

# Using Mathematica to solve simple optimal tax problems

July 26, 2013

# Overview

## Optimal Tax in Mathematica

### Optimal Taxation Problem

#### Model Simple Life-Cycle Problem

#### Scope of this Work

### Implementation in Mathematica

#### Objective Function

#### Individual Visualization

#### Building Data Base

#### Pareto Frontier Results

## 1 Optimal Taxation Problem

- Model
- Simple Life-Cycle Problem
- Scope of this Work

## 2 Implementation in Mathematica

- Objective Function
- Individual Visualization
- Building Data Base
- Pareto Frontier
- Results

# Policy Optimization in a Life-Cycle Model

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

Type Space

$$\Rightarrow \theta \in \Theta$$

Policy Space

$$\Rightarrow \kappa \in K$$

Consumer Utility Function

$$\Rightarrow U(x|\theta, \kappa) = \int_0^T e^{-\rho t} u(x_t|\theta, \kappa)$$

Policy-Maker Revenue Function

$$\Rightarrow V(x|\theta, \kappa) = \int_0^T e^{-rt} \mathcal{T}(x_t|\theta, \kappa)$$

# Simple Life-Cycle Model

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem  
Model  
Simple  
Life-Cycle  
Problem  
Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function  
Individual  
Visualization  
Building Data  
Base  
Pareto Frontier  
Results

We assume:

- Homogeneous preferences.  $\theta$  is the same for everyone.
- A separable CRRA utility function

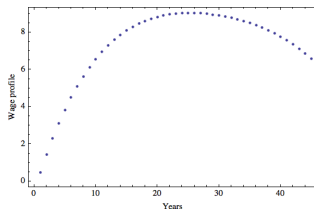
$$u(c_t, l_t | \gamma, \eta) = \frac{c_t^{1-\gamma}}{1-\gamma} - \frac{l_t^{1+\eta}}{1+\eta}$$

- A T-year discrete period.

$$U(c, l | \gamma, \eta) = \sum_{t=1}^T \beta^{t-1} u(c_t, l_t | \gamma, \eta)$$

# Simple Life-Cycle Model

Optimal Tax  
in  
Mathematica



- Exogenous wage profile  
 $w(t)$  = 4th degree polynomial [Hubbard, Judd, 1986].
- A retirement age  $T_{ret}$  at which  $\ell_t = 0$
- A borrowing constraint  $a_{min}$
- A policy space of two dimensions.
  - 1  $\tau_k$  Capital Tax Rate
  - 2  $\tau_\ell$  Labor Tax Rate

Optimal  
Taxation  
Problem  
Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

# Purpose of this Work

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

- Use Multi-objective optimization to get a broad picture of optimal tax policy in a simple life-cycle model.
- Create a portable environment capable of evaluating parameters specified by user.

# Implementation: Multi-Objective Optimization

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

$$\textcircled{1} \quad U^*(c^*, l^* | \gamma, \eta) = \max_{c, l \in B(c, l)} \sum_{t=1}^T \beta^{t-1} \frac{c_t^{1-\gamma}}{1-\gamma} - \frac{l_t^{1+\eta}}{1+\eta}$$

$$\textcircled{2} \quad V(c, l) = \sum_{t=1}^T \frac{1}{1+r}^{t-1} \mathcal{T}(w_t l_t, r a_t | \tau_l, \tau_k)$$

$$\text{s.t.} \quad (1+r)a_t + w_t l_t \geq c_t + \mathcal{T}(w_t l_t, r a_t | \tau_l, \tau_k) + a_{t+1}$$

$$c_t > 0, l_t \geq 0 \quad \forall t \in \{1 \dots T\}$$

# Objective function and constraints

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

$$\max_{c, l \in B(c, l)} \sum_{t=1}^T \beta^{t-1} \frac{c_t^{1-\gamma}}{1-\gamma} - \frac{\ell_t^{1+\eta}}{1+\eta}$$

s.t.

$$Ra_t + w_t l_t \geq c_t + \mathcal{T}(w_t l_t, ra_t | \tau_l, \tau_k) + a_{t+1}$$

$$c_t > 0, l_t \geq 0$$

$$a_1 = 0, a_{T+1} \geq 0$$

$$a_t \geq a_{min} \quad \forall t \in \{1 \dots T\}$$



Since consumer is allowed to borrow, the Tax function  $\mathcal{T}$  must be represented like this:

$$\mathcal{T}(w_t l_t, r a_t | \tau_l, \tau_k) = \begin{cases} \tau_l w_t l_t + \tau_k r a_t & a_t > 0 \\ \tau_l w_t l_t & \text{otherwise} \end{cases}$$

