

# Beyond the Classical Paradigm

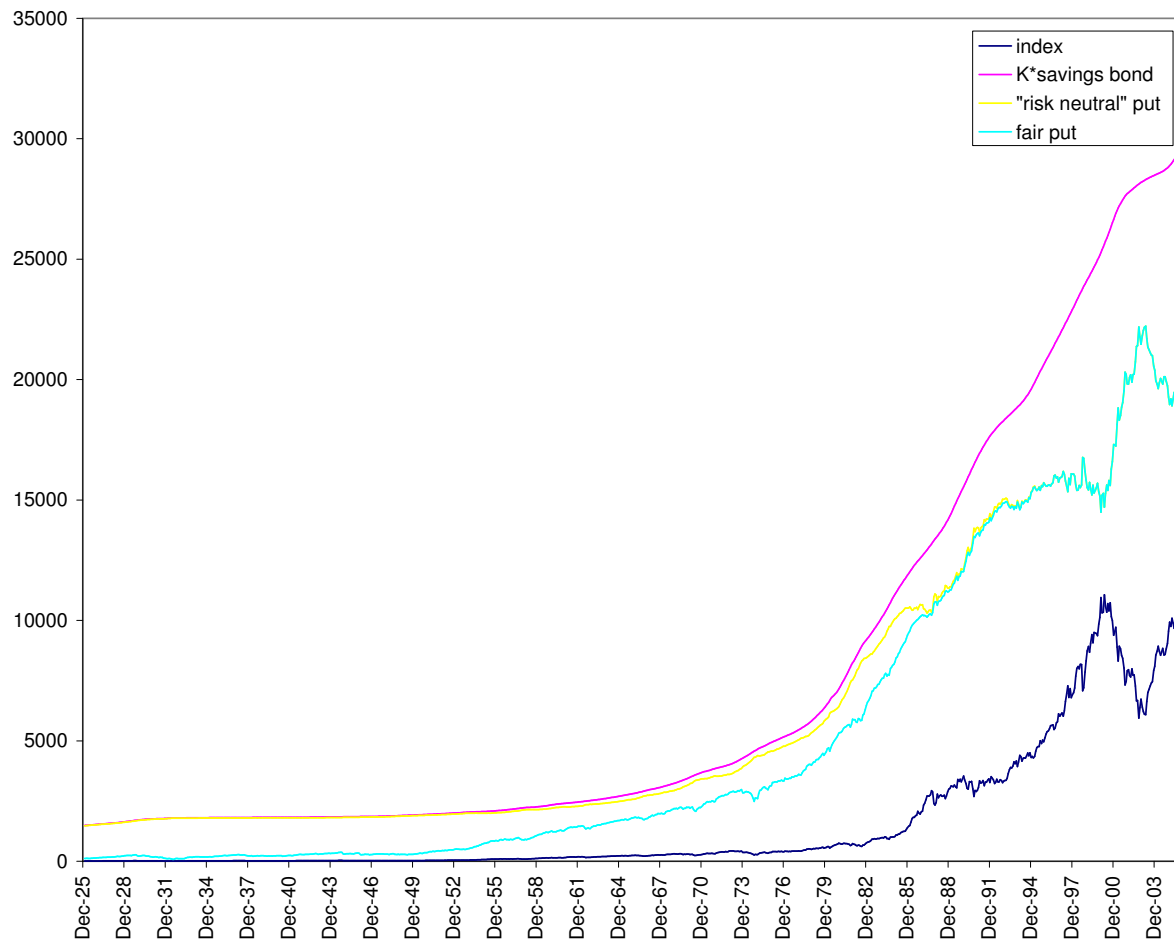
**Eckhard Platen**

University of Technology Sydney

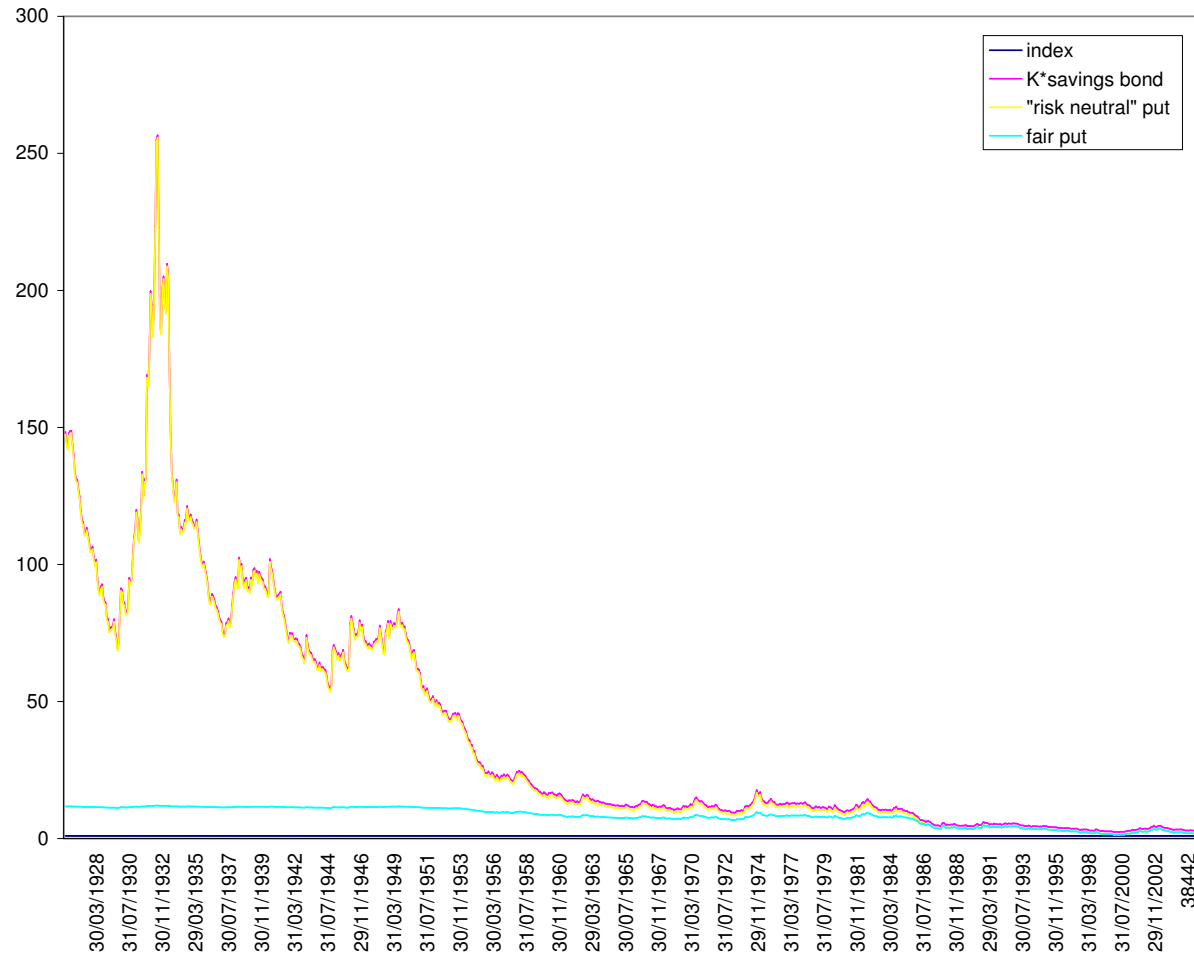
**Pl. & Heath** (2006, 2010), A Benchmark Approach to Quantitative Finance. Springer

**Pl. & Bruti-Liberati** (2010), Numerical Solution of Stochastic Differential Equations with Jumps in Finance. Springer

**Baldeaux & Pl.** (2013). Functionals of Multidimensional Diffusions with Applications to Finance. Springer



Risk neutral and fair put on index



Benchmarked “risk neutral” and fair put on index

## Complications with Classical Approach

- inverse of 3-dimensional Bessel process; Delbaen & Schachermayer (1995)
- $\frac{3}{2}$  volatility model; Pl. (1997), Heston (1997), Lewis (2000), Pl. (2001), ...
- some other stochastic volatility models; Sin (1998), ...
- allowing some classical arbitrage; Loewenstein & Willard (2000), Pl. (2002), Fernholz & Karatzas (2005), ...

