

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

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York University Colloquium, April 02, 2012

- 1 Introduction
 - Dynamic General Equilibrium views
 - Aggregate demand and its discontents
 - Minskyian views
- 2 Goodwin model
 - Derivation
 - Properties
 - Example
- 3 Keen model
 - Derivation
 - Equilibria
 - Examples
- 4 Ponzi financing
 - Derivation
 - Properties
 - Example
- 5 Stabilizing government
- 6 Model with Noise

- Seeks to explain the aggregate economy using theories based on strong microeconomic foundations.

Dynamic General Equilibrium views

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents
Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Dynamic General Equilibrium views

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discounts
Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Dynamic General Equilibrium views

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discounts
Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Dynamic General Equilibrium views

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discounts
Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- All variables are **assumed** to be simultaneously in equilibrium.
- The only way the economy can be in disequilibrium at any point in time is through decisions based on wrong information.

The law of demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- Consider an individual with a concave utility of consumption satisfying the following axioms:

The law of demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- Consider an individual with a concave utility of consumption satisfying the following axioms:
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The law of demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- The ‘Hicksian compensated demand’ argument then shows that individual demand curves slope downwards.

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- Does this generalize to aggregate demand ?

Naive arguments for aggregate demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Naive arguments for aggregate demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Naive arguments for aggregate demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Naive arguments for aggregate demand

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- This implicitly assumes that the income of each individual is fixed *and* that their purchases do not alter market price.
- But in a closed economy, neither condition is satisfied !

Two is a crowd

- Consider two individuals and two products: Crusoe making bananas and Friday making cookies.

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

Two is a crowd

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Two is a crowd

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- Consider two individuals and two products: Crusoe making bananas and Friday making cookies.
- An increase in the price of bananas make Crusoe richer and Friday poorer: the distribution of income changes.
- In addition, the budget line turns into a curve: the price paid by Friday for the second banana is higher then the price paid for the first.

Two is a crowd

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- An increase in the price of bananas make Crusoe richer and Friday poorer: the distribution of income changes.
- In addition, the budget line turns into a curve: the price paid by Friday for the second banana is higher then the price paid for the first.
- For Crusoe himself, his income rises as the price of bananas rise, but so does the cost of producing more bananas: there is no way to know which effect is higher.

Two is a crowd

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- For Crusoe himself, his income rises as the price of bananas rise, but so does the cost of producing more bananas: there is no way to know which effect is higher.
- As shown by Gorman (1953), the aggregate demand function *can take any shape at all !!!*

Moving to Egypt

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- When income distributions are allowed to change, Gorman established that a necessary and sufficient condition for the law of demand to hold for the entire market is that the Engle curves for all consumers are identical straight lines.

Moving to Egypt

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- When income distributions are allowed to change, Gorman established that a necessary and sufficient condition for the law of demand to hold for the entire market is that the Engle curves for all consumers are identical straight lines.
- He goes on to say that “The necessary and sufficient condition quoted above is intuitively reasonable. It says, in effect, that an extra unit of purchasing power should be spent in the same way no matter to whom it is given.”

Moving to Egypt

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- In a different direction, Samuelson (1956) proves that the law of demand “apply to all of society *if optimal reallocation of income can be assumed to keep the ethical worth of each person’s marginal dollar equal*”.

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The SMD theorems

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Second, with general preferences, even if the distribution of income is fixed, market demand functions need not satisfy in any way the classical restrictions which characterize consumer demand functions.
- The utility hypothesis tells us nothing about market demand unless it is augmented by additional requirements.

Minsky's alternative interpretation of Keynes

- Neoclassical economics is based on barter paradigm: money is convenient to eliminate the double coincidence of wants.

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Economy is fundamentally cyclical, with each state (boom, crisis, deflation, stagnation, expansion and recovery) containing the elements leading to the next in an identifiable manner.

Minsky's Financial Instability Hypothesis

- Start when the economy is doing well but firms and banks are conservative.

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Minsky's Financial Instability Hypothesis

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discounts

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Highly liquid, low-yielding financial instruments are devalued, rise in corresponding interest rate.

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Minsky's Financial Instability Hypothesis

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discounts

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Ponzi financiers have to sell assets, liquidity dries out, asset market is flooded.

