

# An Economic Model of Oil Exploration and Extraction

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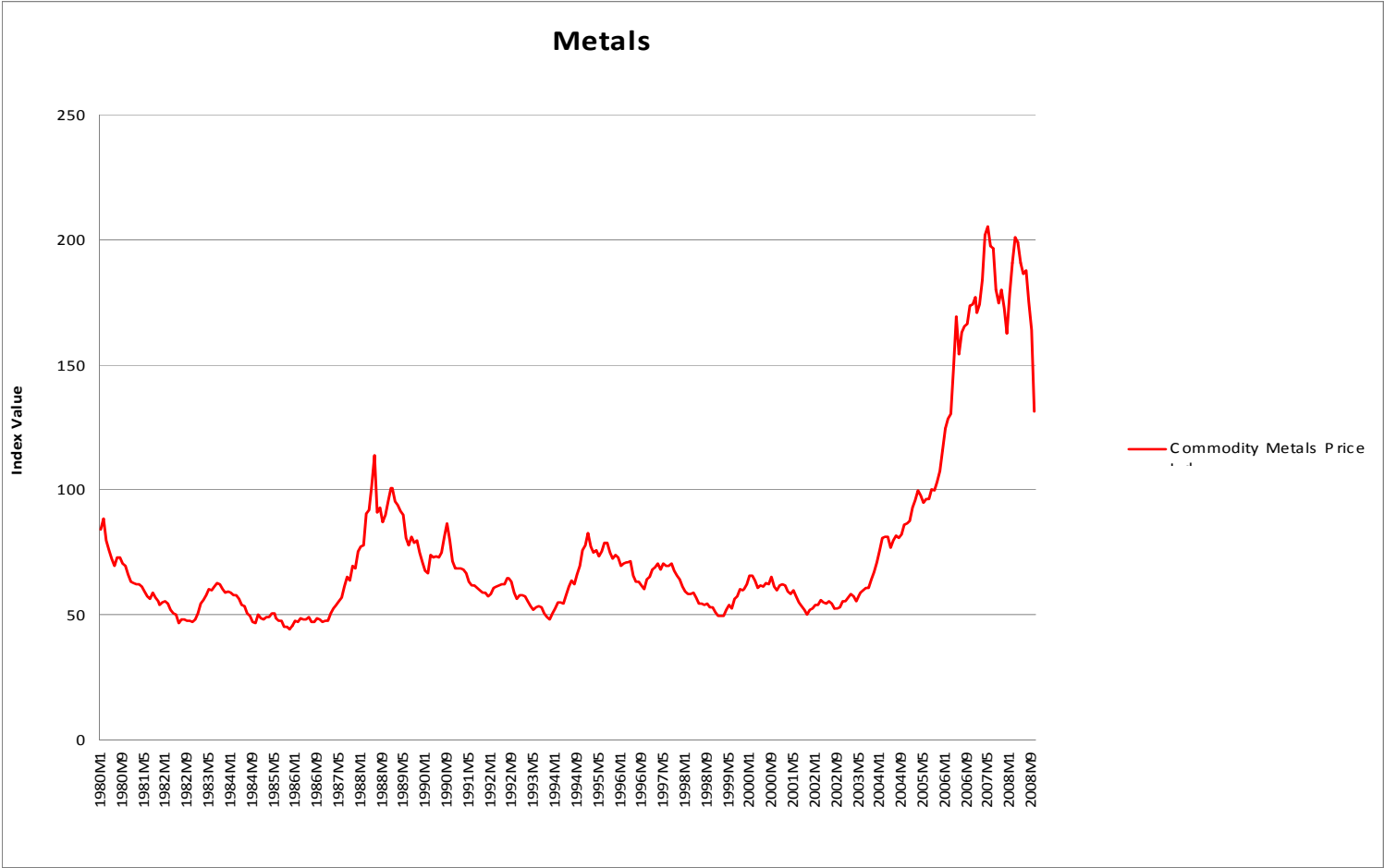
# I. Introduction

- Greiner/Semmler Book: „Global Environment, Economic Growth and Natural Resources,“ OUP, 2008
- **Renewable Resource** (Clark): Growth rate of the resource in interaction with other resources (Lotka-Volterra system), see paper with L. Bernard and A. Greiner for agricultural products
- **Non-Renewable Resources** (Hotelling): stock of exhaustible resource is given, extraction rate monotonically decreasing, competitive pricing, and prices increase monotonically with interest rate
- We here treat **oil (fossil fuel)** as representing something between a non-renewable and renewable resource
- We present results from **infinite** and **finite horizon**
- We **sketch an optimal growth model** with fossil fuel and renewable energy (and how **transition** to renewable energy can be accelerated in a market economy by tax and subsidies)

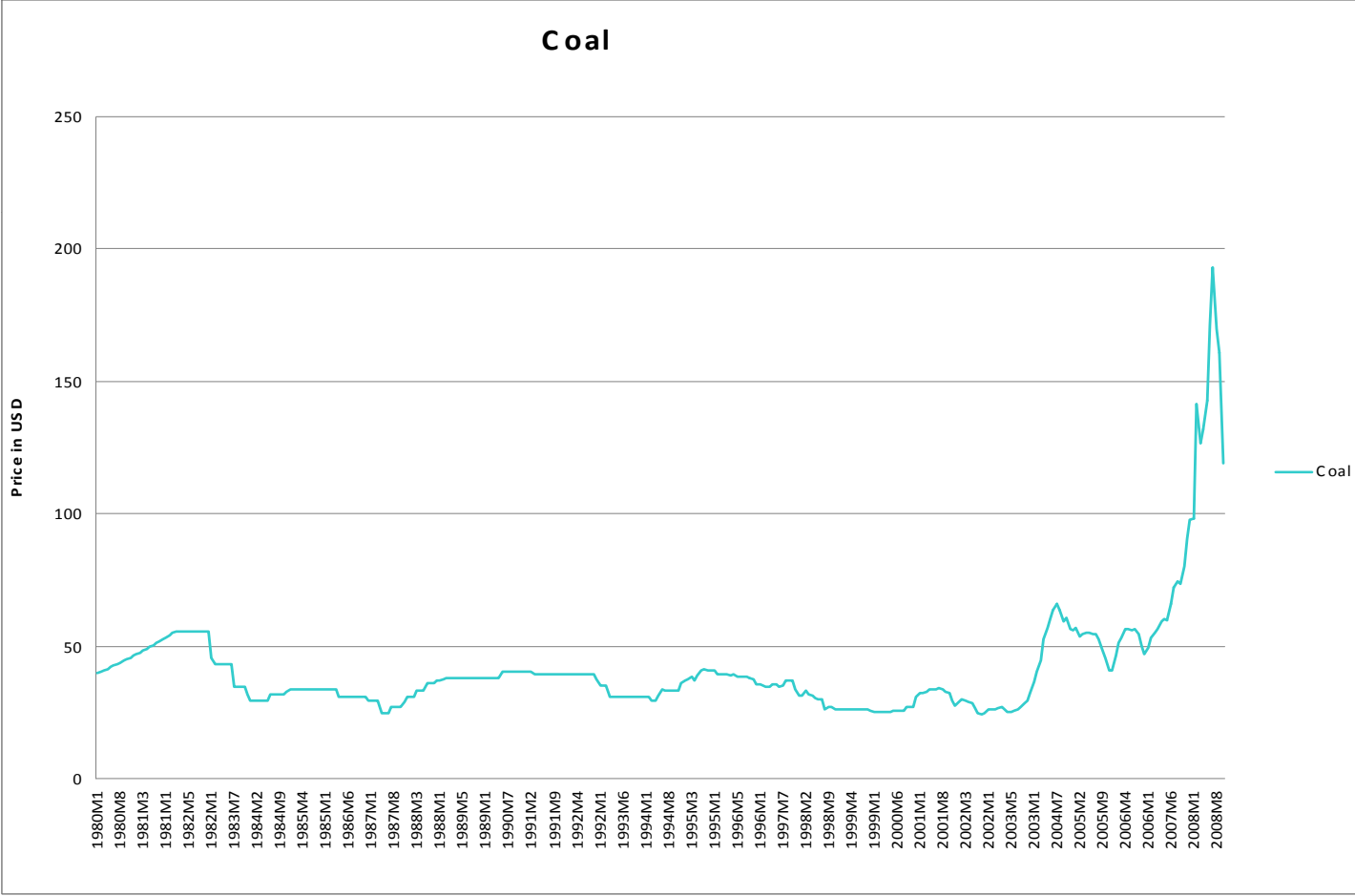
## II. Empirical Facts: Price Volatility and Trend