## Numéraire Portfolio $S_t^*$ as Benchmark

- tradeable for modeling, investing and pricing
- **supermartingale property:**

$$\hat{S}_t^\delta = \frac{S_t^\delta}{S_t^*} \geq E(\hat{S}_s^\delta | \mathcal{F}_t)$$

$$0 \leq t \leq s \leq \infty$$

Long (1990), Becherer (2001), Pl. (2002), Goll & Kallsen (2003), Pl. & Heath (2006), Christensen & Pl. (2005), Karatzas & Kardaras (2007),

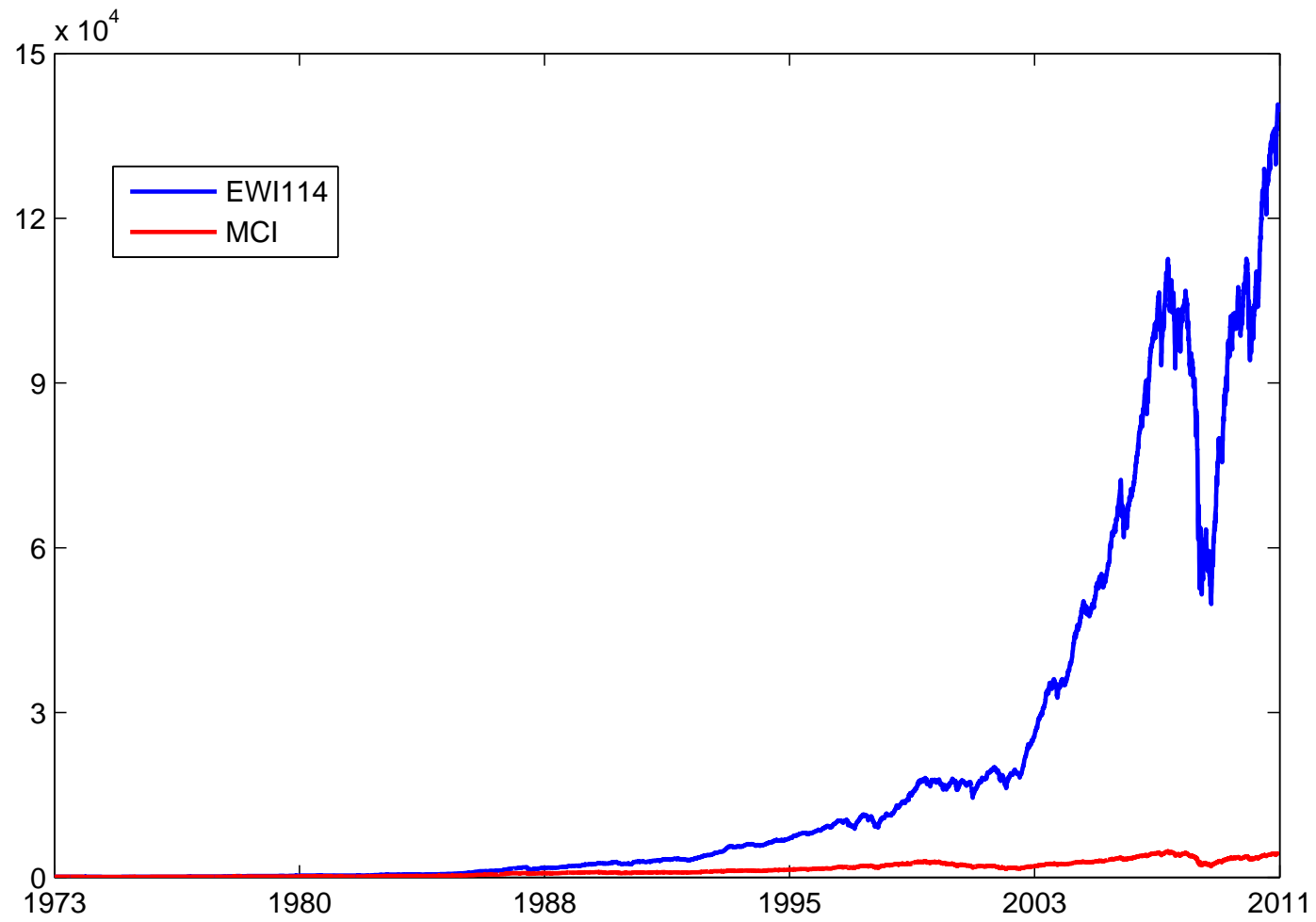
...

- **growth optimal portfolio** is NP  $S_{t_i}^*$   
Kelly (1956), ..., MacLean et al. (2011)
- **long term growth rate**

$$g = \lim_{t \rightarrow \infty} \sup \frac{1}{t} \ln \left( \frac{S_t^*}{S_0^*} \right) \text{ -maximal P-a.s.}$$