Minsky's Financial Instability Hypothesis

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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Minsky's Financial Instability Hypothesis

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Dynamic General
Equilibrium
views

Aggregate
demand and its
discontents

Minskyian views

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Ponzi financiers have to sell assets, liquidity dries out, asset market is flooded.
- Euphoria becomes a panic.
- “Stability - or tranquility - in a world with a cyclical past and capitalist financial institutions is destabilizing”.

Goodwin Model (1967) - Assumptions

- Assume that

$$N(t) = N_0 e^{\beta t} \quad (\text{total labour force})$$

$$a(t) = a_0 e^{\alpha t} \quad (\text{productivity per worker})$$

$$Y(t) = \nu K(t) = a(t)L(t) \quad (\text{total yearly output})$$

where K is the total stock of capital and L is the employed population.

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- Assume further that

$$\dot{w} = \Phi(\lambda)w \quad (\text{Phillips curve})$$

$$\dot{K} = (Y - wL) - \delta K \quad (\text{Say's Law})$$

Goodwin Model - Differential equations

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Derivation

Properties

Example

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

- Define

$$\omega = \frac{wL}{Y} = \frac{w}{a} \quad (\text{wage share})$$

$$\lambda = \frac{L}{N} = \frac{Y}{aN} \quad (\text{employment rate})$$

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- It then follows that

$$\dot{\omega} = \omega(\Phi(\lambda) - \alpha)$$

$$\dot{\lambda} = \lambda \left(\frac{1 - \omega}{\nu} - \alpha - \beta - \delta \right)$$

- If we take Φ to be linear, this is a predator-prey model.

Goodwin Model - Properties

- If we take Φ to be linear, this is a predator-prey model.
- To ensure $\lambda \in (0, 1)$ we assume instead that Φ is $C^1(0, 1)$ and satisfies

$$\Phi'(\lambda) > 0 \text{ on } (0, 1)$$

$$\Phi(0) < \alpha$$

$$\lim_{\lambda \rightarrow 1^-} \Phi(\lambda) = \infty.$$

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- Then $(\bar{\omega}_0, \bar{\lambda}_0) = (0, 0)$ is a saddle point and the only other equilibrium

$$(\bar{\omega}_1, \bar{\lambda}_1) = (1 - \nu(\alpha + \beta + \delta), \Phi^{-1}(\alpha))$$

is non-hyperbolic.

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- Moreover

$$g(\bar{\omega}_1) := \frac{\dot{Y}}{Y}(\bar{\omega}_1) = \frac{1 - \bar{\omega}_1}{\nu} - \delta = \alpha + \beta,$$

Example 1: Goodwin model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Derivation
Properties

Example

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

Example 1 (continued): Goodwin model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Derivation
Properties

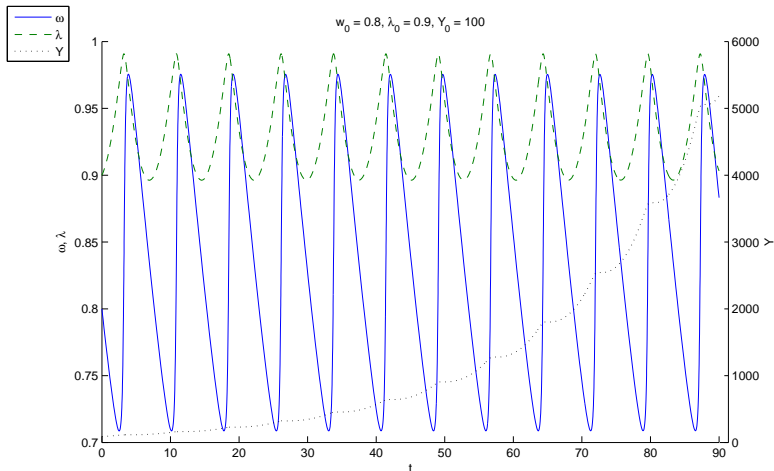
Example

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise



Introducing a financial sector (Keen 1995)

