# Econ 8105 MACROECONOMIC THEORY DYNAMIC PROGRAMMING FOR MACRO 

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These notes are a condensed treatment of the chapters in SLP that deal with Deterministic Dynamic Programming used in conjunction with the treatment of the single sector growth model and its generalizations. More or less, this is Chapters $4-6$ of the book along with some of the Mathematics that is used in those sections.

## Read S.L.P.

- Chapters 1 and 2 for background (skim 2.2)
- Skim Chapter 3 - Math.
- We will cover Chapter 4/parts of Chapter $5 /$ parts of Chapter 6 in detail. Reread Chapter 3 as needed as we go along.

Go for:

1. Simple version.
2. Time stationary rep.
3. Global Dynamics (special cases)
4. Numerical procedure.

From what we've seen so far, an ADE allocation can be found as the solution to the maximization problem of the form:

$$
\begin{array}{cl}
P(\widehat{k}): & \max _{(\widetilde{c}, \widetilde{x}, \widetilde{\ell}, \tilde{\imath}, \tilde{n})} \\
\text { s.t. } & u(\widetilde{c}, \tilde{\ell}) \\
& c_{t}+x_{t} \leq F_{t}\left(k_{t}, n_{t}\right) \\
& k_{t+1} \leq(1-\delta) k_{t}+x_{t} \\
& n_{t}+\ell_{t} \leq \bar{n}_{t} \\
& k_{0}=\widehat{k} \text { fixed } \\
& \text { non-negativity. }
\end{array}
$$

Assume that $\bar{n}_{t}$ is independent of $t$ and $F_{t}$ is independent of $t$.
e.g., $\bar{n}_{t} \equiv \bar{n} \equiv 1, F_{t}(k, n)=A k^{\alpha} n^{1-\alpha}$

Let:
$\Gamma(\widehat{k} ; \bar{n}, F)$ denote the set of feasible sequences for $(\tilde{c}, \widetilde{x}, \widetilde{k}, \widetilde{n}, \widetilde{\ell})$ given $\bar{n}, F$ and $\widehat{k}$. That is,

$$
\begin{array}{rll}
(\tilde{c}, \widetilde{x}, \widetilde{k}, \widetilde{n}, \widetilde{\ell}) \in \Gamma(\bar{k} ; \bar{n}, F) & \Longleftrightarrow & \\
c_{t}+x_{t} \leq F\left(k_{t}, n_{t}\right) & & \forall t \\
k_{t+1} \leq(1-\delta) k_{t}+x_{t} & & \forall t \\
n_{t}+\ell_{t} \leq \bar{n} & & \forall t \\
k_{0}=\widehat{k} &
\end{array}
$$

and write

$$
(\tilde{c}, \widetilde{x}, \widetilde{k}, \widetilde{n}, \widetilde{\ell})=\left(c_{0}, x_{0}, k_{0}, n_{0}, \ell_{0} ; \widetilde{c_{1}}, \widetilde{x}_{1}, \ldots, \widetilde{\ell}_{1}\right)
$$

in period 0 , and period $1,2 \ldots$ decisions, respectively.

## NOTICE:

$$
\begin{array}{cl}
(\tilde{c}, \widetilde{x}, \widetilde{k}, \widetilde{n}, \widetilde{\ell}) \in & \Gamma(\widehat{k} ; n, t) \\
\Leftrightarrow & c_{0}+x_{0} \leq F\left(k_{0}, n_{0}\right) \\
& k_{1} \leq(1-\delta) k_{0}+x_{0} \\
& n_{0}+\ell_{0} \leq \bar{n} \\
\text { and } \quad & k_{0}=\widehat{k}
\end{array}
$$

AND $\quad\left(\widetilde{c}_{1}, \widetilde{x}_{1}, \ldots, \widetilde{\ell}_{1}\right) \in \Gamma\left(k_{1} ; \bar{n}, F\right)$.
That is,
The constraint set for $P(\widehat{k} ; \bar{n}, F)$ has a RECURSIVE structure - There is a " $t=0$ component" and a "continuation component" and, moreover, the "continuation component" looks "just like" the original set!

Problem: Give a Max Problem where this isn't true!
Note: This requires infinite horizon for it to be true!
Indeed, note that $\Gamma(k ; \bar{n}, F)$ is of the form

$$
\left\{(\tilde{c}, \widetilde{x}, \widetilde{k}, \widetilde{n}, \widetilde{\ell}) \mid\left(c_{t}, x_{t}, k_{t}, \ell_{t}, n_{t}\right) \in \widehat{\Gamma}\left(k_{t-1}\right)\right\}
$$

where

$$
\widehat{\Gamma}(k)=\left\{\begin{array}{c}
\left(c, x, k^{\prime}, \ell, n\right) \mid c+x \leq F(k, n) \\
k^{\prime} \leq(1-\delta) k+x \\
c+n \leq \bar{n} \\
\text { non-negativity }
\end{array}\right\}
$$

i.e., constraint set is a time stationary function of the "state variable" $k_{t}$.

## Other Problems Like This

If don't cut the tree at period $t$, then (Tree-height at $t)=(1+$ height at $t-1$ ), i.e., $k_{t}=1+k_{t-1}$. Consider also $k_{t}=0$ forever if you do cut the tree.

If you cut it at height $k_{t}$ you get payoff $\beta^{t} u\left(k_{t}\right)$.
Let $x_{t}=\left\{\begin{array}{cc}0 & \text { if don't cut } \\ 1 & \text { if cut }\end{array}\right\}$
Then the problem can be written as:

$$
\begin{aligned}
& \max \sum \beta^{t} u\left(x_{t}, k_{t}\right) \\
& x_{t} \in\{0,1\} \\
& k_{t+1}=\left(1-x_{t}\right)\left(k_{t}+1\right)\left(1-\chi_{\left(k_{t}=0\right)}\right)
\end{aligned}
$$

## 1 Outline/Strategy for Tackling These Problems

Our strategy for solving problems like this is to use a simple fact about maximization problems over two variables (even if the second variable for us is an infinite history of all relevant variables). This property is easily described via the following.

