ProblemSet2_ANSWER

May 15, 2019

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0.0.1 Problem Set 2
MACS 30250, Dr. Evans
Due Wednesday, May. 15 at 1:30pm
Tianxin Zheng
1.Stochastic i.i.d. cake eating problem
In [1]: import numpy as np
        import scipy.optimize as opt
        import scipy.interpolate as intpl
        import matplotlib.pyplot as plt
        %matplotlib notebook
(a)
In [2]: \# Set up the parameters
        beta = 0.9
        gamma = 2.2
        W_{min} = 0.1
        W_{max} = 10.0
        W_size = 30
        W_vec = np.linspace(W_min, W_max, W_size)
        V_t = np.log(W_vec)
        def util_CRRA(W, W_pr, gamma):
            # Define CRRA utility function
            c = W - W_pr
            util = (c ** (1 - gamma) - 1) / (1 - gamma)
            return util
```

eps_vec = np.array([-1.40, -0.55,0.00,0.55,1.4])

 $eps_prob = np.array([0.1,0.2,0.4,0.2,0.1])$

eps_size = eps_vec.shape[0]

```
def neg_V_iid(W_pr, *args):
            W_init, eps, util, EXP_V_t_interp, gamma, beta = args
            Vtp1 = np.exp(eps) * util(W, W_pr, gamma) + beta * EXP_V_t_interp(W_pr)
            neg_Vtp1 = -Vtp1
            return neg_Vtp1
In [3]: V_init = np.zeros((W_size, eps_size))
        V_new = V_init.copy()
        VF iter = 0
        VF dist = 10
        VF_maxiter = 200
        VF_mindist = 1e-8
        while (VF_iter < VF_maxiter) and (VF_dist > VF_mindist):
            VF_iter += 1
            V_init = V_new.copy()
            V_new = np.zeros((W_size, eps_size))
            psi_vec = np.zeros((W_size, eps_size))
            # Intergrate out eps_pr from V_init
            Exp_V = V_init @ eps_prob.reshape((eps_size, 1))
            # Interpolate ? value function
            Exp_V_interp = intpl.interp1d(W_vec, Exp_V.flatten(), kind='cubic',
                                           fill value='extrapolate')
            for eps_ind in range(eps_size):
                for W_ind in range(W_size):
                    W = W_vec[W_ind]
                    eps = eps_vec[eps_ind]
                    V_args = (W, eps, util_CRRA, Exp_V_interp, gamma, beta)
                    results_all = opt.minimize_scalar(neg_V_iid, bounds=(1e-10, W - 1e-10),
                                                       args=V_args, method='bounded')
                    V_new[W_ind, eps_ind] = -results_all.fun
                    psi_vec[W_ind, eps_ind] = results_all.x
            VF_dist = ((V_init - V_new) ** 2).sum()
            print('VF_iter=', VF_iter, ', VF_dist=', VF_dist)
VF_iter= 1 , VF_dist= 3494.416552492849
VF_iter= 2 , VF_dist= 3288.9775602179398
VF_iter= 3 , VF_dist= 4368.033199294504
VF_{iter} = 4 , VF_{dist} = 5171.123172733101
VF_iter= 5 , VF_dist= 5690.816865389136
VF_iter= 6 , VF_dist= 5962.334129328155
VF_iter= 7 , VF_dist= 6029.410863441401
```

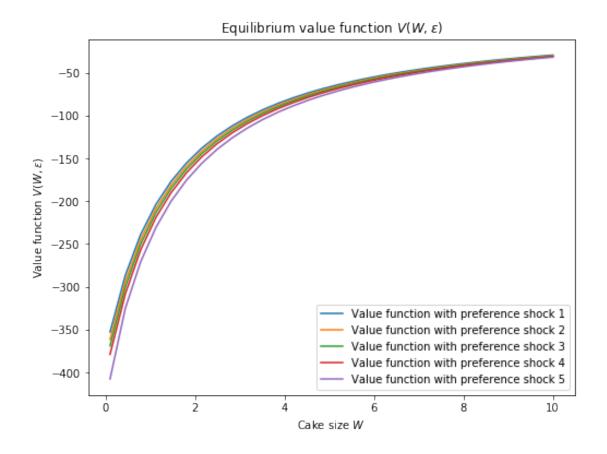
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\label{eq:VF_iter} VF\_iter = \ 62 \ , \ VF\_dist = \ 0.7676605629606206
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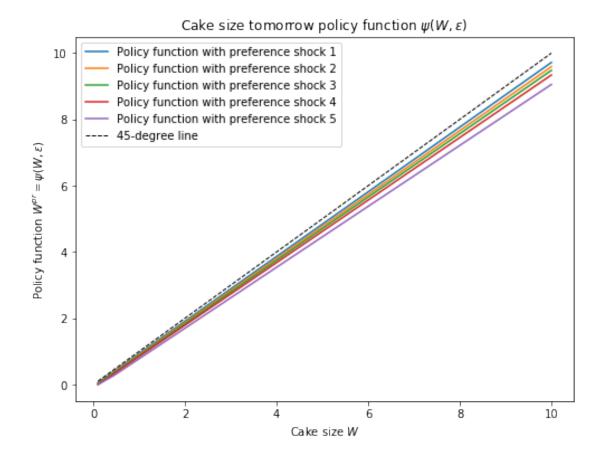
