Computational Techniques for Stability Analysis of a Class of Dynamic Economic Models

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ABSTRACT
Modern microeconomics and macroeconomics study dynamic phenomena. Dynamics could predict future states of an economy based on its structural characteristics. Dynamic models in discrete time discrete state economic systems may take the form of one single linear difference equation or a system of linear difference equations. In this study we use Xcas and Mathematica as software tools in order to generate results concerning the dynamic properties of the solutions of the difference equation(s) and, determine whether an economic equilibrium exists. Our computational approach does not require solving the difference equation(s) and makes no assumptions for initial conditions. The results provide quantitative information based on the qualitative properties of the mathematical solutions rather than on their quantifiable ones. The relevant output of CAS software is created in a way as to be interpreted without the knowledge of advanced mathematics. The computer codes are fully presented and can be reproduced as they are in computational-based research practice and education.

Keywords: Economic Equilibrium Exists, Computational-Based Research, Mathematical Models, Dynamic Economic System, Fundamental Dynamic Equation

1. INTRODUCTION
Dynamic economic analysis is to determine whether, given sufficient time, economic variables tend to converge to certain equilibrium (steady state) values. Time is considered as a discrete variable, meaning that any variable undergoes a change only once within a period of time. Thus, mathematical models used consist of one single or a simultaneous set of n-order linear difference equations. Linearity is not restrictive in economic applications since it may be imposed on a model through means of a first order taylor approximation.

In discrete time discrete state dynamic economic systems, only a subset of elements is given, these are the state variables of the economy such as the capital stock and asset position. Other variables may be free to take any value even in the initial period; these are typically flow variables such as consumption and labor. Classic discrete time discrete state economic models are the Cobweb model with memory of several periods, Samuelson multiplier-acceleration interaction model, inflation-unemployment model in discrete time, dynamic market models, macroeconomic and macroeconometric models.

In multi equation models, difference equations are often combined into a single fundamental dynamic equation. A simple second or third order difference equation usually does not suffice to explain cycles and other fluctuation phenomena that economic activity generates. As models become larger their dynamic behavior becomes more difficult and less straightforward. Therefore, a proper usage of computer software off-loads manual solving procedures that require heavy mathematical background. Studies towards this direction are made in textbooks as (Amman et al., 1996; Huang and Crooke, 1997; Tesfatsion and Judd, 2006; Miranda and Fackler, 2004; Varian, 1996) and papers as (Kendrick and Amman, 1999; Al-Rawi et al., 2007).

The study is organized as follows. Materials and Methods section introduces the concepts of stability and asymptotic convergence and sets the theoretical
framework that ensures stability for a single, linear, constant coefficient difference equation. In addition, eigen-decomposition and asymptotic stability are discussed for multivariable economic models expressed in matrix form. Results’ section proposes computer codes for stability conditions for single difference equations and for systems of difference equations in Mathematica and Xcas. Then, asymptotic behavior in convergent cases is predicted. Some applications are used to perform computations’ potential into several selected dynamic economic models. Finally, Discussion section concludes the study.

2. MATERIALS AND METHODS

When the solution of a dynamic economic system follows a restrictive non-explosive path this is what characterizes economic equilibrium. The structure of the mathematical model that insures existence of equilibrium has been studied among others in (Batra, 2006; Blanchard and Kahn, 1980; Folsom et al., 1976; Gu et al., 2003; Hamza and Khalaf-Allah, 2007; Jury, 1974). In economic applications stability appears to be a property with diachronic interest as shown in recent studies of (Ratto, 2008; Gomes, 2010).

The solution that follows a convergent time path is considered stable. Figure 1a-d depict the motion of variables during a given period. Specifically, Fig. 1a, b depict unstable solutions that belong to models with explosive behaviors. Figure 1c depicts a solution that follows a convergent time path with dampened oscillations; Fig. 1d depicts solutions with a non-oscillatory convergent time path.