Suppose we have an indexed family of maximization problems, one for each $x \in X, P(x)$. In each of these you have to pick a $y=\left(y_{1}, y_{2}\right) \in Y_{1} \times Y_{2}$. So, $P(x)$ is given by:

$$
\begin{aligned}
& P(x): \quad \max _{\left(y_{1}, y_{2}\right)} u\left(x, y_{1}, y_{2}\right) \\
& \text { s.t } \quad\left(x, y_{1}, y_{2}\right) \in \Lambda(x), \quad x \text { given. }
\end{aligned}
$$

Here, $\Lambda(x) \subset Y_{1} \times Y_{2}$ is the constraint set for the problem $P(x)$. Assume that there is a solution for this problem for each $x \in X$ given by $\left(y_{1}^{*}(x), y_{2}^{*}(x)\right)$ and define $V^{*}(x)$ to be the value of utility at the solution:

$$
V^{*}(x)=u\left(x, y_{1}^{*}(x), y_{2}^{*}(x)\right)
$$

This is the description of the problem in its 'raw' or sequential form.
Alternatively, for each $x \in X$, define

$$
\Lambda_{1}(x)=\left\{y_{1} \in Y_{1} \mid \exists y_{2} \in Y_{2}, \text { s.t., }\left(x, y_{1}, y_{2}\right) \in \Lambda\right\}
$$

and for each $y_{1} \in \Lambda_{1}(x)$ define

$$
\Lambda_{2}\left(x, y_{1}\right)=\left\{y_{2} \in Y_{2} \mid\left(x, y_{1}, y_{2}\right) \in \Lambda\right\} .
$$

Next, consider the following Two Step Procedure for solving $P(x)$ :
Step 1: For each $\left(x, y_{1}\right)$ such that $y_{1} \in \Lambda_{1}(x)$, solve the maximization problem $P^{2}\left(x, y_{1}\right)$ given by:

$$
\begin{aligned}
P^{2}\left(x, y_{1}\right) & \max _{y_{2}} \quad u\left(x, y_{1}, y_{2}\right) \\
\text { s.t. } & y_{2} \in \Lambda_{2}\left(x, y_{1}\right) \\
& \left(x, y_{1}\right) \quad \text { fixed }
\end{aligned}
$$

Assuming a solution exists for each choice of $\left(x, y_{1}\right)$, this defines a function (or correspondence if there are multiple solutions), $y_{2}\left(y_{1}, x\right)$. Define $U^{2}\left(x, y_{1}\right)$ by:

$$
U^{2}\left(x, y_{1}\right)=u\left(x, y_{1}, y_{2}\left(x, y_{1}\right)\right)
$$

Step 2: For each $x \in X$ define the maximization problem $P^{1}(x)$ by:

$$
\begin{aligned}
P^{1}(x) & \max _{y_{1}} U^{2}\left(x, y_{1}\right) \\
\text { s.t. } & y_{1} \in \Lambda_{1}(x)
\end{aligned}
$$

Assuming a solution exists for each choice of $x$, this defines a function (or correspondence if there are multiple solutions), $y_{1}(x)$. Define $U^{1}(x)$ by:

$$
U^{1}(x)=U^{2}\left(x, y_{1}(x)\right)=u\left(x, y_{1}(x), y_{2}\left(x, y_{1}(x)\right)\right) .
$$

Then, you can show that:

1. $V^{*}(x)=U^{1}(x)=U^{2}\left(x, y_{1}(x)\right)=u\left(x, y_{1}(x), y_{2}\left(x, y_{1}(x)\right)\right)$ for all $x \in X$.
2. $\left(y_{1}^{*}(x), y_{2}^{*}(x)\right)=\left(y_{1}(x), y_{2}\left(y_{1}(x)\right)\right.$ for all $x \in X$ assuming unique solutions.
3. $V^{*}(x)=U^{1}(x)$ for all $x \in X$ even if max is replaced by sup and no solution need exist.
4. Something like 2) holds even if the solution is NOT unique.

## Adding More Structure

Suppose in addition that the continuation problems are also like the original problems, i.e., if each $P^{1}$ is in the class $P$, and that the some additional structure is placed on both the OBJ and Constraint Sets:

1. Assume that $Y_{1}=X$ and $Y_{2}=X \times X \times \ldots$. so that $y_{1}$ is an $x$ and $y_{2}$ is an infinite string of $x^{\prime} s$.
2. Assume that $u\left(x, y_{1}, y_{2}\right)=h\left(x, y_{1}\right)+\beta u\left(y_{1}, y_{2}\right)$ for some function $h$.
3. Assume that there is some $\Gamma(x)$ such that $\left(x, y_{1}, y_{2}\right) \in \Lambda(x)$ if and only if $y_{1} \in \Gamma(x)$ and $y_{2} \in \Gamma\left(y_{1}\right)$.

Then, under these conditions, the problem from time 1 on, i.e., the problem that we called $P^{2}\left(x, y_{1}\right)$ above

1. does not depend on $x: x$ enters the problem only as a constant added to the objective function and hence can be dropped (indeed the term $h\left(x, y_{1}\right)$ can be dropped), and
2. is equivalent to the problem $P\left(y_{1}\right)$.

Because of this, we can rewrite the 'result'

$$
V^{*}(x)=U^{1}(x)=U^{2}\left(x, y_{1}(x)\right)=u\left(x, y_{1}(x), y_{2}\left(x, y_{1}(x)\right)\right)
$$

as

$$
V^{*}(x)=h\left(x, y_{1}(x)\right)+\beta u\left(y_{1}, y_{2}\left(y_{1}\right)\right)=h\left(x, y_{1}(x)\right)+\beta V^{*}\left(y_{1}\right)
$$

Note that our Growth Model IS of this form:
Constraint problem is already this way., i.e., $\Gamma\left(k_{1}\right)=\Gamma(\widehat{k})$.
Something we can do to $u(\widetilde{c}, \widetilde{\ell})$ to make this happen?

$$
\begin{array}{rr}
P(\widetilde{k}): \max _{\left\{\left(c_{t}, x_{t}, k_{t}, n_{t}, \ell_{t}\right)\right\}} \sum_{0}^{\infty} \beta^{t} u\left(c_{t}, \ell_{t}\right) & \\
c_{t}+x_{t} \leq F\left(k_{t}, n_{t}\right) & t=0, \ldots \\
k_{t+1} \leq(1-\delta) k_{t}+x_{t} & t=0, \ldots \\
n_{t}+\ell_{t} \leq \bar{n} & t=0, \ldots \\
k_{0}=\widehat{k} &
\end{array}
$$

