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Macroeconomic instability and microeconomics financial fragility: a stock-flow consistent approach with heterogeneous agents¹

Laura de Carvalho and Corrado Di Guilmi

Mathematics for New Economic Thinking Toronto, October 31 2013

¹Financial support by INET is gratefully acknowledged $\langle B \rangle \langle E \rangle \langle E \rangle \langle E \rangle \langle E \rangle$

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• Features:

• This paper introduces heterogeneous microeconomic behavior into a demand-driven stock-flow consistent (SFC) model.

• Analytical aggregation of heterogeneous agents by means of statistical mechanics tools (Aoki 2006, Di Guilmi 2008, Foley JET 1994, Landini and Uberti CE 2008).

• Main objective: study the link between the **financial micro-variables** and the macroeconomic fluctuations (Minsky).

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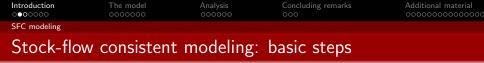
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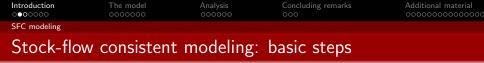
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- model the behavioral equations and the social accounting matrix (flows);
- build a dynamical system from the behavioral equations and identify the steady state;

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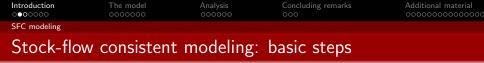
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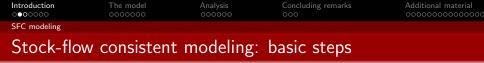
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A social accounting matrix

Table 2.6	Transactions	flow	matrix	

	Households	Productio	on firms	Banks		Banks Government Central		Central	l Bank	
	(1)	Current (2)	Capital (3)	Current (4)	Capital (5)	(6)	Current (7)	Capital (8)	Σ	
Consumption	-C	+C							0	
Investment	$-I_{\rm h}$	+I	$-I_{f}$						0	
Govt. exp.		+G				-G			0	
Wages	+WB	-WB							0	
Profits, firms	$+FD_{f}$	$-F_{\rm f}$	$+ FU_{f}$						0	
Profits, banks	+FDb	12	10	$-F_{\rm b}$	+FUb				0	
Profit, central Bk	-79			1000	1.1	$+F_{cb}$	$-F_{cb}$		0	
Loan interests	$-r_{l(-1)} \cdot L_{h(-1)}$	$-r_{l(-1)} \cdot L_{f(-1)}$		$+r_{l(-1)} \cdot L_{(-1)}$					0	
Deposit interests	$+r_{m(-1)} \cdot M_{h(-1)}$	1.11.11.11		$-r_{m(-1)} \cdot M_{(-1)}$					0	
Bill interests	$+r_{b(-1)} \cdot B_{h(-1)}$			$+r_{b(-1)} \cdot B_{b(-1)}$		$-r_{b(-1)} \cdot B_{(-1)}$	$+r_{b(-1)} \cdot B_{cb(-1)}$		0	
Taxes - transfers	$-T_{\rm h}$	$-T_{f}$		$-T_{b}$		+T			0	
Change in loans	$+\Delta L_{\rm h}$		$+\Delta L_{f}$		$-\Delta L$				0	
Change in cash	$-\Delta H_{\rm h}$				$-\Delta H_{\rm b}$			$+\Delta H$	0	
Change, deposits	$-\Delta M_{\rm h}$				$+\Delta M$				0	
Change in bills	$-\Delta B_{\rm h}$				$-\Delta B_{\rm h}$	$+\Delta B$		$-\Delta B_{cb}$	0	
Change, equities	$-(\Delta e_{\rm f} \cdot p_{\rm ef} + \Delta e_{\rm b} \cdot p_{\rm eb})$		$+\Delta e_{\rm f} \cdot p_{\rm ef}$		$+\Delta e_{\rm b} \cdot p_{\rm eb}$				0	
Σ	0	0	0	0	0	0	0	0	0	

Figure: Source: Godley and Lavoie, Monetary Economics, Palgrave McMillian, 2007

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Microfoundations				

- Traditional *aggregative* SFC models: no role for **heterogeneity** and **interaction** among agents.
- Minsky (1975): "an ultimate reality in a capitalist economy is the set of interrelated balance sheets among the various units".