- Assume now that new investment is given by

$$\dot{K} = \kappa(1 - \omega - rd)Y - \delta K$$

where $\kappa(\cdot)$ is $C^1(-\infty, \infty)$ satisfying

$$\kappa'(\pi) > 0 \text{ on } (-\infty, \infty)$$

$$\lim_{\pi \rightarrow -\infty} \kappa(\pi) = \kappa_0 < \nu(\alpha + \beta + \delta) < \lim_{\pi \rightarrow +\infty} \kappa(\pi)$$

$$\lim_{\pi \rightarrow -\infty} \pi^2 \kappa'(\pi) = 0.$$

Accordingly, total output evolves as

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Accordingly, total output evolves as

$$\frac{\dot{Y}}{Y} = \frac{\kappa(1 - \omega - rd)}{\nu} - \delta := g(\omega, d)$$

- This leads to external financing through debt evolving according to

$$\dot{D} = \kappa(1 - \omega - rd)Y - (1 - \omega - rd)Y$$

Denote the debt ratio in the economy by $d = D/Y$, the model can now be described by the following system

$$\begin{aligned}\dot{\omega} &= \omega [\Phi(\lambda) - \alpha] \\ \dot{\lambda} &= \lambda \left[\frac{\kappa(1 - \omega - rd)}{\nu} - \alpha - \beta - \delta \right] \\ \dot{d} &= d \left[r - \frac{\kappa(1 - \omega - rd)}{\nu} + \delta \right] + \kappa(1 - \omega - rd) - (1 - \omega)\end{aligned}\tag{1}$$

- Define

$$\bar{\pi}_1 = \kappa^{-1}(\nu(\alpha + \beta + \delta))$$

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- We verify that

$$\bar{\omega}_1 = 1 - \bar{\pi}_1 - r \frac{\nu(\alpha + \beta + \delta) - \bar{\pi}_1}{\alpha + \beta}$$

$$\bar{\lambda}_1 = \Phi^{-1}(\alpha)$$

$$\bar{d}_1 = \frac{\nu(\alpha + \beta + \delta) - \bar{\pi}_1}{\alpha + \beta}$$

is an equilibrium for (1) and satisfies the relation

$$1 - \bar{\omega}_1 - r\bar{d}_1 = \bar{\pi}_1$$

- Define

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$$\bar{\lambda}_1 = \Phi^{-1}(\alpha)$$

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is an equilibrium for (1) and satisfies the relation

$$1 - \bar{w}_1 - r\bar{d}_1 = \bar{\pi}_1$$

- Moreover

$$g(\bar{w}_1, \bar{d}_1) = \frac{\kappa(1 - \bar{w}_1 - r\bar{d}_1)}{\nu} - \delta = \alpha + \beta.$$

- If we rewrite the system with the change of variables $u = 1/d$, we obtain

$$\dot{\omega} = \omega [\Phi(\lambda) - \alpha]$$

$$\dot{\lambda} = \lambda \left[\frac{\kappa(1 - \omega - r/u)}{\nu} - \alpha - \beta - \delta \right] \quad (2)$$

$$\dot{u} = u \left[\frac{\kappa(1 - \omega - r/u)}{\nu} - r - \delta \right] - u^2 [\kappa(1 - \omega - r/u) - (1 - \omega)].$$

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$$\dot{\lambda} = \lambda \left[\frac{\kappa(1 - \omega - r/u)}{\nu} - \alpha - \beta - \delta \right] \quad (2)$$

$$\dot{u} = u \left[\frac{\kappa(1 - \omega - r/u)}{\nu} - r - \delta \right] - u^2 [\kappa(1 - \omega - r/u) - (1 - \omega)].$$

- We now see that $(0, 0, 0)$ is an equilibrium of (2) corresponding to the point

$$(\bar{\omega}_2, \bar{\lambda}_2, \bar{d}_2) = (0, 0, +\infty)$$

for the original system.

- Analyzing the Jacobian of (1) and (2) we obtain the following conclusions.

