

## TESTING THE LONG-RUN RISK MODEL: A KALMAN FILTER APPROACH

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T K f L -R R B (2004)  
 M L  
 f -  
 f f . I  
 - M L 70 f  
 , L -R R  
 US . H , f  
 f .  
 Ke d : E ; - ; K f .

### 1. Introduction

D ,  
 -f<sup>1</sup> M P (1985)  
 f , . , ff f -  
 - f f 6%  
 -f . A  
 (RRA) (> 50)  
 6% U.S . S  
 -f ,

<sup>‡</sup>C  
<sup>1</sup>P C (2017) f

-f W (1989). T, f  
f - S D F (SDF)  
, . . ,  
H -J (H J , 1991) B ,  
( > 250).  
M f M P (1985)  
f ff . S E Z  
(1989), C C (1999), B (2004), B (2006),  
. E Z (1989) f f -  
f f , - ,  
f f - (EIS)  
. W E Z (E Z , 1989, 1991) -  
f , -  
6%  
-f , EIS E Z  
f . T , E Z f -f , . . ,  
-f ,  
B (2004) .  
(LRR)  
. T f LRR  
. F f E Z f ,  
f -  
. T f ,  
( “L -  
R ”). W , . . , f -  
1.5 10, LRR  
f US . H , -  
. F , f -  
. I  
AR(1) f AR(1) ( (   
ff  $\rho = 0.98$  )  
 $\sigma$  ). S , f  
. I ,  
- f f -  
f f - . S  
- f ,  
f -  
K f . T - f  
f f f

. W M -H  
f f ML .  
T K f f ,  
f f . F , B  
N (1999) K f  
G f  
(2000) K f -f . S S  
f f . P H (1990) f - -  
f K f .

$\mu_c$   $\mathbf{f}$   $\mathbf{f}$   $\sigma_c, \sigma$   $\mathbf{f}$   
 $\varepsilon_t$   $\varepsilon_t^c$   $\mathbf{f}$  *i.i.d.*  $\mathbf{f}$   $\mathbf{T}$   
 $\mathbf{f}$   $\mathbf{T}$   $\mathbf{f}$   $\mathbf{f}$   $\mathbf{f}$   
 $\mathbf{f}$   $\mathbf{f}$   $\mathbf{f}$   $\mathbf{f}$   
 B (2004). W  
 B (2004) , ,

$$\iota_t = \frac{\beta}{1-\beta} \left( \mu_c + (1-\gamma) \left( \frac{\sigma_c^2}{2} + \frac{\beta^2}{2(1-\beta\rho)^2} \sigma^2 \right) \right) + \varsigma_t + \frac{\beta}{1-\beta\rho} \iota_t. \tag{6}$$

$$\begin{aligned} \text{O} \qquad \text{SDF } M_{t+1} \\ M_{t+1} = \beta \left( \frac{C_{t+1}}{C_t} \right)^{-1} \left[ \frac{[(1-\gamma) \iota_{t+1}]}{E_t [ - ((1-\gamma) \iota_{t+1})]} \right], \end{aligned} \tag{7}$$

$\mathbf{f} \varsigma_{t+1} \quad \iota_{t+1} \quad \mathbf{f} \quad :$

$$\begin{aligned} \iota_{t+1} = \quad & \beta - (\mu_c + \iota_t) - \frac{1}{2} (1-\gamma)^2 \left( \sigma_c^2 + \left( \frac{\beta\sigma}{1-\beta\rho} \right)^2 \right) \\ & + (1-\gamma) \frac{\beta\sigma}{1-\beta\rho} \varepsilon_{t+1} - \gamma \sigma_c \varepsilon_{t+1}^c. \end{aligned} \tag{8}$$

$$\text{I} \qquad \qquad \qquad 3$$

$$E(M_{t+1}) = \beta \quad \left( -\mu_c + \left( \gamma - \frac{1}{2} \right) \sigma_c^2 + \frac{\sigma^2}{2(1-\rho^2)} \right), \tag{9}$$

$$\sigma_{M_{t+1}} = E(M_{t+1}) \cdot \sqrt{\left( \frac{\sigma^2}{1-\rho^2} + (\gamma\sigma_c)^2 + \left( \frac{(1-\gamma)\beta\sigma}{1-\beta\rho} \right)^2 \right) - 1}. \tag{10}$$

### 3. Data and Model Performance

T  $\mathbf{W}$  US  
 - ,  
 S&P 500 3- T  $\mathbf{f}$  F  
 R E D (FRED)  $\mathbf{T}$  R  $\mathbf{f}$  , -

6 F -F f . A  
f 1948Q2 2011Q3.  
G , H -J f SDF  
( ) ( ) f f , ( )  
( ) 6 F -F P f (F F , 1989). A F . 1,  
f SDF. SDF  
f .

