OSM Lab - Dynamic Programming

Jason DeBacker
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Notes for Lecture #3

Today

- Discrete Choice Dynamic Programming
- Tips for better computing performance

Discrete Choice Cake Eating Problem: (an example of an optimal stopping problem)

- control: {eat cake, leave cake} $\rightarrow$ binary (0,1 choice)
  - $z \in \{1, 0\}$
- state: $w, \varepsilon \Rightarrow$ know w and ε at the time of the decision
- transition: $w' = \rho w$ if $z = 0$ (grow/shrink leftover cake), $w' = 0$ if $z = 1$ (cake eaten in period 1, no w')
- value function: $V(w, \varepsilon) = \max\{\underbrace{V^0(w, \varepsilon)}_{\text{leave cake}}, \underbrace{V^1(w, \varepsilon)}_{\text{eat cake}}\},\ \forall(w, \varepsilon)$
  - $V^0(w, \varepsilon) = \beta E_{\varepsilon'|\varepsilon} V(\rho w, \varepsilon')$
  - $V^1(w, \varepsilon) = \varepsilon u(w)$
- policy function: $z(w, \varepsilon) \in \{0, 1\},\ \forall(w, \varepsilon)$
- Choice depends on:
  - State variables: (w & ε) b/c in state vector
  - Parameters:
    - ρ, b/c as $\rho \uparrow$, gain to waiting
    - β, $\beta \downarrow$ cost to waiting
    - Π: the transition matrix
- NOTE: No Euler equation in discrete case - eat or don't eat - it's not continuous
- e.g., $\rho = 1$, $\varepsilon \in \{\varepsilon_L, \varepsilon_H\}$
  - $z(w, \varepsilon_H) = 1, ,\ \forall w$: nothing to wait for!
  - $z(w, \varepsilon_L) = \{0, 1\} \rightarrow$ wait if: β near 1 or π_{LH} sufficiently high
    - NOTE: w unimportant b/c its in both V^0 and V^1 decisions
    - How high does π_{LH} have to be to wait?
    - wait if: $\varepsilon_L u(w) \leq \beta\{E_{\varepsilon'|\varepsilon_L} V(w, \varepsilon')\} = \beta\{\pi_{LH}\varepsilon_H u(w) + \pi_{LL} V(w, \varepsilon_L)\}$
    - B/c always eat in high, and assuming never eat in low (this is the RHS of the equality), know that: $E_{\varepsilon'|\varepsilon_L} V(w, \varepsilon') = \pi_{LH}\varepsilon_H u(w) + \pi_{LL}\beta E_{\varepsilon'|\varepsilon_L} V(w, \varepsilon')$
    - Solving for $V(w, \varepsilon') \Rightarrow E_{\varepsilon'|\varepsilon_L} V(w, \varepsilon') = \frac{\pi_{LH}\varepsilon_H u(w)}{1-\beta\pi_{LL}}$
    - Thus, wait if $\varepsilon_L u(w) \leq \beta\{E_{\varepsilon'|\varepsilon_L} V(w, \varepsilon')\} = \frac{\beta\pi_{LH}\varepsilon_H u(w)}{1-\beta\pi_{LL}}$
    - Note that we can divide both sides by $u(w)$: $\varepsilon_L \leq \frac{\beta\pi_{LH}\varepsilon_H}{1-\beta\pi_{LL}}$
    - So, without growth in the size of the cake overtime, the decision rule is not a function of the size of the cake or the parameterization of the utility function.

    - NOTE: this is not the case if the size of the cake is growing.

Some final tips on speeding up computations

- In Python, use `Numba` and it's just-in-time compilation to speed up loops
  - Otherwise, in Python or other higher-level languages, "vectorize" your code so that you are doing operations on arrays rather than through loops with element-by-element operations
- Consider parallel processing (e.g., to evaluate functions are different parts of your state space simultaneously)
  - The `dask` package for Python makes multiprocessing relatively straightforward