Excess Volatility from Increasing Overreaction

Daniele d'Arienzo

Bocconi University - Harvard University

Sloan-Nomis Workshop

February 21, 2019

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 1 / 15

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

Excess volatility and Beliefs

Conclusions

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 2 / 15

• Shiller (1981): excessively volatile prices. Due to beliefs?

Excess Volatility from Increasing Overreaction

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ - 三 - のへぐ

- Shiller (1981): excessively volatile prices. Due to beliefs? **Issue**:
 - a constant discount rate is assumed: discount rates movements or excess beliefs movements?

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

- Shiller (1981): excessively volatile prices. Due to beliefs? **Issue**:
 - a constant discount rate is assumed: discount rates movements or excess beliefs movements?
- Giglio and Kelly (2018): excessively volatile prices of long term claims relative to short term ones

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

▲□▶ ▲圖▶ ▲匡▶ ▲匡▶ ― 匡 … のへで

- Shiller (1981): excessively volatile prices. Due to beliefs? **Issue**:
 - a constant discount rate is assumed: discount rates movements or excess beliefs movements?
- Giglio and Kelly (2018): excessively volatile prices of long term claims relative to short term ones
 - beyond discount rates

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

• A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*

Excess Volatility from Increasing Overreaction

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ - 三 - のへぐ

▲□▶ ▲□▶ ▲□▶ ▲□▶ = □ - つへで

February 21, 2019

4 / 15

Preliminaries

- A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*
- $P_{t,m} := price$ of a ZCB with maturity m at time t

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

- A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*
- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t

Excess Volatility from Increasing Overreaction

- A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*
- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t
- Yield curve at time $t: \{y_{t,m}\}_{m \ge 1}$

▲□▶ ▲□▶ ▲三▶ ▲三▶ 三三 のへで

- A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*
- *P_{t,m}* := *price* of a ZCB with maturity *m* at time *t*

•
$$y_{t,m} := -\frac{\log P_{t,m}}{m}$$
 bond's yield to maturity m at time t

- Yield curve at time $t: \{y_{t,m}\}_{m \ge 1}$
- Rational Expectations impose constraints across maturities

$$P_{t,m} = \mathbb{E}_t^{\mathbb{Q}} \left[P_{t+1,m-1} \right] = \mathbb{E}_t^{\mathbb{Q}} \left[\mathbb{E}_{t+1}^{\mathbb{Q}} \left[P_{t+2,m-2} \right] \right] = \dots$$

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 4 / 15

- A zero coupon bond (ZCB) with *maturity m* at time *t* pays 1\$ at time *t* + *m*
- *P_{t,m}* := *price* of a ZCB with maturity *m* at time *t*

•
$$y_{t,m} := -\frac{\log P_{t,m}}{m}$$
 bond's yield to maturity m at time t

- Yield curve at time $t: \{y_{t,m}\}_{m \ge 1}$
- Rational Expectations impose constraints across maturities

$$P_{t,m} = \mathbb{E}_t^{\mathbb{Q}} \left[P_{t+1,m-1} \right] = \mathbb{E}_t^{\mathbb{Q}} \left[\mathbb{E}_{t+1}^{\mathbb{Q}} \left[P_{t+2,m-2} \right] \right] = \dots$$

Long maturity yields ≈ Expected future short maturity yields

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 4 / 15

Giglio and Kelly (2018): US Treasury Bonds



Research Question

Do beliefs account for excessively volatile long rates?

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 6 / 15

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

▲□▶ ▲□▶ ▲□▶ ▲□▶ = □ - つへで

February 21, 2019

6 / 15

Research Question

Do beliefs account for excessively volatile long rates?

1. Survey data suggest that over-reaction increases with maturity

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

Do beliefs account for excessively volatile long rates?

1. Survey data suggest that over-reaction increases with maturity

2. Recovered beliefs from prices (via Ross Recovery Theorem)

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

<ロト < 同ト < 回ト < 回ト = 三日 - 三日 -

Do beliefs account for excessively volatile long rates?

- 1. Survey data suggest that over-reaction increases with maturity
- 2. Recovered beliefs from prices (via Ross Recovery Theorem)
 - confirm increasing over-reaction

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

Do beliefs account for excessively volatile long rates?

- 1. Survey data suggest that over-reaction increases with maturity
- 2. Recovered beliefs from prices (via Ross Recovery Theorem)
 - confirm increasing over-reaction
 - are strongly correlated with survey data

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

Do beliefs account for excessively volatile long rates?