- ⇒ **Renewable** commodities show high volatility and no trend
- ⇒ **Non-renewable** commodities (fossil fuel , metals) show higher volatility and trend
- ⇒ In particular **oil shows U-shaped price trend**

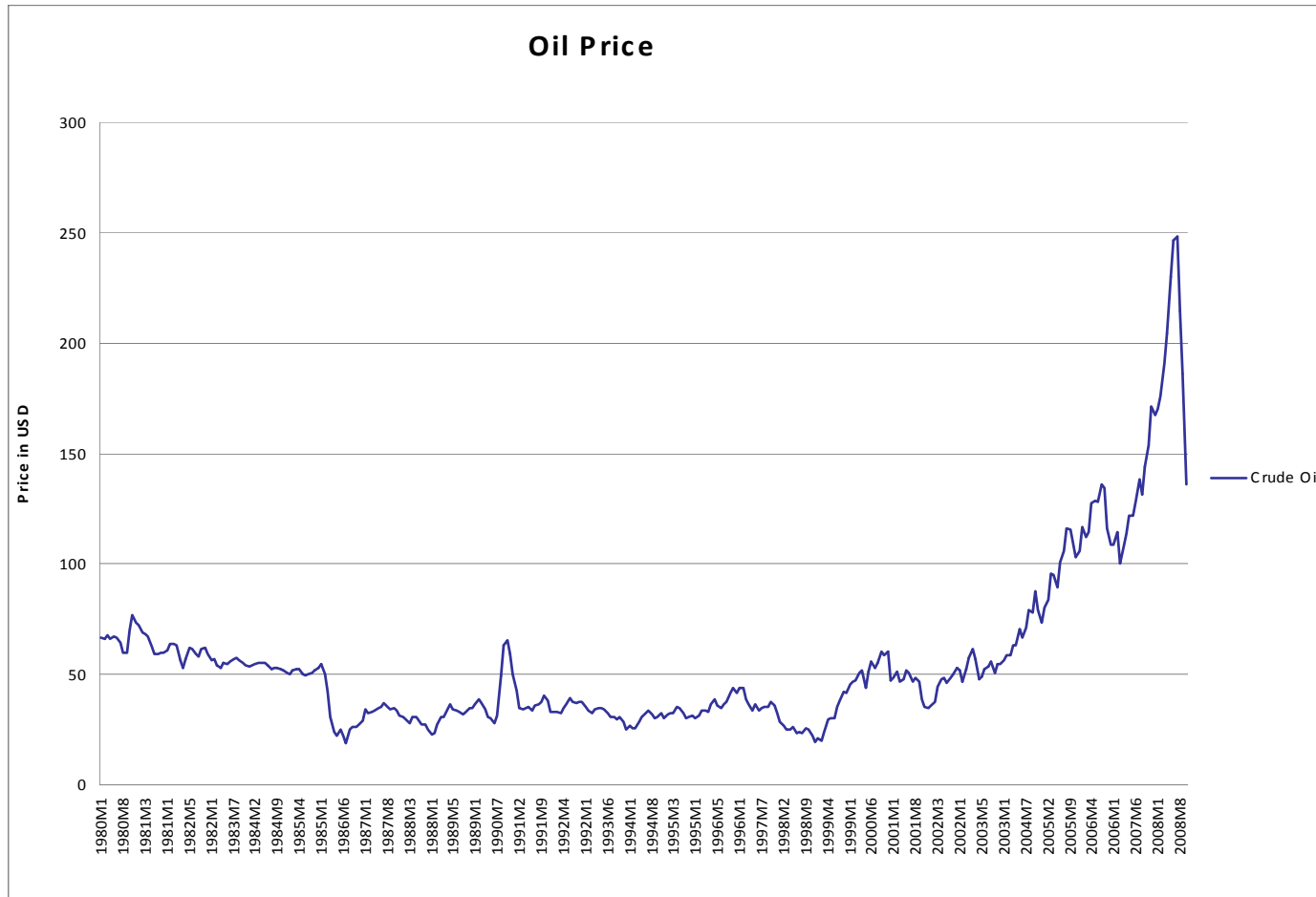
# II. Empirical Facts: Volatility and Trend



# II. Empirical Facts: Volatility and Trend

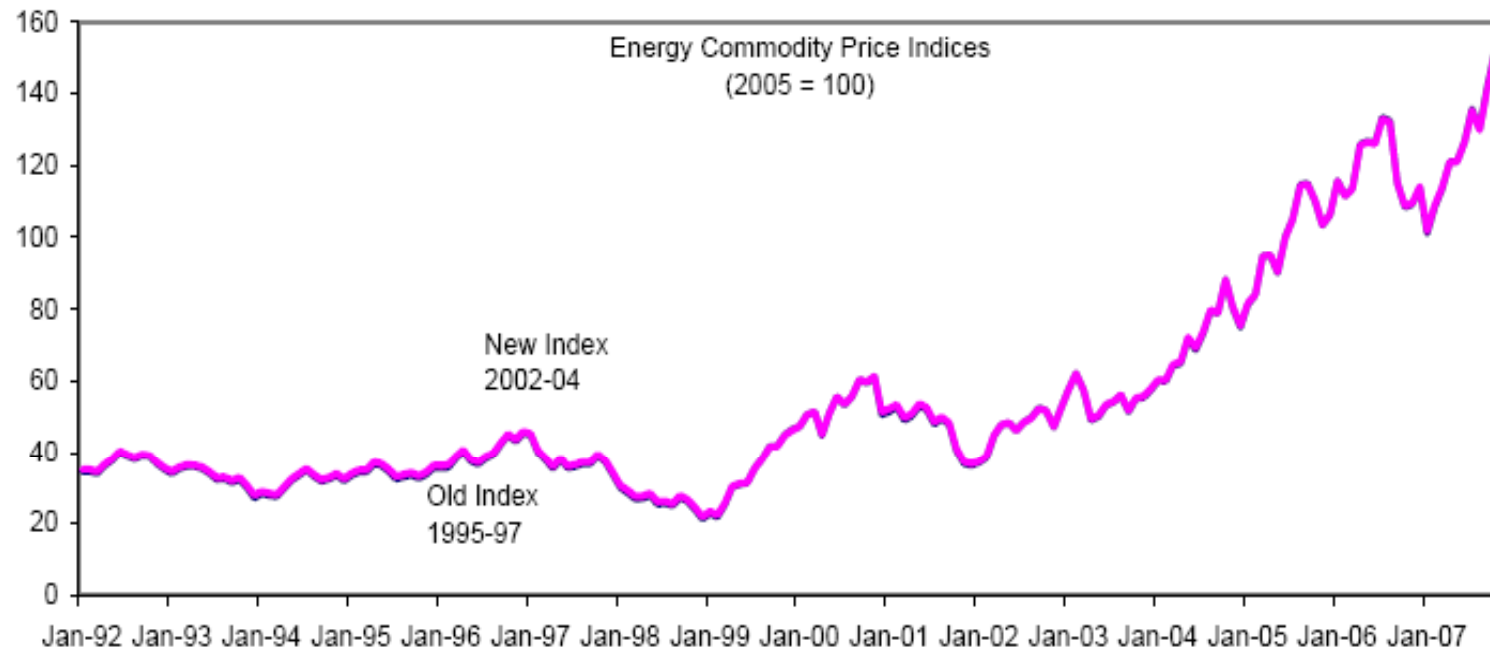


# II. Empirical Facts: Volatility and Trends



## II. Empirical Facts: Volatility and Trends

- IMF Energy Commodity Price Index



Source: IMF Energy and Commodities Surveillance Unit.

