

Dynamics of the Warsaw Stock Exchange index as analysed by the Mittag-Leffler function

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Schedule

- Motivation and inspiration
- Model: fractional risings and relaxations decorated by oscillations
- Comparison with empirical data
- Microscopic model: hierarchical network of investors
- Conclusions

Motivation and inspiration

**WIG is the oldest index of the WSE.
Duration of its peaks covers ~3/4 time-range.
Definition of WIG analogous to S&P500.
Our aim is to describe:**

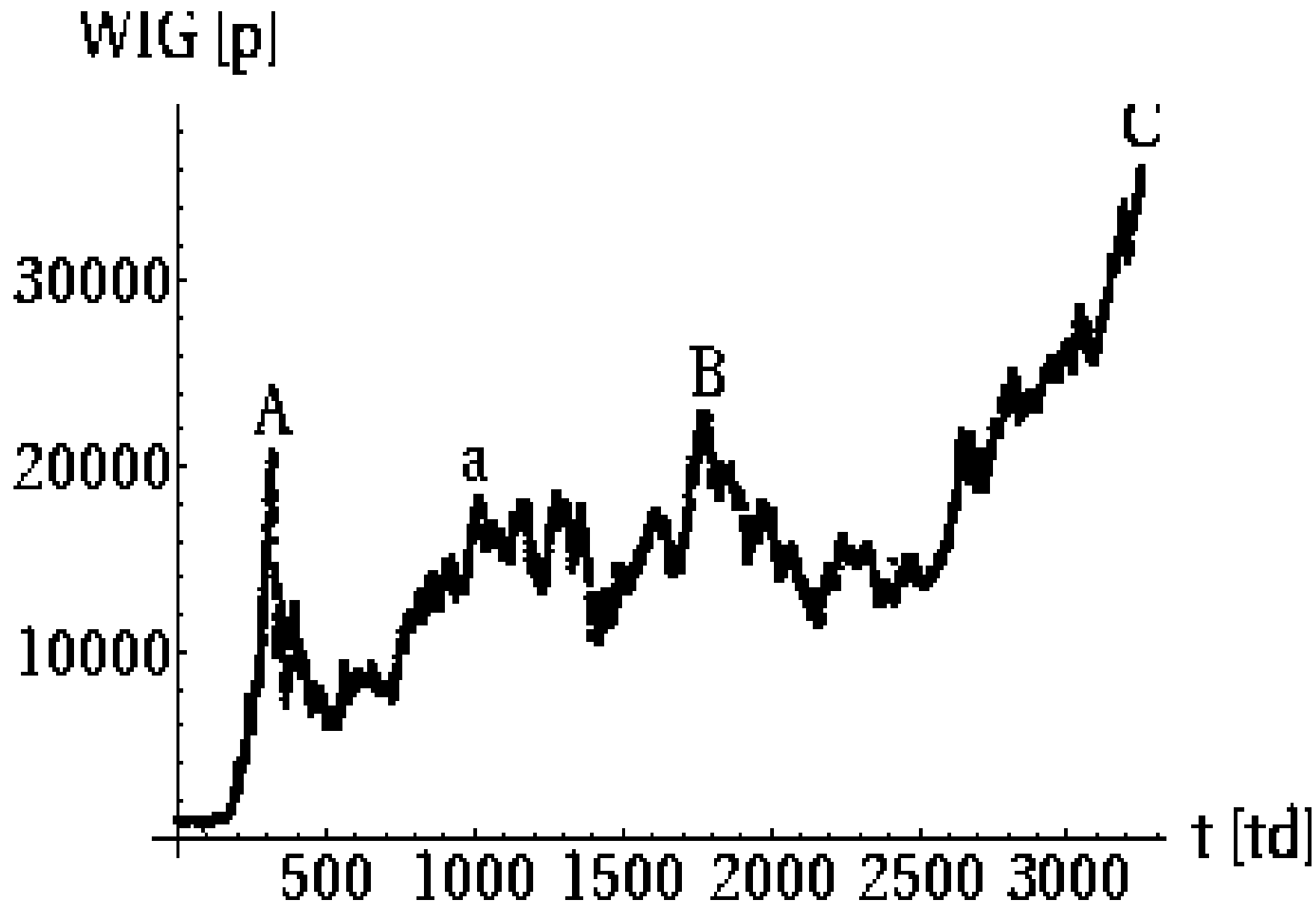
- Slowing down of risings and relaxations within intermediate (and possibly long) time-ranges of temporal maximums of WIG.
- Systematic oscillations of WIG within maximums.
- Possibly sudden increase of market activity in the vicinity of temporal maximums of WIG.
- Retarded feedback of WIG (a kind of memory): main effect responsible for temporal maximums.

Model: fractional risings, relaxations and oscillations.

Model consists of two steps

- Linear, ordinary differential equation of the first order without any retardation describing evolution of a hypothetical auxiliary index.
- **Glöckle-Nonnenmacher conjecture** which transforms this equation to a more general fractional differential one which already describes evolution of an empirical index. This was done in analogy to similar step performed for viscoelastic materials.

WIG dzienny na zamknięciu: 16.04.91 - 31.12.05



Definitions of indexes

Definition of **WIG** and S&P500

$$\mathbf{WIG}(t), \text{ S\&P500}(t) \sim K(t) \sum L_j(t) X_j(t)$$

$K(t)$: correction

$L_j(t)$: current number of stocks of j -th company
on stock market

$X_j(t)$: price of stock of j -th company

Model: fractional risings, relaxations and oscillations

Instantaneous decomposition of $WIG(t)$

$$WIG(t) = A U(t) + B V(t) \quad (\geq 0)$$

$U(t)$: instantaneous offset between demand and supply

$V(t)$: volume trade

A, B, C, D, E : coefficients

Instantaneous dynamics

$$\frac{dV(t)}{dt} = C V(t) + D WIG(t) + E \frac{dWIG(t)}{dt}$$

Model: fractional risings, relaxations and oscillations

Convenient equation without $V(t)$:

$$\frac{dWIG(t)}{dt} = -\frac{1}{\tau} WIG(t) \pm \frac{A'}{\tau_0} U(t) + A' \frac{dU(t)}{dt}$$

$$A' = \frac{A}{1 - BE}, \quad \tau_0 = \frac{1}{(C)}, \quad \tau = \left(\frac{C + BD}{1 - BE} \right)^{-1}$$

Conjecture: usual differentiations are replaced by fractional differentiations



Model: fractional risings, relaxations and oscillations

Dynamics of WIG is described by the linear fractional differential equation.