Case I: CRRA. If CRRA f , SDF  
f f

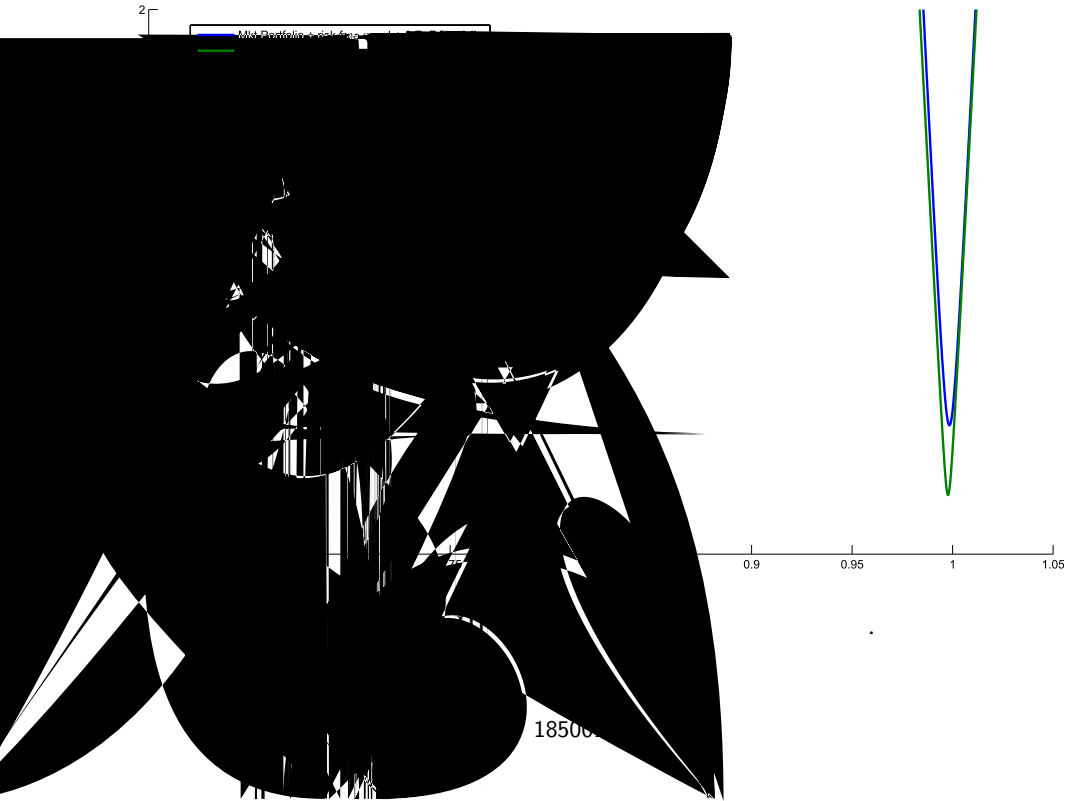
$$M_{t+1} = \beta \left( \frac{C_{t+1}}{C_t} \right)^{-\gamma}.$$
 (11)

B  $C_t$  f f

$$c_{t+1} = c_t + \mu_c + \sigma_c \varepsilon_{t+1}^c, \quad \varepsilon_{t+1}^c \sim i.i.d. \text{ N } (0, 1),$$
 (12)

$$E(M_{t+1}) = \beta \left[ -\gamma \mu_c + \frac{1}{2} (\gamma \sigma_c)^2 \right],$$
 (13)

$$V(M_{t+1}) = E(M_{t+1}) \cdot \sqrt{(\gamma^2 \sigma_c^2) - 1}.$$

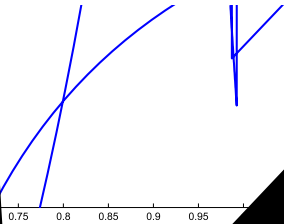


T 1. P .