## II. Empirical Facts: Historical Trends and Volatilities, 1980 - 2008

	Agricultural Commodities			Energy				Metals				Stocks	U.S. GDP
	Commodity Food Price Index <sup>1</sup>	Commodity Agricultural Raw Materials Index <sup>2</sup>	Rice <sup>3</sup>	Crude Oil <sup>4</sup>	Crude Oil <sup>11</sup> (LT)	Coal <sup>5</sup>	Natural Gas <sup>6</sup>	Commodity Metals Price Index <sup>7</sup>	Copper <sup>8</sup>	Nickel <sup>9</sup>	Gold <sup>10</sup>	Dow Jones	Industrial Production Index
<b>Mean price change per month</b>	0.03%	0.07%	0.13%	0.21%	0.30%	0.32%	0.50%	0.13%	0.18%	0.18%	0.03%	0.69%	0.28%
<b>Volatility per month</b>	2.72%	3.10%	6.26%	8.17%	9.50%	5.09%	6.35%	4.39%	6.32%	8.44%	4.93%	4.42%	0.66%
<b>Mean price change per quarter</b>	0.10%	0.20%	0.40%	0.62%	0.89%	0.96%	1.52%	0.39%	0.55%	0.53%	0.10%	2.07%	0.83%
<b>Volatility per quarter</b>	4.70%	5.38%	10.84%	14.15%	16.45%	8.82%	11.00%	7.61%	10.95%	14.62%	8.53%	7.66%	1.14%

All samples from monthly data, 1980-2008. Source IMF.

Exception: The time series "Oil" are nominal annual oil prices from 1860 -2007.

<sup>1</sup>includes Cereal, Vegetable Oils, Meat, Seafood, Sugar, Bananas, and Oranges Price Indices

<sup>2</sup>includes Timber, Cotton, Wool, Rubber, and Hides Price Indices

<sup>3</sup>Five percent broken milled white rice, US\$ per metric tonne

<sup>4</sup>simple average of three spot prices; Dated Brent, West Texas Intermediate, and the Dubai Fateh

<sup>5</sup> Australian thermal coal, 12000- btu/pound, less than 1% sulfur, 14% ash, FOB Newcastle/Port Kembla, US\$ per metric tonne

<sup>6</sup> Russian Natural Gas border price in Germany, US\$ per thousands of cubic meters of gas

<sup>7</sup>includes Copper, Aluminum, Iron Ore, Tin, Nickel, Zinc, Lead, and Uranium Price Indices

<sup>8</sup>grade A cathode, LME spot price, CIF European ports, US\$ per metric tonne

<sup>9</sup>melting grade, LME spot price, CIF European ports, US\$ per metric tonne

<sup>10</sup>Price in US Dollars US\$/oz

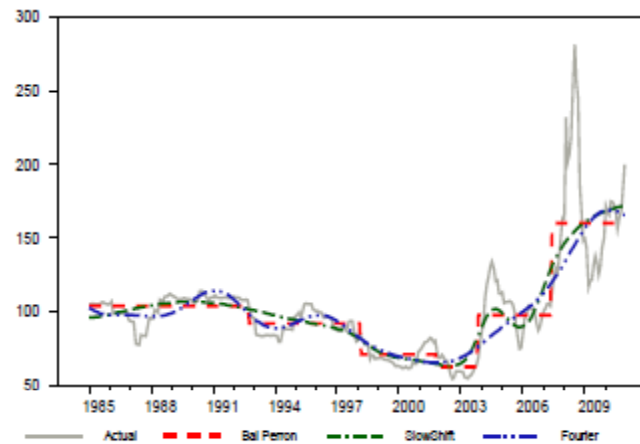
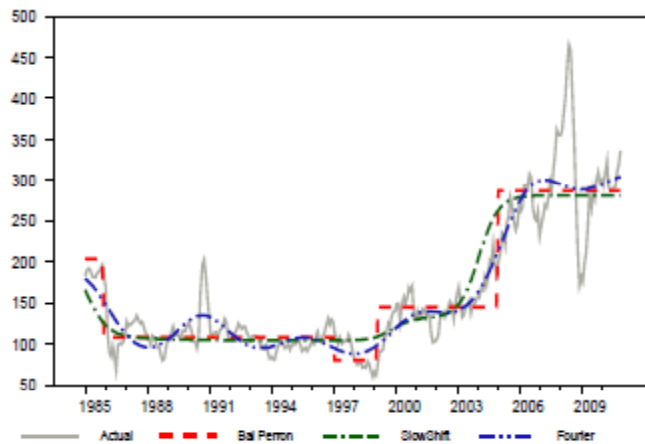
<sup>11</sup>Nominal annual oil prices, longterm: 1860 - 2007



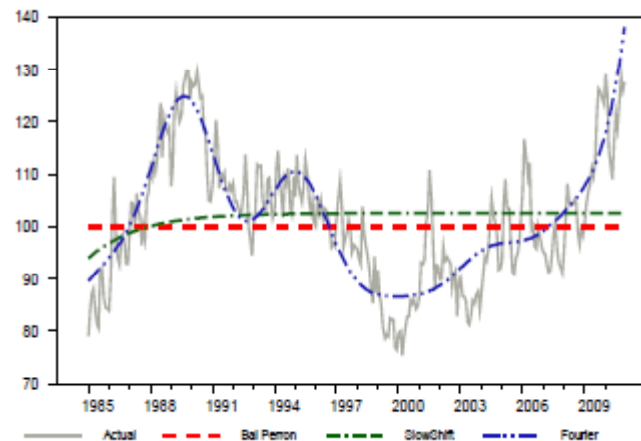
## II. Empirical Facts: Historical Trends and Volatilities, 1980 – 2010

Econometric work: Enders and Holt (2011), shifting mean

### Non-Renewable: Oil (left), Coal (right)



### Renewable: Food



### III. A Model: Conjectures on Price Trends

- **Renewable Resources:** Price volatility, but trend is uncertain
- **Non-Renewable (...Oil);** 1) Hotelling (1931): price monotonically rises, 2) Recent views: price first falls, then rises, Pindyck (1978)
- Note: We do not study volatility, see Pindyck (2001, 2003, 2004)

# III. A Model: Hotelling on Non-Renewable Resources

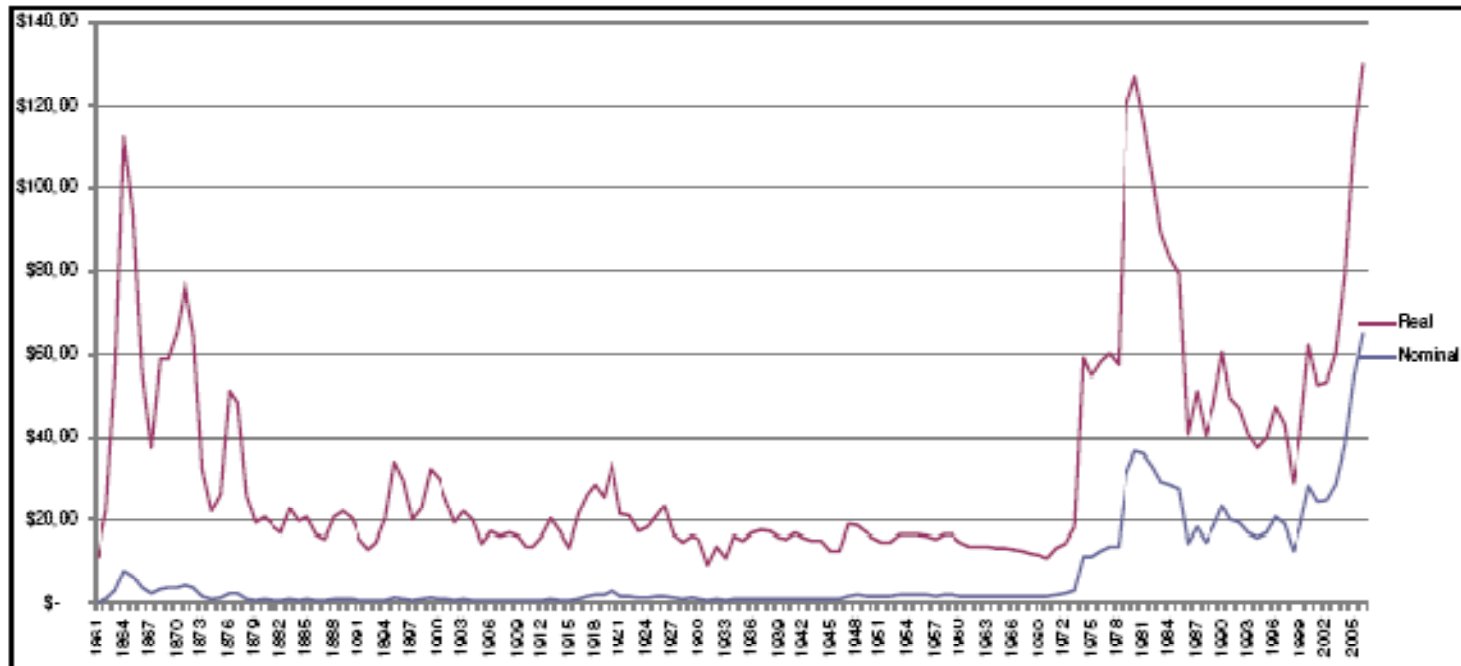
- **Non-Renewable Resource (1. Hotelling, 1931: Price rises with interest rate, 2. Pindyck, 1978: Price may first decline, before rising)**