Free case $U=0$ (for $0 < \alpha \leq 1$):

$$\frac{dWIG(t)}{dt} = -\frac{1}{\tau^\alpha} {}_0D_t^{1-\alpha} WIG(t), \quad 0 < \alpha \leq 1$$

$${}_0D_t^{1-\alpha} WIG(t) = \frac{d}{dt} {}_0D_t^{-\alpha} WIG(t)$$

$${}_0D_t^{-\alpha} WIG(t) = \frac{1}{\Gamma(\alpha)} \int \frac{WIG(y)}{(t-y)^{1-\alpha}} dy$$

Retarded feedback well seen

Free solution

$$WIG(t) = WIG(0) E_{\alpha} \left(- \left(\frac{t}{\tau} \right)^{\alpha} \right), \quad 0 < \alpha \leq 1$$

Mittag-Leffler fnction (generalised exponent)

$$E_{\alpha} \left(- \left(\frac{t}{\tau} \right)^{\alpha} \right) = \sum \frac{\left(- (t/\tau)^{\alpha} \right)^n}{\Gamma(1 + \alpha n)}$$

Characteristic limits of Mittag-Leffler function

Stretched exponential function or
Kohlrausch-Williams-Watts (KWW) decay:

$$E_{\alpha} \left(- \left(\frac{t}{\tau} \right)^{\alpha} \right) \approx \exp \left(- \left(\frac{t}{\tau} \right)^{\alpha} \right), \quad 0 < \alpha \leq 1, \quad t \ll \tau$$

Power-law or Nutting law:

$$E_{\alpha} \left(- \left(\frac{t}{\tau} \right)^{\alpha} \right) \approx \frac{1}{\Gamma(1-\alpha)} \frac{1}{(t/\tau)^{\alpha}}, \quad 0 < \alpha \leq 1, \quad t \gg \tau$$

Model: fractional risings, relaxations and oscillations

Dynamics of WIG is described by the linear fractional differential equation.

Full case (for $0 < \alpha \leq 1$):

$$\frac{dWIG(t)}{dt} = -\frac{1}{\tau^\alpha} {}_0D_t^{1-\alpha} WIG(t) \mp \frac{A'}{\tau_0^\alpha} {}_0D_t^{1-\alpha} U(t) + A' \frac{dU(t)}{dt}$$

$U(t)$ – instantaneous offset between demand and supply.

For example, a wiggle:

$$U(t) \sim \exp(i(\omega - \Delta\omega)t) + \exp(i(\omega + \Delta\omega)t)$$

Approximate solution

$$WIG((t - t_{MAX})) \sim E_{\alpha} \left(- \left(\frac{(t - t_{MAX})}{\tau} \right)^{\alpha} \right) + C \cos(\omega(t - t_{MAX})) \cos(\Delta\omega(t - t_{MAX}))$$

Comparison with empirical data gives:

$$0.25 \leq \alpha \leq 0.42$$

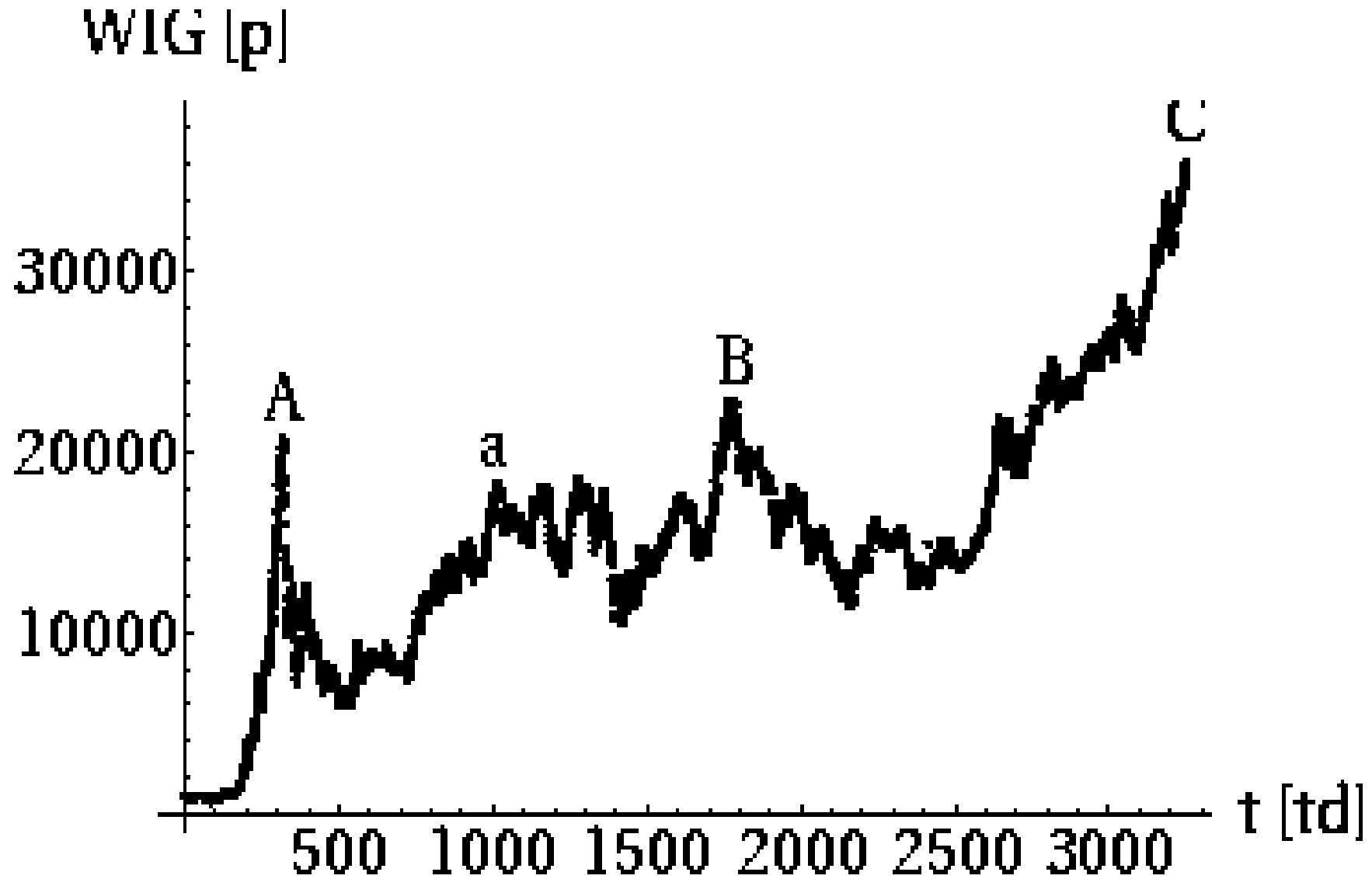
$$60 \leq \tau \leq 320$$

$$0.1 \leq \omega \leq 0.2$$

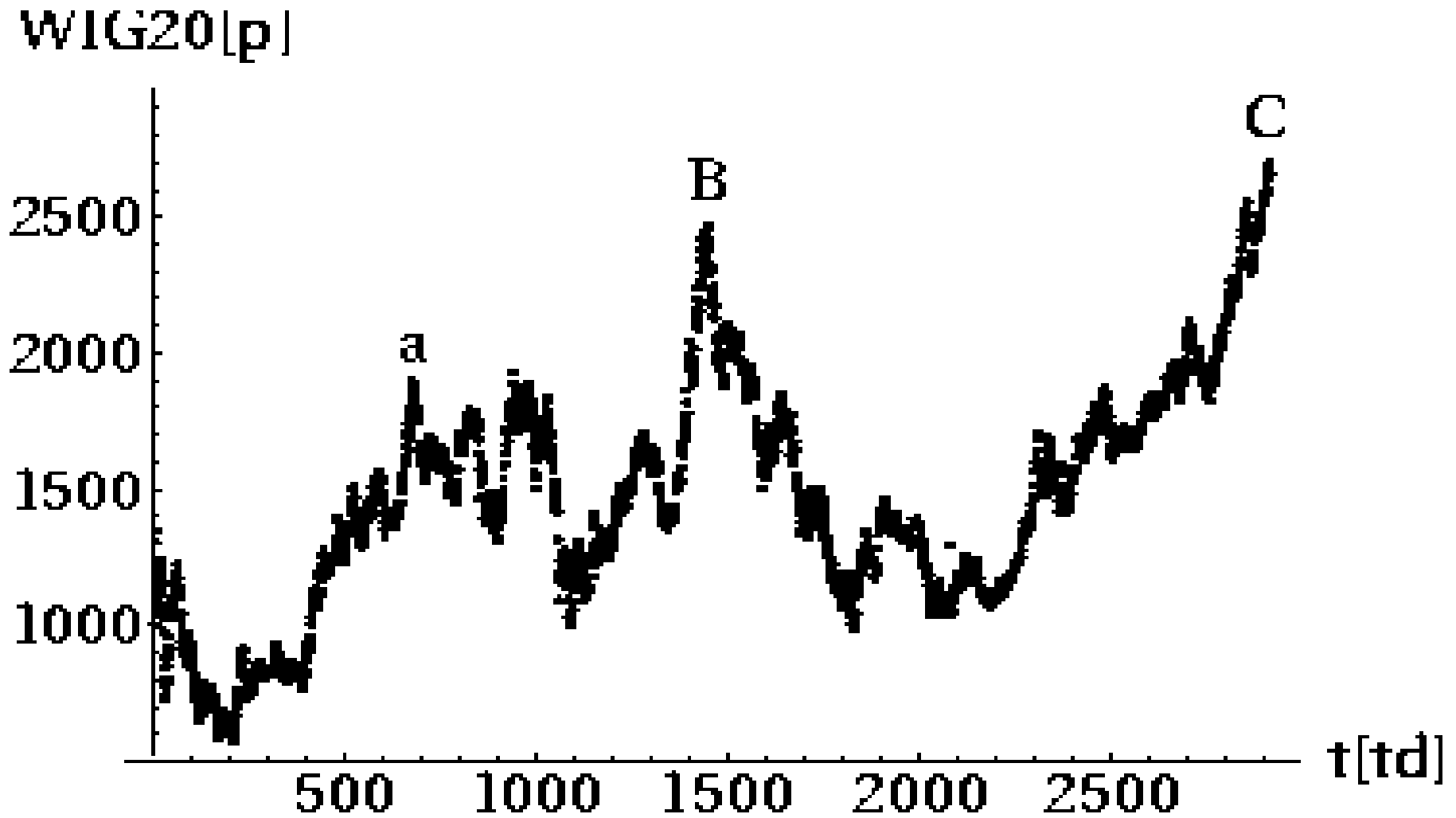
$$0.01 \leq \Delta\omega \leq 0.02$$

$$1500 \leq |C| \leq 4500$$

Daily closing price of WIG

