

Quantitative Macroeconomics

Problem Set 8
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¹Using the code provided by Luis Rojas.

Model

Assumptions

- Small open economy with stochastic endowment y_t , which follows a Markov Process.
- The government preferences are given by $E_0\{\sum \beta^t u(c^t)\}$.
- Government trades one period bonds with risk neutral investors.
- Timing of the Model
 1. Outstanding debt b_t and the GDP realisation y_t .
 2. Decision to repay debt or default.
 3. If there is no default, the government issues new debt at $q(b_{t+1}, y_t)$
 4. If there is default, the government is excluded from the financial markets and can return with a probability λ
 5. The economy suffers a loss of τ fraction of the endowment during default.

Government's Problem - Value Functions

Value function in the case where government repays the debt.

$$V^{ND}(b, y) = \max_{b'} \{u(y + q(b', y)' - b) + \beta E\{V(b', y'|y)\}\} \quad (1)$$

The value of default is,

$$V^D(y) = u((1 - \tau)y) + (1 - \lambda)\beta E\{V^D(y'|y)\} + \lambda\beta E\{V(0, y'|y)\} \quad (2)$$

The value function before taking the default decision is given by,

$$V(b, y) = \max_{D \in [0,1]} \{(1 - D)V^{ND}(b, y) + DV^D(y)\} \quad (3)$$

Creditors

The Break even condition is given by,

$$q(b', y) = \frac{E\{(1 - D(b', y')|y)\}}{R} \quad (4)$$

Where R is the opportunity cost and the creditors know the function $D(b', y')$.

Equilibrium

A recursive equilibrium is a price schedule $q(b', y)$, value functions $V(b, y)$, $V^{ND}(b, y)$, $V^D(y)$ and policy functions $b'(b, y)$ and $D(b, y)$ such that,

1. Given the price schedule, the value functions and policy functions correspond to the solution of the government problem.
2. Creditors break even in expectation.
3. In equilibrium the following is satisfied,

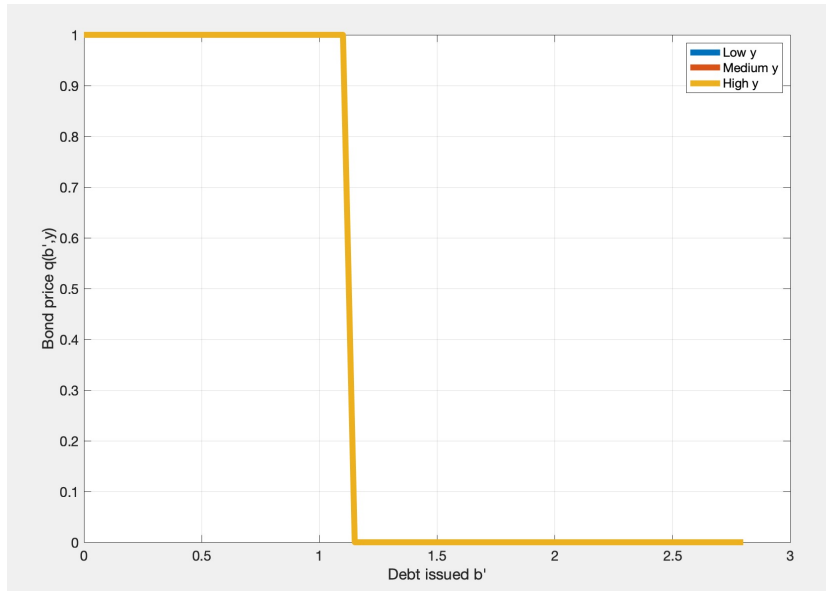
$$q(b', y) = \frac{E\{(1 - I\{V^{ND}(b', y', q) \leq V^D(y', q)\})|y\}}{R} \quad (5)$$

Where, I is an indicator function which is one if there is default.