$0<\beta<1, u$ increasing, concave, etc.

$$
\begin{aligned}
P\left(\widehat{k} ; \widehat{x}_{0}, \widehat{k}_{0}, \widehat{n}_{0}, \widehat{\ell}_{0}, \widehat{k}_{0}\right) & : \max _{c_{1}, \ldots, \ell_{1}} \sum \beta^{t} u\left(c_{t}, \ell_{t}\right) \\
\text { s.t. } c_{t}+x_{t} & \leq F\left(k_{t}, \ell_{t}\right) \quad t=1, \ldots \\
k_{t+1} & \leq(1-\delta) k_{t}+x_{t} \quad t=1, \ldots \\
n_{t}+\ell_{t} & \leq \bar{n} t=1, \ldots \\
k_{1} & =\widehat{k}_{1}=(1-\delta) \widehat{k}_{0}+\widehat{x}_{0}
\end{aligned}
$$

1. For any choice of $\left(\widehat{c}_{0}, \widehat{x}_{0}, \widehat{k}_{0}, \widehat{n}_{0}, \widehat{\ell}_{0}\right)$ This gives a new max problem.
2. Can drop $\beta^{0} u\left(c_{0}, \ell_{0}\right)$ from OBJ and factor out $\beta$ from remaining.
3. New max problem depends only on $\widehat{k}_{1}$.

This problem is identical to $P\left(\widehat{k}_{1}\right)$ !

## It is a time stationary-recursive Max problem!

Let $g(\widehat{k}) \rightarrow$ new $k$, i.e., the $k_{1}$ from the solution to $P(\widehat{k})$. Then solution to overall problem SHOULD be $k_{0}=\widehat{k}, k_{1}=g(\widehat{k}), k_{2}=g\left(k_{1}\right)=g(g(\widehat{k}))$ etc. That is, the optimal solution SHOULD have the form if $\left(\widehat{k}, k_{1}, k_{2} \ldots\right)$, is the solution for the problem starting from $k_{0}=\widehat{k}$, then $\left(k_{1}, k_{2} \ldots\right)$ is the optimal solution for the problem starting from $k_{0}=k_{1}$.

What does this say about $V(\widehat{k})=\sup \sum \beta^{t} u(\quad) \ldots$ It follows that:

$$
\begin{aligned}
V(\widehat{k}) & =\sup u\left(c_{0}, \ell_{0}\right)+\beta V\left(k^{\prime}\right) \\
c_{0}+x & \leq F(\widehat{k}, \delta) \\
k^{\prime} & \leq(1-\delta) \widehat{k}+x_{0} \\
n_{0}+\ell_{0} & \leq \bar{n}
\end{aligned}
$$

In words, the last term on the RHS of the OBJ is what you get from $t=1$ on if you have to have optimality from $t=1$ and given that you start at $k^{\prime}$.

## 2 The Canonical Form

Given the discussion above, we will examine indexed families of optimization problems of the form:

$$
\begin{aligned}
(S P) \text { or }\left(S P\left(x_{0}\right)\right) & \sup \sum_{\left\{x_{t+1}\right\}_{t=0}^{\infty}}^{\infty} \beta_{t=0}^{t} F\left(x_{t}, x_{t+1}\right) \\
\text { s.t. } & x_{t+1} \in \Gamma\left(x_{t}\right) \\
& x_{0} \in X \text { given. } \\
& \Gamma \subset X . \\
& \Gamma(x): X \Longrightarrow X
\end{aligned}
$$

$F=$ return function
$\Gamma=$ Feasibility correspondence.. What is possible for $x_{t+1}$ given that the state at $t$ is $x_{t}$ ?

Let $V\left(x_{0}\right)$ denote this sup (possibly $+\infty,-\infty$ ), (by convention, $\sup _{x \in \emptyset} H(x)=$ $-\infty)$.

## Example:

1-sector growth model, inelastic labor supply.

$$
\begin{aligned}
& \\
& P\left(k_{0}\right) \max \sum \beta^{t} u\left(c_{t}\right) \\
& \text { s.t. }\left\{\begin{array}{l}
c_{t}+x_{t} \leq F\left(k_{t}, \bar{n}\right) \\
k_{t+1} \leq(1-\delta) k_{t}+x_{t} . \\
k_{0} \text { fixed }
\end{array}\right.
\end{aligned}
$$

What is $F$ here?

$$
\begin{aligned}
c_{t} & =F\left(k_{t}, \bar{n}\right)-x_{t} \\
& =F\left(k_{t}, \bar{n}\right)-\left(k_{t+1}-(1-\delta) k_{t}\right) \\
& =F\left(k_{t}, \bar{n}\right)+(1-\delta) k_{t}-k_{t+1} \\
& \equiv G\left(k_{t}, k_{t+1}\right) . \quad G_{1}>0, G_{2}<0 .
\end{aligned}
$$

What is $\Gamma$ here?

$$
k_{t+1} \leq F\left(k_{t}, \bar{n}\right)+(1-\delta) k_{t}
$$

For this choice of $F$ and $\Gamma$ we can rewrite the 1 -sector growth model in canonical form:

$$
\begin{aligned}
& \max \sum \beta^{t} u\left(G\left(k_{t}, k_{t+1}\right)\right) \\
\text { if } \quad k_{t+1} \in & \Gamma\left(k_{t}\right)=\left\{k_{t+1} \mid k_{t+1} \leq F\left(k_{t}, \bar{n}\right)+(1-\delta) k_{t}\right\}
\end{aligned}
$$

## Example:

Tree Cutting Problem - $P\left(k_{0}\right)$.

Problem - Rewrite TCP in this form.

## Example

1 sector growth model, elastic labor supply.

$$
\begin{aligned}
& \qquad P\left(k_{0}\right) \max \sum \beta^{t} u\left(c_{t}, \ell_{t}\right) \\
& \text { s.t. }\left\{\begin{array}{l}
c_{t}+x_{t} \leq F\left(k_{t}, n_{t}\right) \\
k_{t+1} \leq(1-\delta) k_{t}+x_{t} \\
n_{t}+\ell_{t} \leq \bar{n} \\
k_{0} \text { fixed. }
\end{array}\right.
\end{aligned}
$$

Problem: rewrite this as SP in canonical form.