# Some individual profiles obtained

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

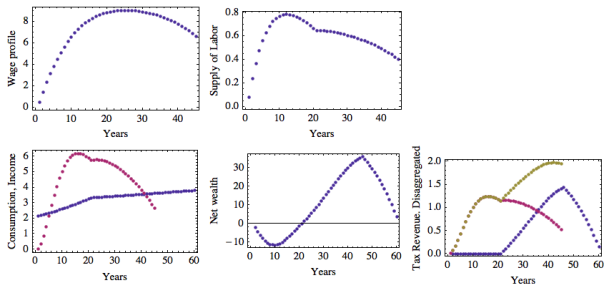
Objective  
Function

Individual  
Visualization

Building Data  
Base

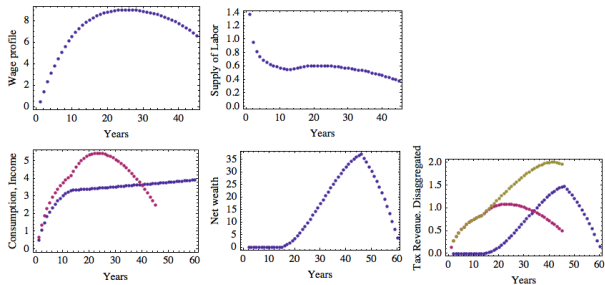
Pareto Frontier  
Results

Figure : Individual profile with:  $\gamma = 2, \eta = 1$  Subject to:  
 $\tau_k = 0.40, \tau_l = 0.20$ . Borrowing Constraint = -20



# Some individual profiles obtained

Figure : Individual profile with:  $\gamma = 2, \eta = 1$  Subject to:  
 $\tau_k = 0.40, \tau_l = 0.20$ . Borrowing Constraint=0



We can see that the same consumer with a same tax rate can change its profile sharply due to a borrowing constraint.

# Some individual profiles obtained

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

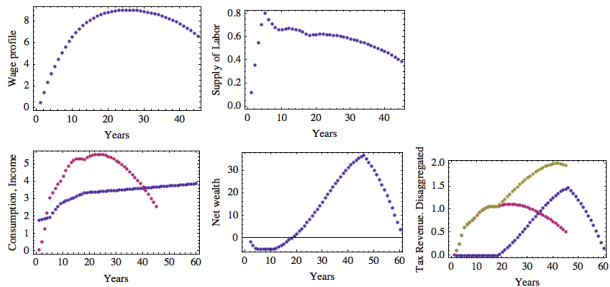
Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

Figure : Individual profile with:  $\gamma = 2, \eta = 1$  Subject to:  
 $\tau_k = 0.40, \tau_l = 0.20$ . Borrowing Constraint = -5



# Building Data Base

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

**Building Data  
Base**

Pareto Frontier  
Results

Data Base was built with different elasticities and borrowing constraints

$$\gamma = \frac{1}{2}, 1, 2, 4$$

$$\eta = 1, 2, 5, 10$$

$$a_{min} = 0, -10, -20, -\infty$$

For each one of these, we create our grid of tax policies  $\tau_l, \tau_e$ .

# Data Base in Mathematica

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

In Mathematica tax policies  $\tau_\ell, \tau_\ell$  were evaluated with a 5% grid interval, giving us a total of 25600 calculations.

Run	Single	Parallel
Simple Run	7h20m*	–
Warm Start	6h28m*	2h56m
Warm Start "smart" cycle	6h	2h38m

Table : Run Times in Mathematica

# Data Base in Ipopt

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

In C++ through Ipopt the tax policies were evaluated with a 1% grid interval, giving us a total of 640,000 calculations.

Run	Single
Simple Run	—
Warm Start (primals)	4h
Warm Start (primals & duals)	3h00m
Warm Start (p & d) + "smart" cycle	2h40m

Table : Run Times in Ipopt

-The linear solver used for Ipopt was MUMPS, in order to avoid the need for a strictly academic license.