Bond price schedule

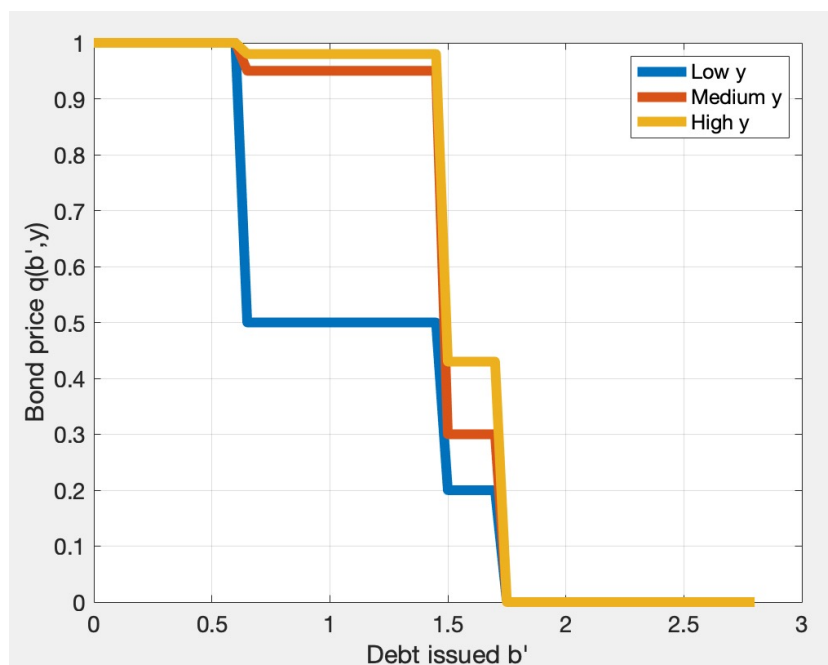
The bond-price schedule is telling us the set of quantity-price combinations for the public debt given the GDP endowments. The graph 1 shows the bond-price menu for $\tau = 0.2$ and $\lambda = 0.5$, where τ is the fraction of the GDP lost if the government defaults and λ is the probability of returning to the financial markets once you've been excluded.

Figure 1: Bond-price menu for $\tau = 0.2$



Now, we change the value of τ , assigning different τ to different levels of GDP endowments. In other words, we assume that the output cost of default depends on the level of output. Thus, introducing state-contingent losses makes default more responsive to GDP shocks and then, less responsive to outstanding debt.

Figure 2: Bond-price menu for different $\tau = [0.1, 0.4, 0.5]$ and y_t .



Equilibrium default

Adjusting the parameters to have that each country is 3% in default, we get a graph with the probability of default at $t+1$ given the debt-to-gdp ratio.

Figure 3: Probability of default for different $\tau = 0.2$.

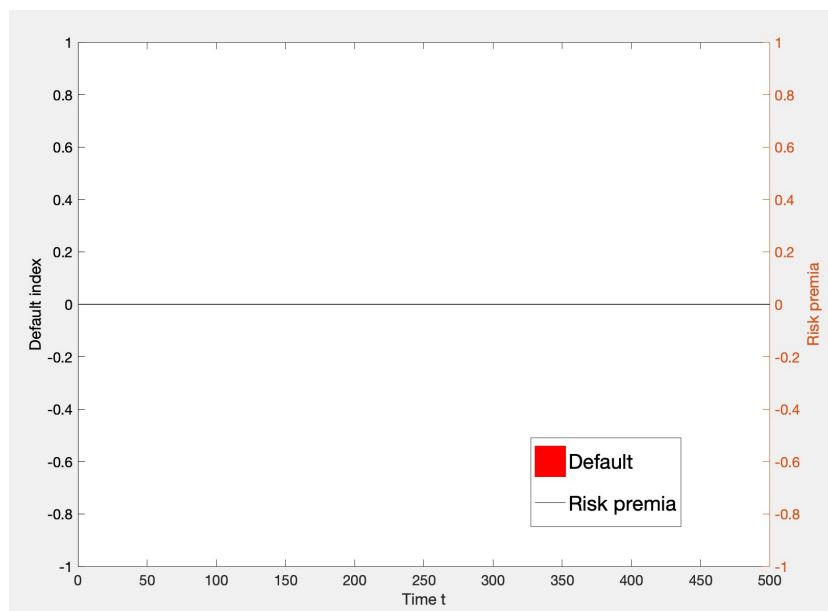


Figure 4: Probability of default for different $\tau = [0.1, 0.4, 0.5]$.