Example: 1 sector Growth Model, Multiple Capital Goods, inelastic labor supply.

$$
\begin{gathered}
\qquad P\left(k_{0}\right) \max \sum \beta^{t} u\left(c_{t}\right) \\
\text { s.t. }\left\{\begin{array}{l}
c_{t}+x_{1 t}+\cdots+x_{J t} \leq F\left(k_{1 t}, \cdots, k_{J t}, n_{t}\right) \\
k_{j t+1} \leq\left(1-\delta_{j}\right) k_{j t}+x_{j t} \\
n_{t}+\ell t \leq \bar{n} . \\
k_{01, \ldots,}, k_{0 J} \quad \text { given }
\end{array}\right.
\end{gathered}
$$

Problem: Rewrite this as SP in canonical form.
Example: Same as above, but $u\left(c_{t}, \ell_{t}\right)$.

Example: Two sector neo-classical growth model, inelastic labor supply

$$
\begin{gathered}
\max \sum \beta^{t} u\left(c_{t}\right) \\
\text { s.t. }\left\{\begin{array}{l}
c_{t} \leq F^{c}\left(k_{c t}, n_{c t}\right) \\
x_{t} \leq F^{x}\left(k_{x t}, n_{x t}\right) \\
k_{t+1} \leq(1-\delta) k_{t}+x_{t} \\
k_{c t}+k_{x t} \leq k_{t} \\
n_{c t}+n_{x t} \leq \bar{n} \\
k_{0} \quad \text { fixed }
\end{array}\right.
\end{gathered}
$$

Problem: Rewrite in Canonical Form.

Problem: Add elastic labor supply.
Problem: Add multiple $k$ 's, one sector each.
Can't move $x$ across sectors?

Example: 1-sector Model, adjustment costs in $k$, inelastic labor supply

$$
\begin{aligned}
& \max \sum \beta^{t} u\left(c_{t}\right) \\
\text { s.t. } \quad c_{t}+x_{t} \leq & F\left(k_{t}, \bar{n}\right) \\
k_{t+1} \leq & (1-\delta) k_{t}+g\left(x_{t}\right) \\
& k_{0} \quad \text { fixed. } \\
g(0)= & 0, \quad \text { increasing and strictly concave. }
\end{aligned}
$$

## INSERT FIGURE HERE

In this example, if you try to make too big a change in $k$, you lose efficiency.

Problem: Write in CF.
Problem: Add, elastic $\ell$, multiple sectors.
Problem: Other forms? Adjustment on $n$ ?

$$
\begin{array}{r}
F\left(k_{t}, n_{t}\right)-g\left(n_{t}-n_{t-1}\right) \\
k_{t+1}=(1-\delta) k_{t}+g\left(\frac{x_{t}}{k_{t}}\right) ?
\end{array}
$$

## Example:

$(k, h)$-model, inelastic $\ell ? ?$

$$
\begin{gathered}
\max \sum \beta^{t} u\left(c_{t}\right) \\
\text { s.t. }\left\{\begin{array}{l}
c_{t} \leq F^{c}\left(k_{c t}, h_{c t}, n_{c t}\right) \\
x_{k t} \leq F^{k}\left(k_{k t}, h_{k t}, n_{k t}\right) \\
x_{h t} \leq F^{h}\left(k_{h t}, h_{h t}, n_{h t}\right) \\
k_{t+1} \leq\left(1-\delta_{k}\right) k_{t}+x_{k t} \\
h_{t+1} \leq\left(1-\delta_{h}\right) h_{t}+x_{h t} \\
h_{0}, k_{0} \quad \text { fixed. } \\
n_{c t}+n_{h t}+n_{k t} \leq \bar{n} \\
k_{c t}+k_{k t}+k_{h t} \leq k_{t} \\
h_{c t}+h_{k t}+h_{h t} \leq h_{t}
\end{array}\right.
\end{gathered}
$$

Here, $h$ is interpreted as 'knowledge' of the individual.
Problem: Write in CF

## Example:

$$
\begin{aligned}
& \max \sum \beta^{t} u\left(c_{t}, \ell_{t}\right) \\
\text { s.t. } \quad c_{t} \leq & F^{c}\left(k_{c t}, z_{c t}\right) \\
x_{k t} \leq & F^{k}\left(k_{k t}, z_{k t}\right) \\
x_{h t} \leq & F^{h}\left(k_{h t}, z_{h t}\right) \\
k_{t+1} \leq & \left(1-\delta_{k}\right) k_{t}+x_{k t} \\
h_{t+1} \leq & \left(1-\delta_{h}\right) h_{t}+x_{h t}
\end{aligned}
$$

Effective Labor supplies:

$$
\begin{aligned}
Z_{c t} & \leq M^{c}\left(n_{c t}, h_{t}\right) \\
Z_{c t} & \leq M^{x}\left(n_{x t}, h_{t}\right) \\
Z_{h t} & \leq M^{h}\left(n_{h t}, h_{t}\right) \\
k_{c t}+k_{x t}+k_{h t} & \leq k_{t} \\
n_{c t}+n_{x t}+n_{k+1}+\ell_{t} & \leq \bar{n}
\end{aligned}
$$

Example: Family Labor Supply

$$
\begin{aligned}
& \sum \beta^{t}\left[\lambda_{f} u^{f}\left(c_{f t}, \ell_{f t}\right)+\lambda_{m} u^{m}\left(c_{m t}, \ell_{m t}\right)\right] \\
c_{f t}+c_{m t}+x_{t} \leq & F\left(k_{t}, n_{f t}+n_{m t}\right) \\
k_{t+1} \leq & (1-\delta) k_{t}+x_{t} \\
n_{f t}+\ell_{f t} \leq & \bar{n}_{f} \\
n_{m t}+\ell_{f t} \leq & \bar{n}_{m} \\
& k_{0} \text { fixed. }
\end{aligned}
$$

Add home good?
Example: Fertility

$$
\begin{aligned}
\sum \beta^{t} u\left(N_{t}, c_{t} / N_{t}\right) & \\
\text { s.t. } c_{t}+X_{t}+\theta N_{t+1} & \leq N_{t} F\left(K_{t} / N_{t}, \bar{n}\right) \\
K_{t+1} & \leq(1-\delta) K_{t}+X_{t}
\end{aligned}
$$

$K_{0}$ fixed.
ETC.