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- Bezemer (wp2011): heterogeneous balance sheets;
- drawback: agent-based models can only be solved numerically:
 - no analytical definition for the relationships between macro and micro-variables;
 - causality links within the system cannot be clearly identified.

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- Meso-foundation: "The point is that precise behavior of each agent is irrelevant. Rather we need to recognize that microeconomic behavior is fundamentally stochastic." (Aoki and Yoshikawa 2006);
- how it works:
 - reduction in the heterogeneity by grouping the agents in clusters;
 - identifying the mean-field variables (mean-field approximation);
 - master equation: study of the dynamics of the number of firms in each cluster, modeled as a Markov process.



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Steps of	the analysis			

- Set up and numerically simulate the ABM with N heterogeneous firms belonging to two different categories (borrowing and hedge);
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The Firms				

- Two types of firms
 - borrowing firms (z = 1): cannot finance all investment with internal finance and issue equities and bonds;
 - hedge firms (z = 2): finance all investment with retained profits.
- investment function:

$$\dot{i}_{z}^{j}(t) = \alpha \ h(t) + \beta_{z} \ a^{j}(t) + \epsilon \ u^{j}(t)$$
(1)

i: investment; *a*: retained profits; *u*: capacity utilization ratio; h(t) = Pe(t)E(t)/P K(t), *Pe*: stock price; *K*: aggregate capital; $\alpha, \beta_z, \epsilon > 0$.

• Fazzari et al. 1988: $\beta_1 > \beta_2$.

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The Firms				

- Total demand: consumption from salaries, profits and capital gains + investment;
- demand allocated among firms according to their size plus a uniformly distributed and idiosyncratic *preferential attachment* shock s with E[s] = 0;
- price: constant mark-up μ on the cost of labor; accordingly, output shares of labor (Ψ) and profit (Π) are given exogenously;

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The household sector				

- The propensities to save out of disposable income are constant parameters.
- wealth W accumulates for savings S and capital gain G;
- households allocate W between money M and shares E.

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The financial sector				

• The financial sector is considered as an aggregate;

• the demand for firms' shares depends on previous capital gains G

$$\frac{Pe(t)E(t)}{W(t)} = \frac{1}{1 - exp[\lambda_r r - \lambda_G G(t - dt)]}$$
(2)

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• the interest rate for deposits and loans is the same.

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Master equation				

Quantify the mean-field variables (reduction of heterogeneity);

- 2 identify the transition probabilities η and ζ as functions of the shock *s* and the firms' balance sheets variables;
- define the ME:

 $\frac{dP(N_1,t)}{dt} = (\text{probability of flow of firms into the borrowing state}) - (\text{probability of flow of firms out of the borrowing state})$

(1) the solution of the ME yields the dynamics of n_1 :

$$\dot{n}_1(t) = \eta m(t) - (\eta + \zeta)[m(t)]^2 + \sigma \ dV(t)$$
 (3)

m:trend; *dV* is a stationary Wiener increment and $\sigma = \frac{\eta \zeta}{(\eta + \zeta)^2}$

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SFC system				

• Solution of the ME: dynamics of N_1 ;

• total investment:

$$\dot{K}(t) = I(t) = N_1 i_1 + N_2 i_2 = N \alpha h(t) + N_1 [\beta_1 a_1(t) + \epsilon u_1(t)] + N_2 [\beta_2 a_2(t) + \epsilon u_2(t)]$$
(4)

• dynamics of aggregate debt:

$$\dot{B}(t) = N_1 \{ \varpi [i_1(t) - a(t) - m_1(t)] \}$$
 (5)

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$$\dot{E}(t) = N_1 \left\{ (1 - \varpi) \left[i_1^j(t) - a^j(t) - m_1^j(t) \right] / Pe(t) \right\}$$
 (6)

Introduction	The model	Analysis	Concluding remarks	Additional material
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SFC system				

- Solution of the ME: dynamics of N₁;
- total investment:

$$\dot{K}(t) = I(t) = N_1 i_1 + N_2 i_2 = N \alpha h(t) + N_1 [\beta_1 a_1(t) + \epsilon u_1(t)] + N_2 [\beta_2 a_2(t) + \epsilon u_2(t)]$$
(4)

• dynamics of aggregate debt:

$$\dot{B}(t) = N_1 \left\{ \varpi \left[i_1(t) - a(t) - m_1(t) \right] \right\}$$
(5)