M				
V	P ( )			P ( )
	CRRA	E	Z	L -
$\beta$		0.995		0.995
$\mu_c$		0.0042		0.0042
$\sigma_c$		0.0062		0.0062
$\rho$		—		0.98
$\sigma$		—		0.00062

None: T f  
T f  $\beta$  0.995 f  
F CRRA f E Z  
f ,  $\mu_c$   $\sigma_c$  f E . (12)  
P ( ). P ( )  
f L - . W f B  
(2004) f  $\rho$   $\sigma$  .

$\mu_c$   $\sigma_c^2$  f , T  
f  $M_{t+1}$  f ff  $\gamma$   
CRRA f . I  
f H -J B ,  
220. A  $\gamma$



(Hall and Jones, 1997)),  
(1985). The RRA is  $\gamma$  times the CRRA. The RRA is 6%.

**Case II: Epstein-Zin.** If  $\eta = 1$ , the SDF

$$E(M_{t+1}) = \beta \left[ -\mu_c + \sigma_c^2 \left( \gamma - \frac{1}{2} \right) \right], \tag{14}$$
$$\sigma_{M_{t+1}} = E(M_{t+1}) \cdot \sqrt{(\gamma^2 \sigma_c^2) - 1}.$$

Since  $\mu_c = \sigma_c^2 \gamma$ , the SDF is  $E(M_{t+1}) = \beta \gamma$ . The RRA is  $\gamma$  times the CRRA. The RRA is 85%.

**Case III: Long-Run risk.** The SDF is  $E(M_{t+1}) = \beta \gamma$ . The RRA is  $\gamma$  times the CRRA. The RRA is 39%.

4. Estimation of the Long-Run Risk Component

As shown in (1), the SDF is  $E(M_{t+1}) = \beta \gamma$ . The RRA is  $\gamma$  times the CRRA. The RRA is 39%.

<sup>4</sup>See A and B for details.

$$\rho \quad \sigma$$



T	MLE	fLRR	f
N	M	E	
$\mu_c$	0.004274	0.004239	0.003894
$\sigma_c$	0.004628	0.004999	0.005185
$\rho$	0.741086	0.90	0.98
$\sigma$	0.002719	0.001826	0.001422

Note: T LRR f T f

f  $\rho \in [0.9, 1)$ . I , f  $\rho \in [0.98, 1)$ .