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- The good equilibrium $(\bar{\omega}_1, \bar{\lambda}_1, \bar{d}_1)$ is stable if and only if

$$r \left[\frac{\kappa'(\bar{\pi}_1)}{\nu} (\bar{\pi}_1 - \kappa(\bar{\pi}_1) + \nu(\alpha + \beta)) - (\alpha + \beta) \right] > 0.$$

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- The point $(0, 0, 0)$ is a stable equilibrium for (2) if and only if

$$\frac{\kappa_0}{\nu} - \delta < r.$$

Example 2 : convergence to the good equilibrium in a Keen model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

Derivation
Equilibria
Examples

Ponzi
financing

Stabilizing
government

Model with
Noise

Example 2 (continued): convergence to the good equilibrium in a Keen model

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

M. R. Grasselli

Introduction

Goodwin model

Keen model

Derivation

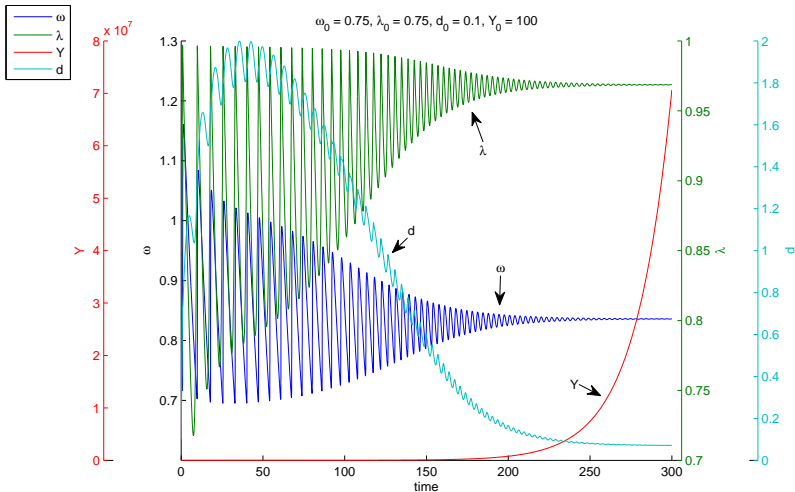
Equilibria

Examples

Ponzi financing

Stabilizing government

Model with Noise



Example 3: explosive debt in a Keen model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

Derivation

Equilibria

Examples

Ponzi
financing

Stabilizing
government

Model with
Noise

Example 3 (continued): explosive debt in a Keen model

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

M. R. Grasselli

Introduction

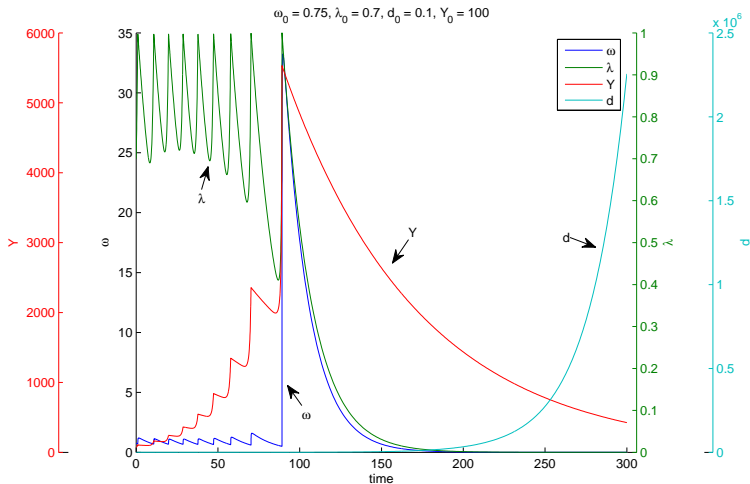
Goodwin model

Keen model
Derivation
Equilibria
Examples

Ponzi financing

Stabilizing government

Model with Noise





Example 3 (continued): explosive debt in a Keen model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

Derivation

Equilibria

Examples

Ponzi
financing

Stabilizing
government

Model with
Noise

Example 3 (continued): explosive debt in a Keen model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