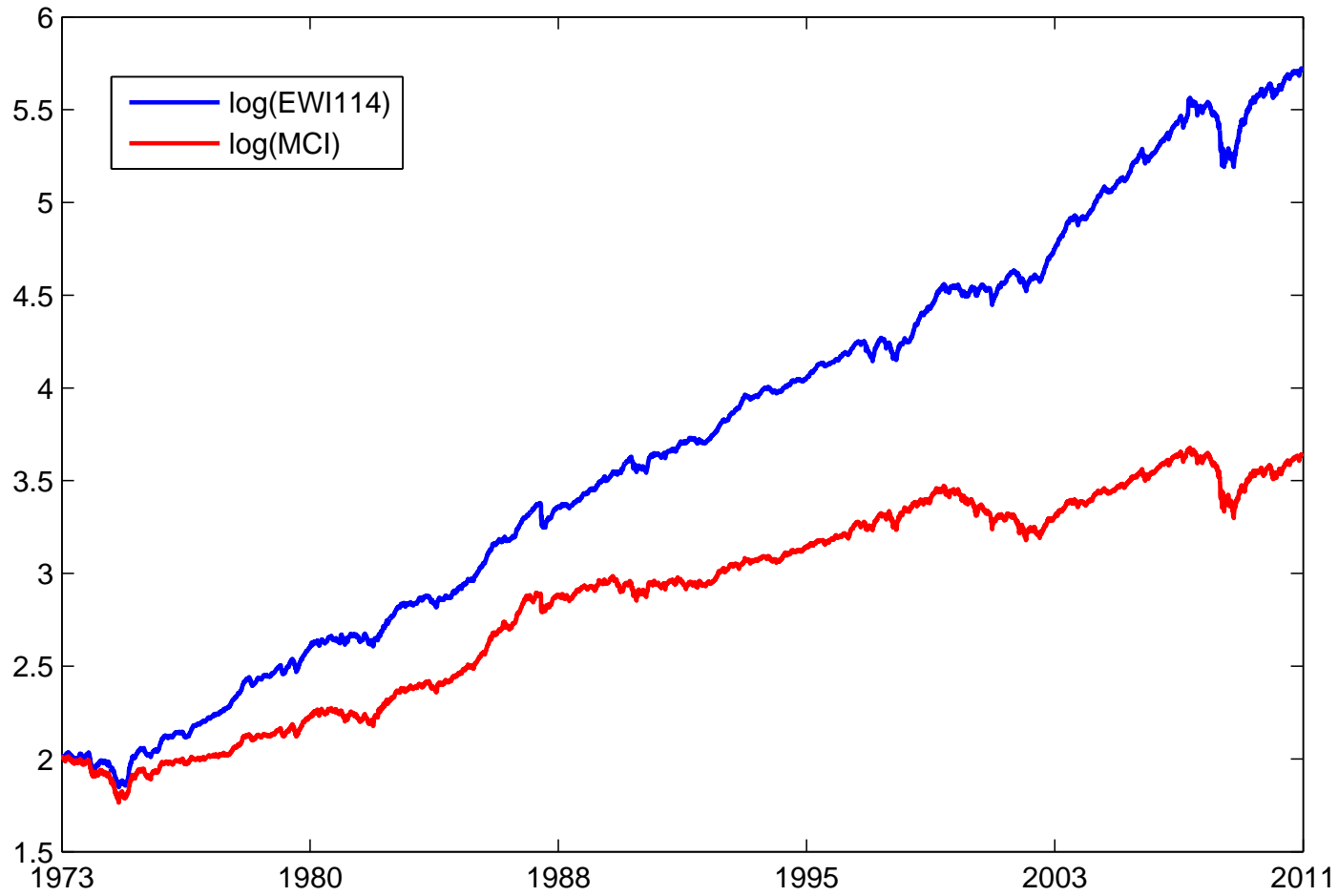
## **Diversification Approximates NP**

- **diversification theorem**  
Pl. (2005), Le & Pl. (2006)
- **naive diversification**  
Pl. & Rendek (2012)  
model independent



EWI114 and MCI





Logarithms of EW114 and MCI

# Maximum Drawdown Constrained Portfolios

Kardaras, Obloj & Pl. (2012)

Cheredito, Nikeghbali & Pl. (2012)

$\mathcal{X}$  - set of nonnegative continuous discounted portfolios

- **running maximum**

for  $X = \{X_t, t \geq 0\} \in \mathcal{X}$

$$X_t^* = \sup_{u \in [0, t]} X_u$$

- **relative drawdown**

$$\frac{X_t}{X_t^*}$$

- **maximum relative drawdown**

**express attitude towards risk by restricting to  $X \in {}^\alpha \mathcal{X}$ , where**

$$\frac{X_t}{X_t^*} \geq \alpha, \alpha \in [0, 1)$$

pathwise criterion

- **maximum drawdown constrained portfolio**

$\alpha \in [0, 1), X \in \mathcal{X}$

$$\begin{aligned} {}^\alpha X_t &= \alpha (X_t^*)^{1-\alpha} + (1-\alpha) X_t (X_t^*)^{-\alpha} \\ &= 1 + \int_0^t (1-\alpha) (X_s^*)^{-\alpha} dX_s \geq \alpha^\alpha X_t^* \end{aligned}$$

Grossman & Zhou (1993), Cvitanic & Karatzas (1994)

$\implies$  SDE

$$\frac{d^\alpha X_t}{\alpha X_t} = \alpha \pi_t \frac{dX_t}{X_t}$$

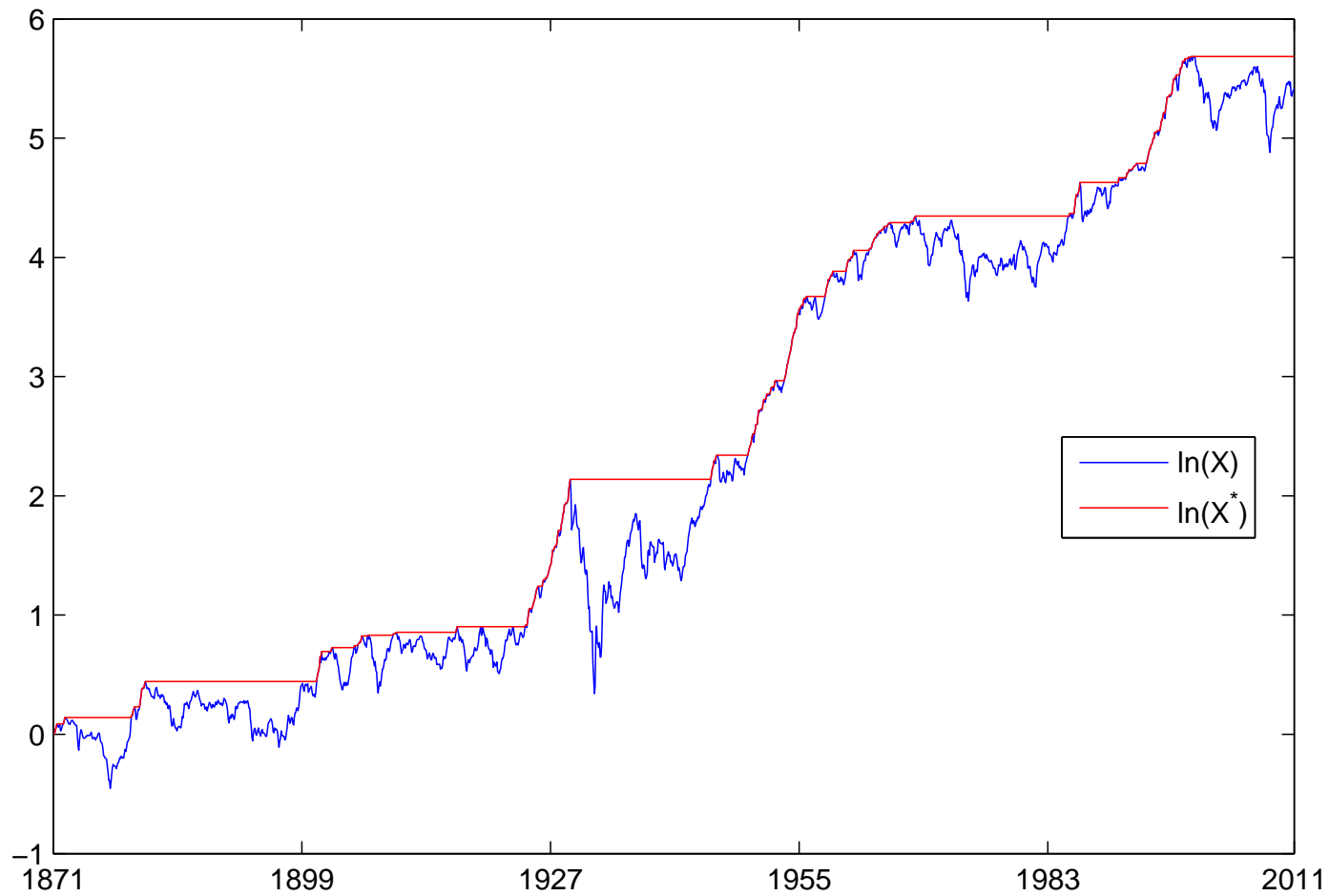
fraction

$$\alpha \pi_t = 1 - \frac{(1 - \alpha) \frac{X_t}{X_t^*}}{\alpha + (1 - \alpha) \frac{X_t}{X_t^*}}$$