# Visualization

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

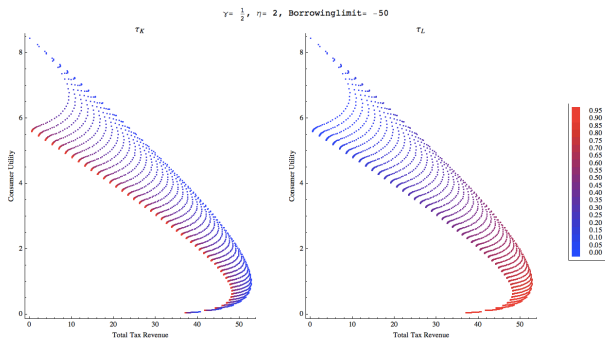
Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

Figure : Tax Interval: 5x5





# Visualization

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

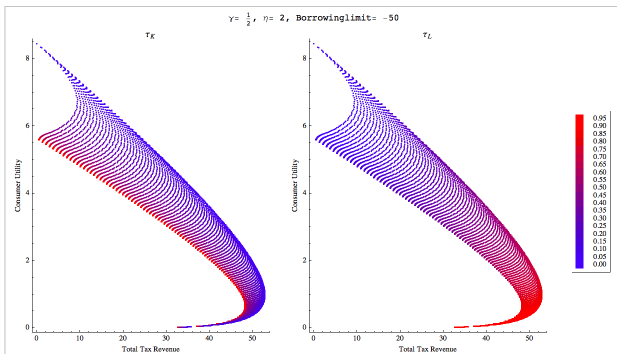
Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

Figure : Tax Interval: 1x1



# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem  
Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function  
Individual  
Visualization  
Building Data  
Base  
**Pareto Frontier**  
Results

Calculation was made through Mathematica and an interactive tool of results can be constructed.

# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

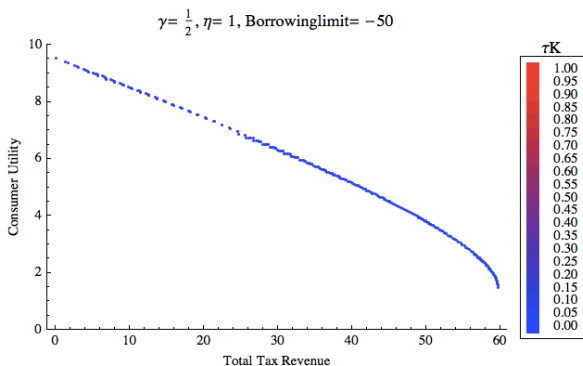
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

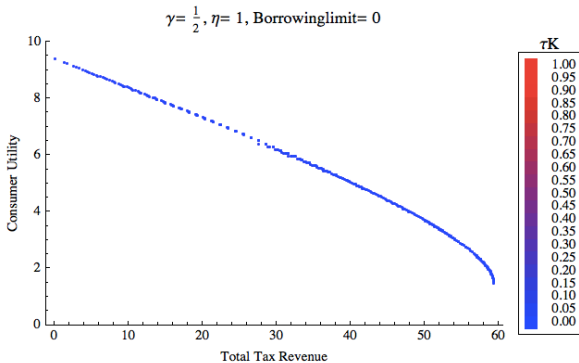
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

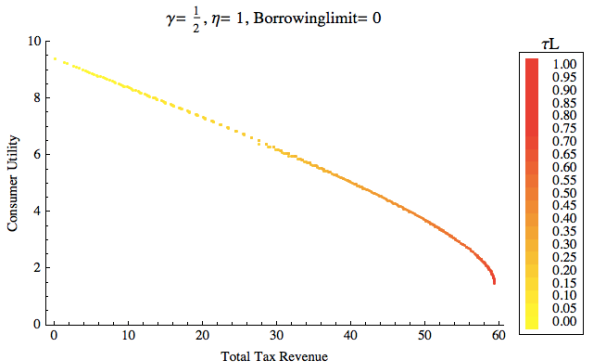
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