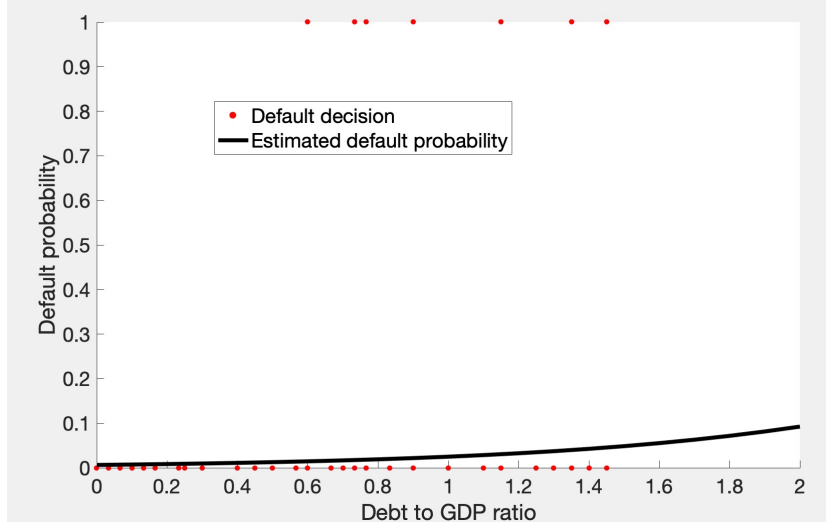
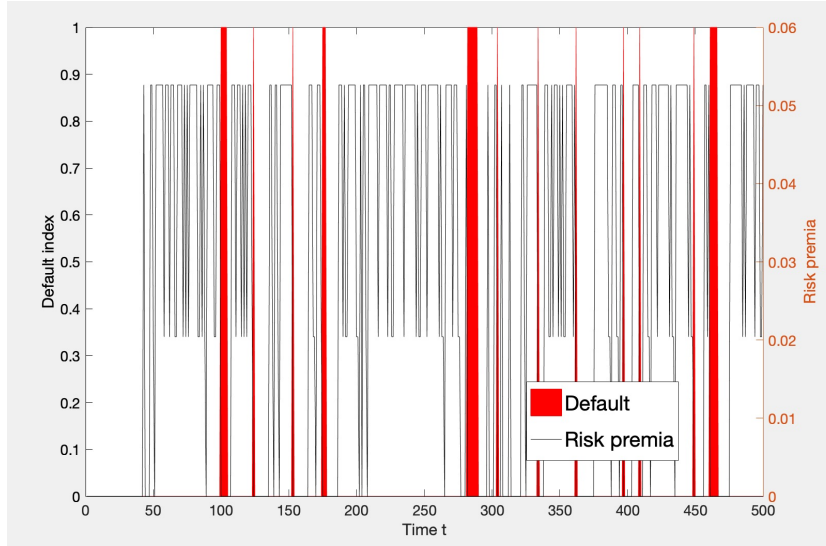


Figure 5: Probability of default.



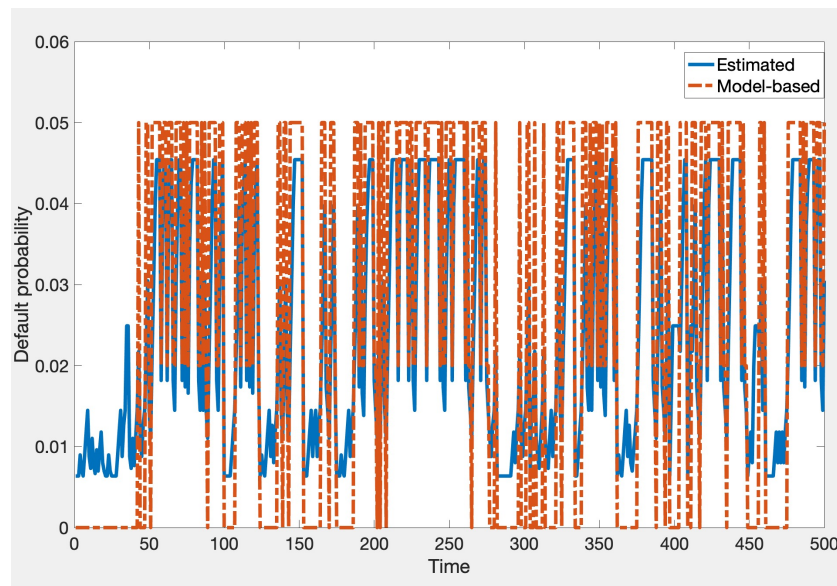
We find that with a fixed cost of default, the country does not default. Whereas with a different cost of default, there is a higher probability of default. This could be due to the fact that now the cost is too small relative to the GDP endowment. Thus, allowing for greater flexibility when making a decision about default. As discussed before, the more variable the cost of default, the higher the elasticity of default.