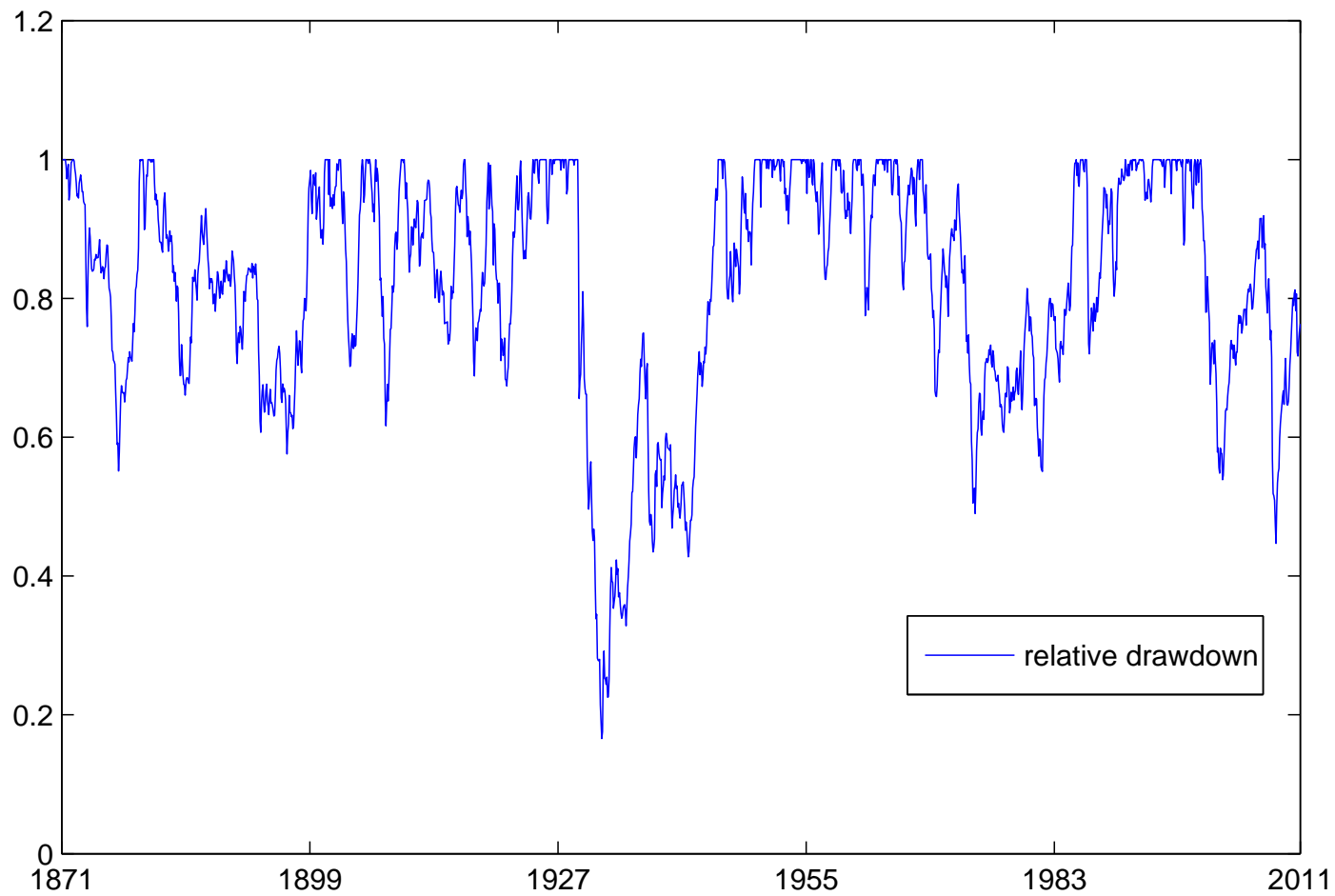
model independent

depends only on  $\frac{X_t}{X_t^*}$  and  $\alpha$

$\alpha \bar{S}_t^*$  - invests in  $\bar{S}^*$  and savings account



Logarithm of discounted S&P500 and its running maximum



Relative drawdown of discounted S&P500

- **asymptotic maximum long term growth rate**

Kardaras, Obloj & Pl. (2012)

$$\lim_{t \rightarrow \infty} \frac{1}{t} \log({}^\alpha S_t^*) = (1 - \alpha) \lim_{t \rightarrow \infty} \frac{1}{t} \log(S_t^*)$$

$${}^\alpha g = (1 - \alpha)g$$

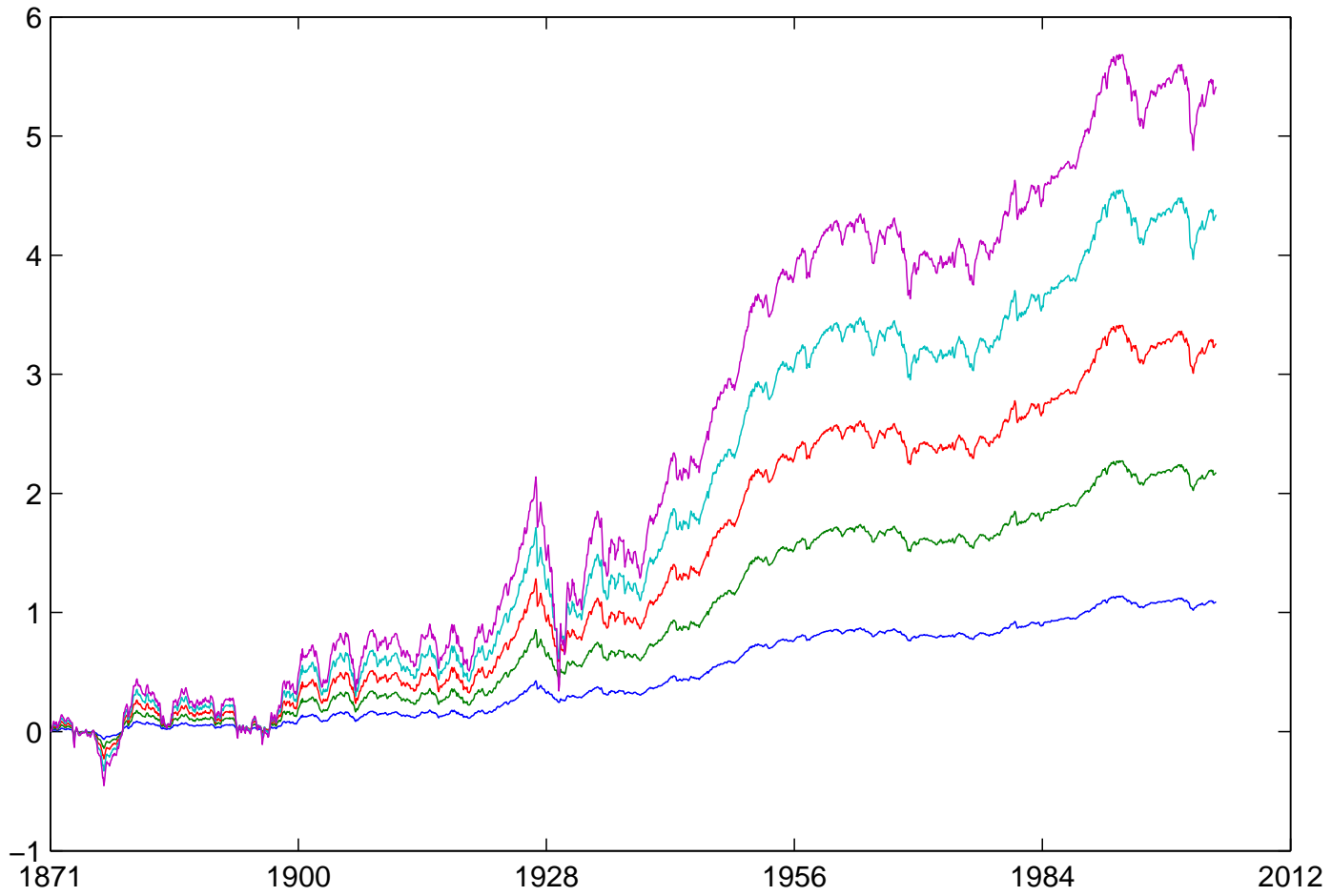
restricted drawdown  $\implies$  reduced maximum growth rate