2.1. Stability conditions for Linear Constant Coefficient Difference Equations

Stability Condition I. The general solution of a n-th order linear difference equation $a_0 y_{t+n} + a_1 y_{t+n-1} + \ldots + a_n y_t = g(t)$ consists of two parts, the complementary solution $y_c$ and the particular solution $y_p$, so that $y_t = y_c + y_p$. We are interested in the limiting behavior of the complementary function $y_c$. We say that the general solution is stable if and only if $\lim_{t \to \infty} y_c = 0$. Hence as $t \to \infty$, the behavior of the general solution of the difference equation is essentially that of the particular function. For a n-th order linear difference equation with constant coefficients, a necessary and sufficient condition for the particular solution to be stable is that Eq. 1:

$$|k| < 1, i = 1, \ldots, n$$

where, $r_i$ are real or complex roots of the characteristic polynomial $a_n r^n + a_{n-1} r^{n-1} + \ldots + a_0 = 0$.

Stability Conditions II. Next we present a determinantal expression of necessary and sufficient stability conditions.

Schur Theorem. The real polynomial $f(x) = a_0 x^n + a_1 x^{n-1} + a_2 x^{n-2} + \ldots + a_n = 0$ is called Schur stable if its roots $x_i$ are $|x_i| < 1$. The condition $|x_i| < 1$ holds if and only if the n determinants $\Delta_i (i = 1, \ldots, n)$ are positive. Given:

$$\Delta_i = \begin{vmatrix} a_0 & a_n & \cdots & a_{i+1} \\ a_1 & a_0 & \cdots & a_i \\ \vdots & \vdots & \ddots & \vdots \\ a_n & a_{n-1} & \cdots & a_0 \end{vmatrix}$$

The determinants $\Delta_i$ are Eq. 2:

$$\Delta_1 = a_n a_{n-1} \cdots a_1 a_0, \Delta_2 = a_n a_{n-1} a_{n-2} \cdots a_1 a_0, \ldots, \Delta_n = a_n a_{n-1} a_{n-2} \cdots a_1 a_0$$

For a detailed analysis see (Chiang, 2006; Jury, 1974; Neumann, 1979).

2.2. Stability Conditions For Systems Of Linear Constant Coefficient Difference Equations

Stability Condition III. Consider a system of linear constant coefficient first order difference equation in $u_k$ Eq. 3:

$$u_{k+1} = Au_k$$

Where:

$$u_k = \text{A vector of date k economic variables}$$

$$A = \text{Some square matrix}$$

By extending the vector $u_k$ and relabeling some lagged variables we can transform a higher order difference equation system into a first order difference equation (Chiang, 2006). It turns out that the eigenvalues of A help determining whether an equilibrium exists. After k steps there are k multiplications of the transformation $A = PDP^{-1}$ and the solution of (3) is the solution of Eq. 4:

$$u_{k+i} = A^i u_i = PD^i P^{-1} u_i$$
Fig. 1. About here (a) Unstable oscillatory behavior (b) Unstable non-oscillatory behavior (c) Stable oscillatory behavior (d) Stable non-oscillatory behavior
Where:
\[
P = \text{A matrix with columns the eigenvectors and characteristic vectors of the matrix } A
\]
\[
D = \text{The Jordan matrix of } A \text{ verifying } D = P^{-1}AP
\]
(Strang, 1988) 5G p.264

The necessary stability conditions for the system (3) are Eq. 5:
\[
-n < \text{tr} A < n
\]
\[-1 < |P| < 1
\]
(5)

Where:
\[
\text{tr} A = \text{The trace of the coefficient matrix } A
\]
\[n = \text{The number of variables } (\text{Strang, 1988} \ 5J)
\]

3. RESULTS

3.1. All Electronic Files are Available on Request

3.1.1. Computations in Xcas

Xcas is a Computer Algebra System available free in http://www-fourier.ujf-grenoble.fr/~parisse/giac.html In Xcas programming environment we create schurseries function, with arguments the characteristic polynomial (poly) of the difference equation and its variable (var). schurseries function calculates the determinant series (2). The computer codes are:

\[
A_{11}(\text{poly}, \text{var}):=\text{matrix}(\text{degree}(\text{poly}, \text{var}), \text{degree}(\text{poly}, \text{var}), (j, k)\rightarrow \text{if}(j < k) \ 0; \ \text{else coef}(\text{poly}, \text{var})[[j-k+1]]);
\]
\[
A_{12}(\text{poly}, \text{var}):=\text{matrix}(\text{degree}(\text{poly}, \text{var}), \text{degree}(\text{poly}, \text{var}), (j, k)\rightarrow \text{if}(j > k) \ 0; \ \text{else coef}(\text{poly}, \text{var})[[\text{degree}(\text{poly}, \text{var})+j-k+1]]);
\]
\[
A_{21}(\text{poly}, \text{var}):=\text{matrix}(\text{degree}(\text{poly}, \text{var}), \text{degree}(\text{poly}, \text{var}), (j, k)\rightarrow \text{if}(j < k) \ 0; \ \text{else coef}(\text{poly}, \text{var})[[\text{degree}(\text{poly}, \text{var})+k-j+1]]);
\]
\[
A_{22}(\text{poly}, \text{var}):=\text{matrix}(\text{degree}(\text{poly}, \text{var}), \text{degree}(\text{poly}, \text{var}), (j, k)\rightarrow \text{if}(j > k) \ 0; \ \text{else coef}(\text{poly}, \text{var})[[k-j+1]]);
\]

\[
\text{schurseries}(\text{poly}, \text{var}) := \text{seq} (\text{det} (\text{blockmatrix}(2,2,[\text{subMat}(A_{11}(\text{poly}, \text{var}),0,0,\text{var}),\text{subMat}(A_{12}(\text{poly}, \text{var}),0,0,\text{var}),\text{subMat}(A_{21}(\text{poly}, \text{var}),0,0,\text{var}),\text{subMat}(A_{22}(\text{poly}, \text{var}),0,0,\text{var}),\text{var})),k=0..\text{degree}(\text{poly}, \text{var}))-1)
\]

According to stability conditions II, if all determinants have positive signs, the corresponding difference equation is stable. For a direct answer to this stability test, we define stabilitytest1 function in Xcas, with arguments the characteristic polynomial (poly) of the difference equation and its variable (var), stabilitytest1 function returns «stable» for systems with equilibrium state(s) in case where all determinants (2) have positive signs and «unstable» for systems that have explosive behavior otherwise:

\[
\text{stabilitytest1}(\text{poly}, \text{var}) := \text{if}(\text{seq}(\text{sign}(\text{schurseries}(\text{poly}, \text{var})[[k]]), k=1..\text{degree}(\text{poly}, \text{var})) == \text{makelist}(1,1,\text{degree}((\text{poly}, \text{var}))) \text{ stable; else unstable};
\]

In Xcas environment, stability conditions (5) are examined using stabilitytest2 function taking system’s coefficient matrix as argument, stabilitytest2 function returns «stable» for systems with equilibrium state(s) in case where conditions (5) are satisfied and «unstable» for systems that have explosive behavior otherwise:

\[
\text{stabilitytest2}(\text{x}) := \text{if} (\text{abs} (\text{trace}(\text{x})) < \text{length}(\text{x}) \text{ and abs} (\text{det}(\text{jordan}(\text{x})[[2]])) < 1) \text{ "stable"; else "unstable";}
\]

In case equilibrium exists, we create steadystate function with arguments system’s coefficient matrix (a) and the system’s initial state in a column matrix form. steadystate function calculates the asymptotic state of the system in a column matrix form. Steadystate function uses Xcas’ built in function matpow which calculates the \(k=100000\) power of a matrix by jordanization, as shown in (4):

\[
\text{steadystate}(\text{a}, \text{initialstate}) := \approx \text{matpow} (\text{a},100000) * \text{initialstate}
\]

3.2. Computations in Mathematica

In Mathematica environment we can easily create the list of the absolute values of the characteristic roots. charvalues function takes as arguments the characteristic polynomial (poly) of the difference equation and its variable (var). charvalues function generates the list of the absolute values of the real or complex characteristic roots of the difference equation:

\[
\text{charvalues}[\text{poly}, \text{var}] := \text{Table} [\text{Abs} [\text{Root}[\text{poly}, \text{i}], i, \text{Length} [\text{Solve}[\text{poly}==0, \text{var}]], 1]
\]

For a direct answer to the stability test (1), we define stabilitytest function in Mathematica, with arguments the characteristic polynomial (poly) of the difference equation and its variable (var). Stabilitytest function returns «stable» for systems with equilibrium state(s) in case where the maximum element of the list of the
absolute values of the characteristic roots is less than 1 and «unstable» for systems that have explosive behavior otherwise:

\[
\text{stabilitytest[poly_,var_]:=If[Max[Table[Abs[Root[poly,i]],\{i,1,Length[Solve[poly==0,var]],1}\]<1,stable,unstable]}
\]

steadystate function in Xcas calculates the asymptotic behavior of the system \(u_{k+1} = A^k u_1\) after \(k=100000\) steps. Let us define now steadystate function in Mathematica. Mathematica’s steadystate function provides greater calculative precision, since the asymptotic behavior of the system is estimated for power \(k \to \infty\).