Running down the stock ( $x_0 > 0$ )

$$\begin{aligned}\dot{x} &= -u(x) \\ x_0 - y &= \int_0^{\infty} u dt\end{aligned}$$

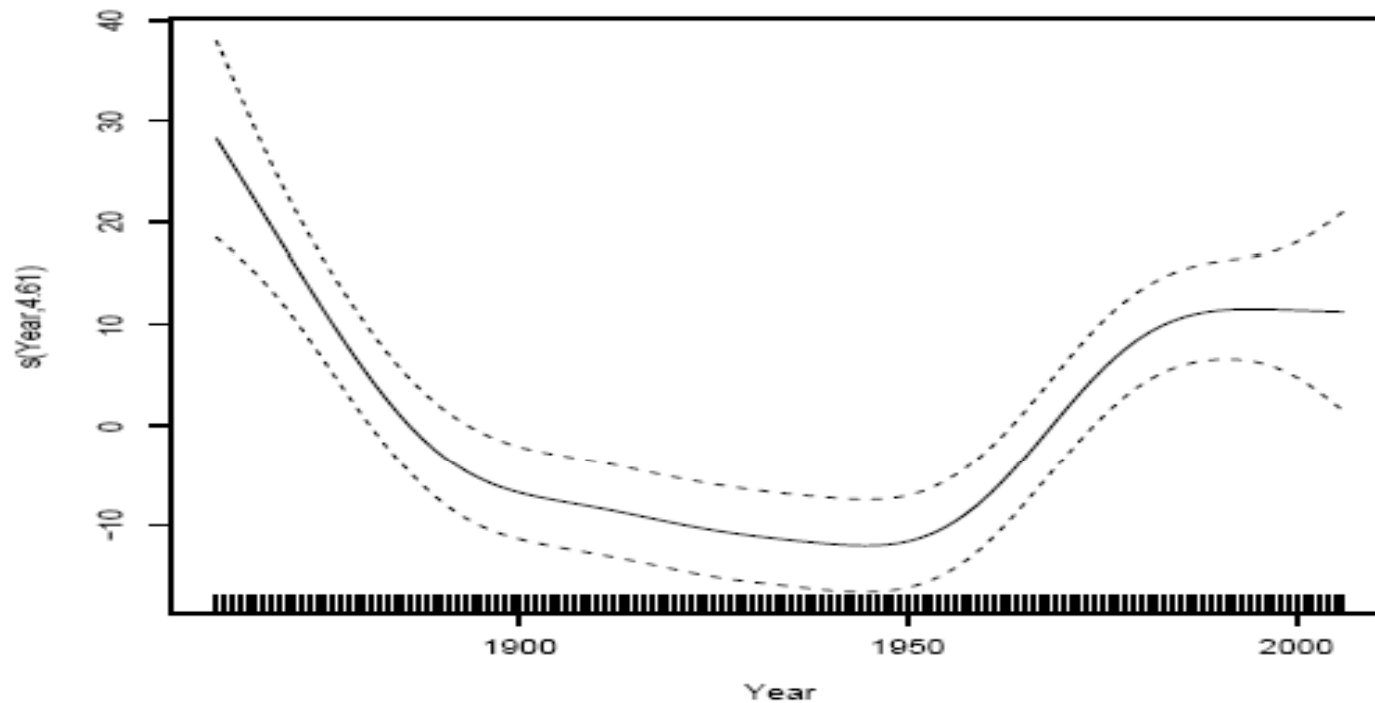
### III. A Model: Conjecture -- First Falling and then Rising Oil Price

- Nominal and real oil price, since 1880



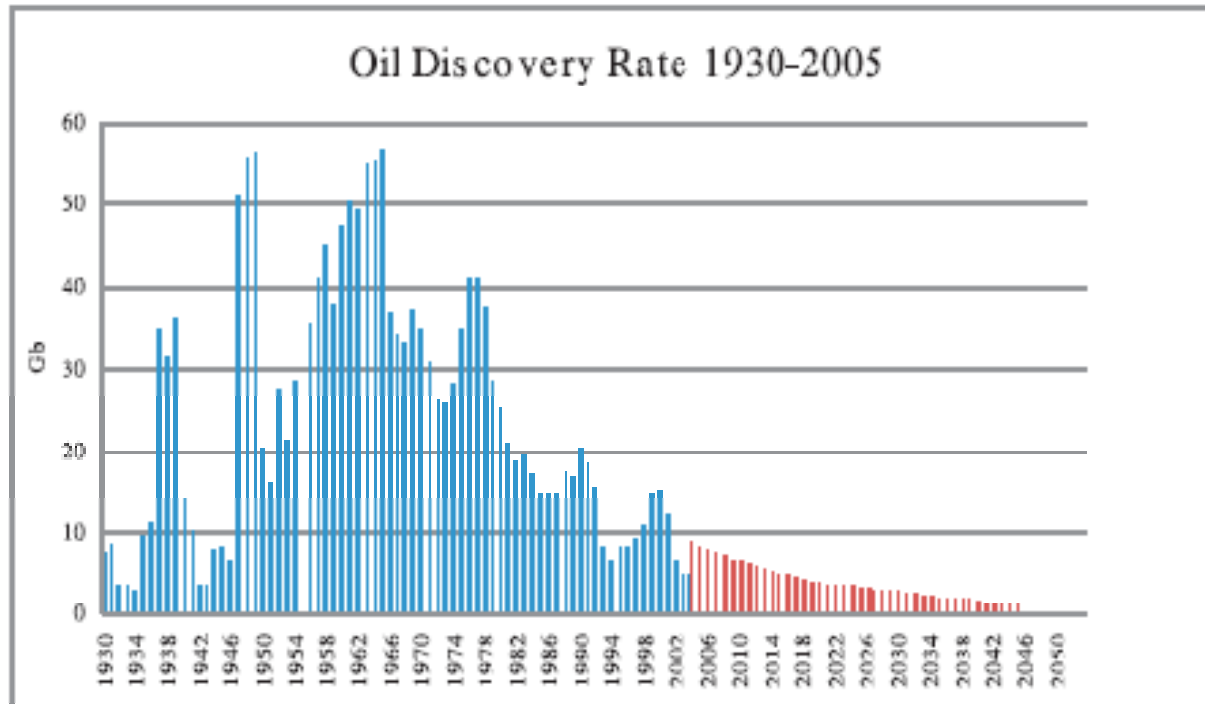
## IV. A Model: Conjecture -- First Falling and then Rising Oil Price

- Non-parameteric estimation of the oil price (Penalized Splines)