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(b)

Out[4]: <matplotlib.legend.Legend at 0x1108c5198>



Out[5]: <matplotlib.legend.Legend at 0x1109dd748>



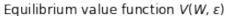
2. Persistent AR(1) stochastic cake eating problem

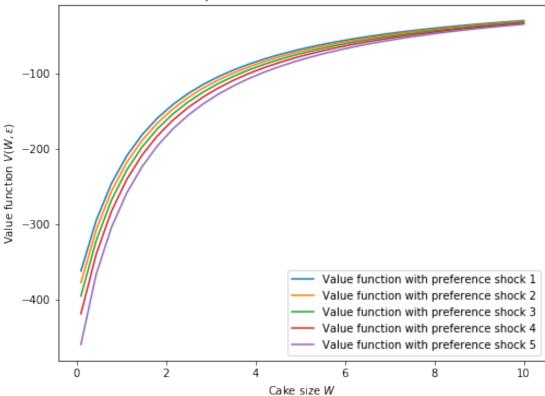
```
while (VF_iter < VF_maxiter) and (VF_dist > VF_mindist):
            VF_iter += 1
            V_init = V_new.copy()
            V new = np.zeros((W size,eps size))
            psi_mat = np.zeros((W_size,eps_size))
            for eps ind in range(eps size):
                eps = eps_vec[eps_ind]
                eps_prob = trans_mat[eps_ind,:]
                Exp_V = V_init @ eps_prob.reshape((eps_size,1))
                Exp_V_interp = intpl.interp1d(W vec, Exp_V.flatten(), kind='cubic',
                                          fill_value='extrapolate')
                for W_ind in range(W_size):
                    W = W_{vec}[W_{ind}]
                    V_args = (W, eps, util_CRRA, Exp_V_interp, gamma, beta)
                    results1 = opt.minimize_scalar(neg_V_iid, bounds=(1e-10, W - 1e-10),
                                                   args=V_args, method='bounded')
                    V_new[W_ind, eps_ind] = -results1.fun
                    psi_mat[W_ind, eps_ind] = results1.x
            VF dist = ((V init - V new) ** 2).sum()
            print('VF_iter=', VF_iter, ', VF_dist=', VF_dist)
VF_iter= 1 , VF_dist= 3494.416552492849
VF iter= 2 , VF dist= 4874.985394413625
VF_iter= 3 , VF_dist= 5656.12392067181
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VF_iter= 5 , VF_dist= 6784.60512520715
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VF_iter= 113 , VF_dist= 1.9639175069992804e-05
\label{eq:vf_iter} VF\_iter = \ 114 \ \ , \ VF\_dist = \ 1.5907355728518072e-05
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VF_iter= 135 , VF_dist= 1.8980678277275483e-07
VF_iter= 136 , VF_dist= 1.5373192912320232e-07
VF_iter= 137 , VF_dist= 1.245151713786484e-07
VF_iter= 138 , VF_dist= 1.0085235263566314e-07
VF_iter= 139 , VF_dist= 8.168739194090008e-08
VF_iter= 140 , VF_dist= 6.616508779991977e-08
VF iter= 141 , VF dist= 5.359289518903287e-08
VF_iter= 142 , VF_dist= 4.340998180457873e-08
VF_iter= 143 , VF_dist= 3.51621655905898e-08
VF_iter= 144 , VF_dist= 2.8481629018835357e-08
VF_iter= 145 , VF_dist= 2.3070489617555775e-08
VF_iter= 146 , VF_dist= 1.868749732046429e-08
VF_iter= 147 , VF_dist= 1.5137265955297337e-08
VF_iter= 148 , VF_dist= 1.2261547883836958e-08
VF_iter= 149 , VF_dist= 9.93217479503226e-09
(b)
In [8]: plt.figure(figsize=(8,6))
        for i in range(5):
            plt.plot(W_vec, V_new[:,i], label='Value function with preference shock {}'.format
        plt.title('Equilibrium value function $V(W, \epsilon)$')
        plt.xlabel('Cake size $W$')
        plt.ylabel('Value function $V(W, \epsilon)$')
        plt.legend()
Out[8]: <matplotlib.legend.Legend at 0x110b046a0>
```





```
(c)
```

Out[9]: <matplotlib.legend.Legend at 0x110c7aa20>