## Back To General Development

Sequence Problem for the Initial Condition $x-S P(x)$

Find $V(x)$ which is defined by:

$$
\begin{array}{ll} 
& V(x)=\sup _{\left(x_{0}, \ldots\right)} \sum_{t=0}^{\infty} \beta^{t} F\left(x_{t}, x_{t+1}\right) \\
\text { s.t. } & x_{t+1} \in \Gamma\left(x_{t}\right) . \forall t \\
& x_{0}=x \quad \text { fixed. }
\end{array}
$$

Functional Equation Problem:

Find a function $v(x)$ satisfying:

$$
v(x) \equiv \sup _{y \in \Gamma(x)}[F(x, y)+\beta v(y)]
$$

That is, this is an identity in $x$ !
Fundamental Theorem of Dynamic Programming (More or less):
(a) If $V(x)$ solves $S P(x) \quad \forall x$, then $V(x)$ satisfies FEP.
(b) If $v(X)$ satisfies FEP then $v(x)$ solves $S P(x) \quad \forall x$.
N. B. This can't be quite true as stated because:

$$
\begin{array}{cc}
v(x) \equiv & -\infty \\
v(x) & +\infty
\end{array}
$$

always solve FEP., but won't necessarily solve SP. So, some conditions have to be added to (b).

## 3 The Details

Let $A=\{(x, y) \in X \times X \mid y \in \Gamma(x)\}$
This is the graph of $\Gamma$.

INSERT GRAPH HERE.
Let

$$
\pi(\bar{x})=\left\{\left(x_{0}, \ldots,\right) \in X^{\infty} \mid x_{t+1} \in \Gamma\left(x_{t}\right) \forall t \geq 0, x_{0}=\bar{x}\right\}
$$

$\pi\left(x_{0}\right)$ is the feasible set for $S P\left(x_{0}\right)$.
Assumption $4.1 \Gamma(x) \neq \phi, \quad \forall x \in X$.
Problem: Show that Assumption $4.1 \Longrightarrow \pi\left(x_{0}\right) \neq \phi \quad \forall x \in X$.
Assumption $4.2 \forall x_{0} \in X$ and all $\tilde{x} \in \pi\left(x_{0}\right)$,

$$
\lim _{n \rightarrow \infty} \sum_{t=0}^{n} \beta^{t} F\left(x_{t}, x_{t+1}\right) \quad \text { exists. }
$$

N.B. We allow $+\infty,-\infty$ as possible limits, i.e., $\exists \quad a \in \bar{R} \equiv R \cup\{-\infty,+\infty\}$, such that

$$
\lim _{n \rightarrow \infty} \sum_{t=0} \beta^{t} F\left(x_{t}, x_{t+1}\right) \rightarrow a .
$$

INSERT GRAPH HERE.

## Sufficient conditions for Assumption 4.2

SC1A4.2 $|F(x, y)| \leq M, \quad \forall(x, y) \quad$ and $\quad 0<\beta<1$.
Problem: Prove $\mathrm{SC} 2 \mathrm{~A} 4.2 \Longrightarrow \mathrm{~A} 4.2$ holds.
SC2A4.2 $\forall x_{0} \in X, \exists \theta, c, 0<c<\infty, 0<\theta<1 / \beta$ such that

$$
\tilde{x} \in \pi\left(x_{0}\right) \Longrightarrow F\left(x_{t}, x_{t+1}\right) \leq c \theta^{t}
$$

Problem: Prove SC2A4.2 $\Longrightarrow$ A4.2

For each $n$, define $u_{n}: \pi\left(x_{0}\right) \rightarrow R$ by

$$
u_{n}(\widetilde{x})=\sum_{t=0}^{n} \beta^{t} F\left(x_{t}, x_{t+1}\right) .
$$

i.e., the partial sum.

And define $u(\widetilde{x})=\lim _{n \rightarrow \infty} u_{n}(x)$.
By A.4.2, $u: \pi\left(x_{0}\right) \rightarrow \bar{R}$.
Finally, define $V^{*}: X \rightarrow \bar{R}$ by:

$$
V^{*}(x)=\sup _{\bar{x} \in \pi\left(x_{0}\right)} u(\bar{x}) .
$$

What it means for $V^{*}$ to solve SP:
Then $V^{*}$ is a well-defined function satisfying:
a. If $\left|V^{*}\left(x_{0}\right)\right|<\infty$ then

$$
\begin{equation*}
V^{*}\left(x_{0}\right) \geq u(\tilde{x}) \quad \forall \tilde{x} \in \pi\left(x_{0}\right) \tag{2}
\end{equation*}
$$

and

$$
\begin{align*}
\forall \varepsilon & >0, \quad \exists \tilde{x} \in \pi\left(x_{0}\right) \Longrightarrow  \tag{3}\\
u(\tilde{x}) & \geq V^{*}\left(x_{0}\right)-\epsilon
\end{align*}
$$

b. If

$$
\begin{aligned}
V^{*}\left(x_{0}\right) & =+\infty, \quad \exists \tilde{x}^{k} \in \pi\left(x_{0}\right) \Rightarrow \\
u\left(\tilde{x}^{k}\right) & \rightarrow \infty .
\end{aligned}
$$

c. If $V^{*}\left(x_{0}\right)=-\infty$ then $u(\tilde{x})=-\infty \forall \tilde{x} \in \pi\left(x_{0}\right)$.

That is $V^{*}$ divides $X$ into 3 mutually exclusive and exhaustive subsets.

$$
\begin{array}{rlrl}
X & =A \cup B \cup C \\
\left|V^{*}(x)\right| & <\infty \rightarrow \quad x \in A \\
V^{*}(x) & =+\infty \rightarrow & x \in B \\
V^{*}(x) & =-\infty \rightarrow \quad x \in C
\end{array}
$$

## What it means for $v^{*}$ to solve FE.

a. If $\left|v^{*}\left(x_{0}\right)\right|<\infty$ then

$$
\begin{equation*}
v^{*}\left(x_{0}\right) \geq F\left(x_{0}, y\right)+\beta v^{*}(y) \quad \forall y \in \Gamma x_{0} \tag{4}
\end{equation*}
$$

and $\forall \varepsilon>0, \quad \exists y \in \Gamma\left(x_{0}\right)$ such that

$$
\begin{equation*}
v^{*}\left(x_{0}\right) \leq F\left(x_{0}, y\right)+\beta v^{*}(y)+\varepsilon \tag{5}
\end{equation*}
$$

b. If $x^{*}\left(x_{0}\right)=+\infty, \quad \exists y^{k} \in \Gamma\left(x_{0}\right)$ such that

$$
\begin{equation*}
\lim _{k \rightarrow \infty}\left\{F\left(x_{0}, y^{k}\right)+\beta v^{*}\left(y^{k}\right)\right\}=\infty \tag{6}
\end{equation*}
$$

c. If $v^{*}\left(x_{0}\right)=-\infty$ then $F\left(x_{0}, y\right)+\beta v^{*}(y)=-\infty, \forall y \in \Gamma\left(x_{0}\right)$.

