mathsf{UST}} \middle| i \in t\right),$$

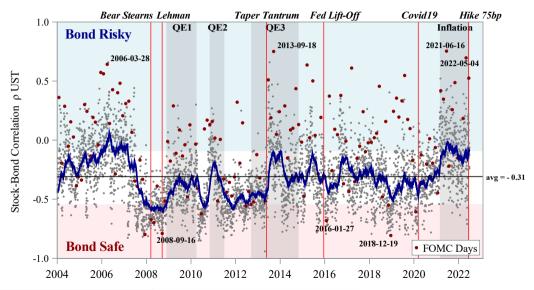
where $R_{i,t}^{\text{SPX}}$ and $R_{i,t}^{\text{UST}}$ are 5-minute SPX and UST returns realized on day t.

• Use ρ_t^{UST} to sort days into bond safety (lower 20%) and bond risky (upper 20%).

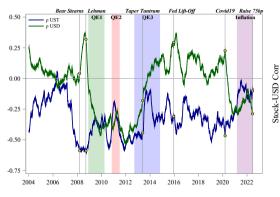
	mean	std	min	20%	median	80%	max
$ ho_t^{\sf UST}$	-0.31	0.26	-0.94	-0.54	-0.33	-0.10	0.75
			UST :	Safety		UST	Risky
$ ho_t^{\sf USD}$	-0.06	0.28	-0.77	-0.33	-0.04	0.18	0.75
			USD :	Safety		USD	Risky

• We further construct ρ_t^{USD} , ρ_t^{UST2Y} , and ρ_t^{UST3M} as alternative measures.

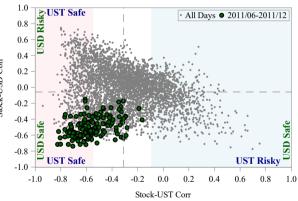
High-Frequency Stock-Bond Correlation ρ_t^{UST}



The Safety of UST vs. USD

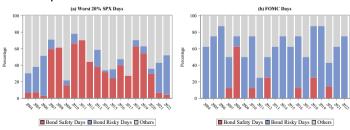


2011 European Debt Crisis



What is Captured by the Stock-Bond Correlation Measure ρ_t^{UST} ?

- Three states with diverging sources of risks:
 - S=1: SPX is the main source of risk, UST serving as the safe haven.
 - S=2: UST is the main source of risk (interest-rate, inflation, and liquidity).
 - \blacksquare S=3: other days.
- How UST comoves with SPX is indicative of its roles and the corresponding states
 - ho_t^{UST} informs the probability, $\mathsf{Prob}(S_t = i)$, of the states.
- An illustrative example:



Performance of Key Assets Under Dual UST

Bond	Safety D	ays (Lo	wer 20% c	of $\rho_t^{\sf UST})$
SPX	UST	DXY	EUR/USD	YEN/USE

	SPX	UST	DXY	EUR/USD	YEN/USD
Mean Return (bps)	-36.20***	13.60***	1.20	-2.08	15.83***
	[-8.04]	[9.57]	[0.63]	[-0.90]	[6.72]
CAPM α (bps)		5.03***	-0.89	0.96	6.11***
		[4.42]	[-0.49]	[0.44]	[3.13]
Δ Implied Vol (%)	0.51***	0.79***	0.07***	0.07***	0.14***
	[6.48]	[4.68]	[3.75]	[3.42]	[4.28]
Δ Volatility (%)	1.11***	-0.02			
	[4.22]	[-0.21]			
Δ Volume (std)	0.25***	0.15***			
	[7.29]	[5.22]			
Daily ETF Flow (\$m)	-162.85**	13.09***			
	[-2.04]	[2.61]			
Δ Net Position (std)		0.40**			
Primary Dealers		[2.07]			

- Sharp decline in SPX; significant rally in UST.
- Large spikes in implied vol across the board.
- Significant SPX outflow and UST inflow.
- Primary dealers increase net UST position.

