

# Economic Scenario Generator for Insurance and Pension

## Rational Decision Making Under Uncertainty

by

Steve Craighead and Mark Tenney

### ABSTRACT

We develop a stochastic generator for the generation of scenarios of the S & P 500 index, dividend yield, consumer price index, and U.S. Treasury yields. We first create a set of 'stylized facts' for these series. We estimate statistical models for these series. These in-sample statistical models are themselves not suitable for generation of scenarios for decision making, but instead are additional 'stylized facts' that assist in model development. The 'best' statistical model according to standard statistical model selection criteria can easily lead to a model that is highly unsuitable for generation of scenarios for decision making. We develop a stochastic generator that is suitable for decision making under uncertainty.

**Some key words :** Stylized facts; Double mean reverting process; ARIMA models; Transfer functions; Green's functions; Diffusion models; Rational decision making; Insurance; Pension; Uncertainty.

## DMRP™ Model

### Economic Scenarios

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- We based our Economic Model on Mark Tenney's DMRP™

#### DMRP™

- $du = \kappa_u(\bar{u} - \lambda_{u_0} - u)dt + \sigma_u dz_u$
- $dv = \kappa_v(\bar{v} - \lambda_{v_0} - v)dt + \sigma_v dz_v$
- where  $z_u$  and  $z_v$  follow a Wiener process with correlation  $\rho$ .

Series	Symbol	relationship	residuals
Short rate	$r_t$	$u_t = \ln(r_t)$	$\epsilon_{u,t}$
Intermediate rate	$s_t$	$\theta_t = \ln(s_t)$	$\epsilon_{\theta,t}$
Total Return Stock Index	$T_t$	$v_t = \Delta \ln(T_t)$	$\epsilon_{v,t}$
Price Return Stock Index	$S_t$	$y_t = \Delta \ln(S_t)$	$\epsilon_{y,t}$
Dividend Index	$D_t$		
Dividend Yield	$d_t$	$\sum_{i=1}^{125} \frac{D_{t+i}}{S_{t+i}}$	$\epsilon_{d,t}$
Inflation Index	$P_t$	$w_t = \Delta \ln(P_t)$	$\epsilon_{w,t}$

$$dY = (b + AY)dt + G^T dZ$$

#### Regressions on $u$ and $\theta$

$$w_t = 0.08u_t + 0.07\theta_t + 4.37\epsilon_{u,t} + 0.034 + \epsilon_{w,t}$$

$$d_t = 0.001u_t + 9.312d_{t-1} + 0.006 + \epsilon_{d,t}$$

Total Return Stock Index regression model:

## Residual Formulae

$$e_{1t} = \Delta u_t - \kappa_u(t - t_0 - \lambda_u) \Delta t$$

$$e_{2t} = \Delta \theta_t - \kappa_\theta(t - t_0 - \lambda_\theta) \Delta t$$

$$e_{3t} = w_t - (.0038u_t + .0037\theta_t + .4349w_{t-1} + .0034)$$

$$e_{4t} = x_t - \bar{x}$$

$$e_{5t} = d_t - (.0001u_t + .9312d_{t-1} + .0006)$$

## Residual Formulae

- $\Delta t = 1/12$
- $\kappa_u = 0.5$
- $\lambda_u = 0.1982$
- $\kappa_\theta = 0.15$
- $\lambda_\theta = 0.4732$
- $\theta = \ln(0.106821)$
- $\bar{x} = 0.00982$  the average total return.

## Annualized Covariance Matrix

	u	$\theta$	w	x	d
u	.007115	0.00001	0.001109	-0.007119	0.000012
$\theta$	0.00001	0.042590	0.001169	-0.008271	0.000023
w	0.001109	0.001169	0.000080	0.000119	0.000008
x	-0.007119	-0.008271	0.000119	0.233506	-0.000076
d	0.000012	0.000023	0.000008	-0.000076	0.000003

## Choleski Decomposition G?

	u	$\theta$	w	x	d
u	1.1273	0.00000	0.00000	0.00000	0.00000
$\theta$	0.00000	0.7781	0.00000	0.00000	0.00000
w	0.00190	0.00075	0.00027	0.00000	0.00000
x	0.00000	0.00000	0.00000	0.233506	0.00000
d	0.00000	0.00000	0.00000	0.00000	0.00000