Thus, as above, if $v^{*}$ is a solution to FE it divides $X=\hat{A} \cup \hat{B} \cup \hat{C}$ such that:

$$
\begin{aligned}
\left|v^{*}(x)\right| & <\infty \rightarrow x \in \hat{A} \\
v^{*}(x) & =+\infty \rightarrow x \in \hat{B} \\
v^{*}(x) & =-\infty \rightarrow x \in \hat{C} .
\end{aligned}
$$

## Goal

Theorem A. If $V^{*}$ solves SP then $v^{*}$ solves FE.
Theorem B. If $v^{*}$ solves FE then $v^{*}$ solves SP .
That is $-A=\hat{A}, B=\hat{B}$ and $C=\hat{C}$.
Most of the difficulties are with sup instead of max, and the possibility that $V^{*}$ and/or $v^{*}= \pm \infty$ for some/all $x_{0}$ 's.

Lemma 4.1 Suppose A4.2. Then $\forall x_{0} \in X$ and $\forall \tilde{x} \in \pi\left(x_{0}\right)$

$$
u(\tilde{x})=F\left(x_{0}, x_{1}\right)+\beta u\left(\tilde{x}^{1}\right)
$$

where $x^{1}=\left(x_{1}, \ldots\right)$.
Proof. Under 4.2. $\forall x_{0} \in X, \forall \tilde{x} \in \pi\left(x_{0}\right)$,

$$
\begin{aligned}
u(\tilde{x}) & =\lim _{n \rightarrow \infty} \sum_{0}^{n} \beta^{t} F\left(x_{t}, x_{t+1}\right) \\
& =\lim _{n \rightarrow \infty} F\left(x_{0}, x_{1}\right)+\beta \lim _{n \rightarrow \infty} \sum_{t=0}^{n} \beta^{t} F\left(x_{t+1}, x_{t+2}\right) \\
& =F\left(x_{0}, x_{1}\right)+\beta \cdot u\left(\tilde{x}^{1}\right) .
\end{aligned}
$$

Where the last equality comes from the definition of $u\left(\tilde{x}^{1}\right)$.
Theorem 4.2 Under A.4.1, and A.4.2 if $V^{*}$ solves SP then $V^{*}$ solves FE.
That is:

$$
\forall x \in X, \quad V^{*}(x)=\sup _{y \in \Gamma(x)} F(x, y)+\beta V^{*}(y)
$$

Intuition/Discussion of Proof:
First, for this first part it's useful to do an intuitive version of the proof and then go through the technical details. YOU SHOULD DO THIS YOURSELF FOR THE OTHER PARTS OF THE PROOF!

To start, suppose $\left|V^{*}(x)\right|<\infty$ for a particular $x$. For example, $V^{*}(x)=$ 7.218. And what we want to show is - at this same $x$, the valued 7.218 solves the FE. In other words,

$$
7.218=\sup _{y \in \Gamma(x)} F(x, y)+\beta V^{*}(y)
$$

What would it mean to show this? First, it means that 7.218 is an upper bound for the RHS of this equation. Second it means that there is no other, smaller upper bound for the RHS.

To see that 7.218 is an upper bound for the RHS, proceed by contradiction. That is, there is some $y^{*} \in \Gamma(x)$ with:

$$
F\left(x, y^{*}\right)+V^{*}\left(y^{*}\right)>7.218
$$

From here, we proceed to construct a feasible plan beginning from $x, \tilde{x}$, for which $u(\tilde{x})>7.218$. To do this, first construct a plan from $y^{*}, \tilde{y}$ which is feasible $\left(\tilde{y} \in \pi\left(y^{*}\right)\right)$ and gets really close to $V^{*}\left(y^{*}\right)$. Then, it can be checked that $\tilde{x}=\left(x, y^{*}, \tilde{y}\right) \in \pi(x)$ and by construction

$$
u\left(x, y^{*}, \tilde{y}\right)=u(\tilde{x}) \text { is really really close to } F\left(x, y^{*}\right)+V^{*}\left(y^{*}\right)>7.218
$$

But this is a contradiction that 7.218 is an upper bound for the problem $S P(x)$.

The rest of the proofs are similar intutitively. And all that is left is to fill in the $\varepsilon^{\prime} s$ and $\delta^{\prime} s$.

Back to proof:
Suppose $\left|V^{*}(x)\right|<\infty$ for a particular $x$.

Need to show

$$
V^{*}(x)=\sup _{y \in \Gamma(x)} F(x, y)+\beta V^{*}(y)
$$

since $V^{*}(x)<\infty$. This is the same as showing

$$
\begin{equation*}
V^{*}(x) \geq F(x, y)+\beta V^{*}(y) \quad \forall y \in \Gamma(x) \tag{4~A}
\end{equation*}
$$

and $\forall \varepsilon>0, \exists y \in \Gamma(x) \Rightarrow$

$$
\begin{equation*}
V^{*}(x)-\varepsilon<F(x, y)+\beta V^{*}(y) \tag{5~A}
\end{equation*}
$$

To show (4A):
Let $x_{1} \in \Gamma(x)$ and choose $\varepsilon>0$. By the definition of $V^{*}\left(x_{1}\right), \exists \tilde{x}^{1}=$ $\left(x_{1}, \ldots\right) \in \pi\left(x_{1}\right)$ such that

$$
u\left(\tilde{x}^{1}\right) \geq V^{*}\left(x_{1}\right)-\varepsilon
$$

Since $x_{1} \in \Gamma(x)$ and $\tilde{x}^{1} \in \pi\left(x_{1}\right)$, it follows that $\left(x_{1}, \tilde{x}^{1}\right) \in \pi(x)$. Thus, from (2) and Lemma 4.1

$$
\begin{aligned}
V^{*}(x) & \geq u\left(x_{1}, \tilde{x}^{1}\right)=F\left(x, x_{1}\right)+\beta u\left(\tilde{x}^{1}\right) \\
& \geq F\left(x, x_{1}\right)+\beta V^{*}\left(x_{1}\right)-\beta \varepsilon
\end{aligned}
$$

Since $\varepsilon$ was arbitrary,

$$
V^{*}(x) \geq F\left(x, x_{1}\right)+\beta V^{*}\left(x_{1}\right) \quad \forall x_{1} \in \Gamma(x)
$$

follows.
Note-implicit: If $\left|V^{*}(x)\right|<\infty$ and $y \in \Gamma(x)$ then $\left|V^{*}(y)\right|<\infty$-show this.