The first argument of steadystate function in Mathematica contains system’s coefficient matrix \((a)\) and the second argument system’s initial state \((\text{initial})\) in a column matrix form. steadystate function calculates the asymptotic behavior of the system in a column matrix form:

\[
\text{steadystate[a_,initial_]:=Simplify[JordanDecomposition[a][[1]].Limit[MatrixPower[JordanDecomposition[a][[2]],k],k \to \infty].Inverse[JordanDecomposition[a][[1]]].initial//MatrixForm}
\]

Generalizing previous output, we create distribution function, with arguments system’s coefficient matrix \((a)\) and system’s initial state \((\text{initial})\). Distribution function calculates the system state in step/time \(k\), in a column matrix form. Steadystate and distribution function in Mathematica are based on the equality \(A^k = P D^k P^{-1}\) and use Mathematica’s built in function JordanDecomposition which calculates a similarity matrix and the Jordan canonical form of a square matrix:

\[
\text{distribution[a_,initial_]:=Simplify[JordanDecomposition[a][[1]].MatrixPower[JordanDecomposition[a][[2]],k].Inverse[JordanDecomposition[a][[1]]].initial//MatrixForm}
\]

Let us examine existence of equilibrium in a number of economic models.

### 3.3. The Cobweb Model

The supply function for period \(t\) is \(Q^s_t = F + G E_{t-1}(p_t)\) where \(Q^s_t\) is the quantity supplied and \(E_{t-1}(p_t)\) is the price that suppliers in period \(t-1\) expected to prevail in period \(t\). Assuming that \(E_{t-1}(p_t) = P_{t-1} + \Delta P_{t-2}\) where \(\Delta P_{t-2} = P_{t-1} - P_{t-2}\) is the price change from period \(t-2\) to period \(t-1\) and \(r\) is a parameter. If \(0 \leq r \leq 1\), suppliers expect the next price change, \(E_{t-1}(p_t)\) to be in the opposite direction of the previous price change, \(\Delta P_{t-2}\). If \(-1 \leq r \leq 0\), suppliers expect the next price change to be in the same direction as the previous price change. The demand function is given by \(Q^d_t = A + B p_t\). Equilibrium occurs if \(Q^s_t = Q^d_t\). Substitutions lead to the following second-order difference equation:

\[
p_{t+2} - g(1-r) \frac{p_{t+1} - gr}{b} = (f-a) \frac{b}{b}
\]

We will test the stability for several values of \(g, b, r, a, f\). The example is taken from (Hoy et al., 2011) p.826.

In Mathematica we get a list of the absolute values of the characteristic roots by writing:

\[
G = 13; b = -16; r = -3/13; a = 60; f = 2; \text{charvalues}[x^2-g/b (1-r) x-g/b r,x]/N \{1.16144, 0.161438\}
\]

We apply Xcas’ programmed function schurseries:

\[
\text{schurseries(18*x^3+9*x^2-5*x-2,x)}
\]

Alternatively we decide stability using:

\[
\text{stabilitytest[x^2-g/b (1-r) x-g/b r,x] unstable}
\]

For different values of \(g,b,r,a,f\), Mathematica’s stability test gives:

\[
G = 13; b = -16; r = 3/13; a = 60; f = 2; \text{charvalues}[x^2-g/b (1-r) x-g/b r,x]/N \{0.433013, 0.433013\}
\]

We apply Xcas’ programmed function schurseries:

\[
\text{schurseries(18*x^3+9*x^2-5*x-2,x)}
\]

Xcas’ stability test gives:

\[
\text{stabilitytest(18*x^3+9*x^2-5*x-2,x) stable}
\]