MLE f f f K F E . (18). T

f f T 2. I  $\hat{\mu}_c$  0.004215,

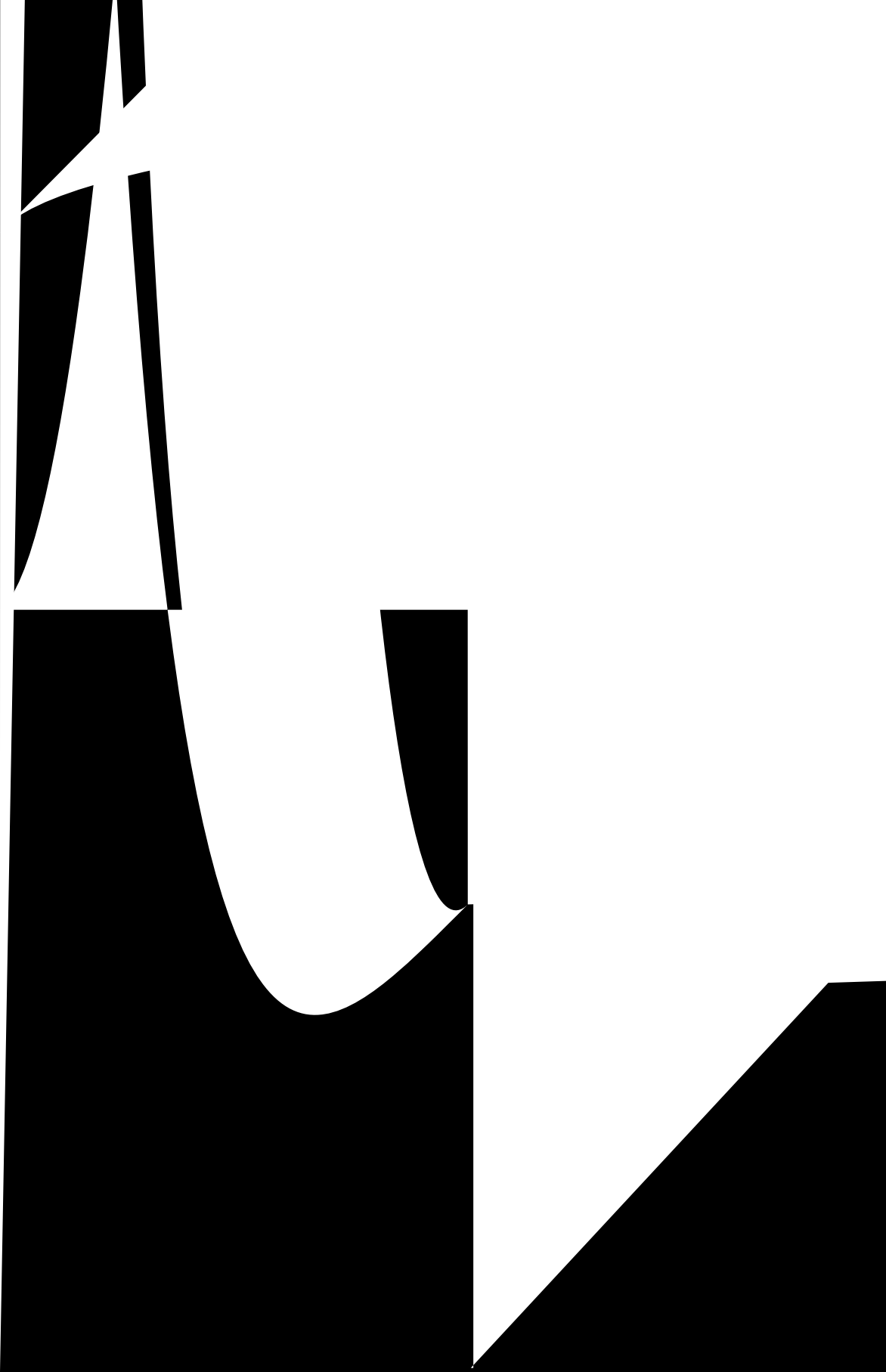
f  $\hat{\sigma} \simeq \frac{\hat{\sigma}_c}{2}$ . T . I E . (18),  $\sigma \simeq \frac{\sigma_c}{10}$  MLE  $\hat{\sigma}_c$   $\hat{\sigma}$  f , f

T -  $\hat{\rho} = 0.741$  f f f . O f f , E . (5), (2004) B f (PDF) f W

ML M -H . I f 50,000 PDF f f F . 3. T

$\sigma_c$ ,  $\mu_c$  . A PDF f  $\sigma$  MLE,  $\mu_c, \sigma_c, \sigma$  f . I f  $\rho$ . T f f MLE f  $\rho$  (0.72, 0.8). B , f  $\rho$  f (2004) ,

0.9 ). W  $\rho$  0.98 ( f  $\sigma_c$   $\sigma$







$$\frac{f}{f} = \frac{P}{LRR} \quad (B) \quad \frac{f}{f} = F \quad . \quad 2, \quad \frac{f}{f}$$

## 5. Conclusion

I , K F M L  
 $\frac{f}{f}$  - B (2004).  
 W  $\rho$   
 $\frac{f}{f}$  LRR . T  $\frac{f}{f}$  -  
 $\rho$ . U , -  
 $\frac{f}{f} \sigma_c$   $\sigma$   $\frac{f}{f}$  M -H  $\frac{f}{f}$   
 $\sigma = \sigma_c$ ,  
 . A , , LRR  
 70  $\frac{f}{f}$  US . M  
 $\frac{f}{f}$  -  
 B (2004) . H ,  
 $\frac{f}{f}$  .

## Acknowledgments

T C P S F (G  
 N . 2018M641302).