long term view with short term attitude towards risk

realistic alternative to Markowitz mean-variance approach

and utility maximization





Logarithm of drawdown constrained portfolios

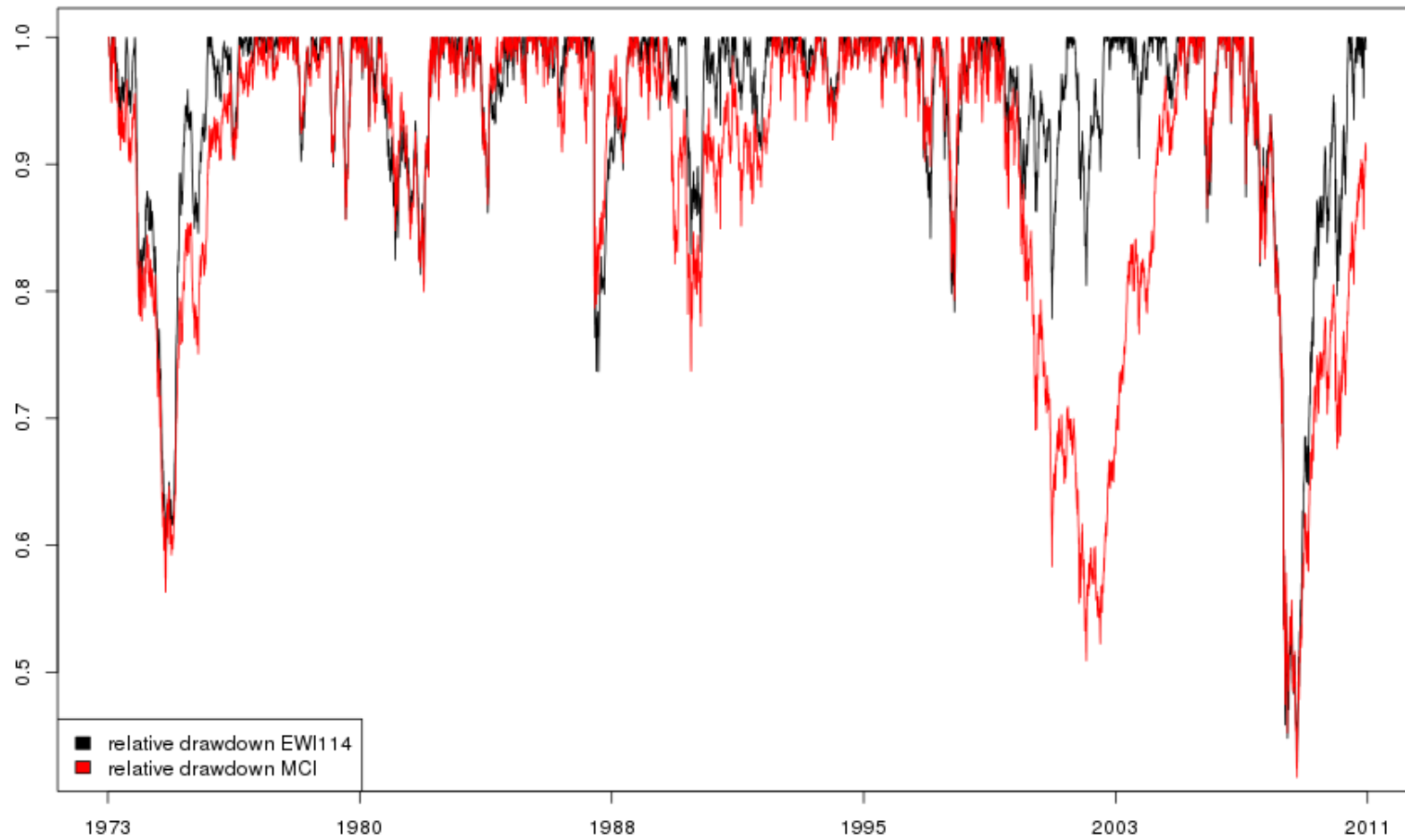
# Shortest Expected Market Time to Reach a Level

Kardaras & Pl. (2010)

Works together with maximum drawdown constraint

⇒ new type of fund management

- long term view
- short term attitude
- pathwise properties
- model independent



Relative drawdown of MCI and EW114

## Utility Maximization

Kardaras & Pl. (2013), Pl. & Heath (2006)

$$\hat{S}_t^\delta = E(U'^{-1}(\hat{S}_T^0) \hat{S}_T^0 | \mathcal{F}_t)$$

- two fund separation  $\Rightarrow$  some efficient frontier
- substituting market portfolio by NP  $\Rightarrow$  modified CAPM
- does not maximize Sharpe ratio for jump case  
Christensen & Pl. (2007)

## Last Passage Times

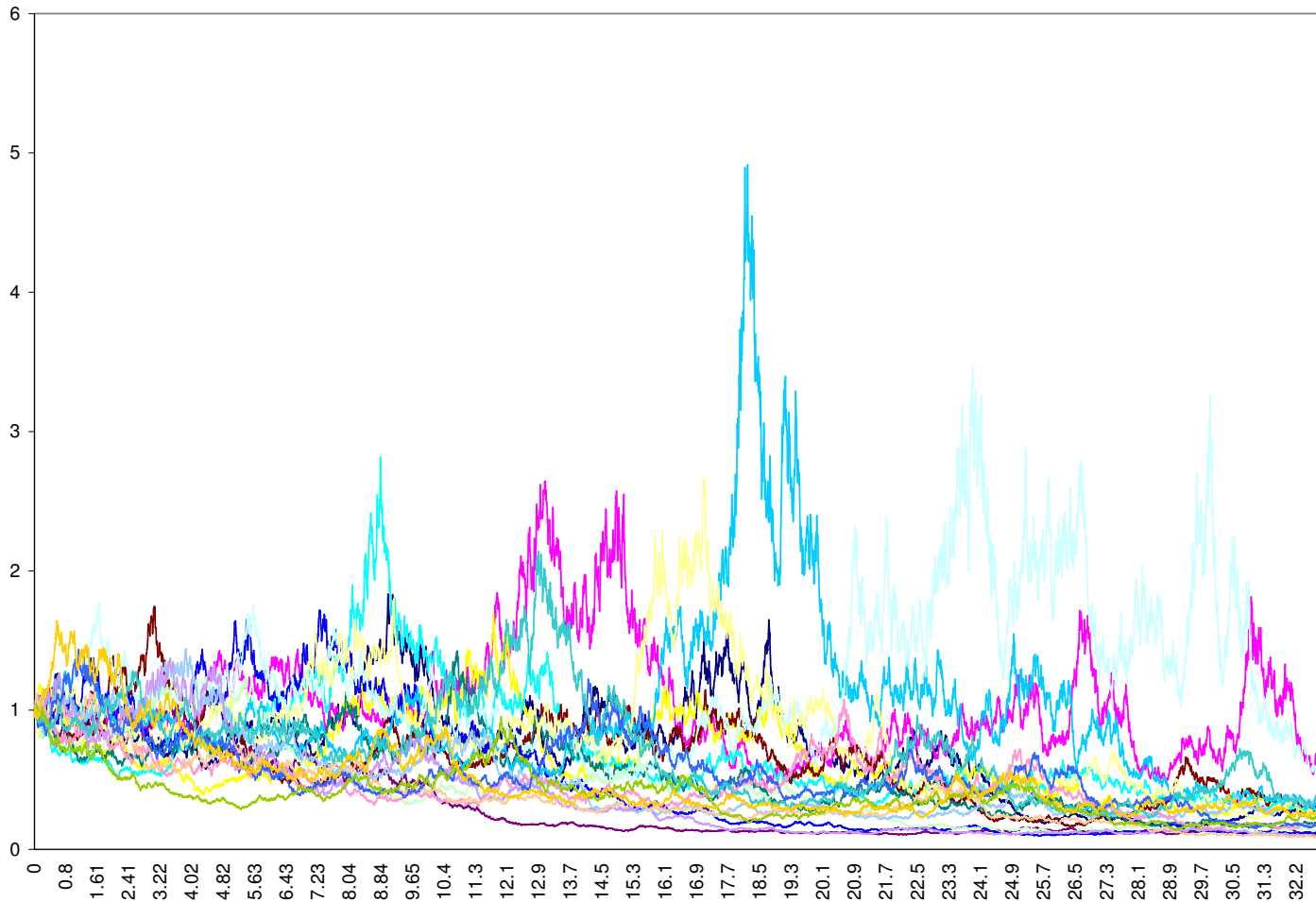
Nikeghbali & Pl. (2008, 2013); Profeta, Roynette & Yor (2010)