## b Vector

u	$-\kappa_u \lambda_u$
$\theta$	$\theta \kappa_\theta - \kappa_\theta \lambda_\theta$
w	0
x	$-0.5(\sigma_x)^2$
d	0

## b Vector, Cont.

The stock return under risk-neutral pricing should be  $r_t - 0.5(\sigma_x)^2$  where  $r_t$  is the risk free rate, and  $(\sigma_x)^2$  is the variance of the stock residuals. Since the risk-free rate will be dynamic, the drift term will only contain the variance term. We will then build up the risk neutral stock returns from the yield curve process.

### A Matrix

	u	0	w	x	d
u	$-K_u$	$K_u$	0	0	0
0	0	$K_w$	0	0	0
w	0	0	0	0	0
x	0	0	0	0	0
d	0	0	0	0	0

### Generalized Method of Moments Realistic Scenarios & Stylized Facts

Using GMM methods, you adjust the contents of the b vector and the A matrix to force the model to replicate certain stylized facts. You leave the contents of G<sup>0</sup> alone.

### Risk Neutral Parameter Values

$\kappa_u = 0.689$   
 $\lambda_w = 0$   
 $\kappa_x = 0.0369$   
 $\lambda_d = 0$   
 $\theta = 0.106821$   
 $0.5(\sigma_x)^2 = 0.11753$

### Process Variable Names

$u_t$  log of instantaneous rate  
 $\theta_t$  log of intermediate target rate  
 $\epsilon_{w,t}$  inflation residual  
 $\epsilon_{x,t}$  Stock residual with variance drift  
 $\epsilon_{d,t}$  dividend yield residual

### Inflation

$$w_t = .0018u_t - .0037\theta_t + .4349w_{t-1} + .0034 + \epsilon_{w,t}$$

### Dividend Yield

$$d_t = \max(\min(.0001u_t + .9312d_{t-1} + .0006 + \epsilon_{d,t}, .01/12), .08/12)$$

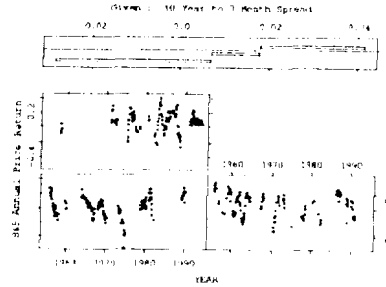
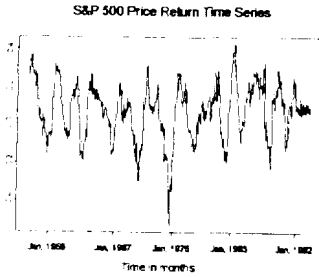
### Total Return

$$x_t = \exp(\frac{\delta}{12} \Delta t) \exp(\epsilon_t)$$

### Price Return

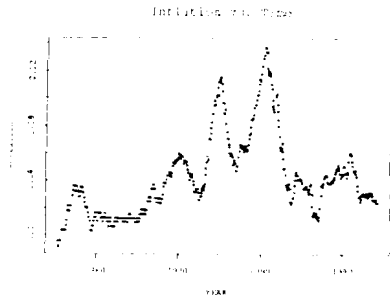
$$y_t = x_t / (1 + d_t)$$

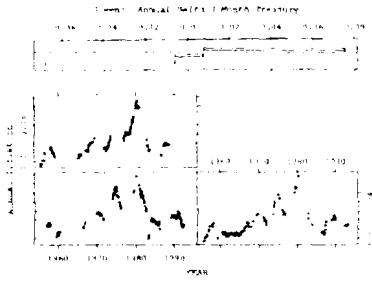
$\delta$  is the instantaneous risk free force of interest



### Realistic-Stock Market

- Model: 3 Observed Environments for the Stock Market, related to the spread between 10 year and 3 month treasuries
  - High
  - Middle
  - Low





## Realistic-Inflation

- Model: 3 Observed Environments for the Stock Market, related to the Delta between the current and last year's 3 month Treasury
  - High
  - Middle
  - Low