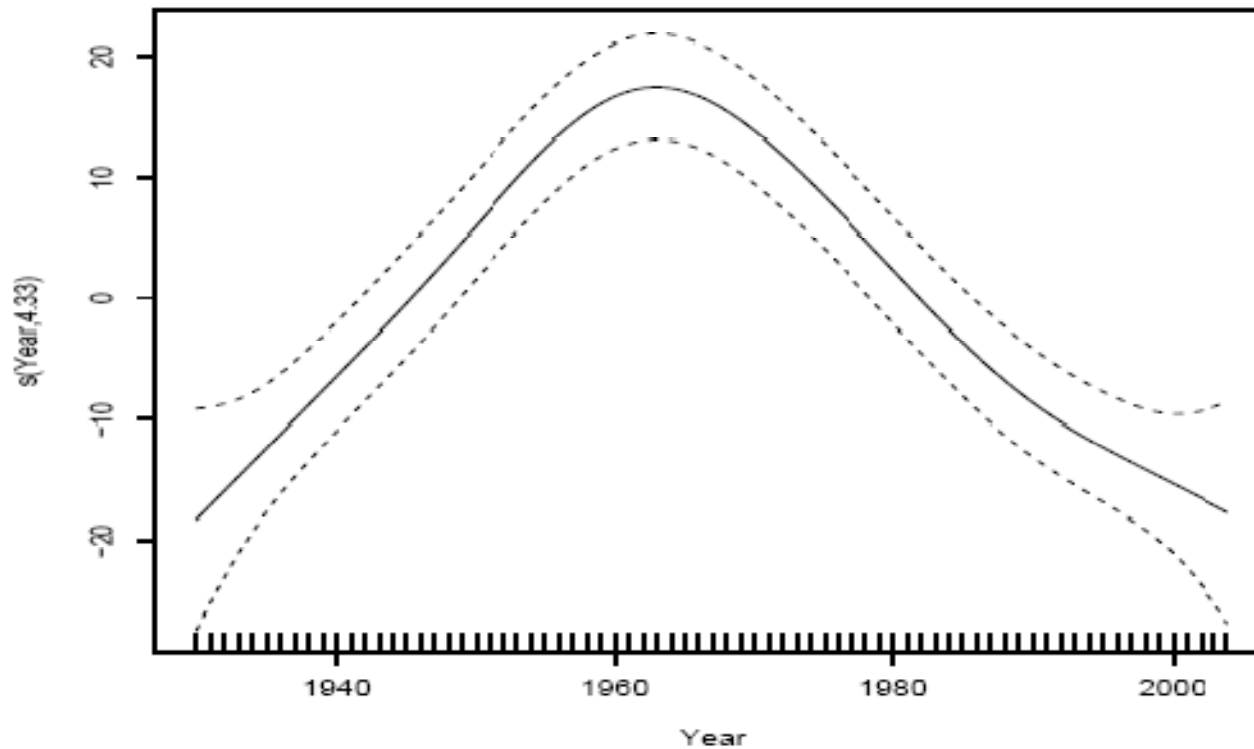
# IV. A Model: Conjecture--First Falling and then Rising Oil Price

- Discovery rates



# IV. A Model: First Falling and then Rising Oil Price

- Non-parameteric estimation of discovery rates (Penalized Splines)



# IV.1. A Model: Oil Discovery and Extraction—Infinite Horizon

Oil discovery and extraction model with discovery rates  
(using DP, Grüne/Semmler, 2004)

$$\max_u \int_0^{\infty} e^{-rt} (p(u, y) - C(x_o - y)) u dt,$$

$$\dot{x}^k = -u + f(x_o - y - x^k), \quad x^k(0) > 0$$

$$\dot{y} = u, \quad y(0) \geq 0$$

$$\lim_{t \rightarrow \infty} x^k \geq 0$$



## IV.1. A Model: Oil Discovery and Extraction– Infinite Horizon

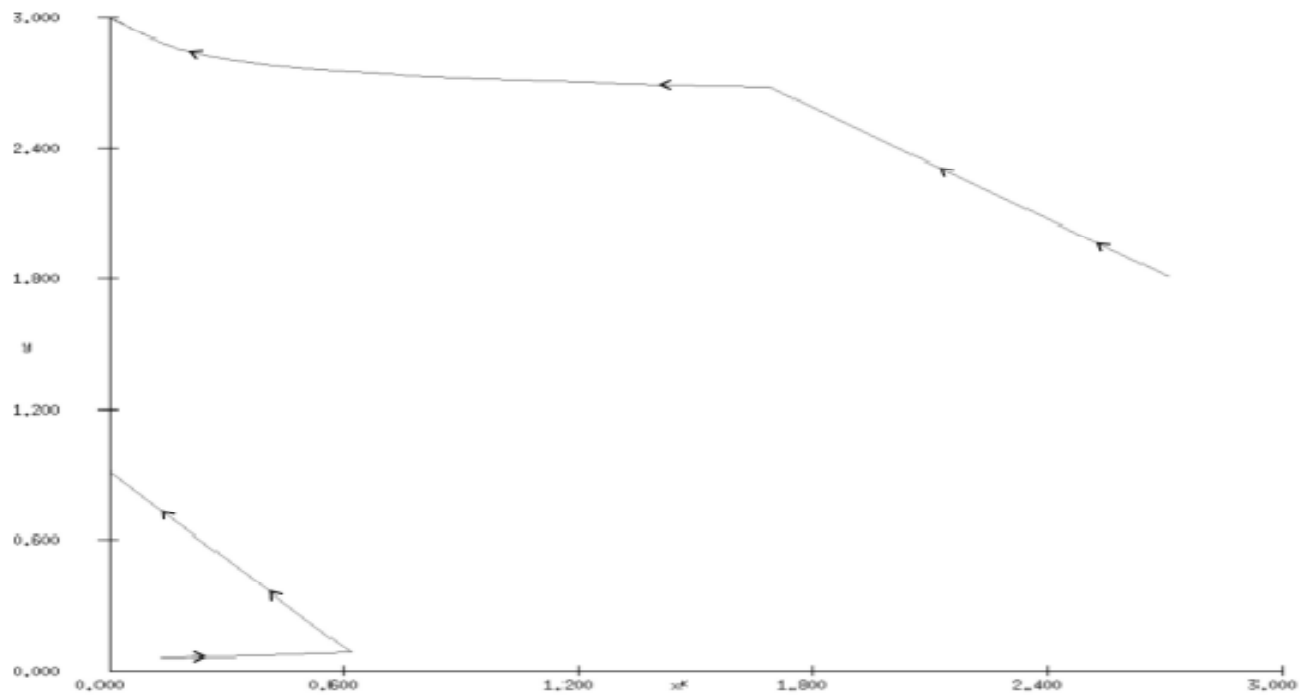
- Cost (exploration and extraction costs) and price

$$C(x_0 - y) = (\phi/2)(x_0 - y)^{-2}, \phi > 0$$

$$p(u, y) = \left( \frac{1}{\gamma + \eta u - \mu y} \right)^\alpha, \alpha > 0, \gamma > 0, \eta > 0, \mu \geq 0$$

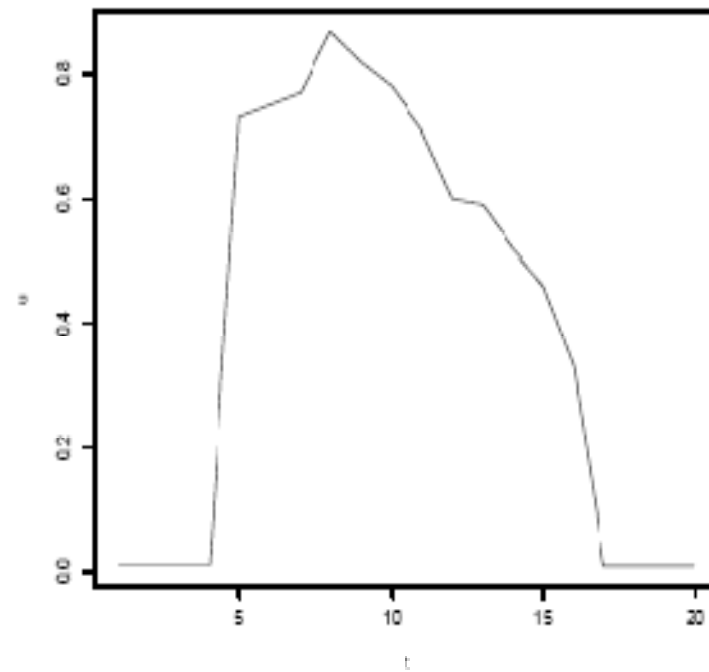
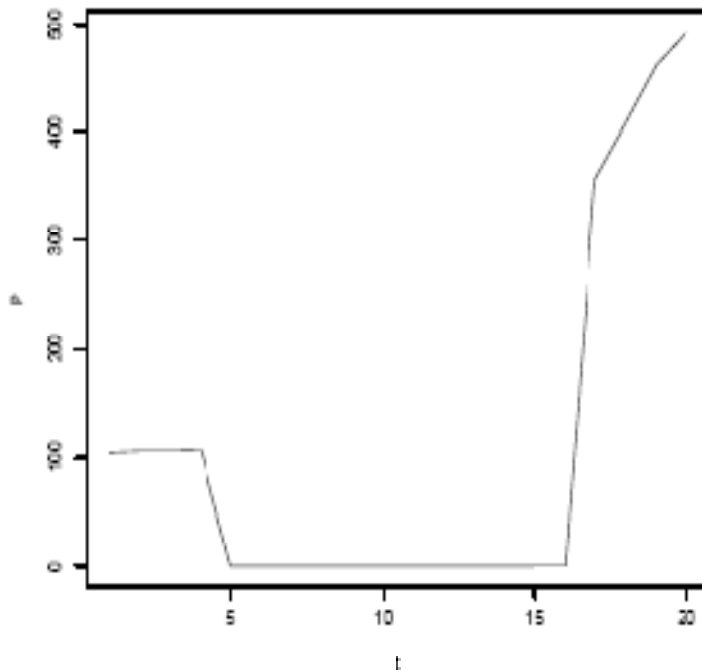
# IV.1. A Model: Oil Discovery and Extraction– Infinite Horizon