$N_t$ -local martingale, no positive jumps,  $\lim_{t \rightarrow \infty} N_t = 0$

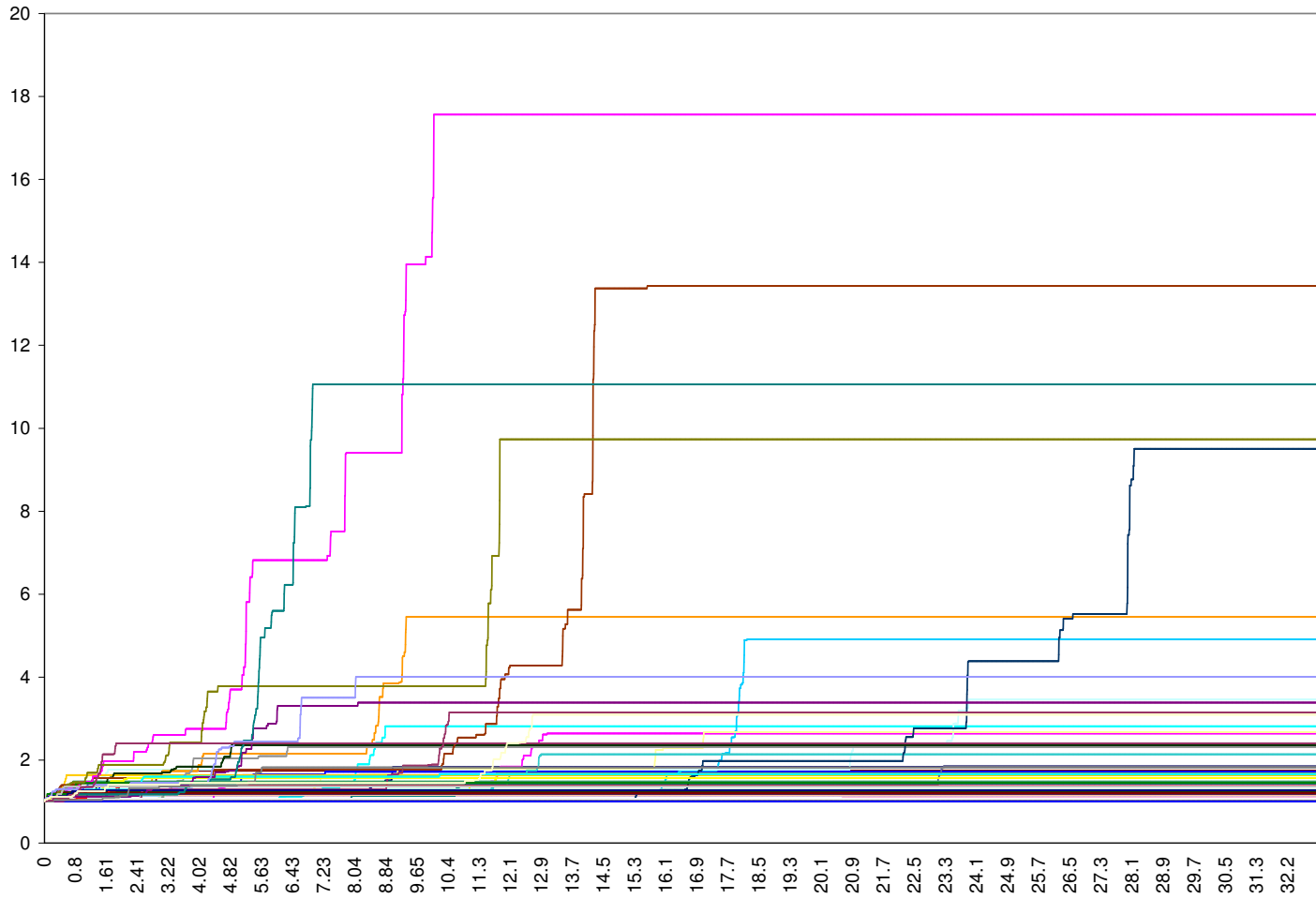
$\Rightarrow$

$$\frac{N_0}{\lim_{t \rightarrow \infty} \sup_{t \geq 0} N_t} \sim U(0, 1)$$

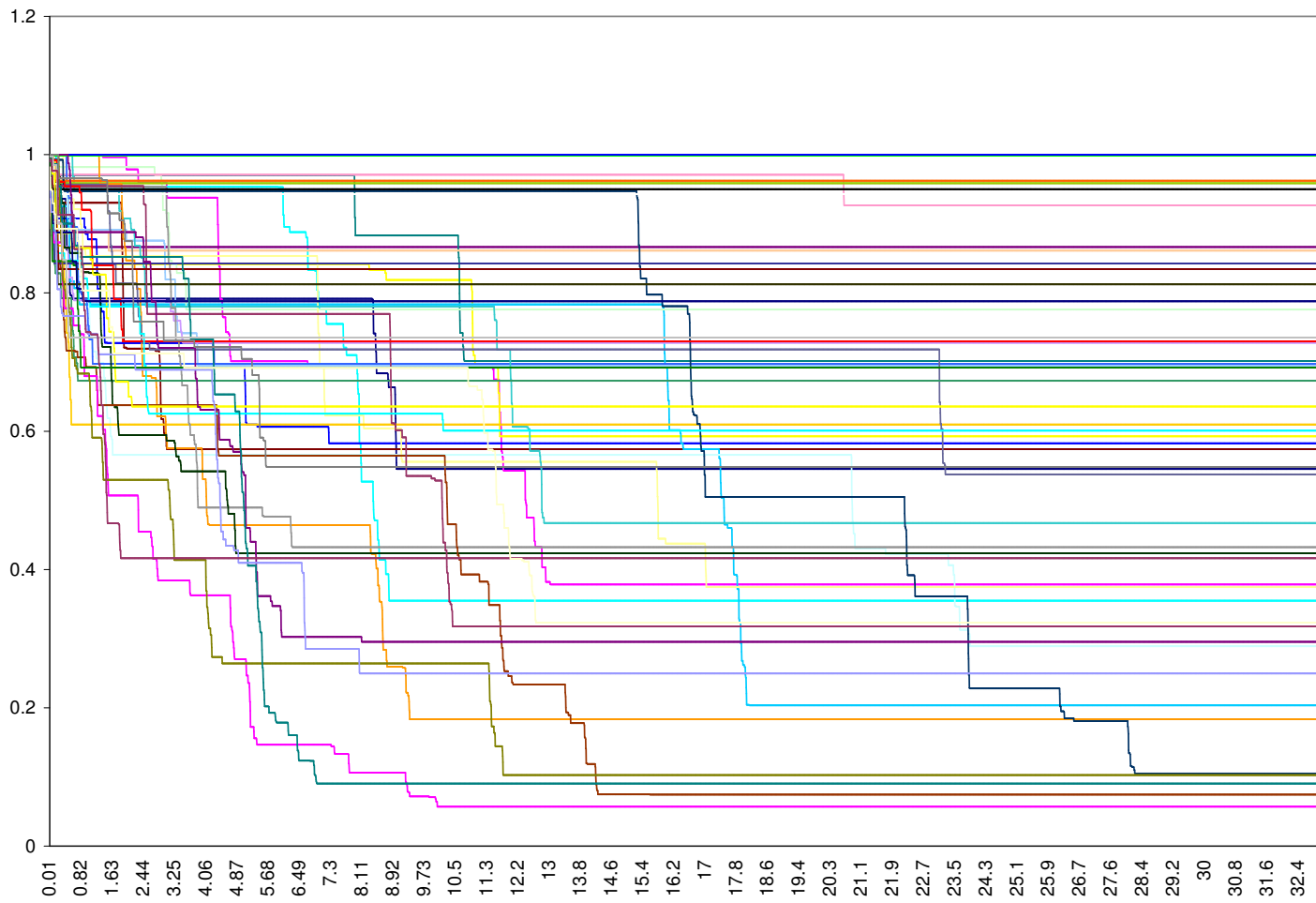
- model independent



Trajectories of  $N_t$  under MMM



Running maxima



Inverse of maxima



## Valuation and Pricing

- supermartingale property for all price processes  $\Rightarrow$  NUPBR

$$\hat{S}_t^{\delta_{H_T}} \geq E\left(\frac{H_T}{S_T^*} \mid \mathcal{F}_t\right)$$