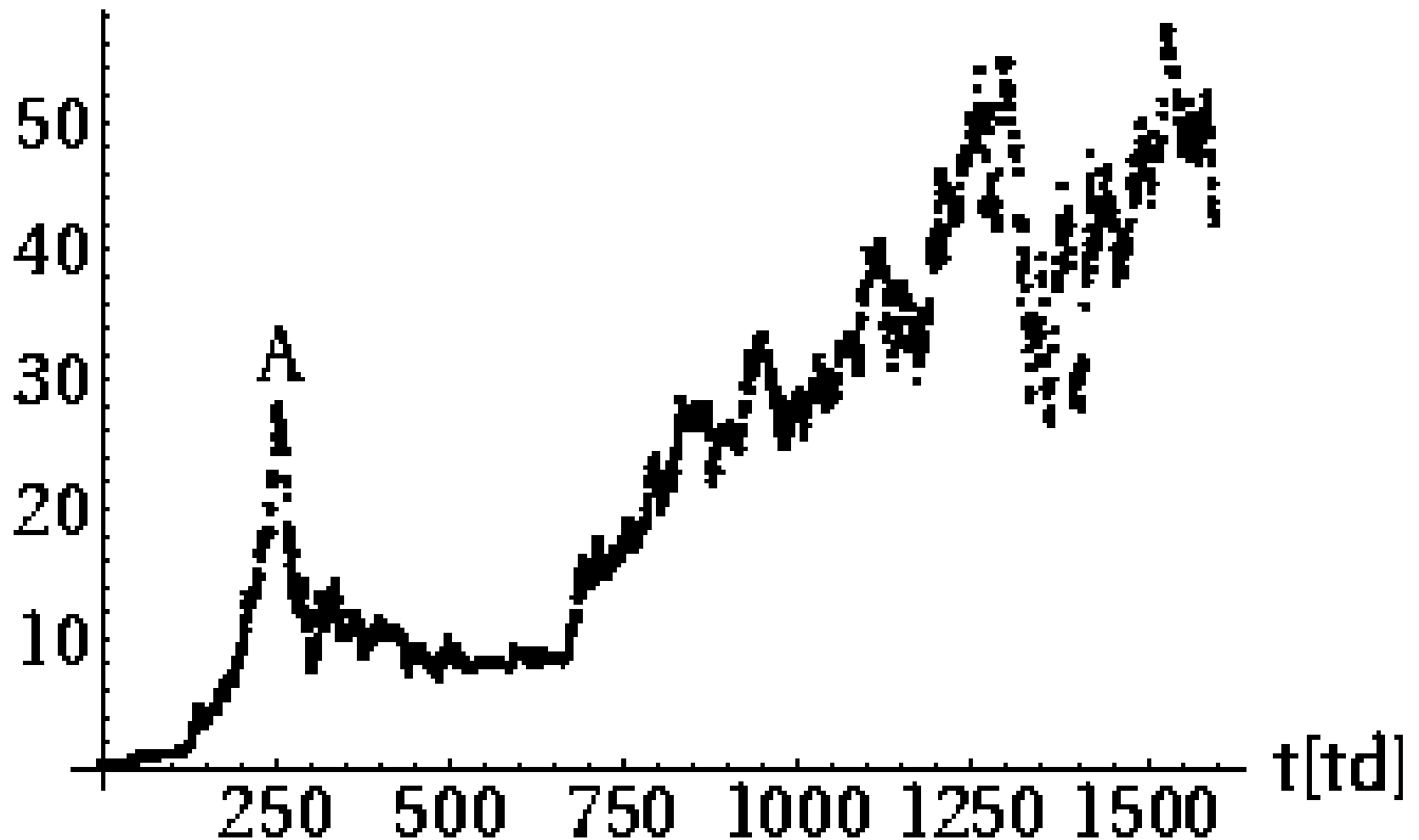


Daily closing price of WIG20



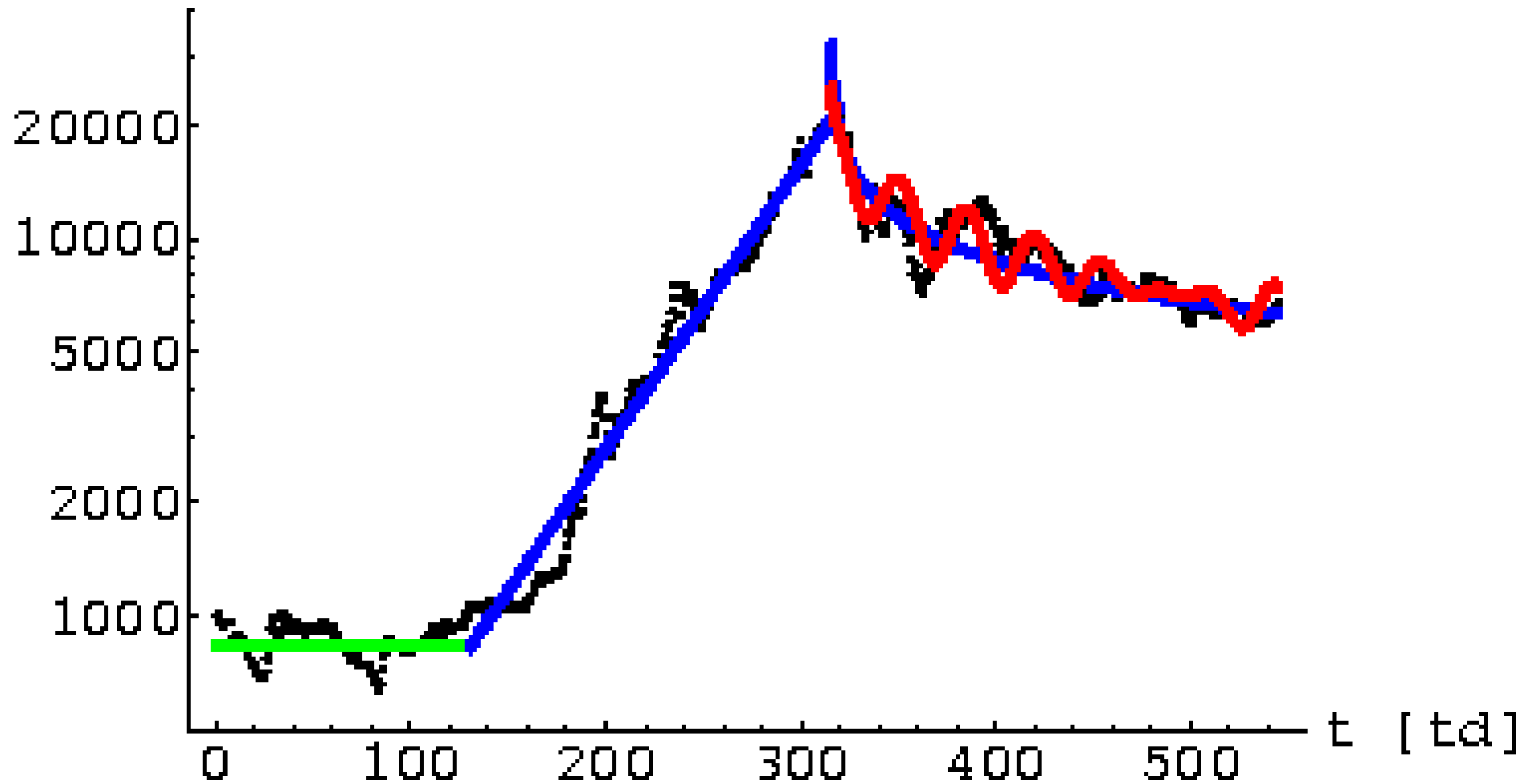
Daily closing price of Elektrim-Vivendi Company

Stock price [PLN]



Temporal maximum A of WIG

Log(WIG) [Log(p)]



Temporal maximum a of WIG

Log(WIG) [Log(p)]