To show that (5A) holds at $x$, choose $\varepsilon>0$. From (3) $\exists \tilde{x} \in \pi(x), \tilde{x}=$ $\left(x, x_{1, \ldots}\right)$ such that

$$
\begin{aligned}
V^{*}(x) & \leq u(\tilde{x})+\varepsilon \\
& =F\left(x, x_{1}\right)+\beta u\left(\tilde{x}^{1}\right)+\varepsilon
\end{aligned}
$$

where $\tilde{x}^{1}=\left(x_{1}, \ldots\right)$. The equality comes from Lemma 4.1.

But $\tilde{x} \in \pi(x) \Rightarrow x_{1} \in \Gamma(x)$ and by the definition of $V^{*}\left(x_{1}\right)$, it follows that

$$
\begin{aligned}
V^{*}(x) & \leq F\left(x, x_{1}\right)+\beta u\left(\tilde{x}^{1}\right)+\varepsilon \\
& \leq F\left(x, x_{1}\right)+\beta V^{*}\left(x_{1}\right)+\varepsilon
\end{aligned}
$$

That is $x_{1} \in \Gamma(x)$ is a choice of $y$ that will work in (5A). If $V^{*}\left(x_{0}\right)=\infty$ then
$\exists \tilde{x}^{k} \in \pi\left(x_{0}\right)$ such that $u\left(\tilde{x}^{k}\right) \rightarrow \infty$. Since $x_{1}^{k} \in \Gamma\left(x_{0}\right), \forall k$, and $u\left(\tilde{x}^{k}\right) \rightarrow$ $\infty$,
$u\left(\tilde{x}^{k}\right)=F\left(x_{0}, x_{1}^{k}\right)+\beta u\left(\tilde{x}^{k}\right) \leq F\left(x_{0}, x_{1}^{k}\right)+\beta V^{*}\left(x_{1}^{k}\right)$.
It follows that (6) holds for the sequence $y^{k}=x_{1}^{k}$, and $x_{1}^{k} \in \Gamma\left(x_{0}\right), \forall k$. If $V^{*}\left(x_{0}\right)=-\infty$ then

$$
\begin{equation*}
u(\tilde{x})=F\left(x_{0}, x_{1}\right)+\beta u\left(\tilde{x}^{1}\right)=-\infty, \forall \tilde{x} \in \pi\left(x_{0}\right) . \tag{7}
\end{equation*}
$$

Since $F(x, y) \in R, \forall(x, y)$, it follows that $u\left(\tilde{x}^{1}\right)=-\infty, \forall x_{1} \in \Gamma\left(x_{0}\right)$, $\forall \tilde{x}^{1} \in \pi\left(x_{0}\right)$.

Hence, $V^{*}\left(x_{1}\right)=-\infty \forall x_{1} \in \Gamma\left(x_{0}\right)$.
But, since $F$ is real valued and $\beta>0$, (7) follows from this. This completes the proof.

Theorem 4.3 (Theorem B) Suppose A.4.1, A.4.2 hold. If $v^{*}$ is a solution to FE

AND

$$
\begin{equation*}
\lim _{n \rightarrow \infty} \beta^{n} v\left(x_{n}\right)=0 \quad \forall \tilde{x} \in \pi\left(x_{0}\right) \quad \forall x_{0} \in X \tag{8}
\end{equation*}
$$

Then $v^{*}=V^{*}$.
What does it mean to show this?
Proof.

1. If $v^{*}\left(x_{0}\right)<\infty$, then (4) and (5) hold. It's enough to show that (2) and (3) hold.

First (2):

$$
\begin{aligned}
& \tilde{x} \in \pi\left(x_{0}\right) \Longrightarrow x_{1} \in \Gamma\left(x_{0}\right) \text { so }(4) \Longrightarrow \forall x \in \pi\left(x_{0}\right), \\
& v^{*}\left(x_{0}\right) \geq F\left(x_{0}, x_{1}\right)+\beta v^{*}\left(x_{1}\right) \\
& \geq F\left(x_{0}, x_{1}\right)+\beta F\left(x_{1}, x_{2}\right)+\beta^{2} v^{*}\left(x_{2}\right) \\
& \vdots \\
& \geq u_{n}(\tilde{x})+\beta^{n+1} v^{*}\left(x_{n+1}\right)
\end{aligned}
$$

so

$$
v^{*}\left(x_{0}\right) \geq \lim u_{n}(\tilde{x})+\lim \beta^{n+1} v^{*}\left(x_{n+1}\right) .
$$

So from (8),

$$
v^{*}\left(x_{0}\right) \geq u(\tilde{x}), \forall \tilde{x} \in \pi\left(x_{0}\right),
$$

i.e. (2) holds.

To see that (3) holds, fix $\varepsilon>0$. We want to find an $\tilde{x} \in \pi\left(x_{0}\right)$ such that $u(x) \geq V^{*}(x)-\varepsilon$.