- Small and large known reserves



# IV.1. A Model: Oil Discovery and Extraction– Infinite Horizon

- Oil Price (left) and extraction rate (right) for small known reserves (Sinn's green paradox? see left)



## IV.2. A Model: Oil Discovery and Extraction– Finite Horizon (Maurer et al., 2010)

The model with finite horizon (using Büskens and Maurer, 2000)

$$\max_u \int_0^T e^{-rt} (p(u, y) - C(x_o - y)) u dt,$$

$$\dot{x}^k = -u + f(x_o - y - x^k), \quad x^k(0) > 0$$

$$\dot{y} = u, \quad y(0) \geq 0$$

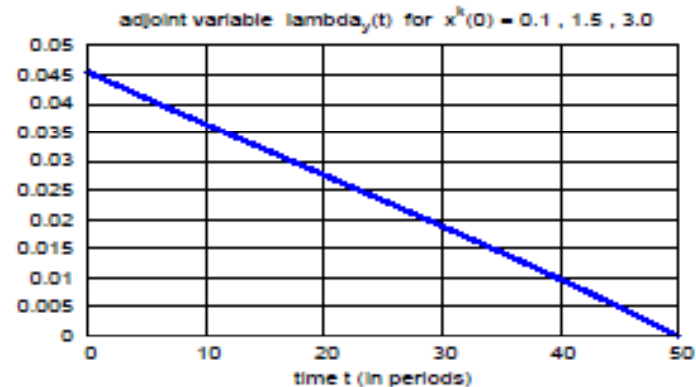
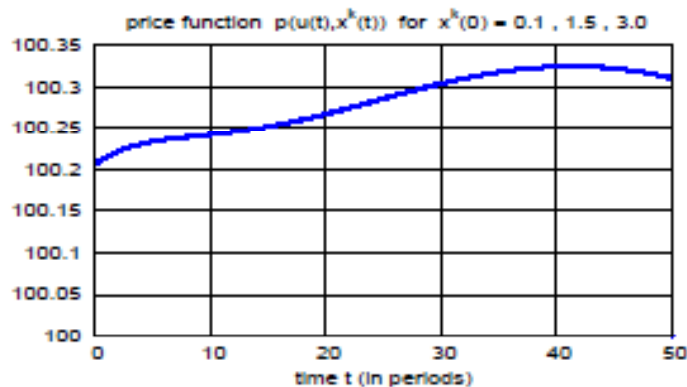
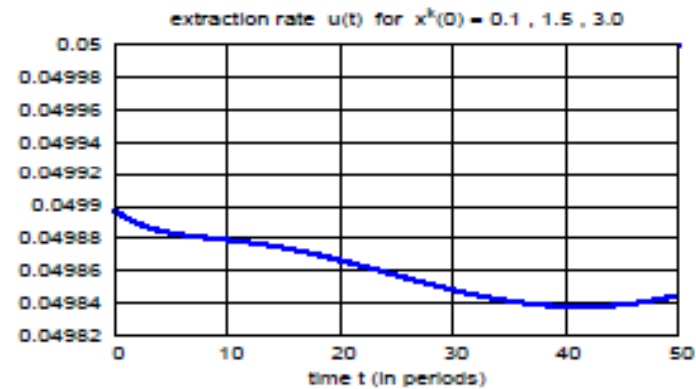
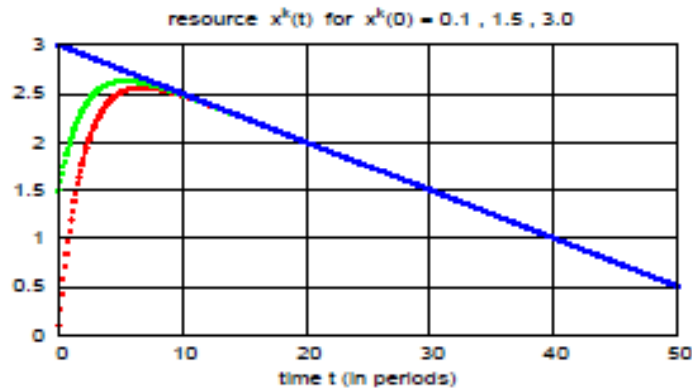
$$\lim_{t \rightarrow \infty} x^k \geq 0$$

$$\text{for } 0 \leq t \leq T, \quad p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

## IV.2. A Model: Oil Discovery and Extraction–Finite Horizon

$$p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

With finite horizon: Case  $T = 50, w_T = 0, \mu = 0, w_u = 1,$

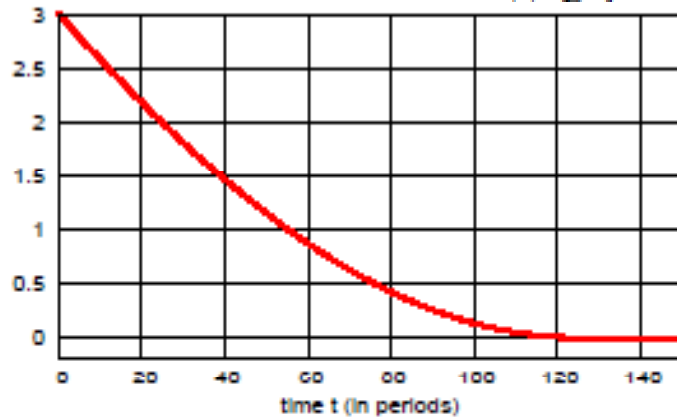


## IV.2. A Model: Oil Discovery and Extraction–Finite Horizon

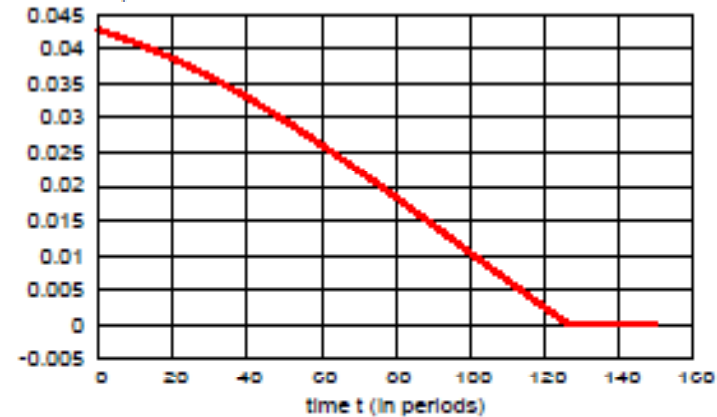
$$p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

With finite horizon: Case  $T = 150$ ,  $w_x = 0$ ,  $\mu = 0$   $w_u = 1$ .

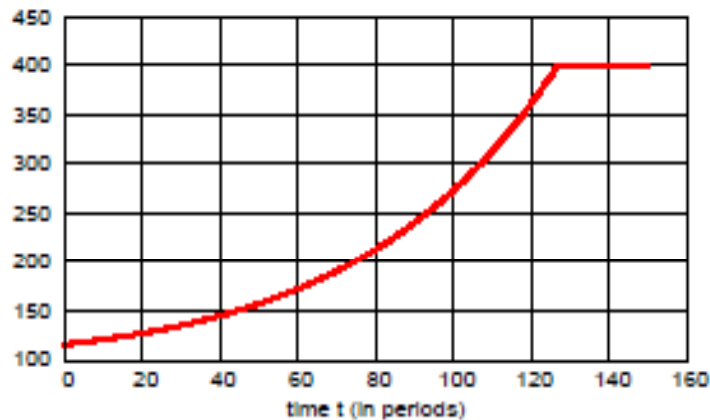
resource  $x^k(t)$  for  $x^k(0)$



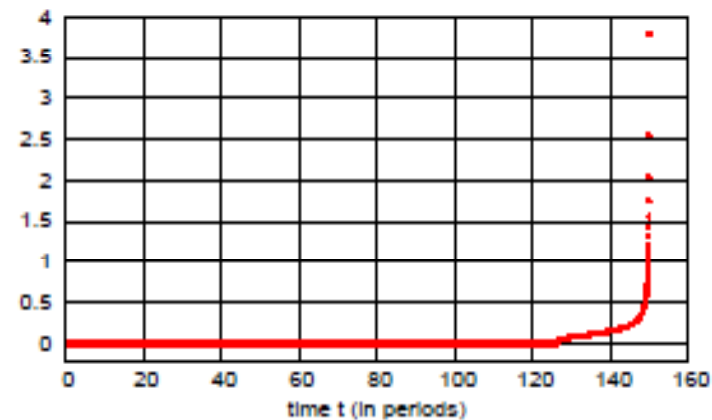
extraction rate  $u(t)$  for  $x^k(0) = 0.1, 1.5, 3.0$