30000

20000

15000

0

50

100

150

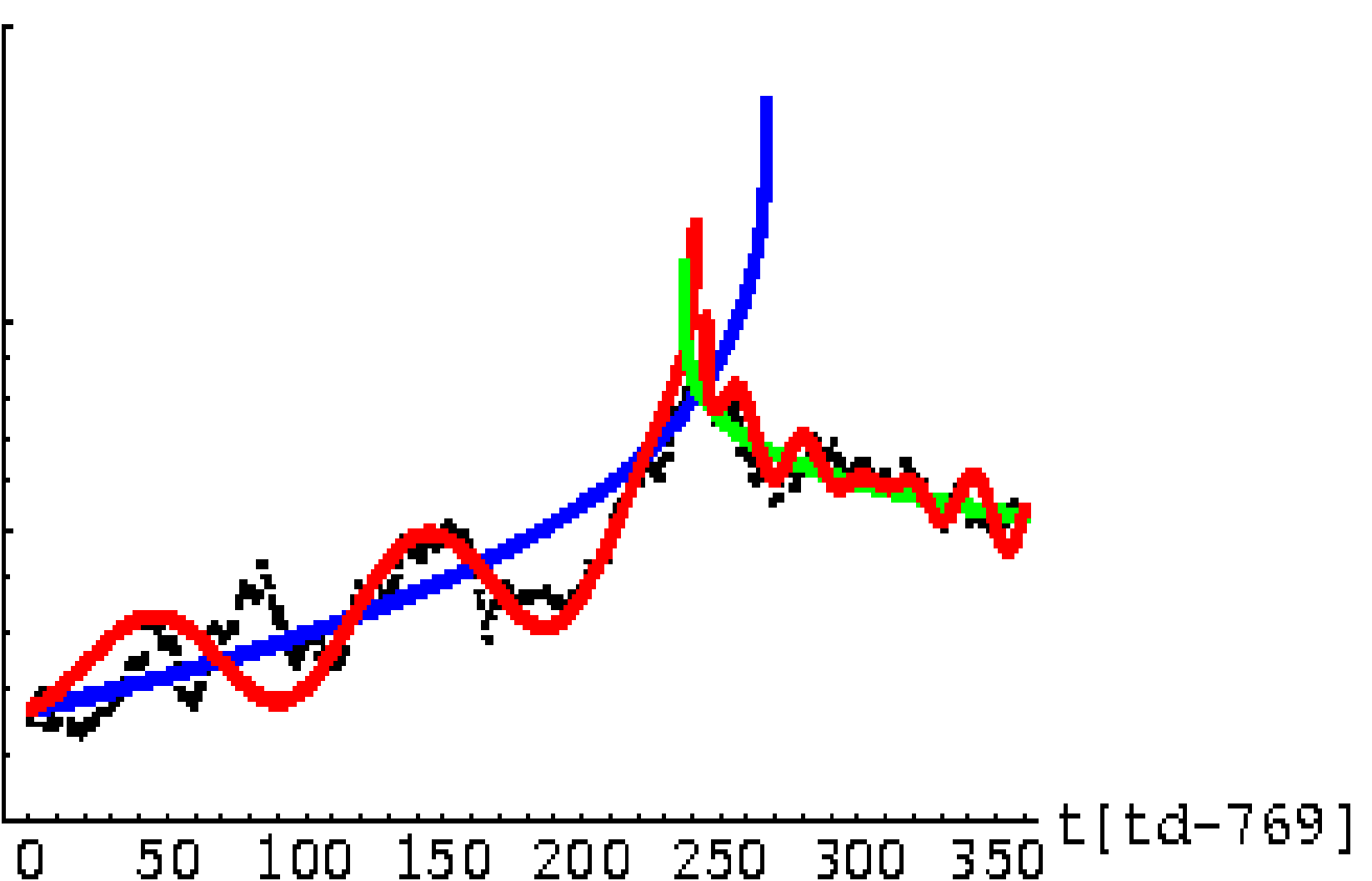
200

250

300

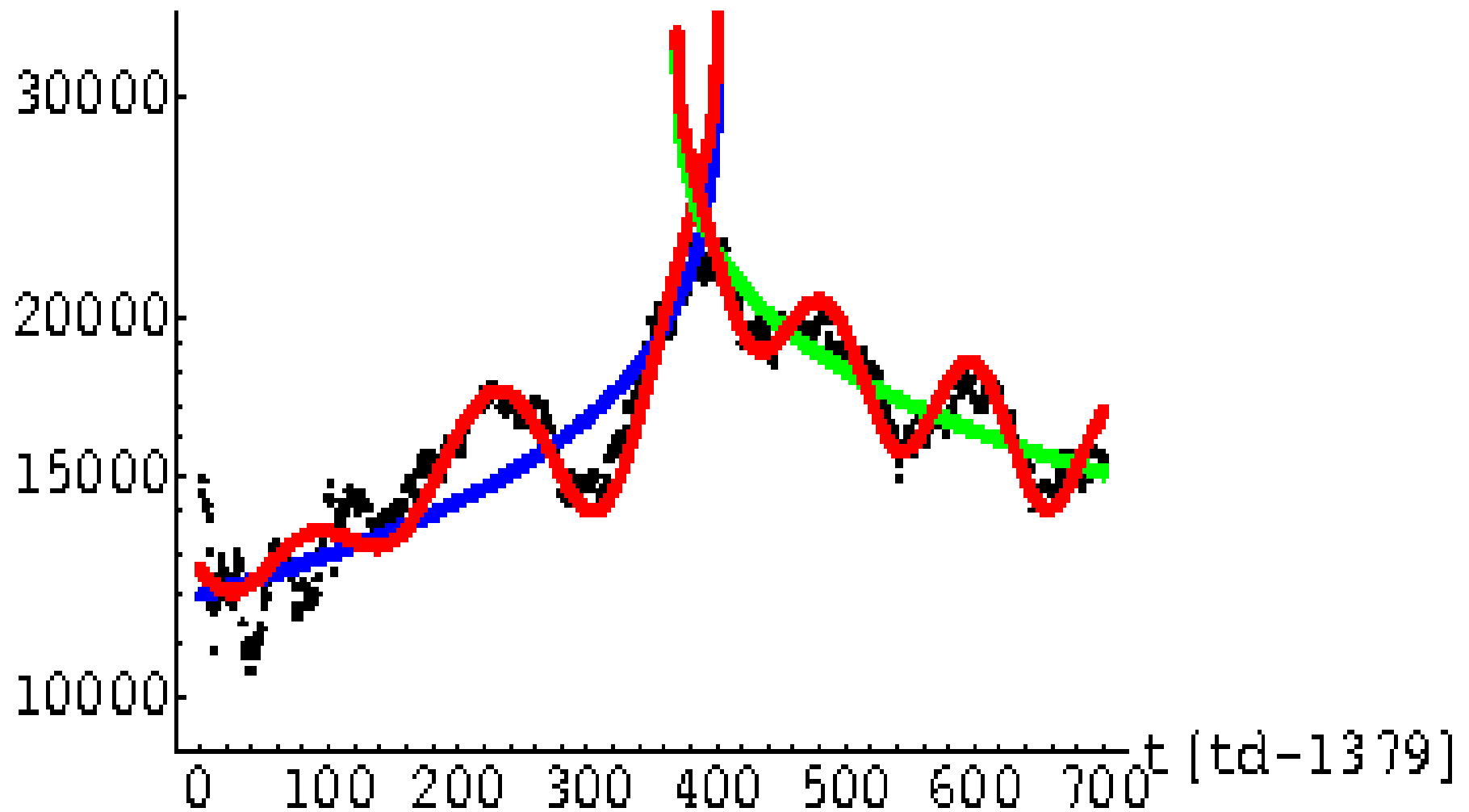
