

# Lecture 11: Solving DSGE Models Part II

## Numerical Solution Methods

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Advanced Monetary Economics 2018

# Roadmap

- 1 Introduction
- 2 Perturbation Methods
- 3 Dynare Basics
- 4 Example Model
- 5 Advanced Features of Dynare
- 6 Conclusion

# Motivation

- Analytical solution methods involve finding optimality conditions for the model, linearising and then guess and verify.
- Nice because this can lead to nice closed-form solutions for impulse responses that we can perform comparative statics on.
- **Limitation:** this only works for very simple models.
- When things get a little more complicated, we need to use a computer.

# Numerical Solutions

- When you use a computer, instead of getting solutions for a general set of parameters as we did in the last lecture, you'll get a particular solution for a **specific set of parameters**.
- This is why we call it a numerical solution.
- E.g. say there are three different types of capital stocks that can be saved by agents in the model.
  - This is too many endogenous state variables to keep track of analytically.
  - We'll often **have to** solve numerically.

# Computational Economics

- There's a whole branch of economics that deals with computational methods for models.
- This is an area that Wisconsin is pretty well-known for, so I learned a lot about it in graduate school.
- If we're finding numerical solutions, how do we interpret the numbers that come out of the model simulations?
- You'll typically be asking a **quantitative** research question rather than a qualitative one.
- E.g. if the fed funds rate increases by 1%, what will the response of output be?
  - Answer would be something like output decreases by  $x\%$ .


# Dynare

- In this lecture, I'm just going to focus on one small and accessible tool that you can use for solving relatively complicated DSGE models.
- Dynare: collection of Matlab libraries that make solving these models easy.
- Requires no programming experience.
- Used by central banks, international organisations and graduate students.
- I used it for my Masters thesis in Australia...



Original Article

## Effectiveness of the Australian Fiscal Stimulus Package: A DSGE Analysis\*

Shuyun May Li  Adam Hal Spencer

First published: 12 November 2015 | <https://doi.org/10.1111/1475-4932.12224> | Cited by: 2

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# General Perturbation Methods

- Dynare employs what are called perturbation methods.
- We are looking for policy functions that satisfy the FOCs of our DSGE model.
- FOC equations generally of the form

$$\mathbb{E}_t[f(y, \epsilon, p)] = 0$$

where  $y$  is a vector of endogenous variables,  $\epsilon$  is a vector of state variables and  $p$  is a vector of parameters.

- We seek a policy function of the form  $y(\epsilon, p)$ .

# First and Higher Order Perturbation

- When we log-linearise our model, we employ a **first order** perturbation.
- Find the coefficients of a linear approximation to the policy function

$$y(\epsilon, p) = y_0(p) + y_1(p)(\epsilon - \bar{\epsilon})$$

- Higher order perturbation involves extra terms

$$y(\epsilon, p) = y_0(p) + y_1(p)(\epsilon - \bar{\epsilon}) + y_2(p)(\epsilon - \bar{\epsilon})^2 + y_3(p)(\epsilon - \bar{\epsilon})^3 + \dots$$

- Dynare can do **second** and **third** order perturbations as well as first.
- Higher order means more moments of the shocks affect the endogenous outcomes.

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# Timing

- Timing convention is such that variables that are known at time  $t$  are dated  $t - 1$ .
- Need to change the notation from what we've been using.
- E.g. in RBC model with capital
  - $k_t$  denoted the capital we came into the period with.
  - $k_{t+1}$  was our choice of control.
- The translation we'd have to make for input into Dynare would be
  - $k(t - 1)$  denoted the capital we came into the period with.
  - $k(t)$  was our choice of control.

# Model File: Overview

- The input into Dynare is a model file (.mod file).
- Has a very specific syntax that you need to follow.

## Model File (1)

```
%List the endogenous variables  
var a b c d;
```

```
%List the exogenous variables  
varexo e f;
```

```
%List the parameters  
parameters alpha_1 alpha_2 alpha_3 alpha_4;
```

```
%Specify the values for the parameters  
alpha_1 = 1;  
alpha_2 = 1;  
alpha_3 = 1;  
alpha_4 = 1;
```

## Model File (2)

```
%Specify the model equations
model;
eq_{1};
eq_{2};
eq_{3};
eq_{4};
eq_{5};
eq_{6};
end;
```

## Model File (3)

```
%Specify the initial values
initval;
a = a_initval;
b = b_initval;
c = c_initval;
d = d_initval;
e = e_initval;
f = f_initval;
end;
```



## Model File (4)

```
%Give values to the shocks
shocks;
var e = 0.01^2;
var f = 0.01^2;
end;

stoch_simul;
```

## Model File: Output

- The output from running this code will be impulse response functions for all the endogenous variables from shocks of size 1% to each of the  $e$  and  $f$  exogenous variables.
- You'll also get details regarding the policy functions (useful if you want to simulate the model).