price function  $p(u(t), x^k(t))$  for  $x^k(0) = 0.1, 1.5, 3.0$



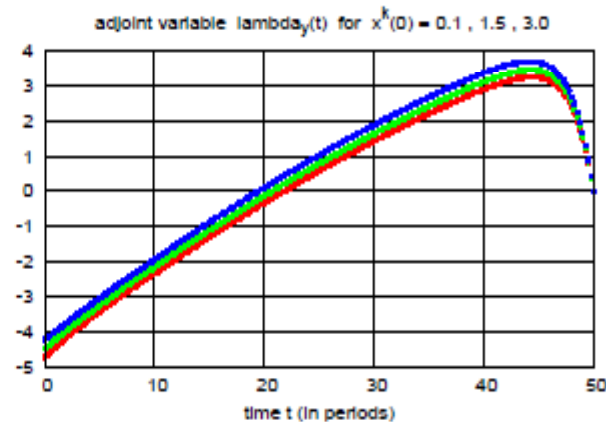
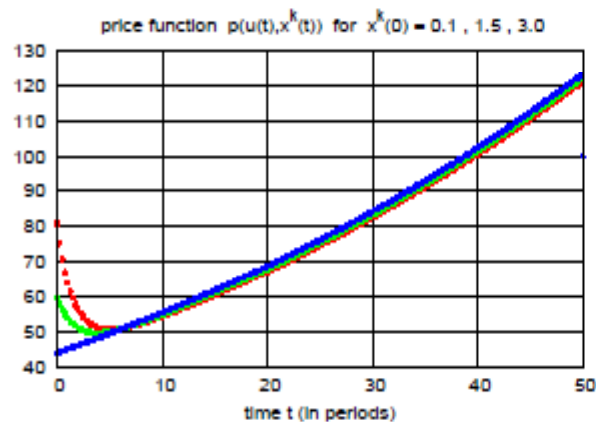
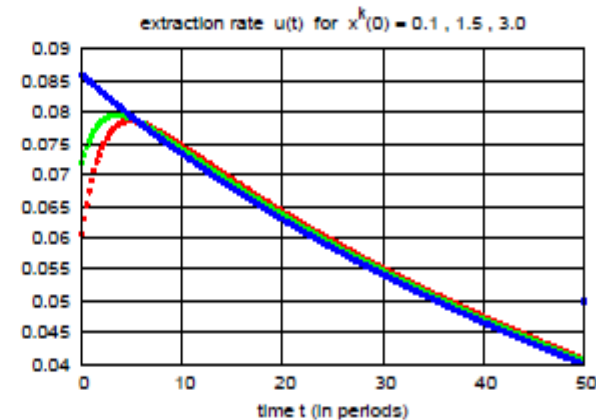
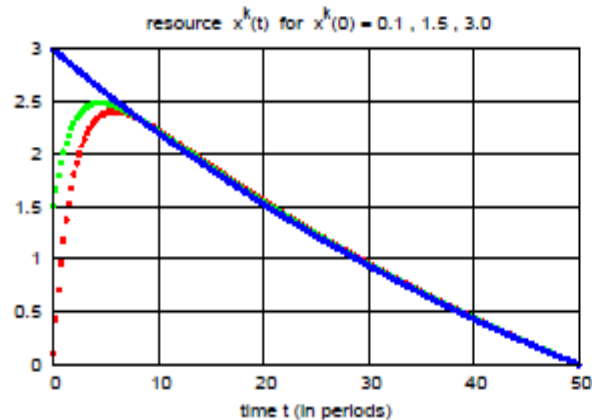
multiplier  $\eta(t)$  for state constraint  $x^k(t) \geq 0$



## IV.2. A Model: Oil Discovery and Extraction–Finite Horizon

$$p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

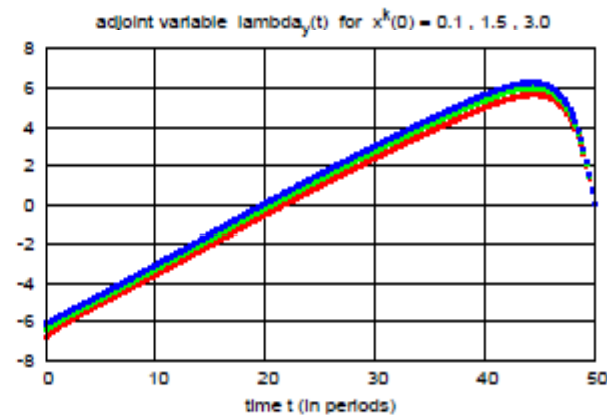
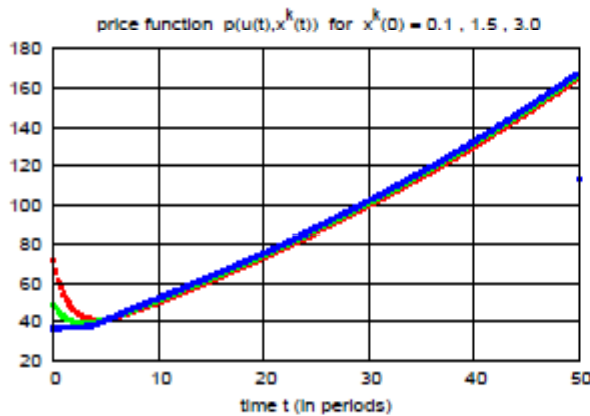
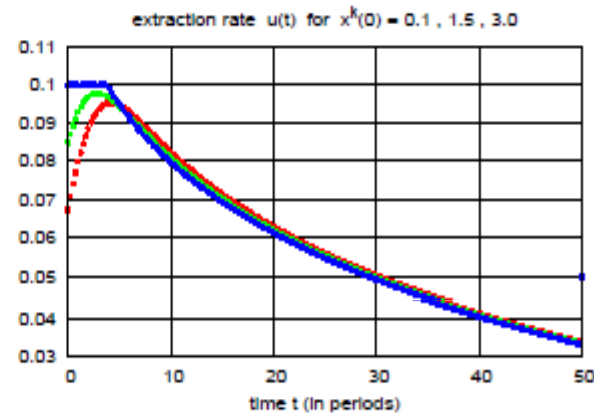
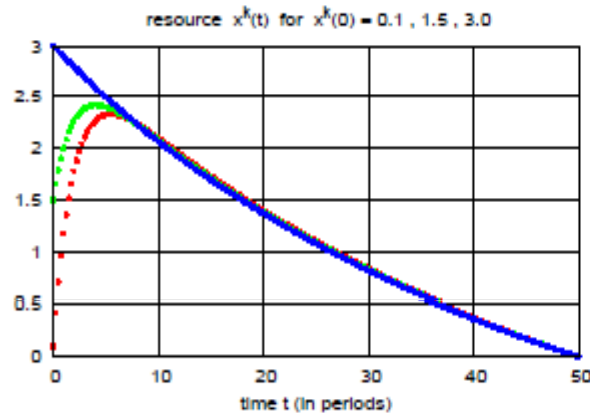
With finite horizon: Case  $T = 50$ ,  $w_x = 0.005$ ,  $\mu = 0$ ,  $w_u = 1$ .



## IV.2. A Model: Oil Discovery and Extraction–Finite Horizon

$$p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

With finite horizon: Case  $T = 50$ ,  $w_x = 0.005$ ,  $\mu = 0.002$   $w_u = 1$ .