- 1. Survey data suggest that over-reaction increases with maturity
- 2. Recovered beliefs from prices (via Ross Recovery Theorem)
 - confirm increasing over-reaction
 - are strongly correlated with survey data
- 3. Explain increasing over-reaction *and* excess volatility with a model of diagnostic expectations

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 6 / 15

▲□▶ ▲□▶ ▲□▶ ▲□▶ = □ - ○○○

Do beliefs account for excessively volatile long rates?

- 1. Survey data suggest that over-reaction increases with maturity
- 2. Recovered beliefs from prices (via Ross Recovery Theorem)
 - confirm increasing over-reaction
 - are strongly correlated with survey data
- 3. Explain increasing over-reaction *and* excess volatility with a model of diagnostic expectations
 - key ingredient: agents over-react more in more volatile environments

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 6 / 15

Excess volatility and Beliefs

Conclusions

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 7 / 15

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ - 三 - のへぐ

February 21, 2019 8 / 15

Testing for Rational Expectation

- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t
- Forecast error $FE_{t+1}^m := y_{t+1,m} \hat{y}_{t+1|t,m}$, where $\hat{y}_{t+1|t,m}$:

▲□▶ ▲□▶ ▲三▶ ▲三▶ 三三 のへで

- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t
- Forecast error $FE_{t+1}^m := y_{t+1,m} \hat{y}_{t+1|t,m}$, where $\hat{y}_{t+1|t,m}$:
 - directly observed for survey data; or

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ - 三 - のへぐ

- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t
- Forecast error $FE_{t+1}^m := y_{t+1,m} \hat{y}_{t+1|t,m}$, where $\hat{y}_{t+1|t,m}$:
 - directly observed for survey data; or
 - inferred from prices (Ross Recovery Theorem)

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ - 三 - のへぐ

- $P_{t,m} := price$ of a ZCB with maturity m at time t
- $y_{t,m} := -\frac{\log P_{t,m}}{m}$ bond's yield to maturity m at time t
- Forecast error $FE_{t+1}^m := y_{t+1,m} \hat{y}_{t+1|t,m}$, where $\hat{y}_{t+1|t,m}$:
 - directly observed for survey data; or
 - inferred from prices (Ross Recovery Theorem)
- Forecast revision $FR_t^m := \hat{y}_{t+1|t,m} \hat{y}_{t+1|t-1,m}$

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 8 / 15

・ロト ・ 同ト ・ ヨト ・ ヨー ・ つへの

Testing Under/Over-reaction to Information

Coibion and Gorodnichenko (2015) regression: $FE_{t+1}^m = a_m + b_m FR_t^m + \epsilon_{t+1}^m$

- $b_m > 0$: under-reaction to information
- $b_m < 0$: over-reaction to information

Testing Under/Over-reaction to Information

Coibion and Gorodnichenko (2015) regression: $FE_{t+1}^m = a_m + b_m FR_t^m + \epsilon_{t+1}^m$

- $b_m > 0$: under-reaction to information
- $b_m < 0$: over-reaction to information



- both survey and recovered forecast exhibit increasing over-reaction
- recovered beliefs display under-reaction at short end, over-reaction at long end

イロト イボト イヨト イヨト 二日

Survey Data and Ross Recovered Beliefs

- survey data and recovered beliefs are strongly correlated
- departures at short maturities: heterogeneity?



э

(4) (E) (4) (E)

< (10 b)

Diagnostic Expectations

Empirical facts

- excess volatility
- increasing over-reaction

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

Diagnostic Expectations

Empirical facts

- excess volatility
- increasing over-reaction

Modeling Asset Prices and Beliefs

• One factor drives the yield curve dynamics $X_{t+1}|X_t \stackrel{\mathbb{Q}}{\sim} \mathcal{N}(\rho X_t, \sigma^{\mathbb{Q}})$

Diagnostic Expectations

Empirical facts

- excess volatility
- increasing over-reaction

Modeling Asset Prices and Beliefs

- One factor drives the yield curve dynamics $X_{t+1}|X_t \stackrel{\mathbb{Q}}{\sim} \mathcal{N}(\rho X_t, \sigma^{\mathbb{Q}})$
- Diagnostic Expectations. Based on the representativeness heuristics (Bordalo, Gennaioli and Shleifer (2017))

11 / 15

Diagnostic Expectations

Empirical facts

- excess volatility
- increasing over-reaction

Modeling Asset Prices and Beliefs

- One factor drives the yield curve dynamics $X_{t+1}|X_t \stackrel{\mathbb{Q}}{\sim} \mathcal{N}(\rho X_t, \sigma^{\mathbb{Q}})$
- Diagnostic Expectations. Based on the representativeness heuristics (Bordalo, Gennaioli and Shleifer (2017))