- martingale is the minimal supermartingale, Du & Pl. (2013)  
 $\Rightarrow$  minimal price:

**real world pricing formula**

$$\begin{aligned}\hat{S}_t^{\delta_{H_T}} &= E\left(\frac{H_T}{S_T^*} \mid \mathcal{F}_t\right) \\ \Rightarrow S_t^{\delta_{H_T}} &= S_t^* E\left(\frac{H_T}{S_T^*} \mid \mathcal{F}_t\right)\end{aligned}$$

If  $S_T^*$  and  $H_T$  independent  $\Rightarrow$  **Actuarial pricing formula**

$$S_t^{\delta_{H_T}} = P(t, T) E(H_T | \mathcal{F}_t)$$

If Radon-Nikodym derivative  $\Lambda_t = \frac{\hat{S}_t^0}{\hat{S}_0^0}$  martingale  $\Rightarrow$

### **Risk neutral pricing formula**

$$S_t^{\delta_{H_T}} = E\left(\frac{\Lambda_T}{\Lambda_t} \frac{S_t^0 H_T}{S_T^0} \mid \mathcal{F}_t\right) = E_Q\left(\frac{S_t^0 H_T}{S_T^0} \mid \mathcal{F}_t\right)$$

## Benchmarked Risk Minimization

Föllmer & Sondermann (1986), Föllmer & Schweizer (1991)  
Du & Pl. (2013), Biagini, Cretarola & Pl. (2014)

- $j$ th benchmarked primary security account

$$\hat{S}_t^j$$

local martingale

## Dynamic Trading Strategy

$v = \{v_t = (\eta_t, \vartheta_t^1, \dots, \vartheta_t^d)^\top, t \in [0, \infty)\}$  forms benchmarked price process

$$\hat{V}_t^v = \vartheta_t^\top \hat{S}_t + \eta_t$$

$\vartheta$  predictable,

$\eta$  adapted,  $\eta_0 = 0$ , monitors non-self-financing part of supermartingale

$$\hat{V}_t^v = \hat{V}_0^v + \int_0^t \vartheta_s^\top d\hat{S}_s + \eta_t$$

- benchmarked contingent claim  $\hat{H}_T$   
*v* delivers  $\hat{H}_T$  if

$$\hat{V}_T^v = \hat{H}_T$$

$\implies$  replicable if self-financing

## Benchmarked P&L

$$\hat{C}_t = \hat{V}_t^v - \sum_{j=1}^d \int_0^t \vartheta_u^j d\hat{S}_u^j - \hat{V}_0^v$$

$$\Rightarrow \hat{C}_t = \eta_t \text{ for } t \in [0, \infty)$$

- benchmarked P&L usually fluctuating
- intrinsic risk



What criterion would be most natural?

- **symmetric** view with respect to all primary security accounts, in particular the domestic savings account
- **pooling** in large trading book  
⇒ vanishing total hedge error, P&L

## Pooling

$\hat{H}_{T,l}; \hat{V}^{v_l}$  with  $\hat{C}^{v_l}$  independent square integrable martingale with  $E \left( \left( \frac{\hat{C}_t^{v_l}}{\hat{V}_0^{v_l}} \right)^2 \right) \leq K_t < \infty$  for  $l \in \{1, 2, \dots\}$ ,

well diversified trading book holds equal fractions at initial time:

$$\text{total benchmarked wealth } \hat{U}_t = \frac{\hat{U}_0}{m} \sum_{l=1}^m \frac{\hat{V}_t^{v_l}}{\hat{V}_0^{v_l}}$$

total benchmarked P&L

$$\hat{C}_m(t) = \frac{\hat{U}_0}{m} \sum_{l=1}^m \frac{\hat{C}_t^{v_l}}{\hat{V}_0^{v_l}},$$

$\Rightarrow$

$$\lim_{m \rightarrow \infty} \hat{C}_m(t) = 0$$

$P$ -a.s.

- $\mathcal{V}_{\hat{H}_T}$  set of strategies  $v$  delivering  $\hat{H}_T$  with orthogonal benchmarked P&L

that is,  $\eta$  and  $\eta\hat{S}$  are local martingales

- market participants prefer **more for less**

⇒ **Benchmarked Risk Minimization**

For  $\hat{H}_T$  strategy  $\tilde{v} \in \mathcal{V}_{\hat{H}_T}$  *benchmark risk minimizing* (BRM) if for all  $v \in \mathcal{V}_{\hat{H}_T}$  price  $\hat{V}_t^{\tilde{v}}$  is minimal

$$\hat{V}_t^{\tilde{v}} \leq \hat{V}_t^v$$

$P$ -a.s. for all  $t \in [0, T]$ .

## Regular Benchmarked Contingent Claims

$\hat{H}_T$  is called *regular* if

$$\hat{H}_T = E_t(\hat{H}_T) + \sum_{j=1}^d \int_t^T \vartheta_{\hat{H}_T}^j(s) d\hat{S}_s^j + \eta_{\hat{H}_T}(T) - \eta_{\hat{H}_T}(t)$$

$\vartheta_{\hat{H}_T}$  - predictable

$\eta_{\hat{H}_T}$  - local martingale, adapted, orthogonal to  $\hat{S}$

$\Rightarrow$  regular  $\hat{H}_T$  has BRM strategy  $v$  with

$$\hat{V}_t^v = E(\hat{H}_T | \mathcal{F}_t) ,$$

and orthogonal benchmarked P&L:  $\hat{C}_t = \eta_{\hat{H}_T}(t)$

- general semimartingale market
- no second moments required
- no risk neutral measure required
- takes evolving information about nonhedgeable part of claim into account
- $H_T$  nonhedgeable  $\Rightarrow \delta_t^0 = E(H_T | \mathcal{F}_t)$

- hedge designed for pooling
- under minimal martingale measure, see Schweizer (1995), prices as under local risk-minimization but hedge different



## Conjectured Model for Well-diversified Equity Indices

Filipovic & Pl. (2009), Pl. & Rendek (2012)