### 3.4. The Cobweb Model for 3 Periods

The Cobweb model could give a higher order difference equation, i.e.:

\[
18y_{t+2} + 9y_{t+1} - 5y_{t+1} - 2y_t = 0
\]

We apply Xcas’ programmed function schurseries:

\[
\text{schurseries(18*x^3+9*x^2-5*x-2,x)}
\]

Xcas’ stability test gives:

\[
\text{stabilitytest(18*x^3+9*x^2-5*x-2,x) stable}
\]
3.5. A Macroeconomic Model

The following macroeconomic model is a quarterly model constructed by Kmenta and Smith. The equations were estimated with quarterly data over the period 1954-1963. The example is taken from (Pindyck and Rubinfeld, 1998).

\[
\begin{align*}
\dot{C}_t & = -1.7951 + 0.1731Y_t + 0.421(I_{d,t-1}
-0.7275L_{t-1}) + 0.7275C_{t-1}

\dot{I}_d^t & = 2.5624 - 0.4411\dot{r}_t + 0.1381(S_{t-1}
-0.7275L_{t-1}) + 0.7275C_{t-1}

\dot{I}_r^t & = 3.6083 - 0.5127\dot{r}_t + 0.1267(S_{t-1}
-0.7275L_{t-1}) + 0.7275C_{t-1}

\dot{S}_{t-2} & + 0.0237\dot{t}_t + 0.8917\dot{I}_d^t

\dot{I}_i^t & = 3.0683 - 0.5127\dot{r}_t + 0.1267(S_{t-1}
-0.7275L_{t-1}) + 0.7275C_{t-1}

\dot{S}_{t-2} & + 0.0218\dot{t}_t + 0.6483\dot{I}_i^t

\dot{r}_t & = 13.8928 + 0.261Y_t

-0.1501M_t + 0.0588M_{t-1}

Y_t & = 3.0716Y_{t-1} - 3.6561Y_{t-2} + 2.0850Y_{t-3} - 0.5585Y_{t-4} + 0.0535Y_{t-5}

+1.1427G_t - 2.5300G_{t-1} + 1.3779G_{t-2} + 0.5853G_{t-3} - 0.7463G_{t-4}

+0.1784G_{t-5} + 0.3168M_t

-0.7499M_{t-1} + 0.6253M_{t-2} - 0.2000M_{t-3}

+0.0082M_{t-4} + 0.0046M_{t-5}

+0.048L_t - 0.1065L_{t-1} + 0.0580L_{t-2}

+0.0246L_{t-3} - 0.0314L_{t-4}

+0.075L_{t-5} + 0.1034 - 0.2050(t-1)

+0.1267(t-2) - 0.0192

(t-3) - 0.0032(t-4) - 0.5113

\end{align*}
\]

Where:

\[
\begin{align*}
Y & = \text{Gross national product} \\
C & = \text{Consumption expenditures} \\
I_d & = \text{Producer's outlays on durable plant and equipment} \\
I_r & = \text{Residential construction} \\
I_i & = \text{Increase in inventories} \\
G & = \text{Government purchases of goods and services plus net foreign investment} \\
S & = \text{Final sales of goods and services} \\
T & = \text{Time in quarters (first quarter of 1954 = 0)} \\
R & = \text{Yield on all corporate bonds, percent per annum} \\
M & = \text{Money supply, i.e., demand deposits plus currency outside banks} \\
TD & = \text{Time deposits in commercial banks} \\
L & = \text{Money supply plus time deposits in commercial banks (representing liquid wealth)}
\end{align*}
\]

In Mathematica we get a list of the absolute values of the characteristic roots by writing:

\[
\text{charvalues}\left[x^5-3.0716*x^4+3.6561*x^3-2.085*x^2+0.5585*x-0.0535,x\right]
\]

\[
\{0.207946, 0.593134, 0.593134, 0.855162, 0.855162\}
\]

Alternatively we check stability conditions using:

\[
\text{stabilitytest}\left[x^5-3.0716*x^4+3.6561*x^3-2.085*x^2+0.5585*x-0.0535,x\right] \text{stable}
\]