Representativeness $\underbrace{\mathbb{Q}^{\theta}(X_{t+1}|X_t)}_{\mathbb{Q}^{\theta}(X_{t+1}|X_t)} \quad \propto \quad \underbrace{\mathbb{Q}(X_{t+1}|X_t)}_{\mathbb{Q}(X_{t+1}|X_t)} \quad \left(\frac{\mathbb{Q}(X_{t+1}|X_t)}{\mathbb{Q}(X_{t+1}|X_t)}\right)$ Diagnostic Probability Objective Probability イロト イポト イヨト イヨト - 3 Daniele d'Arienzo Excess Volatility from Increasing Overreaction February 21, 2019

• Under Rational Expectations:

$$y_{t,m} = a_m + \left(1 + \rho + \dots + \rho^{m-1}\right) X_t$$

Daniele d'Arienzo

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

• Under Rational Expectations:

$$y_{t,m} = a_m + \left(1 + \rho + \dots + \rho^{m-1}\right) X_t$$

$$\frac{\mathbb{V}^{\mathbb{Q}}\left[y_{t,m}\right]}{\mathbb{V}^{\mathbb{Q}}\left[y_{t,1}\right]} = \left(\frac{1-\rho^{m}}{1-\rho}\right)^{2}$$

Daniele d'Arienzo

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

• Under Rational Expectations:

$$y_{t,m} = a_m + \left(1 + \rho + \dots + \rho^{m-1}\right) X_t$$

$$\frac{\mathbb{V}^{\mathbb{Q}}\left[y_{t,m}\right]}{\mathbb{V}^{\mathbb{Q}}\left[y_{t,1}\right]} = \left(\frac{1-\rho^{m}}{1-\rho}\right)^{2}$$

• Under Diagnostic Expectations:

$$y_{t,m} = a_m^{\theta} + \frac{1+\theta}{1+\theta-\theta\left(\frac{\sigma_m^{\mathbb{Q}}}{\sigma_m^{\mathbb{Q}}}\right)^2} \left(1+\rho+\dots+\rho^{m-1}\right) X_t$$

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 12 / 15

• Under Rational Expectations:

$$y_{t,m} = a_m + \left(1 + \rho + \dots + \rho^{m-1}\right) X_t$$

$$\frac{\mathbb{V}^{\mathbb{Q}}\left[y_{t,m}\right]}{\mathbb{V}^{\mathbb{Q}}\left[y_{t,1}\right]} = \left(\frac{1-\rho^{m}}{1-\rho}\right)^{2}$$

• Under Diagnostic Expectations:

$$y_{t,m} = a_m^{\theta} + \frac{1+\theta}{1+\theta-\theta\left(\frac{\sigma_m^{\mathbb{Q}}}{\sigma_\infty^{\mathbb{Q}}}\right)^2} \left(1+\rho+\dots+\rho^{m-1}\right) X_t$$

$$\frac{\mathbb{V}^{\mathbb{Q}^{\theta}}\left[y_{t,m}\right]}{\mathbb{V}^{\mathbb{Q}^{\theta}}\left[y_{t,1}\right]} = \left(\frac{1+\theta}{1+\theta-\theta\left(\frac{\sigma_{m}^{\mathbb{Q}}}{\sigma_{\infty}^{\mathbb{Q}}}\right)^{2}}\right)^{2} \left(\frac{1-\rho^{m}}{1-\rho}\right)^{2}$$

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 12 / 15

э

Excess Volatility: Affine Three Factor Model



Excess volatility and Beliefs

Conclusions

Daniele d'Arienzo

Excess Volatility from Increasing Overreaction

February 21, 2019 14 / 15

イロト イロト イヨト イヨト 三日

• Prices of long term claims are excessively volatile relatively to short term claims

Excess Volatility from Increasing Overreaction

▲ロ ▶ ▲周 ▶ ▲ 国 ▶ ▲ 国 ▶ ● の Q @

- Prices of long term claims are excessively volatile relatively to short term claims
- Both survey data and beliefs retrieved from Ross recovery theorem exhibit increasing overreaction

- Prices of long term claims are excessively volatile relatively to short term claims
- Both survey data and beliefs retrieved from Ross recovery theorem exhibit increasing overreaction
- Rationalize both increasing over-reaction and excess volatility within diagnostic expectations. Key ingredient: agents over-react more in more volatile environments