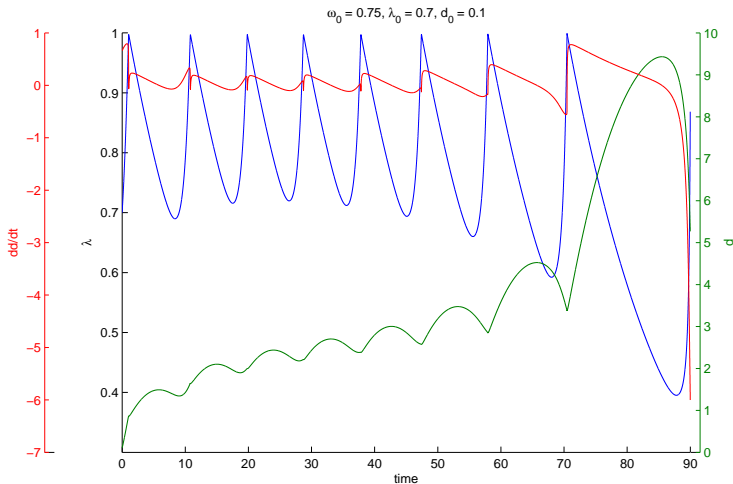
Keen model

Derivation
Equilibria
Examples

Ponzi
financing

Stabilizing
government

Model with
Noise



Data detour: debt

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

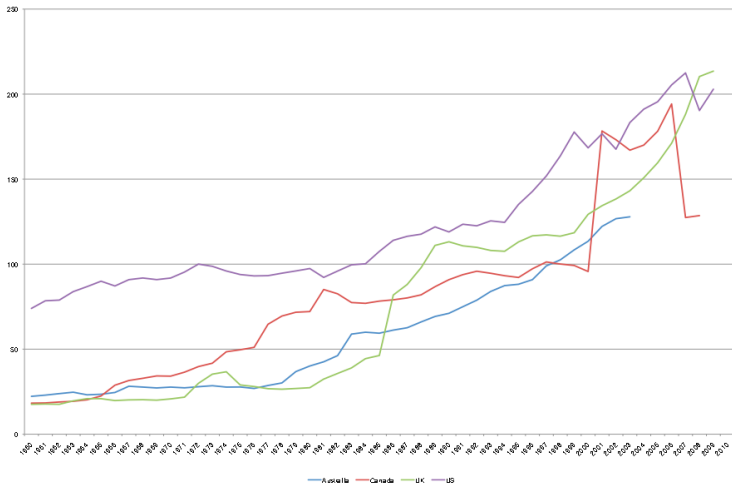
Keen model
Derivation
Equilibria
Examples

Ponzi
financing

Stabilizing
government

Model with
Noise

Private Debt as % of GDP



Data detour: debt and employment

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

M. R. Grasselli

Introduction

Goodwin model

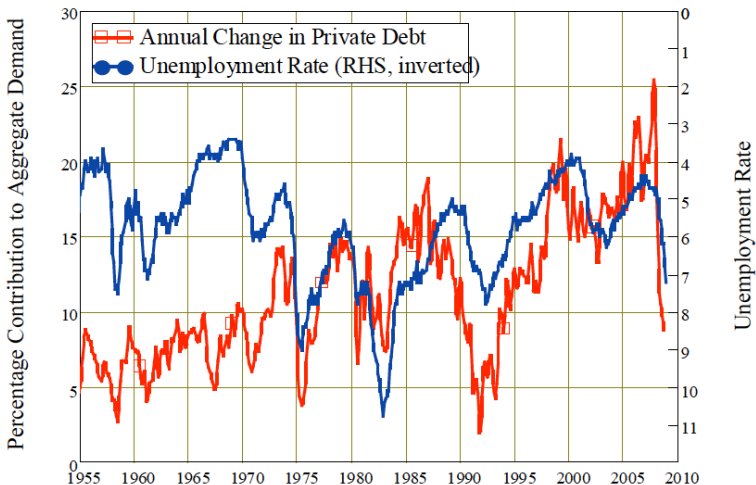
Keen model
Derivation
Equilibria
Examples