Bond Risky Days (Upper 20% of ρ_t^{UST})

) - (- -	P	· rt)
	SPX	UST	DXY	EUR/USD	YEN/USD
Π	13.75***	-6.05***	2.14	-1.93	-8.29***
	[4.76]	[-3.92]	[1.22]	[-0.98]	[-4.16]
		-7.96***	3.61**	-4.99**	-9.97***
		[-4.92]	[2.06]	[-2.53]	[-5.06]
	-0.16***	-0.11	-0.03***	-0.03**	-0.04***
	[-4.12]	[-0.96]	[-3.13]	[-2.47]	[-3.04]
	-0.25**	0.28***			
	[-2.12]	[3.64]			
	-0.00	0.12***			
	[-0.12]	[3.97]			
	10.02	-6.26			
	[0.11]	[-1.03]			
		-0.60***			
		[-3.88]			

- UST: decline in price and increase in volatility.
- Increase in SPX and reduction in VIX.
- Increased trading volume in UST, but not in SPX.
- Primary dealers reduce net UST position.

Further Evidence: Global Assets Under Dual UST

ullet We use global asset returns to estimate the day-t stock and bond factors via

$$R_t^i - r_f = a_t + \beta_{i,t-1}^{\mathsf{S}} \, F_t^{\mathsf{Stock}} + \beta_{i,t-1}^{\mathsf{B}} \, F_t^{\mathsf{Bond}} + \epsilon_t^i \,,$$

where the factor loadings on stock (β^{S}) and bond (β^{B}) are estimated using daily asset returns over a 3-year rolling window.

• The daily returns of the extracted stock and bond factors in basis points,

	US. I	Equity	US. Fixed	Income	FX+Commodity		
	F^{Stock} F^{Bond}		$F^{\sf Stock}$	F^{Stock} F^{Bond}		F^{Bond}	
Bond Safety Days	-54.40***	22.95	-103.14***	17.12***	-43.27***	29.30***	
	[-6.70]	[1.61]	[-5.47]	[8.20]	[-3.57]	[3.27]	
Bond Risky Days	15.60***	-22.00***	47.34***	-7.52***	-1.41	-27.09***	
	[2.72]	[-2.69]	[3.46]	[-4.69]	[-0.14]	[-3.10]	
Other Days	12.77*** -12.24*		58.06***	-1.42	11.62*	-6.99	
	[3.09] [-1.78]		[6.07]	[-1.50]	[1.91]	[-1.56]	

Part II: A Tale of Two Days - Summary of Main Results

- On bond safety days, safety matters the most:
 - ▶ Global asset returns are determined by their relative safety, not fundamentals.
 - ▶ Treasury convenience yield widens, indicating increased demand for UST safety.
 - ▶ Significant reduction in UST term premium, driven by flights-to-safety.
 - ► The otherwise positive linkage between USD and UST breaks down the decrease in UST yield not accompanied by USD depreciation.
- On bond risky days, UST risk takes center stage:
 - ► Significant increase in UST term premium, driven by increased duration risk.
 - ▶ The positive linkage between USD and UST strengthens the increase in UST yield accompanied by double the appreciation of USD.
 - ▶ A stock+bond model outperforms the CAPM in explaining global asset returns.
 - ▶ UST is the source of risk: intraday UST return can predict SPX.

UST Safety – Widening of UST Convenience Yield

- UST basis is y_t^{UST} minus a currency-hedged synthetic government bond yield.
- Negative basis indicates UST convenience: lower funding cost for US government.
- Our result: it is the safety of UST, not USD, that drives the UST convenience.

		1-Year		5-Year				
	Δ UST Basis	Δ UST Basis (CIP Adj.)	Δ Swap Spread	ΔUST Basis	Δ UST Basis (CIP Adj.)	Δ Swap Spread		
UST Safety Days	-0.66***	-0.45***	-0.43***	-0.51***	-0.36***	-0.26***		
	[-3.51]	[-3.07]	[-3.01]	[-4.04]	[-3.36]	[-2.76]		
UST Risky Days	0.1	0.03	-0.06	-0.07	-0.05	-0.08		
	[0.93]	[0.35]	[-0.80]	[-0.74]	[-0.62]	[-1.26]		
USD Safety Days	0.23	0.21*	0.14	0.07	0.13	0.14*		
	[1.58]	[1.73]	[1.32]	[0.64]	[1.34]	[1.68]		
USD Risky Days	0.05 [0.37]	0.12	0.14 [1.56]	-0.03 [-0.24]	0.05 [0.57]	0.09 [1.23]		
Intercept	0.07	0.02	0.04	0.11*	0.05	0.03		
	[0.85]	[0.38]	[0.71]	[1.87]	[1.10]	[0.87]		
NOBS	4423	4423	4423	4428	4428	4428		
R2 (%)	0.55	0.37	0.4	0.47	0.29	0.31		