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# Model Setup

- Consider a problem of the form

$$\max_{\{c_t, k_{t+1}\}_{t=0}^{\infty}} \mathbb{E}_0 \sum_{t=0}^{\infty} \beta^t \frac{c_t^{1-\sigma}}{1-\sigma}$$

subject to

$$k_{t+1} = a_t k_t^\alpha - c_t + (1 - \delta) k_t$$
$$\log(a_t) = \rho \log(a_{t-1}) + \epsilon_t$$

# Model Optimality Conditions

- Has optimality conditions of the form

$$\begin{aligned}c_t^{-\sigma} &= \beta \mathbb{E}_t [c_{t+1}^{-\sigma} (\alpha a_{t+1} k_{t+1}^{\alpha-1} + (1 - \delta))] \\k_{t+1} &= a_t k_t^\alpha - c_t + (1 - \delta) k_t \\ \log(a_t) &= \rho \log(a_{t-1}) + \epsilon_t, \quad \epsilon_t \sim N(0, \sigma_\epsilon)\end{aligned}$$

## Model File (1)

```
%List the endogenous variables
var k a c;

%List the exogenous variables
varexo epsilon;

%List the parameters
parameters sigma beta alpha rho sigma_epsilon delta;

%Specify the values for the parameters
sigma = 1;
beta = 0.95;
alpha = 0.33;
rho = 0.95;
sigma_epsilon = 0.1;
delta = 0.15;
```

## Model File (2)

```
%Specify the model equations
model;
c^(-sigma) = beta*c(+1)^(-sigma)* ...
(alpha*a(+1)*k^(alpha-1) + (1-delta));
k = a*k(-1)^(alpha) - c + (1-delta)*k(-1);
ln(a) = rho*ln(a(-1)) + epsilon
end;
```

## Model File (3)

```
%Specify the initial values
initval;
k = (1/alpha*(1/beta - (1-delta)))^(1/(alpha -1)); ...
%the steady state k
a = 1; %ss a
c = ((1/alpha*(1/beta - (1-delta))))...
^(alpha/(alpha -1)) - ...
delta*(1/alpha*(1/beta - (1-delta)))^(1/(alpha -1));
end;

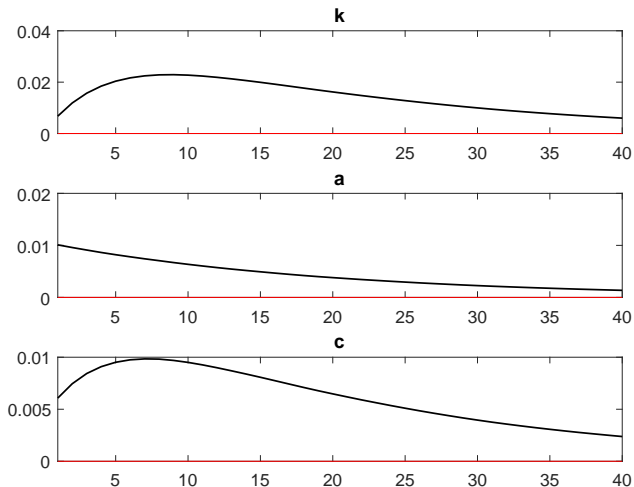
%Give values to the shocks
shocks;
var epsilon = 0.01^2;
end;

stoch_simul;
```



# Output: Impulse Response Functions

- Impulse response functions to 1%  $a_t$  shock.



# Output: Policy Functions

## POLICY AND TRANSITION FUNCTIONS

	k	a	c
Constant	2.070785	1.000000	0.960878
(correction)	0.000026	0	-0.000026
k(-1)	0.805219	0	0.247413
a(-1)	0.636330	0.950000	0.571613
epsilon	0.669821	1.000000	0.601698
k(-1),k(-1)	-0.012578	0	-0.020203
a(-1),k(-1)	0.095328	0	0.097172
a(-1),a(-1)	0.009847	-0.023750	-0.040046
epsilon,epsilon	0.363448	0.500000	0.272311
k(-1),epsilon	0.100346	0	0.102286
a(-1),epsilon	0.690552	0.950000	0.517391

- Notice the second order terms in the policy function given that the default is  $2^{nd}$  order perturbation

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# Estimation

- For the examples we've considered here, we've used fixed parameter values in solving the models.
- A great feature of Dynare is that it can also **estimate** these parameters for you.
- If you collect macro data on observable variables related to the model, (e.g. inflation, output growth and consumption), you can use Bayesian estimation to get posteriors for the structural parameters.

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# Takeaways

- When we can't solve a model in its general form, we need to solve it numerically.
- Dynare is a great way to easily get acquainted with solving models with no programming experience.
- Useful to know if you intend to be a professional macroeconomist.