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$$\dot{E}(t) = N_1 \left\{ (1 - \varpi) \left[\dot{r}_1^j(t) - a^j(t) - m_1^j(t) \right] / Pe(t) \right\}$$
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 (6)

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SFC system				

	Households Firms		Banks	Total	
		Current	Capital		- 11 - 1 22 - 14
Consumption	-C	+C	101		0
Investment		+I	$-\left[N\alpha h+N_1(\beta_1 a_1+\epsilon u_1)+N_2(\beta_2 a_2+\epsilon u_2)\right]$		0
Wages	$+\Psi pQ$	$-\Psi pQ$			0
Profits	$+\Theta(\Pi pQ - rB)$	$-(N_1a_1+N_2a_2)$	$(1-\Theta)(\Pi pQ - rB) + r(N_1m_1 + N_2m_2)$		0
Loan interests		-rB		rB	0
Deposit interests	$r(M_{\Psi} + M_{\Theta})$	$+r(N_1m_1+N_2m_2)$		$-r(M_{\Psi}+M_{\Theta}+N_1m_1+N_2m_2)$	0
Change in loans	N		$+N_1[\bar{\omega}(i_1-a-m_1)]$	$-\dot{B}$	0
Change in deposits	$-(\dot{M}_{\Psi}+\dot{M}_{\Theta})$		$-(N_1\dot{m}_1+N_2\dot{m}_2$	Ň	0
Change in equities			$+N_1[(1-\bar{\omega})(i_1-a-m_1)]$		0
Total	0	0	0	0	0
Capital Gains	$-\dot{PeE}$		$+\dot{P}eE$		0

Figure: Matrix of flows

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Effects of the heterogeneity of the investment rules						

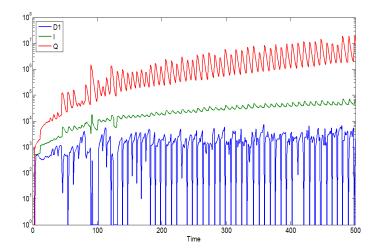


Figure: Dynamics of aggregate demand, investment and debt.

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Effects of the heterogeneity of the investment rules						

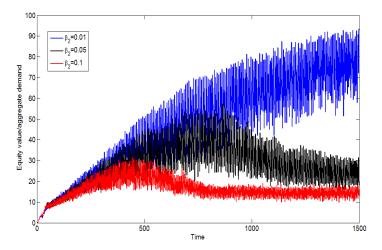


Figure: Dynamics of equity value to aggregate demand ratio for different values of β_2 ($\beta_1 = 0.05$).

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Dynamics of leverage				

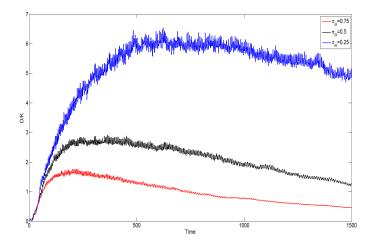


Figure: Dynamics of the debt/capital ratio for different values of σ_{Θ} .

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Dynamics of leverage				

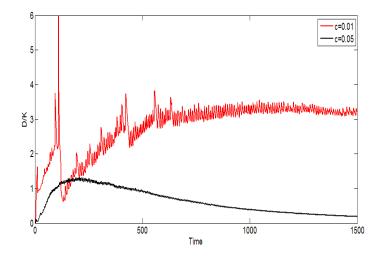


Figure: Dynamics of the debt/capital ratio for different values of *c*.

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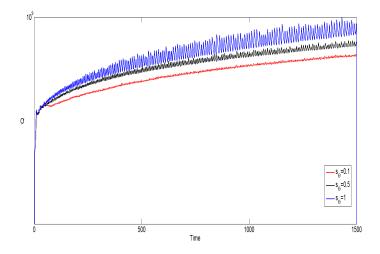


Figure: Dynamics of aggregate demand for different values of s_{Θ} .

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Changes in the propensities to save and distribution of income						

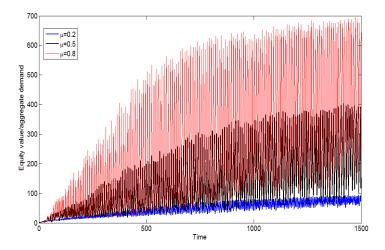


Figure: Dynamics of equity value to aggregate demand ratio for different values of μ .