UST Safety – UST Basis Widening Unique to UST Safety

$$\Delta \text{UST Basis} = \overbrace{\Delta y^{\text{US}} - \underbrace{\Delta (y^{\text{FX}} - (f - s))}_{\text{Synthetic Treasury Yield}} = \underbrace{\Delta (y^{\text{US}} - y^{\text{FX}}) + \underbrace{\Delta (f - s)}_{\text{Hedging Cost}}}_{\text{Hedging Cost}}$$

Maturity: 1-Year			mposition #1	Decompos	ition #2					
	Δ UST Basis	Δy^{UST}	$\Delta(y^{FX} - (f - s))$	$\Delta(y^{UST} - y^{FX})$	$\Delta(f-s)$					
UST Safety Days	-0.51*** [-3.16]	-1.02*** [-5.97]	-0.51*** [-2.62]	-0.95*** [-5.77]	0.44** [2.33]					
Matched Days (without bond safety features)										
Matching Criterion	Δ UST Basis	$\Delta y^{\sf UST}$	Δy^{UST} $\Delta (y^{FX} - (f - s))$		$\Delta(f-s)$					
(1) by Δy^{UST}	-0.14	-1.02***	-0.88***	-0.95***	0.81***					
(2) by UST10Y Ret	[-0.93] 0.23*	[-6.17] -0.09	[-4.75] -0.33**	[-6.07] -0.11	[4.69] 0.34**					
(3) by SPX Ret	[1.81] -0.08	[-0.88] -0.34**	[-2.37] -0.25*	[-0.97] -0.29**	[2.53] 0.21					
(A) I. A) (IV	[-0.59]	[-2.57]	[-1.87]	[-2.20]	[1.55]					
(4) by ΔVIX	-0.07 [-0.57]	-0.04 [-0.40]	0.03 [0.22]	-0.06 [-0.55]	-0.01 [-0.09]					

Transmission of UST to USD

	USD Ret	urn (bps)
$\Delta y^{UST} \times UST Safety$		-1.39***
		[-2.79]
$\Delta y^{UST} imes UST$ Risky		1.89***
		[4.36]
Δy^{UST} (bps)	1.52***	1.16***
	[6.96]	[4.43]
$R^{SPX} imes UST$ Safety		0.04*
		[1.68]
$R^{SPX} imes UST$ Risky		-0.04
		[-1.57]
R^{SPX} (bps)	-0.09***	-0.08***
	[-7.65]	[-5.26]
UST Safety	-0.11	-0.83
	[-0.06]	[-0.41]
UST Risky	1.63	0.75
	[0.85]	[0.38]
Intercept	0.36	0.27
	[0.42]	[0.31]
NOBS	4604	4604
R2 (%)	4.97	6.46

- USD appreciates when UST yield increases.
 - ightharpoonup 1 bps increase in $y^{\rm UST}$ leads to 1.52 bps increase in USD return.
- On UST safety days, this transmission breaks down.
 - Reductions in UST yield due to flights-to-safety do not translate to USD depreciation.
- On UST risky days, this transmission more than doubles.
 - Increase in UST yield due to heightened risk in UST leads to amplified USD appreciation.