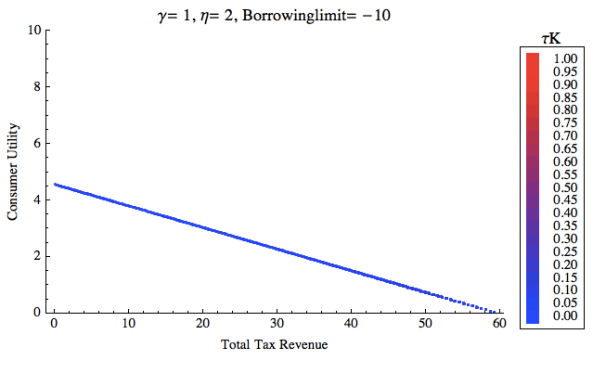
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



# Pareto Frontier

## Optimal Tax in Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

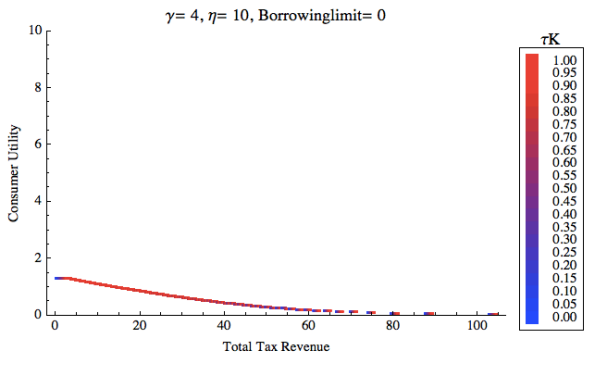
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

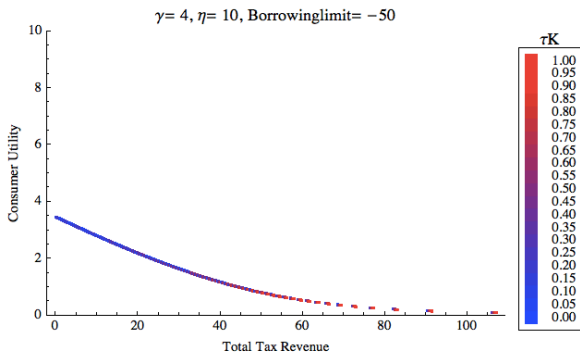
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results





# Pareto Frontier

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

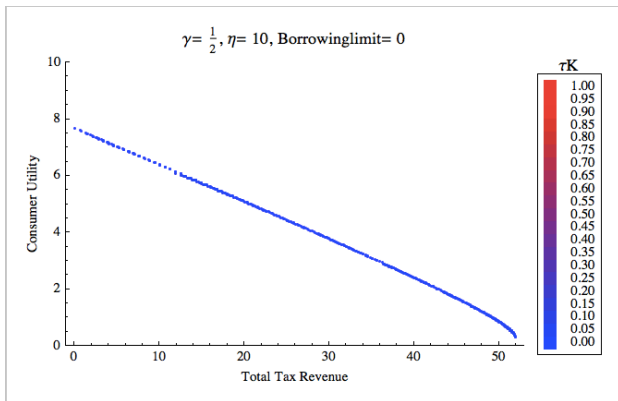
Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



It is only within a corner of our state descriptors where a high capital tax rate could be an optimal point. This is due to the combination of two factors:

- A low intertemporal elasticity of substitution for leisure and consumption makes consumer unwilling (almost indifferent) to shift their consumption and leisure patterns due to a capital tax rate boost.
- The same borrowing constraint prevented the consumer to ease his burden by any negative asset holding. Thus, consumer is also indifferent to shift their savings around time.

# Results

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results

- We could see that the Pareto frontier is composed of policies involving nearly-zero capital tax rates
- With strong borrowing constraints, high capital tax rates may lay over the Pareto frontier. However, a low capital tax rate option is always available with similar revenue.
- In the case that we have a combination of low intertemporal elasticities of consumption and leisure, the borrowing constraint does make a capital tax rate an optimal condition. We basically leave the individual.

# References

Optimal Tax  
in  
Mathematica

Optimal  
Taxation  
Problem

Model  
Simple  
Life-Cycle  
Problem

Scope of this  
Work

Implementation  
in  
Mathematica

Objective  
Function

Individual  
Visualization

Building Data  
Base

Pareto Frontier  
Results



R. Glenn Hubbard, Kenneth L. Judd (1986)

Liquidity Constraints, Fiscal Policy, and Consumption

*Brookings Papers on Economic Activity* 1986(1), 1-59