Testing stability in Xcas we get:

\[
\text{schurseries}\left(x^5-3.0716*x^4+3.6561*x^3-2.085*x^2+0.5585*x-0.0535,x\right)
\]

\[
1, 0.84, 0.24, 0.005, 2e-06
\]

Or:

\[
\text{stabilitytest1}\left(x^5-3.0716*x^4+3.6561*x^3-2.085*x^2+0.5585*x-0.0535,x\right) \text{stable}
\]

3.6. Some Empirical Applications

Application 1

Multinational companies in the U.S., Japan and Europe have assets of $4 trillion. At the start, $2 trillion are in the U.S. and $2 trillion in Europe. Each year $\frac{1}{2}$ of the U.S. money stays home, $\frac{1}{4}$ goes to both Japan and Europe. For Japan and Europe $\frac{1}{2}$ stays home and $\frac{1}{2}$ is sent to the U.S. Find the limiting distribution of the $4$ trillion as the world ends. Find the distribution at year k. (The application is taken from (Strang, 1988) ex. 5.3.11 p. 273).
In Xcas environment we define:

\[
b := \begin{bmatrix}
\frac{1}{2}, \frac{1}{2}, \frac{1}{2} \\
\frac{1}{4}, \frac{1}{2}, 0 \\
\frac{1}{4}, 0, \frac{1}{2}
\end{bmatrix}
\]

`stabilitytest2(b)`  
"stable"

`steadystate(b, [[2], [0], [2]])`:

\[
\begin{bmatrix}
2.0 \\
1.0 \\
1.0
\end{bmatrix}
\]

In Mathematica environment we define:

\[
b := \begin{{array}{ccc}
\frac{1}{2} & \frac{1}{2} & \frac{1}{2} \\
\frac{1}{4} & \frac{1}{2} & 0 \\
\frac{1}{4} & 0 & \frac{1}{2}
\end{array}
\]

`Steadystate[a, {{0}, {5}}]`:

\[
\begin{bmatrix} 3 \\
2.0
\end{bmatrix}
\]

Distributionk[a, {{0}, {5}}]:
Testing the stability of the complementary solution in Xcas:

\[
\text{stabilitytest2}([[0.7,0.3],[0.1,0.75]])
\]

“stable”

We conclude that income vector \( Y_t \) for both economies reaches a steady state as \( t \to \infty \).

4. DISCUSSION

Computer packages provide solutions of the characteristic equations, letting the user compute their magnitude which yields to stability conclusions for difference equations. In our study, computer codes that test necessary and sufficient stability conditions in a black box function are proposed. We created \text{stabilitytest} and \text{stabilitytest1}, \text{stabilitytest2} functions in Mathematica and Xcas correspondingly, to define whether the process of economic adjustment leads to equilibrium. When equilibrium can be accomplished as time passes, the output of our functions is «stable» and otherwise, when the model follows a divergent time path, the output of our functions is «unstable».

By \text{stabilitytest} function the stability result comes from checking the magnitude of the characteristic roots of a difference equation. In \text{stabilitytest1} function, stability test is based on Schur’s Theorem and the result appears without solving the characteristic equation. \text{stabilitytest2} function was programmed using theory of n-dimensional linear algebra to generate stability conclusions for simultaneous difference equations in matrix form. Programmed functions in Mathematica are aimed at the wide community of Mathematica users. For readers with no access to Mathematica or other commercial software of the kind, computer algebra system Xcas is free to single users and institutions.

The reader can reproduce the results avoiding the serious theoretical and computational difficulty underlying in stability analysis. In addition, the computer codes presented can make an open source material to enrich stability analysis with results like the list of the real or complex characteristic roots in absolute value (charvalues function), the determinants of Schur theorem (schurseries function) and future state of economic systems (steadystate and distributionk functions in case of homogeneous systems).

5. CONCLUSION

This study aims at prediction of dynamic behavior of a class of discrete time discrete stage economic systems. Specifically, it examines whether they follow a convergent time path or not. In case convergence is assured, the asymptotic state of the system is given, taking into account its initial value. Stability results come from conditions depending on characteristic roots and/or determinental expressions of coefficient matrices of difference equations and not by the initial values of some elements. Steady state predictions apply Jordan Decomposition method. All results are generated by computer codes in both free computer algebra system Xcas and commercial mathematical package Mathematica.

6. REFERENCES