## Appendix A. Value Function

G E . (3)  $\frac{f}{f} = k_0 + k_1 q_t + k_2 \varepsilon_t$ ,  $k_0, k_1$   
 $\frac{f}{f}$   
 E . (3),

$$\varepsilon_t = (1 - \beta)q_t + \frac{\beta}{1 - \gamma} [E_t((1 - \gamma)(k_0 + k_1 q_{t+1} + k_2 \varepsilon_{t+1}))]. \quad (A.1)$$

S E . (4) (5) E . (A.1)

$$\begin{aligned} \varepsilon_t &= (1 - \beta)q_t + \frac{\beta}{1 - \gamma} [((1 - \gamma)(k_0 + k_1(q_t + \mu_c) + (k_1 + \rho k_2) \varepsilon_t))] \\ &\quad + \frac{\beta}{1 - \gamma} E_t[ ((1 - \gamma)(k_1 \sigma_c \varepsilon_{t+1}^c + k_2 \sigma \varepsilon_{t+1}))] \\ &= \beta \left( k_0 + k_1 \mu_c + (1 - \gamma) \left( \frac{k_1^2 \sigma_c^2 + k_2^2 \sigma^2}{2} \right) \right) + (1 - \beta + \beta k_1) q_t \\ &\quad + \beta (k_1 + k_2 \rho) \varepsilon_t. \end{aligned} \quad (A.2)$$

T

E . (A.2)

f

f

f

$$k_0 + k_1 c_t + k_2 \iota_t$$

E . (A.2),

.

N

.

B

LHS

f

f-

$$k_0 = \frac{\beta}{1 - \beta} \left( \mu_c + (1 - \gamma) \left( \frac{\sigma_c^2}{2} + \frac{\beta^2}{2(1 - \beta\rho)^2} \sigma^2 \right) \right),$$

$$k_1 = 1,$$

$$k_2 = \frac{\beta}{1 - \beta\rho}.$$

Appendix B. SDF

If

$$\mu_{t+1} = (E_t U_{t+1}^{1-\gamma})^{\frac{1}{1-\gamma}},$$

f

f E

Z

f

EIS =  $\eta$

$a = \gamma,$

SDF

$$M_{t+1} = \beta \left( \frac{C_{t+1}}{C_t} \right)^{-\eta} \cdot \left( \frac{U_{t+1}}{\mu_{t+1}} \right)^{\eta - \gamma}$$

(B.1)

F

$$\eta = 1,$$

$$M_{t+1} = \beta \left( \frac{C_{t+1}}{C_t} \right)^{-1} \cdot \left( \frac{[(1 - \gamma) \iota_{t+1}]}{E_t [((1 - \gamma) \iota_{t+1})]} \right)$$

(B.2)

T

$$\iota_{t+1} = \beta - \Delta c_{t+1} + (1 - \gamma) \iota_{t+1} - E_t [((1 - \gamma) \iota_{t+1})].$$

(B.3)

S

E . (6), (4)

(5)

E . (B.4),

$$\iota_{t+1} = \beta - (\mu_c + \iota_t) - \frac{1}{2} (1 - \gamma)^2 \left( \sigma_c^2 + \left( \frac{\beta \sigma}{1 - \beta \rho} \right)^2 \right)$$

$$+ (1 - \gamma) \frac{\beta \sigma}{1 - \beta \rho} \varepsilon_{t+1} - \gamma \sigma_c \varepsilon_{t+1}^c.$$

(B.4)

B

$$M_{t+1} = \beta \left( \frac{C_{t+1}}{C_t} \right)^{-\eta} \cdot \left( \frac{U_{t+1}}{\mu_{t+1}} \right)^{\eta - \gamma}$$

f

{ $\varepsilon_t^c, \varepsilon_t$ },  $\iota_{t+1}$

.

T

f

,

$$E(M_{t+1}) = \beta \left( -\mu_c + \left( \gamma - \frac{1}{2} \right) \sigma_c^2 + \frac{\sigma^2}{2(1 - \rho^2)} \right)$$

$$\sigma_{M_{t+1}} = E(M_{t+1}) \cdot \sqrt{\left( \frac{\sigma^2}{1 - \rho^2} + (\gamma \sigma_c)^2 + \left( \frac{(1 - \gamma) \beta \sigma}{1 - \beta \rho} \right)^2 \right) - 1}.$$

# References

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