Ponzi financing

Stabilizing government

Model with Noise

Demand from Change in Debt vs Unemployment, USA



Basin of convergence for Keen model

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

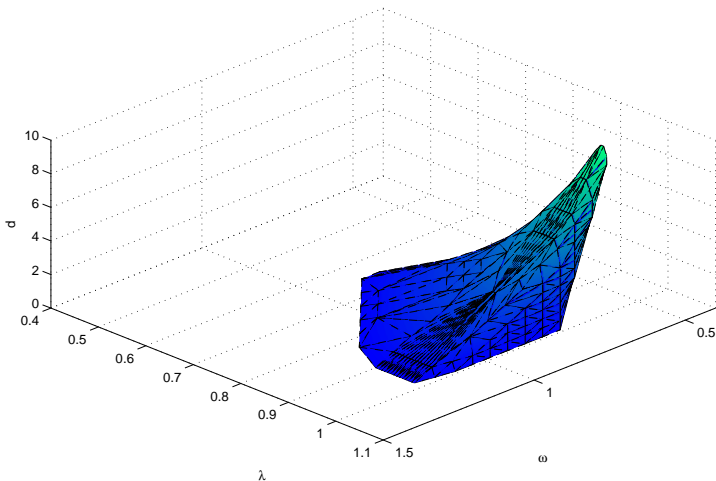
Keen model

Derivation
Equilibria
Examples

Ponzi
financing

Stabilizing
government

Model with
Noise



To introduce the destabilizing effect of purely speculative investment, we consider a modified version of the previous model with

$$\begin{aligned}\dot{D} &= \kappa(1 - \omega - rd)Y - (1 - \omega - rd)Y + P \\ \dot{P} &= \Psi(g(\omega, d)P)\end{aligned}$$

where $\Psi(\cdot)$ is an increasing function of the growth rate of economic output

$$g = \frac{\kappa(1 - \omega - rd)}{\nu} - \delta.$$

With Ponzi financing the dynamical system becomes

$$\dot{\omega} = \omega [\Phi(\lambda) - \alpha]$$

$$\dot{\lambda} = \lambda \left[\frac{\kappa(1 - \omega - rd)}{\nu} - \alpha - \beta - \delta \right] \quad (3)$$

$$\dot{d} = d \left[r - \frac{\kappa(1 - \omega - rd)}{\nu} + \delta \right] + \kappa(1 - \omega - rd) - (1 - \omega) + p$$

$$\dot{p} = p \left[\Psi \left(\frac{\kappa(1 - \omega - rd)}{\nu} - \delta \right) - \frac{\kappa(1 - \omega - rd)}{\nu} + \delta \right]$$

Ponzi financing - Equilibria and stability

- We find that $(\bar{\omega}_1, \bar{\lambda}_1, \bar{d}_1, 0)$ is a stable equilibrium iff

$$\Psi(\alpha + \beta) < \alpha + \beta.$$

Ponzi financing - Equilibria and stability

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- Moreover, introducing $x = 1/p$ and $v = p/d$ we find that

$$(\bar{\omega}_3, \bar{\lambda}_3, \bar{d}_3, \bar{p}) = (0, 0, +\infty, +\infty)$$