350

t [td-769]



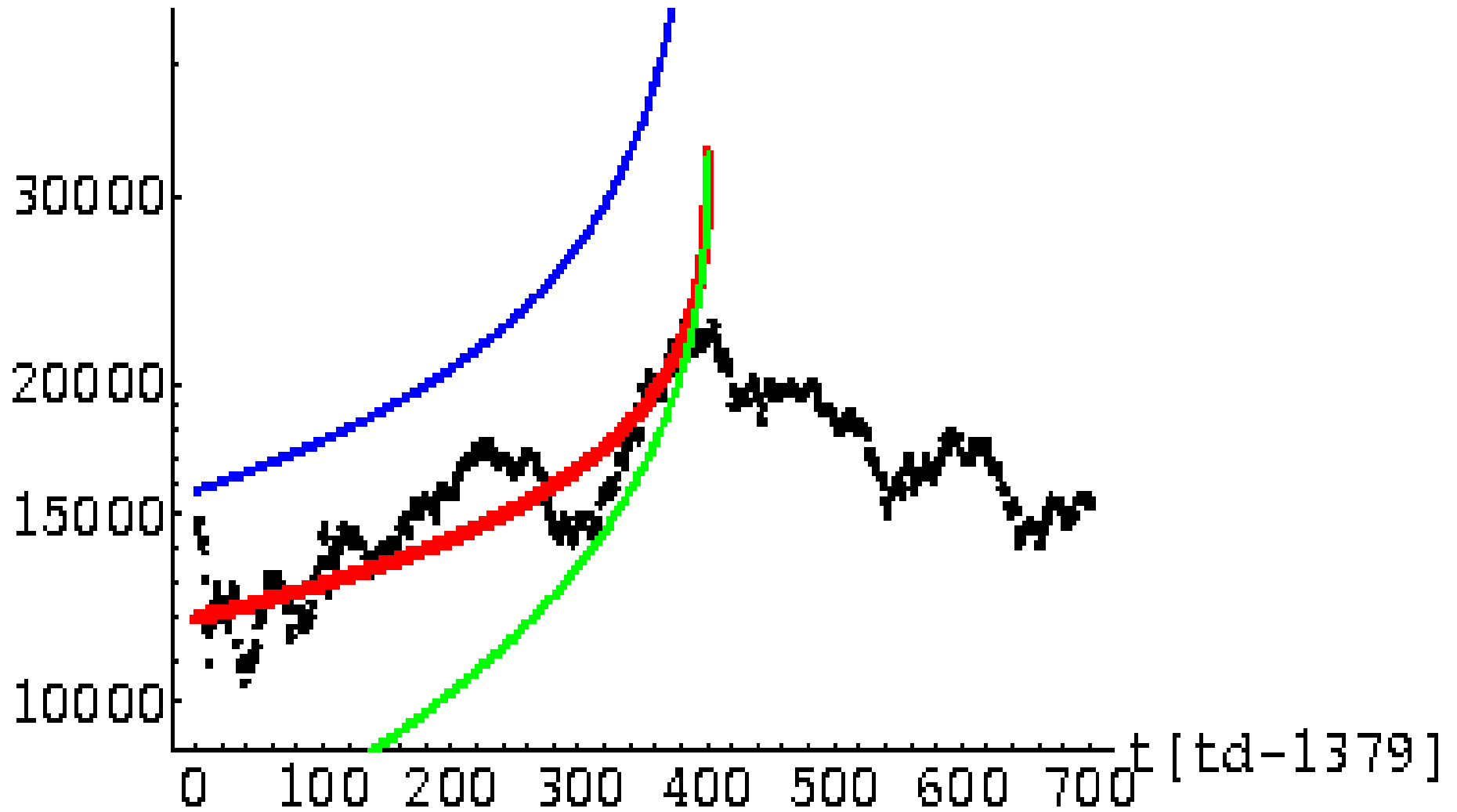
Temporal maximum B of WIG

Log(WIG) [Log(p)]