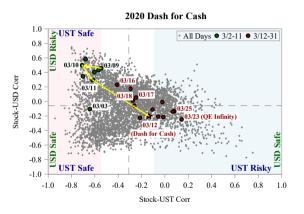
UST Term Premium

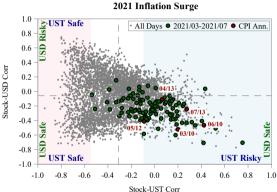
	Panel	A: Adrian,	Crump, an	d Moench	(2013)		Panel B: K	im and Wr	ight (2005)	
	(1)	(2)	(3)	(4)	(5)	(1)	(2)	(3)	(4)	(5)
UST Safety Days	-0.99***	-0.82***	-0.99***	-0.59***	-0.63***	-0.84***	-0.63***	-0.84***	-0.58***	-0.51***
UST Risky Days	[-4.71] 0.45** [2.31]	[-3.78] 0.44** [2.22]	[-4.72] 0.50** [2.55]	[-2.91] 0.45** [2.28]	[-2.94] 0.53*** [2.74]	[-8.06] 0.37*** [3.40]	[-5.52] 0.35*** [3.20]	[-8.05] 0.41*** [3.74]	[-5.64] 0.36*** [3.17]	[-4.74] 0.42*** [3.79]
FTS by Baele et al. (2019)	[2.51]	-1.97* [-1.82]	[2.55]	[2.20]	-0.81 [-0.82]	[5.40]	-2.38*** [-7.52]	[5.74]	[5:17]	-1.64*** [-5.18]
FOMC			-0.61 [-1.11]		-0.90* [-1.67]			-0.46 [-1.53]		-0.51* [-1.74]
SPX worst 20%				-1.60*** [-5.60]	-1.70*** [-6.50]				-1.13*** [-8.90]	-1.05*** [-8.46]
SPX best 20%				1.97***	1.88***				0.86***	0.80***
VIX top 20%				[]	0.32				[]	0.14
VIX bottom 20%					-0.30** [-2.03]					-0.21** [-2.33]
$\Delta Noise$					1.63*** [2.99]					0.14
Δ TYF Vol					0.00 [0.09]					-0.01 [-0.48]
Intercept	0.06	0.08 [0.77]	0.07 [0.71]	-0.10 [-1.00]	-0.02 [-0.19]	0.07 [1.22]	0.09 [1.59]	0.07 [1.38]	0.07 [1.26]	0.11
NOBS R2 (%)	4570 0.81	4570 1.13	4570 0.86	4570 5.3	4557 5.99	4570 2.42	4570 4.36	4570 2.51	4570 8.23	4557 9.23

Part III: A Unique Measure of UST Riskiness – Summary of Results

- ullet We document significantly higher stock-bond correlation $ho_t^{ extsf{UST}}$ under increased
 - ▶ Interest-rate risk: releases of FOMC decisions and minutes.
 - ▶ Dealer capacity risk: quarter ends and increased issuance of 10Y UST notes.
- ullet Captured by $ho_t^{ ext{UST}}$ are prominent examples when UST becomes a source of risk:
 - ▶ 2013 taper tantrum interest rate risk.
 - 2020 dash for cash lack of UST resilience.
 - ▶ 2021 inflation surge inflation risk.
 - ▶ 2022 rate hikes interest rate risk.
- By contrast, existing measures of market risk (e.g., VIX, MOVE, and HPW Noise) are not designed specifically to capture the UST riskiness.

UST Riskiness – Prominent Episodes Captured by ρ_t^{UST}





UST Riskiness – Interest Rate Risk

	N	$\Delta ho^{\sf UST}$	ΔVIX	Δ MOVE	Δ Noise	ΔVol^UST	$\Delta {\sf Vol}^{\sf SPX}$
			(%)		(bps)	(%)	(%)
FOMC Announcement Days	147	0.30***	-0.52***	-2.30***	0.07***	2.19***	2.66***
		[10.18]	[-3.26]	[-6.63]	[2.92]	[6.53]	[5.60]
rate hike	29	0.30***	-0.66**	-2.26***	0.10*	2.43***	2.94***
		[5.63]	[-2.13]	[-3.83]	[1.72]	[6.75]	[2.72]
rate unchanged	107	0.31***	-0.42**	-1.83***	0.06**	2.09***	2.17***
		[9.64]	[-2.28]	[-5.35]	[2.26]	[5.01]	[3.95]
rate cut	11	0.18*	-1.19	-6.91***	0.11**	2.57***	6.66***
		[1.74]	[-1.31]	[-2.89]	[2.16]	[5.08]	[4.15]
FOMC Minutes Release	146	0.10***	-0.09	0.18	-0.03	0.44**	0.07
		[3.39]	[-0.99]	[0.78]	[-1.34]	[2.24]	[0.15]
rate hike	28	0.06	-0.17	0.45	-0.06	0.79**	0.33
		[1.14]	[-1.33]	[0.90]	[-0.94]	[2.25]	[0.38]
rate unchanged	107	0.13***	-0.09	0.18	-0.02	0.42*	-0.14
		[3.90]	[-0.86]	[0.75]	[-1.07]	[1.76]	[-0.21]
rate cut	11	-0.12***	0.06	-0.42	0.00	-0.27	1.55
		[-4.68]	[80.0]	[-0.25]	[0.09]	[-0.25]	[1.40]