Indirect inference

First, we have estimated a logit on the probability of default using the debt-to-gdp as the only regressor and controlling for country fixed effects. By doing so, we got that the coefficient of the *debt_to_gdp* is equal to 1.15.

We then simulate the model and run the same logit regression over the simulated time series. In that case, the coefficient is 1.96. To make them closer, we change β to 0.91; as a result, the coefficient became 1.12. Graph 5 shows the probability of default out of the simulation.

Figure 6: Probability of default of the simulation.



STATA CODE

```
xtset Year Ind
xtlogit default debt_to_gdp, fe nolog
```

MATLAB Code

```
1 %% Code that solves the quantitative sovereign debt model
2 % Problem Set 8
3 rng(13);
4 %% Loading parameters
5 % Discount factor  $\beta=0.95$ 
6
7 betta=0.91;
8 %%
9 % Possible values for GDP  $y \in \{0.9, 1, 1.05\}$ 
```

```

10
11 y_grid=[0.6, 1, 1.5];
12 %%
13 % Transition matrix for GDP
14 %
15 %  $\pi_{yy} = \begin{bmatrix} 0.5 & 0.3 & 0.2 \\ 0.1 & 0.6 & 0.3 \\ 0.3 & 0.2 & 0.4 \end{bmatrix}$ 
16 % & 0.4 & 0.4\end{array}\right]
17
18 piy=[0.5, 0.3, 0.2;...
19      0.05, 0.65, 0.3;...
20      0.02, 0.55, 0.43];
21 %%
22 % Risk aversion parameter  $\sigma=2$ 
23
24 sig=1.5;
25 %%
26 % Utility function  $u(c) = \frac{c^{1-\sigma}}{1-\sigma}$ 
27
28 u = @(c) c.^(1-sig)./(1-sig);
29 %%
30 % Risk-free interest rate  $R=1$ 
31
32 R=1;
33 %%
34 % Probability of regaining access to capital markets next period
35 %  $\lambda=0.3$  We want that the probability of regaining access is 1
36 % - the
37 % probability of remaining in default (0.03).
38 lamda=0.5;
39 %%
40 % GDP loss during default. Varies with the level of GDP.
41 %tau = [0.2]
42 tau=[0.1,0.4,0.5];
43 %%
44 %
45 %% Initial values and the discretized state space
46 % Possible levels of debt issuance  $b \in B = \{0, 0.05, 0.1, \dots, 0.5\}$ 
47 B=0:0.05:2.8;
48
49 max_iter=10000;
50 max_iterq=10000;
51 %%

```

```

52 % Initial values for the value functions:
53 %
54 % We set the initial guess by assuming that GDP and the level of debt
    do not
55 % change over time.
56 %
57 % Value function of no default
58 %
59 %  $V_{\{0\}}(b,y)=\frac{u(y)}{1-\beta}$ 
60
61 V= ones( size(B,2) ,1)*u(y_grid)/(1-beta);
62 %%
63 % Value function of default
64 %
65 %  $V_{\{0\}}(y)=\frac{u(y)}{1-\beta}$ 
66
67 Vd = u((1-tau).*y_grid)/(1-beta);
68 %%
69 %
70 %% Equilibrium computation
71 % Our Initial guess for the bond-price schedule is constructed
    assuming the
72 % government never defaults  $q(b',y)=\frac{1}{R}$ 
73
74 q=ones( size(B,2) ,size(y_grid,2) );
75 %% Iterations on the price schedule
76
77 for iter_q=1:max_iterq
78
79 %
80 %% Value function iterations (taking      as given)
81
82
83 for iter=1:max_iter
84
85     for iy=1:size(y_grid,2)
86
87 %%
88 %  $V_{\{i+1\}}(y)=u\left((1-\tau)y\right)+(1-\lambda)\beta E\left\{ V_i(\right.$ 
        y')\mid
89 %  $y\right\} +\lambda\beta E\left\{ V_{\{i\}}(0,y')\mid y\right\}$ 
90
91     Vd(iy)=u((1-tau(iy))*y_grid(iy))+(1-lambda)*beta*piy(iy,:)*Vd'+
        lambda*beta*V(1,:)*piy(iy,:)';