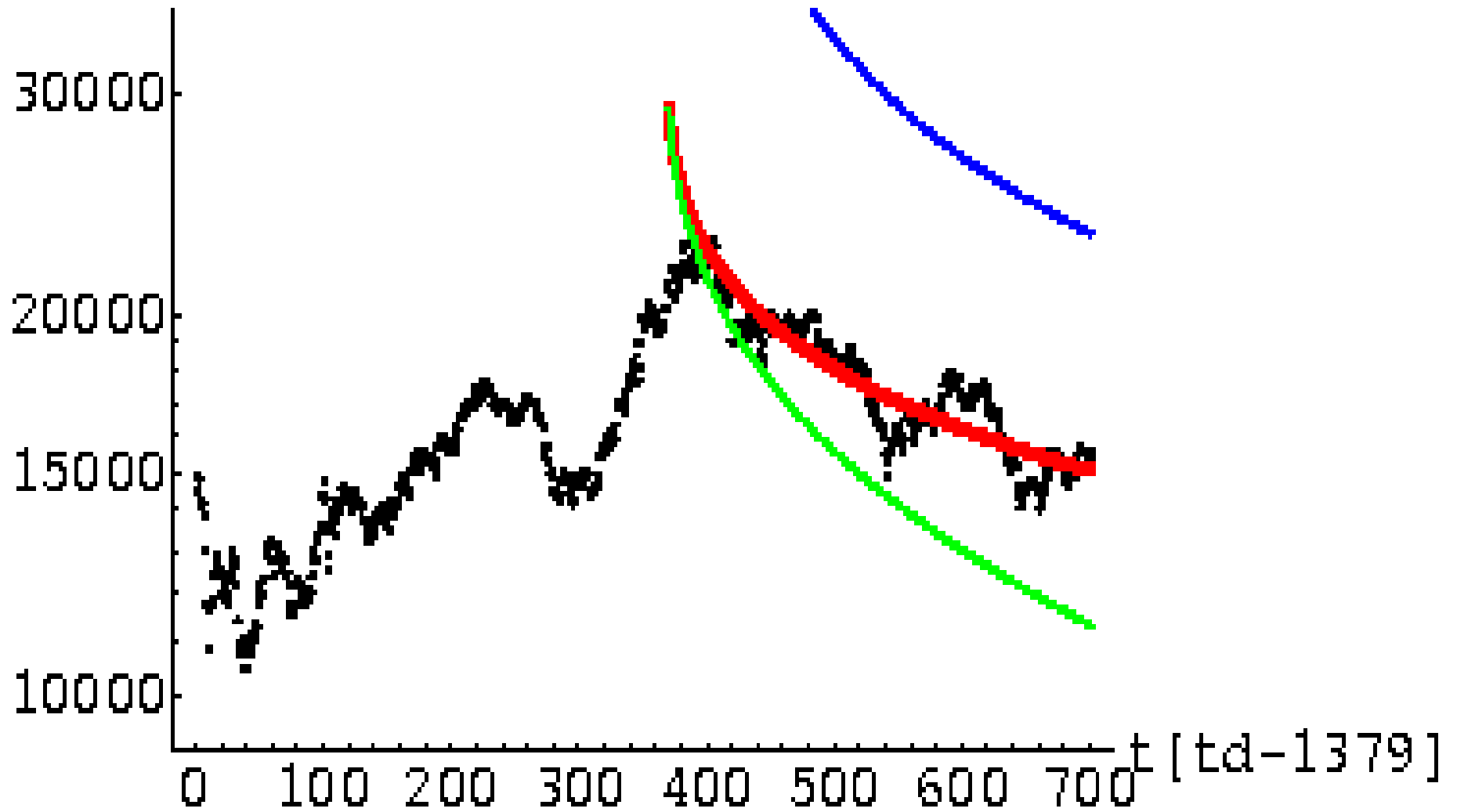
Maximum B: KWW & N limits of Mittag-Leffler function

Log(WIG) [Log(p)]



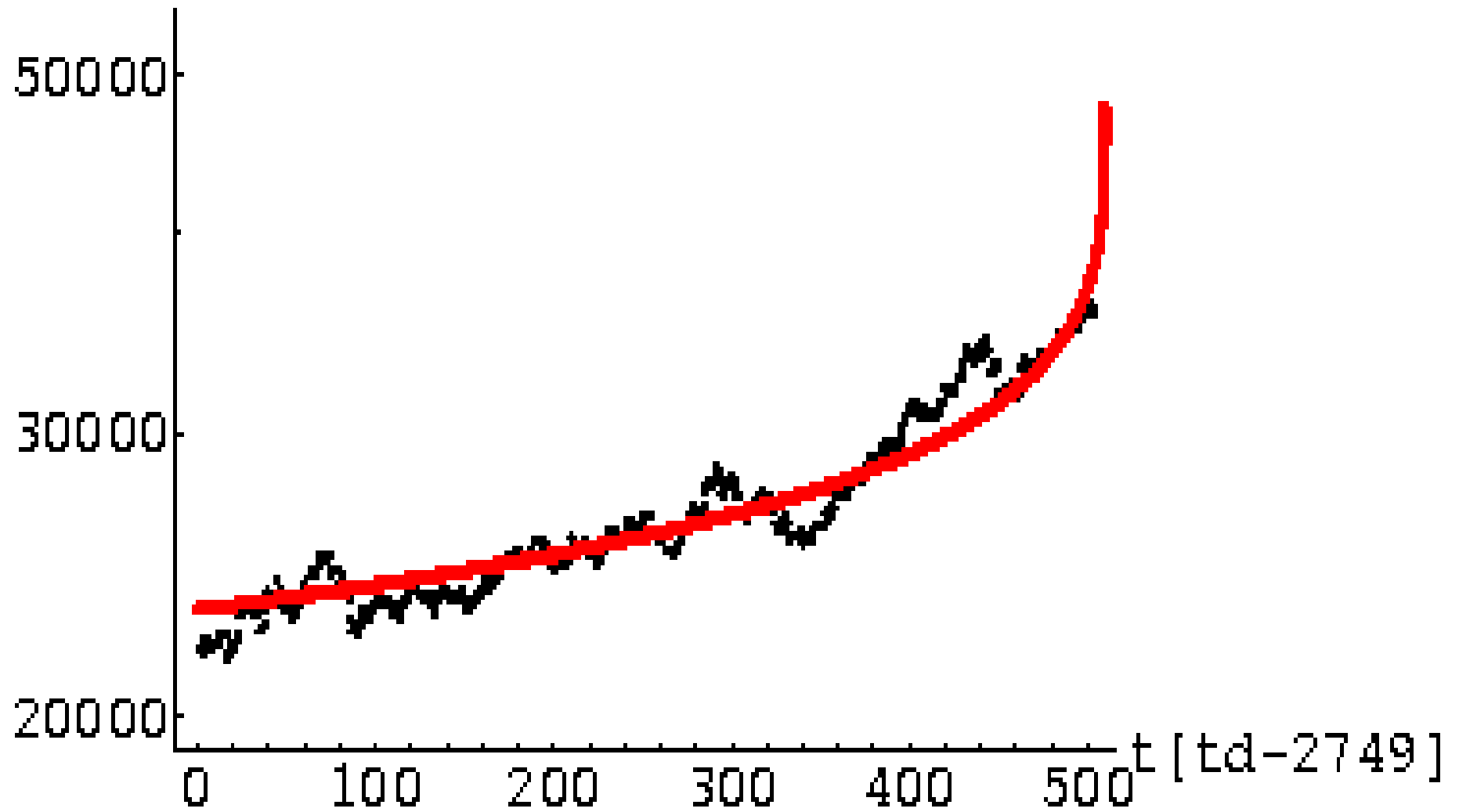
Maximum B: KWW & N limits of Mittag-Leffler function

Log(WIG) [Log(p)]



Temporal maximum C of WIG

Log(WIG) [Log(p)]