is stable iff

$$g_0 < \Psi(g_0) < r.$$

Example 4: effect of Ponzi financing

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

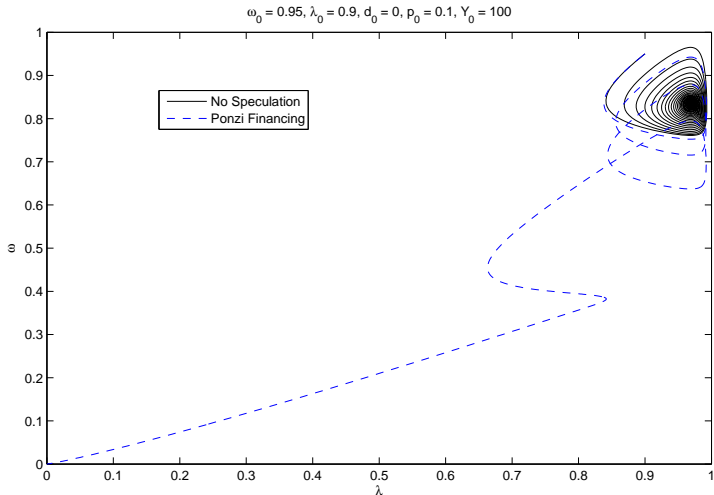
Ponzi
financing

Derivation
Properties

Example

Stabilizing
government

Model with
Noise



Example 4 (continued): effect of Ponzi financing

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

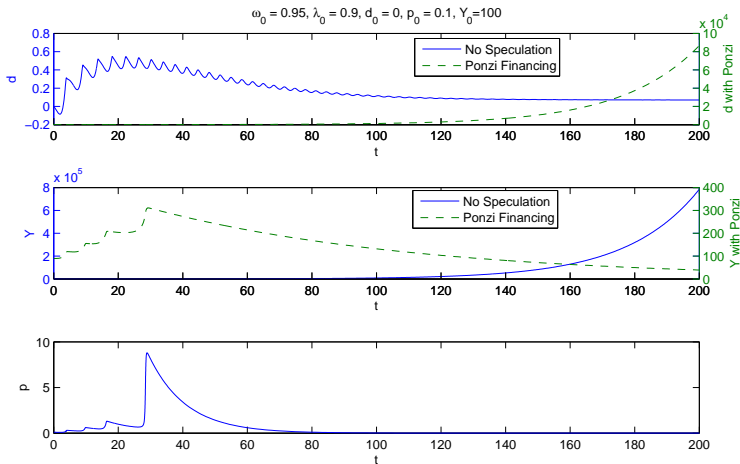
Ponzi
financing

Derivation
Properties

Example

Stabilizing
government

Model with
Noise



Introducing a government sector

- A final extension proposed by Keen (echoing Minsky) consists of adding government spending and taxation into the original system according to

$$\dot{G} = \Gamma(\lambda)Y$$

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Introducing a government sector

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$$\pi = 1 - \omega - rd + g - t$$

- The new 5-dimensional system displays more local fluctuations, but no breakdown for the same initial conditions as before.

Example 5: stabilizing government

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

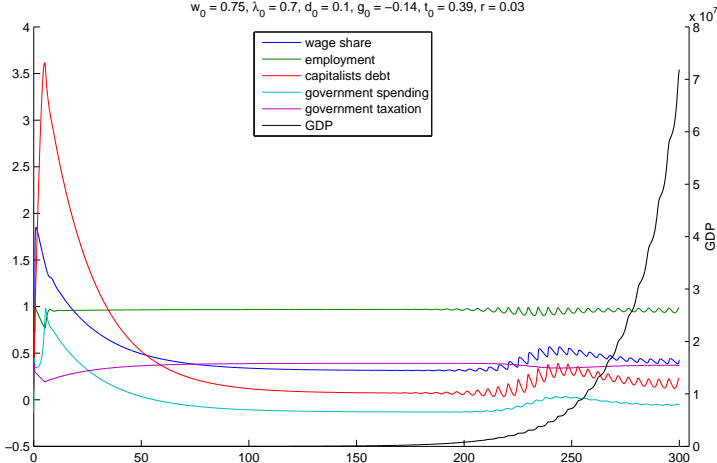
Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

$$w_0 = 0.75, \lambda_0 = 0.7, d_0 = 0.1, g_0 = -0.14, t_0 = 0.39, r = 0.03$$



Example 5 (continued): stabilizing government

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

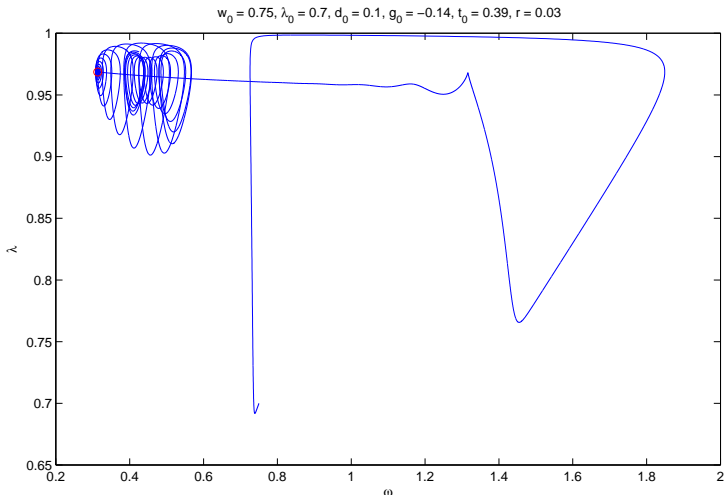
Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise



- Consider a stock price process of the form

$$\frac{dS_t}{S_t} = r_b dt + \sigma dW_t + \gamma \mu_t dt - \gamma dN^{(\mu_t)}$$

where N_t is a Cox process with stochastic intensity
 $\mu_t = M(p(t))$.