UST Riskiness – Dealer Capacity

	N	Δho^{UST}	Δ VIX	Δ MOVE	Δ Noise	ΔVol^UST	ΔVol^SPX
			(%)		(bps)	(%)	(%)
Quarter End	74	0.04**	-0.17	0.27	0.04	0.10	-0.96
		[1.97]	[-0.83]	[1.11]	[0.98]	[0.30]	[-1.10]
post Volcker Rule	28	0.09***	-0.50**	-0.09	0.08	-0.08	0.49
		[2.98]	[-1.98]	[-0.19]	[1.13]	[-0.28]	[0.56]
Month End (ex. Qtr End)	148	0.03*	0.40***	0.59**	0.05**	1.92***	0.42
		[1.84]	[3.77]	[2.28]	[2.46]	[3.63]	[0.64]
post Volcker Rule	56	0.06*	0.50***	0.87**	0.03	0.15	0.60
		[1.89]	[2.68]	[2.12]	[1.23]	[0.22]	[0.93]
10Y UST Auctions	74	0.00	0.32	-0.12	-0.03	0.32	-0.53
		[0.22]	[1.19]	[-0.27]	[-0.88]	[1.05]	[-0.58]
with Increased Off. Amt.	14	0.13***	0.06	-1.37	-0.16	-0.75	-6.18*
		[2.64]	[0.11]	[-1.09]	[-1.62]	[-1.40]	[-1.86]
post Volcker Rule	7	0.22**	-0.13	-0.69	0.02	-0.87	-9.59
		[2.56]	[-0.14]	[-1.27]	[0.88]	[-1.00]	[-1.60]

UST Riskiness – UST Leading SPX in Intraday Pricing

	Bond Ris	sky Days	Othe	r Days	Full S	Sample
	$R^{SPX}_{i+1,t}$	$R_{i+1,t}^{SPX} = R_{i+1,t}^{UST} = R_{i+1,t}^{SPX} = R_{i+1,t}^{UST}$		$R_{i+1,t}^{UST}$	$R_{i+1,t}^{SPX}$	$R_{i+1,t}^{UST}$
$R_{i,t}^{SPX}$	-0.03**	0.01	-0.02**	-0.01***	-0.02**	-0.01***
,	[-2.58]	[1.63]	[-2.29]	[-7.91]	[-2.38]	[-4.26]
$R_{i,t}^{UST}$	0.15***	-0.03**	-0.01	-0.08***	0.03	-0.06***
-,-	[2.65]	[-2.05]	[-0.40]	[-11.54]	[1.46]	[-7.56]
Intercept	0.08**	-0.03**	-0.01	0.02***	0.01	0.01*
	[2.51]	[-2.33]	[-0.42]	[2.87]	[0.29]	[1.84]
NOBS	70,147	69,992	283,174	282,891	353,331	352,893
R2 (%)	0.39	0.11	0.04	0.50	0.05	0.34

- On UST risky days, UST is the source of risk, and can positively predict SPX.
- On other days, SPX negatively predicts UST, not vice versa.

Conclusions

- Our stock-bond correlation measure is effective in capturing not only UST safety, but, more importantly, its riskiness, and with *opposite signals*.
- UST Safety days with highly negative stock-bond correlation
 - ▶ Alignment of global asset returns by their relative safety, not fundamentals.
 - ▶ Widening of UST convenience yield due to UST (not USD) safety.
- UST Riskiness days with high stock-bond correlation
 - ▶ UST dominated by interest rate risk, inflation risk, and dealer capacity risk.
- The unique importance of our measure amid increasing concerns over UST:
 - ▶ Steady decline of dealer capacity to UST outstanding since 2007.
 - Persistent fiscal deficits leading to further growth of UST outstanding.
 - ▶ Trump's campaign promises that are inflationary: taxes, tariffs, labor, the Fed.