```



```

92
93         for ib=1:size(B,2)
94
95             V_old=V;
96             Vd_old=Vd;
97             V(ib, iy)=max(max(u(max(y_grid(iy)+q(:, iy).*B'-B(ib), 0))+betta
98                 *V*piy(iy, :)'), Vd(iy)));
99         end
100     end
101     dev= max(max(abs([V_old-V; Vd_old-Vd])));
102     if dev<=0.001
103         break
104     end
105 end
106
107 %%
108 % Updating the bond price menu
109
110 for iy=1:size(y_grid, 2)
111     for ib=1:size(B, 2)
112
113         q(ib, iy)=1-piy(iy, :)*(V(ib, :)<=Vd)';
114     end
115 end
116
117 end
118 %% Bond price menu
119 plot_q(B, q)
120 %% Simulation of the model
121 % recovering the policy function
122
123 for iy=1:size(y_grid, 2)
124     for ib=1:size(B, 2)
125         % No default value and debt issuance (conditional on no default
126             [V_ND(ib, iy), bp(ib, iy)]=max(u(max(y_grid(iy)+q(:, iy).*B'-B(ib
127                 ), 0))+betta*V*piy(iy, :)') ;
128             % Default decision
129             Dp(ib, iy)=(V_ND(ib, iy)<=Vd(iy)) ;
130     end
131 end
132 %%

```

```

133 % Simuated sequence of GDP
134 %
135 % starting value (index)
136
137 yt=1;
138
139 for t=2:500
140     draw_t=rand;
141     yt(t)=1+(draw_t>=piy(yt(t-1),1))+(draw_t>=sum(piy(yt(t-1),1:2)));
142 end
143
144 %%
145 % initial level of debt
146 %
147 % index in B
148
149 bt=ones(500,1);
150 %%
151 % index for the default decision =1 and the default state
152
153 Def_b=nan(1,500);
154 Def_state(500)=0;
155
156 for t=2:500
157
158     if Def_state(t-1)==0
159
160         %%
161         % default decision (decided at t)
162
163         Def_b(t)=Dp(bt(t-1),yt(t));
164
165         if Def_b(t)==0
166
167             %%
168             % Debt issuance decision (decided at t)
169
170
171             bt(t)=bp(bt(t-1),yt(t));
172
173             Def_state(t)=0;
174         else
175             bt(t)=1;
176             Def_state(t)=1;

```

```

177     end
178
179     elseif rand<=lamda
180
181         Def_b(t)=Dp(bt(t-1),yt(t));
182
183         if Def_b(t)==0
184
185             %%
186             %      Debt issuance decision (decided at t)
187
188             bt(t)=bp(bt(t-1),yt(t));
189             Def_state(t)=0;
190         else
191             bt(t)=1;
192             Def_state(t)=1;
193         end
194
195     else
196
197         Def_state(t)=1;
198         bt(t)=1;
199     end
200
201
202     %%
203     %      Observed risk spread (1/q-1)
204
205     r_spread(t)=1/q(bt(t),yt(t))-1;
206     %%
207     %      Default probability
208
209     p_model(t)=1-q(bt(t),yt(t));
210
211 end
212
213 %%
214 % graph of default and the risk premia
215
216 risk_premia_graph(Def_state , r_spread)
217 %% Estimating a logit
218 % Arranging the data.
219 %
220 % We have to be sure that if a default spell lasts for more than one

```

```

        period ,
221 % we only include the first time default was declared (this is why we
222 %
223 % distinguish between the default decision and the default state)
224 %
225 %
226 %
227 % % Number of observations
228
229 N=sum(1-(isnan(Def_b)));
230 % Regressors. Constant and debt/GDP
231 X=[B(bt) ' ./ y_grid(yt) '];
232
233 % Default decision
234 Y=Def_b';
235
236 % Logit regression. Binomial outcome (0, 1)
237 [par_est,dev,stats]=glmfit(X(1:end-1),Y(2:end),'binomial');
238 disp('The Coefficient from the Logit')
239 disp(par_est)
240
241 % Estimated Default probability
242 X_grid=0:0.1:2;
243 p_est=1./(1+exp(-par_est(1)-par_est(2)*X_grid));
244 Mean_Def_P = mean(p_est);
245 disp('Probability of Default from the Model')
246 disp(Mean_Def_P)
247 Fit_model_graph(X(1:end-1), Y(2:end), X_grid, p_est)
248
249
250 % default probability in the simulation
251 p_est_sim=1./(1+exp(-par_est(1)-par_est(2)*X));
252 Mean_Def_Sim = mean(p_est_sim);
253 disp('Probability of Default from the Simulation')
254 disp(Mean_Def_Sim)
255
256 %Graph for the probability of default for the model and the
    Simualtion
257 sim_and_model_graph([p_est_sim,p_model'])

```