Model mikroskopowy: hierarchia inwestorów

Tabela analogonów

wydłużenie $\rightarrow \varepsilon \equiv X \leftarrow$ wartość indeksu

napięcie $\rightarrow \sigma \equiv U \leftarrow$ różnica pomiędzy popytem a podażą

$\varepsilon^s \equiv X^s$

$\varepsilon^d \equiv X^d$

$\sigma^s \equiv U^s$

$\sigma^d \equiv U^d$

$\varepsilon, \varepsilon_j \left\{ \equiv \right.$ chęć do aktywności aktywności

$\eta, \eta_j \downarrow \equiv$ obawa przed aktywnością

- $\epsilon_j^d = \epsilon_{j+1}^s + \epsilon_{j+1}^d, j=0,1,\dots,n-2$

- $\epsilon_{n-1}^d = \epsilon_n^s$ ← wytworzenie

- $\epsilon = \epsilon_0^s + \epsilon_0^d$ ← naprężenie

- $\sigma_j^s = \sigma_j^d + \sigma_{j+1}^s, j=0,1,\dots,n-1$

- $\sigma = \sigma_0^s$

Warunki początkowe

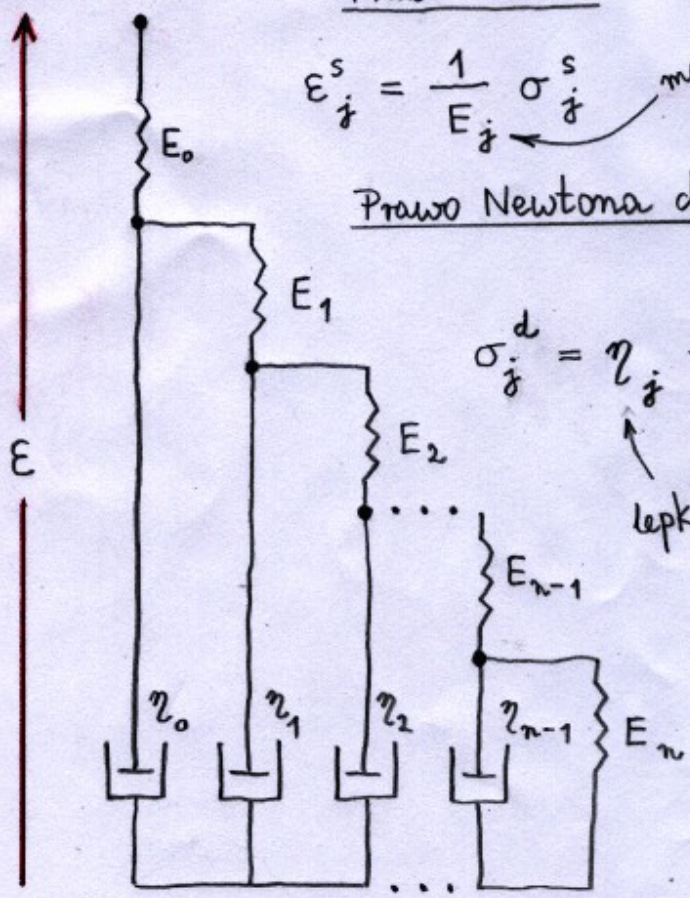
$\epsilon_j^d(0) = 0, j=1,2,\dots,n-1$

Prawo Hooke

$\epsilon_j^s = \frac{1}{E_j} \sigma_j^s$ ← moduł Younga

Prawo Newtona dla płynów

$\sigma_j^d = \eta_j \frac{d\epsilon_j^d}{dt}$ ← lepkość



Wynik

$$\bullet \frac{d \varepsilon(t)}{dt} = \frac{1}{\tau_0^\alpha E_0^{1-\alpha}} {}_0\mathcal{D}_t^{1-\alpha} \sigma(t)$$

Analogon gieldowy

$$\bullet \frac{d}{dt} X(t) = \frac{A'}{\xi} \left[\pm \frac{1}{\tau_0^\alpha} + \frac{1}{(1-\xi)\tau_0^\alpha} \right] {}_0\mathcal{D}_t^{1-\alpha} u(t)$$

$$\bullet X(t) \frac{1-\xi}{A'} = u(t)$$

↑
współczynnik
przełożenia

Uwaga: nasze wyjściowe równanie oraz
równanie drugie dają równanie
pierwsze.

Parametryzacja hierarchii

$$\alpha = \frac{E_1}{E_0} = 1 - \alpha, \quad 0 < \alpha < 1$$

$$\frac{\eta_0}{\eta_1} = 2 \frac{1-\alpha}{\alpha}$$

parzyste $n \geq 4$

$$\frac{E_{n-2}}{E_{n-3}} = \frac{n-3}{n-1} \frac{\frac{n}{2} - \alpha}{\frac{n}{2} - 2 + \alpha}$$

nieparzyste $n \geq 5$

$$\frac{E_{n-2}}{E_{n-3}} \cdot \frac{\eta_{\frac{n-1}{2}-1}}{\eta_{\frac{n-1}{2}}} = \frac{n-3}{n-1} \cdot \frac{\frac{n-1}{2}}{\frac{n-1}{2}-1} \cdot \frac{\frac{n-1}{2}-1+\alpha}{\frac{n-1}{2}+\alpha}$$

Podsumowanie

- **Praktycznie rzecz biorąc, w obrębie maksimów inwestorzy stanowią układy (sieci) pośrednie pomiędzy opisywanymi prawem KWW a prawem Nuttinga.**
- **Maksima dobrze opisuje się funkcjami Mittag-Lefflera udekorowanymi różnego rodzaju oscylacjami.**
- **Są one rozwiązaniem ułamkowych równań różniczkowych, za którymi stoi przede wszystkim efekt opóźnionego sprzężenia zwrotnego w dynamice indeksu.**
- **Równania te można otrzymać z poziomu mikro zakładając hierarchiczną strukturę powiązań pomiędzy inwestorami.**

Podsumowanie c.d.

- Teoretyczna szybkość $\frac{dX(t)}{dt}$ rozbiega się jak $\frac{1}{|t - t_{MAX}|^{1-\alpha}}$ gdy $t \rightarrow t_{MAX}$ z lewej lub prawej strony. Przypuszczamy, że mamy tutaj do czynienia z dynamicznym przejściem fazowym (faza wzrostu – faza spadku).
- Podejście można stosować do innych indeksów a także cen akcji.