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Preliminary results o	f the research			

- Heterogeneity in firms' behavior influences the dependence of the real sector to the financial sector (financialization and leverage ratio).
- the progressively larger weight of the **financial sector** can avoid the paradox of thrift and affects growth, amplitude of fluctuations and distribution of income.
- **inequality** (propensity to save and price mark-up) increases financialization and size of fluctuations;

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Future research				

- A more refined study of the conditions under which bubbles and busts are generated in the present setting;
- introduction of a variable mark-up and the possibility for households to shift between the two categories of profit-earners and income-earners;
- a more sophisticated analysis of the analytical solution of the model, to be achieved by the study of the stability properties of the dynamical system.

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Model				

• All firms adopt the same Leontief-type technology with constant coefficients. As a consequence, the demand for labor at full capacity can be residually quantified once the stock of capital is determined by investment decisions in the previous periods. The supply of labor is infinitely elastic.

$$\bar{q}^{j}(t) = 1/\gamma \ k^{j}(t) \tag{7}$$

 $\gamma >$ 0;

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Model			

• Total output Q is divided between aggregate consumption C and investment I:

$$pQ(t) = (1 - s_{\Psi})Y_{\Psi}(t) + (1 - s_{\Theta})Y_{\Theta}(t) + (1 - \sigma_{\Theta})G_{\Theta}(t) + I(t)$$

Accordingly

$$pQ(t) = \frac{1+\mu}{s_{\Psi} - \mu[1 - \Theta(1 - s_{\Theta})]} [I(t) + A(t)]$$
(8)

where

$$A(t) = r[(1-s_{\Psi})M_{\Psi}(t) + (1-s_{\Theta})(M_{\Theta}(t) - \Theta B(t))] + (1-\sigma_{\Theta})G_{\Theta}(t)$$

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Model				

$$\dot{n}^{j}(t) = a^{j}(t) - i^{j}(t) \tag{9}$$

- where savings S are defined as the difference between households' disposable income and consumption levels S(t) = Y(t) - C(t), and G(t') = [Pe(t') - Pe(t)]E(t).
- The demand for money is residually determined as

$$M_h(t) = W(t) - Pe(t)E(t)$$
(10)

• Given that only profit earners demand for share, we have that

$$\dot{M}_{\Psi}(t) = Y_{\Psi}(t) - C_{\Psi}(t) \tag{11}$$

$$M_{\Theta}(t) = M_h(t) - M_{\Psi}(t) \tag{12}$$

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Master equation's solution: stochastic dynamics of trend and fluctuations						

• Probability for a firm of transitioning from one state to another:

$$\eta^{j}(t) = \Pr[s(t) \ge \Gamma_{1}], \qquad (13)$$

$$\zeta^{j}(t) = \Pr[s(t) < \Gamma_{2}]. \tag{14}$$

where

$$\Gamma_{z} = \frac{i_{z}(t) - m_{z}(t) - [\Pi p q_{z}(t) - r(b_{z}(t) - m_{z}(t)]}{(1 - \Theta) \Pi p q_{z}(t)} \frac{K(t)}{K(t) - K_{z}(t)}.$$

$$\frac{dP(N_{1}, t)}{dt} = \omega_{+}(t)P(N_{1} - 1)(t) + \omega_{-}(t)P(N_{1} + 1)(t) + [\omega_{+}(t) + \omega_{-}(t)]P(N_{1})(t)$$
(16)

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• The solution method splits the state variable into 2 components

$$N_1 = Nm + \sqrt{Ns} \tag{17}$$

m is the deterministic trend; s is the stochastic noise

• trend dynamics:

$$\frac{dm}{d\tau} = \eta m - (\eta + \zeta)m^2, \qquad (18)$$

where $\tau = t/N$.

stationary distribution of the Fokker-Planck equation:

$$\theta(s) = C \exp\left(-\frac{s^2}{2\sigma^2}\right) \quad : \quad \sigma^2 = \frac{\eta\zeta}{(\eta+\zeta)^2}.$$
(19)

• dynamics of n₁:

$$\frac{n_1(t)}{dt} = \eta m - (\eta + \zeta)m^2 + \sigma \ dV(t)$$
(20)

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dV is a stationary Wiener increment.