- well diversified portfolio  $\approx$  NP
- discounted NP time transformed squared Bessel process
- **normalized NP**

$$dY_\tau = (1 - Y_\tau)d\tau + \sqrt{Y_\tau}dW(\tau)$$

- nature of feedback in diversified wealth

- **market activity time**

$$\frac{d\tau_t}{dt} = \frac{1}{Z_t}$$

- **inverse market activity  $Z_t$**

trading behaviour exaggerates volatility, Kahneman & Tversky (1979)  
fast moving

$$dZ_t = (\gamma - \varepsilon Z_t)dt + \sqrt{\gamma Z_t}dW_t$$

$$dW_t = \sqrt{Z_t}dW(\tau_t)$$

$\Rightarrow$  **discounted index model**

$$S_t = A_{\tau_t} Y_{\tau_t}$$

$$A_{\tau_t} = A_0 \exp\{a\tau_t\}$$

$a \geq 1 \Rightarrow \hat{S}^0$  supermartingale

⇒

- volatility

$$\sigma_t = \sqrt{\frac{1}{Y_{\tau_t} Z_t}}$$

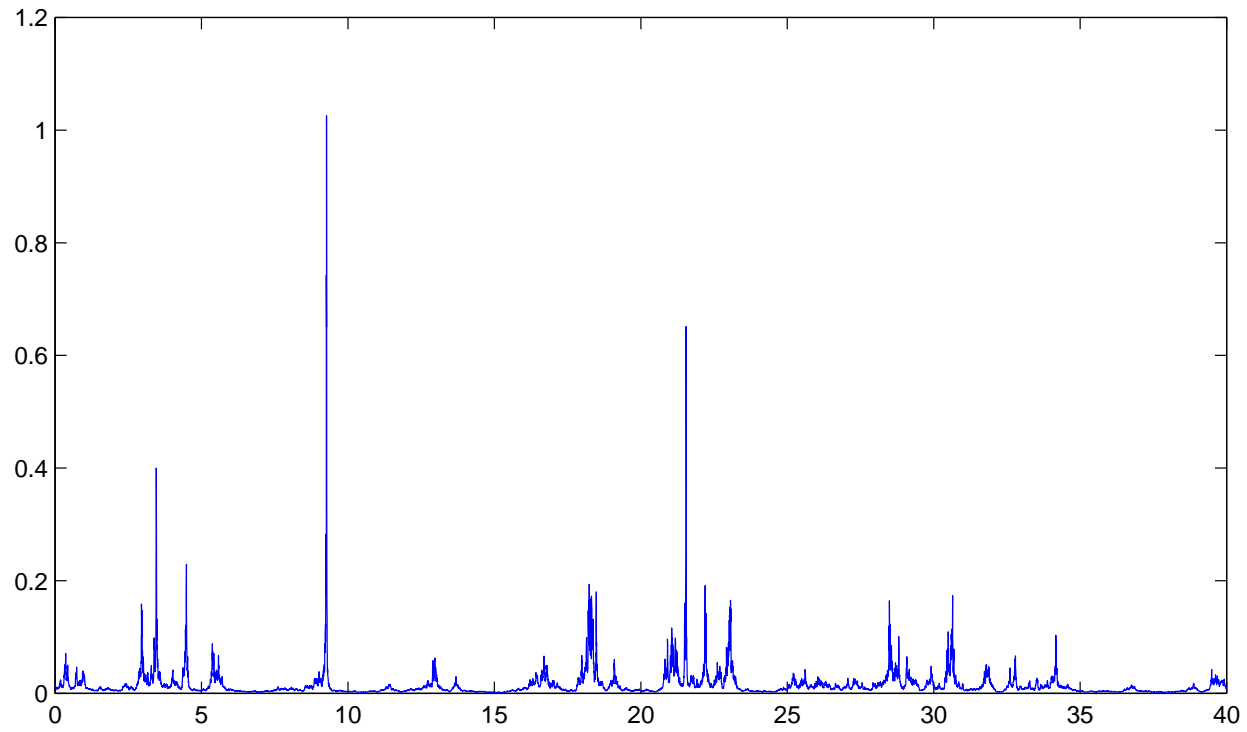
- expected rate of return

$$\mu_t = \frac{a - 1}{Z_t} + \sigma_t^2$$

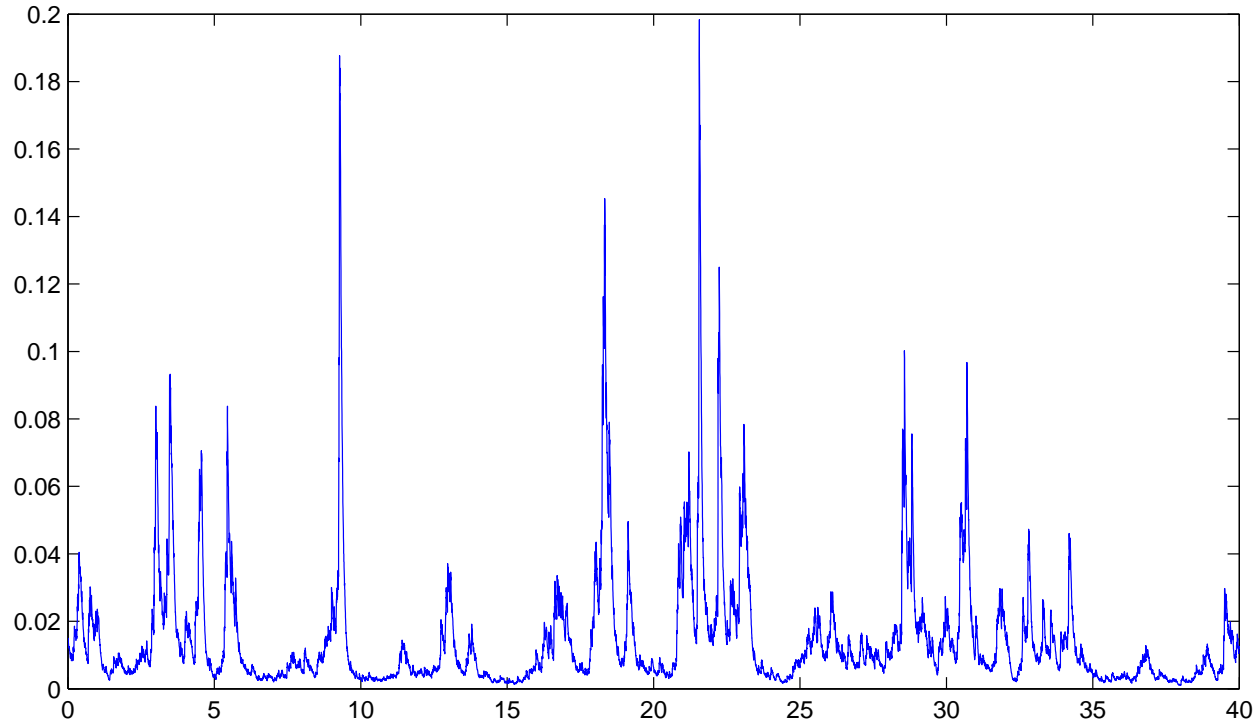
- long term average market time

$$\tau_t \approx \frac{2\varepsilon}{\gamma} t$$

- almost exact simulation



Simulated market activity



Estimated market activity of simulated index

- **conjectured parsimonious model:**

3 initial parameters:  $A_0, Y_0, Z_0$

3 structural parameters:  $\alpha, \varepsilon, \gamma$

1 driving Brownian motion (nondiversifiable equity risk)

highly tractable, Heath & Pl. (2014), Baldeaux & Pl. (2013)

- for long term tasks average market activity  $\bar{M} = \text{const.}$   
if  $\hat{S}^0$  local martingale  $\Rightarrow$

3 initial parameters:  $A_0, Y_0, Z_0 = \frac{2}{M}$

1 driving Brownian motion

analytically tractable

explicit call, put, binary, bond, ...



- Popper (1935, 2002): one can only falsify models
- conjectured model difficult to falsify: MCI, EWI114, S&P500, ...
- most known index models can be falsified  
by some of **10** listed stylized empirical facts, Pl. & Rendek (2014)
- ideal for pricing **long-dated pension and insurance contracts**  
Baldeaux & Pl. (2013), Heath & Pl. (2014), Baldeaux, Grasselli & Pl.  
(2014) (FX)
- model leads **beyond classical paradigm**

- BA generalizes classical theory
- several "puzzles" can be naturally explained
- no representative agent employed
- long term model as simple as BS model

- significant performance improvement in long term fund management
- major savings in pension and insurance products
- systematic, efficient approach to risk measurement and regulation, Pl. & Stahl (2005)