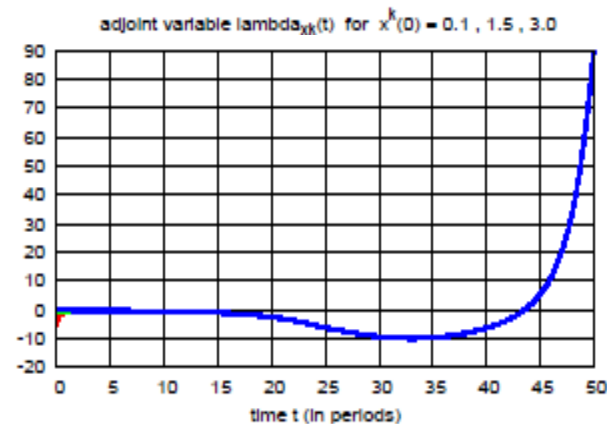
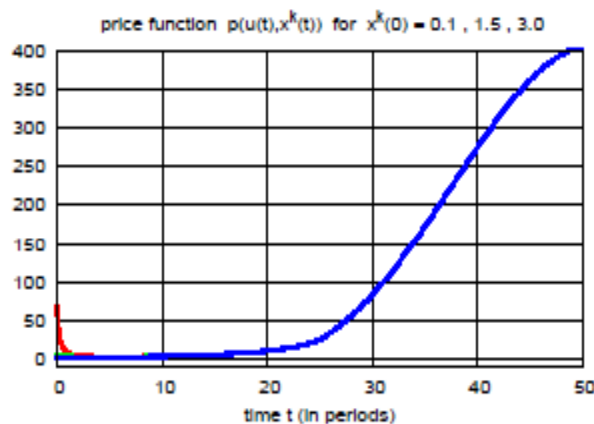
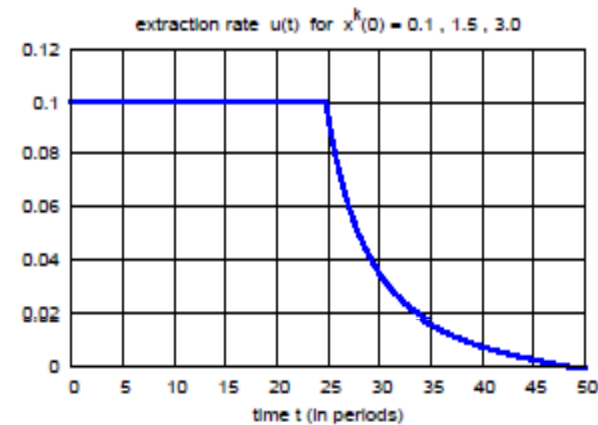
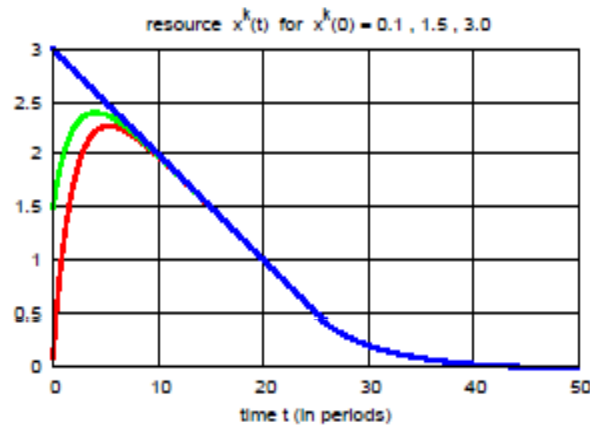




## IV.2. A Model: Oil Discovery and Extraction–Finite Horizon

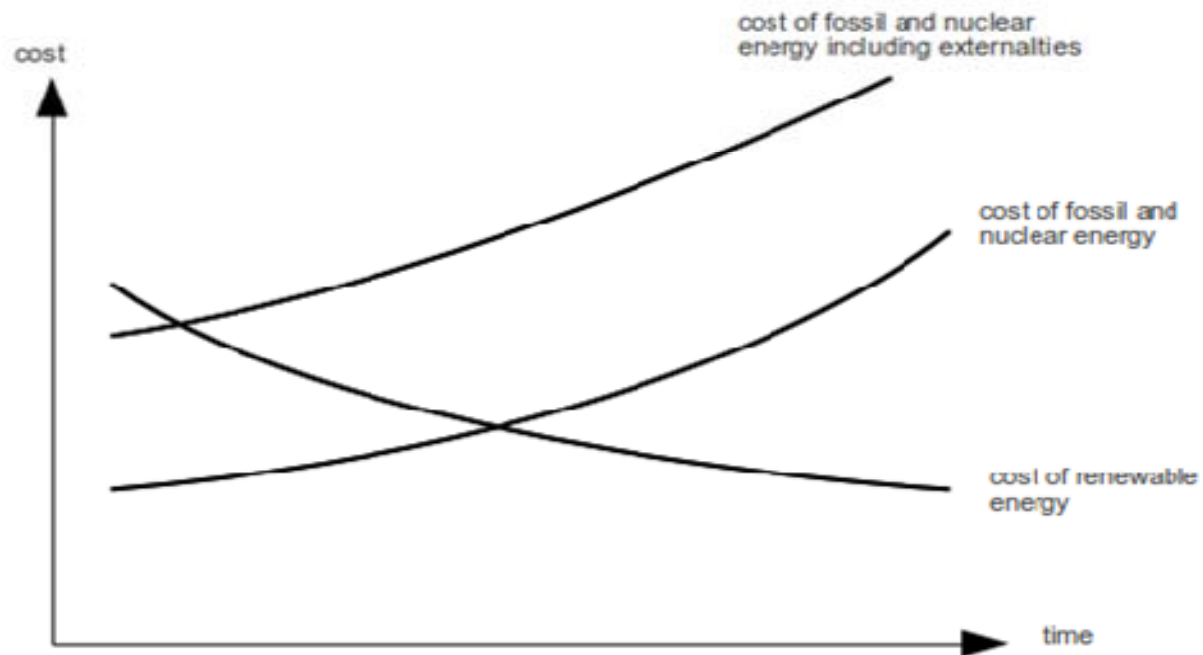
$$p(u, x^k, y) = \left( \frac{1}{\gamma + w_u \cdot u + w_x \cdot x^k - \mu y} \right)^\alpha$$

With finite horizon: Case  $T = 50$ ,  $w_u = 0.5$ ,  $w_x = 0.2$ ,  $\mu = 0$



# V. Fossil and Renewable Energy in an Optimal Growth Model (Data Source: IEA 2011)

Back to Empirical Results: Long run cost trends of Fossil Energy (including externalities) and Renewable Energy  
<http://www.economicpolicyresearch.org/economics-of-climate-change.html>



# V. Fossil and Renewable Energy in an Optimal Growth Model

(Greiner and Semmler, 2011)

Growth model with **externalities** from fossil and renewable energy:

$$\begin{aligned} E_f &= A_f u, \quad E_r = A_r K, \\ Y &= AE^\alpha = A(A_r K + A_f u)^\alpha \end{aligned}$$

$$\begin{aligned} \text{Max}_{\{C, u\}} \quad & \int_0^\infty e^{-rt} \left( \frac{C^{1-\sigma} (M - M_o)^{-\xi(1-\sigma)} - 1}{1-\sigma} \right) dt \\ \text{s. t} \quad & \dot{K} = Y - C - \delta K - a \cdot u \quad (\text{Market solution: } -\tau u - \Gamma + \theta \dot{K}) \\ & \dot{R} = -u \quad (\text{or alternatively: } \dot{R} = \alpha_1 R(\bar{R} - R) - u) \\ & \dot{M} = \beta_1 u - \mu(M - \kappa M_o) \\ & R(0) = R_0, K(0) = K_0, M(0) = M_0 \geq M_o \text{ given} \\ & \lim_{t \rightarrow \infty} e^{-rt} K(t) \geq 0, \lim_{t \rightarrow \infty} R(t) \geq 0, \lim_{t \rightarrow \infty} M(t) \geq M_o \end{aligned}$$

## VI. Conclusions

- Partial Model with fossil energy—how do prices move and does fossil fuel remain unextracted?
  - infinite horizon
  - finite horizon

We currently explore extensions of this type of model, including (further work with H. Maurer):

- delays for control or state equations
- discovery rate as control
- We have indicated how to build in fossil and renewable energy into optimal growth model with negative externality. Next step: to explore carbon tax and subsidy to renewable energy in a market economy, and the fate of R?

# Appendix 2: Speculation

- Eric Tham (2008), „Time Varying Factors behind the Oil Price“