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- The interest rate for private debt is modelled as $r_t = r_b + r_p(t)$ where

$$r_p(t) = \rho_1(S_t + \rho_2)^{\rho_3}$$

Example 6: stock prices, explosive debt, zero speculation

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

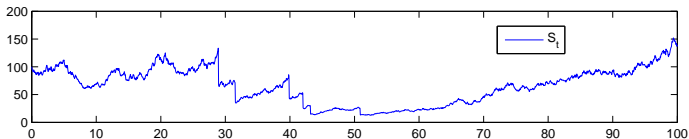
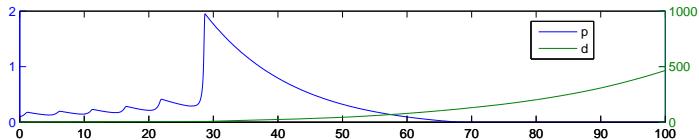
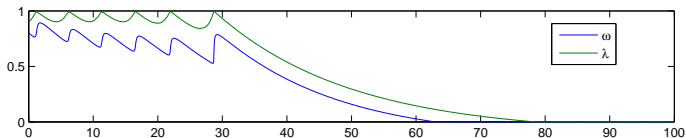
Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise



Example 6: stock prices, explosive debt, explosive speculation

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

M. R. Grasselli

Introduction

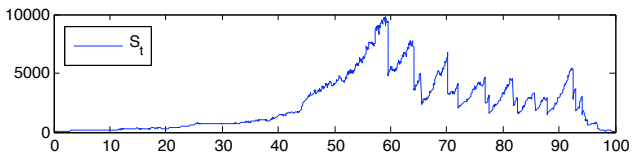
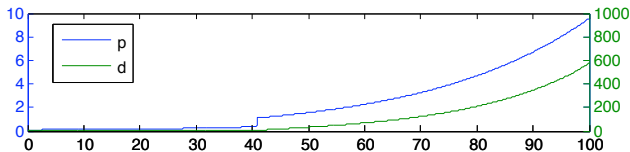
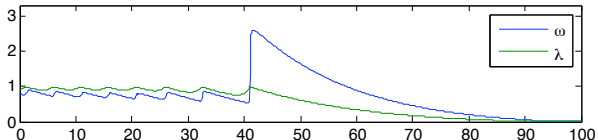
Goodwin model

Keen model

Ponzi financing

Stabilizing government

Model with Noise



Example 6: stock prices, finite debt, finite speculation

A Stochastic Extension of the Keen-Minsky Model for Financial Fragility

M. R. Grasselli

Introduction

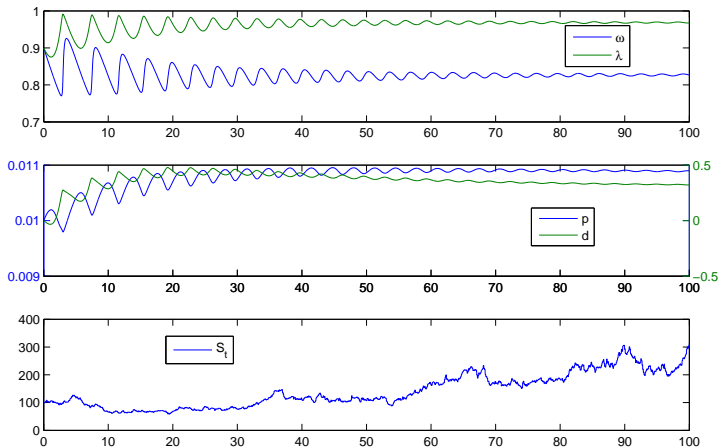
Goodwin model

Keen model

Ponzi financing

Stabilizing government

Model with Noise



- Introduce delay in the investment function

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- Characterize the equilibria with government sector
- Study stochastic model analytically
- Model prices for capital goods P_k and commodities P_c explicitly (Kaleckian mark-up theory, inflation, etc)
- Calibrate to macroeconomic time series.

- Solow (1990): The true test of a simple model is whether it helps us to make sense of the world. Marx was, of course, dead wrong about this. We have changed the world in all sorts of ways, with mixed results; the point is to interpret it.

Concluding thoughts

A Stochastic
Extension of
the
Keen-Minsky
Model for
Financial
Fragility

M. R. Grasselli

Introduction

Goodwin
model

Keen model

Ponzi
financing

Stabilizing
government

Model with
Noise

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- Schumpeter (1939): Cycles are not, like tonsils, separable things that might be treated by themselves, but are, like the beat of the heart, of the essence of the organism that displays them.