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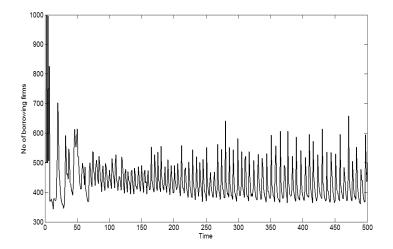


Figure: Dynamics of the number of borrowing firms (total number of firms: 1,000).

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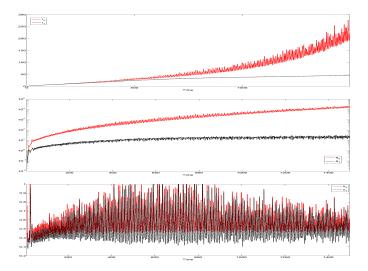


Figure: Investment (top), accumulated profit (center) and capacity utilization (bottom) for average borrowing and hedge firms.

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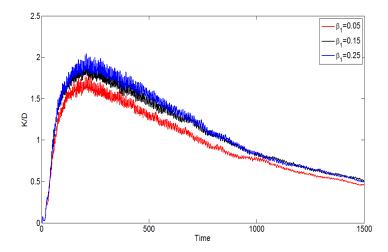


Figure: Dynamics of the debt/capital ratio for different values of β_1 .

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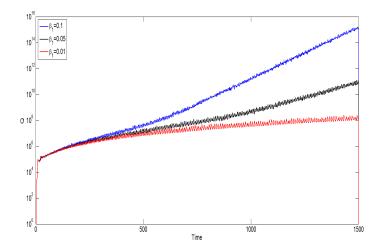


Figure: Dynamics of aggregate demand for different values of β_2 .

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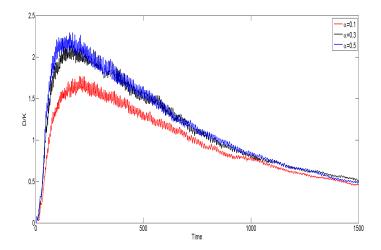


Figure: Dynamics of the debt/capital ratio for different values of α .

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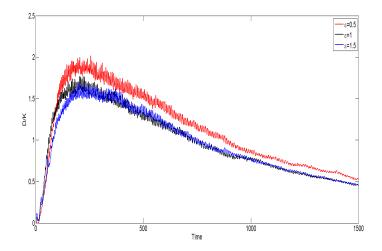


Figure: Dynamics of the debt/capital ratio for different values of ϵ .

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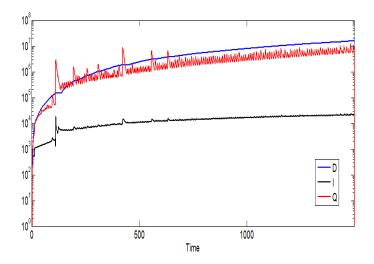


Figure: Dynamics of debt, investment and aggregate demand for c = 0.01.



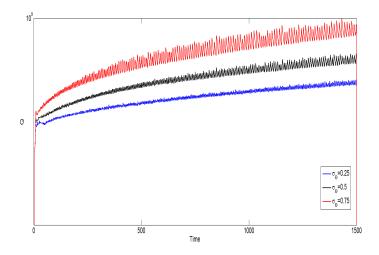


Figure: Dynamics of aggregate demand for different values of σ_{Θ} .

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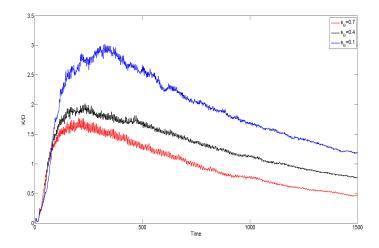


Figure: Dynamics of the debt/capital ratio for different values of s_{Θ} .

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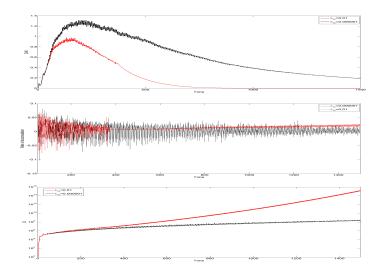


Figure: Debt to capital ratio (top), capital accumulation (center) and aggregate demand (bottom) for different values of λ_{G} .