Choose $\delta_{t} \in R$ such that $\sum_{t=1}^{\infty} \beta^{t-1} \delta_{t} \leq \varepsilon / 2$.
Since (5) holds (at all $x$ ?), [show if it holds at $x_{0}$, it must hold at $x_{1}$ ?], we can find $x_{1} \in \Gamma\left(x_{0}\right), x_{2} \in \Gamma\left(x_{1}\right), \ldots$ so that $v^{*}\left(x_{t}\right) \leq F\left(x_{t}, x_{t+1}\right)+$ $\beta v^{*}\left(x_{t+1}\right)+\delta_{t+1}$. Then, $\left(x_{0}, x_{1}, \ldots\right) \in \pi\left(x_{0}\right)$ by construction, and

$$
\begin{aligned}
v^{*}\left(x_{0}\right) & \leq \sum_{t=0}^{n} \beta^{t} F\left(x_{t}, x_{t+1}\right)+\beta^{n+1} v^{*}\left(x_{n+1}\right)+\left(\delta_{1}+\cdots+\beta^{n} \delta_{n+1}\right) \\
& \leq u_{n}(x)+\beta^{n+1} v^{*}\left(x_{n+1}\right)+\varepsilon / 2 .
\end{aligned}
$$

Thus, using (8),

$$
v^{*}\left(x_{0}\right) \leq u_{n}(\tilde{x})+\varepsilon
$$

for all $n$ sufficiently large (large enough so that $\beta^{n+1} v^{*}\left(x_{n+1}\right)<\varepsilon / 2$ ).
Taking limits gives

$$
v^{*}\left(x_{0}\right) \leq u(\tilde{x})+\varepsilon,
$$

i.e. (3) holds for this $\tilde{x}$.
$v^{*}\left(x_{0}\right)=-\infty$ case, not possible by (7) and (8). Why?

If $v^{*}\left(x_{0}\right)=\infty$, i.e. (6) holds, want to show $\exists x^{k} \in \pi\left(x_{1}\right)$ such that $u\left(\tilde{x}^{k}\right) \rightarrow \infty$.

As a first step, we establish the following Claim:
Claim. There exists an $n, \infty>n \geq 0$, and $\left(x_{0}, \ldots, x_{n}\right)$ such that:
i. $x_{t} \in \Gamma\left(x_{t-1}\right), \quad \forall t=1, \ldots, n$
ii. $v^{*}\left(x_{t}\right)=\infty, \quad \forall t=0, \ldots n$
iii. $v^{*}\left(x_{n+1}\right)<\infty, \quad \forall x_{n+1} \in \Gamma\left(x_{n}\right)$

Proof. Suppose not. I.e., suppose that for $\forall n$, and $\forall\left(x_{0}, x_{1}^{n}, \ldots, x_{n}^{n}\right)$ such that $x_{t}^{n} \in \Gamma\left(x_{t+1}^{n}\right) \forall t, \exists x_{n+1}^{n} \in \Gamma\left(x_{n}^{n}\right)$ with $v^{*}\left(x_{n+1}^{n}\right)=\infty$. Then consider the sequence $\tilde{x}=\left(x_{0}, x_{1}^{0}, x_{2}^{1}, \ldots\right)$. By construction, $x_{n+1}^{n} \in \Gamma\left(x_{n}^{n-1}\right), \forall n$ and $v^{*}\left(x_{n+1}^{n}\right)=\infty, \forall n$. But then $\beta^{n} v^{*}\left(x_{n+1}^{n}\right) \nrightarrow 0$. Contradicting (8).
So, choose such an $n$ and such a sequence $x_{n} \in \Gamma\left(x_{n-1}\right)$. Fix an $A>0$. Since $v^{*}\left(x_{n}\right)=\infty$, by ( 6 ) we can choose $x_{n+1}^{A} \in \Gamma\left(x_{n}\right)$ such that

$$
\begin{equation*}
F\left(x_{n}, x_{n+1}^{A}\right)+\beta v^{*}\left(x_{n+1}^{A}\right) \geq \beta^{-n}\left[A+1-\sum_{t=0}^{n-1} \beta^{t} F\left(x_{t}, x_{t+1}\right)\right] . \tag{*}
\end{equation*}
$$

Also, since $v^{*}\left(x_{n+1}^{A}\right)<\infty$, we can find $\tilde{x}_{n+1}^{A}$ such that
i.

$$
\tilde{x}_{n+1}^{A} \in \pi\left(x_{n+1}^{A}\right)
$$

ii.

$$
\begin{equation*}
u\left(\tilde{x}_{n+1}^{A}\right) \geq v^{*}\left(x_{n+1}^{A}\right)-\beta^{-(n+1)} \tag{**}
\end{equation*}
$$

Then, by construction, $\tilde{x}^{A} \equiv\left(x_{0}, \ldots, x_{n}, \tilde{x}_{n+1}^{A}\right) \in \pi\left(x_{0}\right)$, and

$$
\begin{aligned}
u\left(\tilde{x}^{A}\right) & =\sum_{t=0}^{n-1} \beta^{t} F\left(x_{t}, x_{t+1}\right)+\beta^{n} F\left(x_{n}, x_{n+1}^{A}\right)+\beta^{n+1} u\left(\tilde{x}_{n+1}^{A}\right) \\
& \geq \sum_{t=0}^{n-1} \beta^{t} F\left(x_{t}, x_{t+1}\right)+\beta^{n} \beta^{-n}\left[A+1-\sum_{t=0}^{n-1} \beta^{t} F\left(x_{t}, x_{t+1}\right)\right] .
\end{aligned}
$$

From * and **

$$
\beta^{n+1} v^{*}\left(x_{n+1}^{A}\right)+\beta^{n+1}\left[v^{*}\left(x_{n+1}^{A}\right)-\beta^{-(n+1)}\right]=A
$$

Thus $V^{*}\left(x_{0}\right) \geq u\left(\tilde{x}^{A}\right) \geq A, \forall A \Rightarrow V^{*}\left(x_{0}\right)=\infty$.
This completes the proof of the Theorem.
It follows that there can be AT MOST one solution to FE satisfying (7) since by Theorem 4.3, every solution satisfying (7), $v^{*}$ satisfies $v^{*}(x)=V^{*}(x)$.

FE is called Bellman's Equation. Theorems 4.2 and $4.3 \leftrightarrow$ "Principle of Optimality".

Problem. Show (8) is necessary.
Problem. Suppose that

1. $\forall x \in X, \exists x^{*}(x)$ such that $V^{*}(x)=u\left(x^{*}(x)\right)<\infty$, i.e., there is a solution and $u$ is finite at the solution $-\max =\sup$.
2. $\forall x \in X, \exists y^{*}(x)$ solving $\max _{y \in \Gamma(x)}\left[F(x, y)+\beta V^{*}(x)\right]$.

Prove Theorem 4.2 in this case.
Problem. Suppose that $v^{*}$ satisfies FE, that (1) holds, (2) holds for $v^{*}$ and (3) $v^{*}$ is bounded. Prove Theorem 4.3 in this case.

Problem. Suppose $T<\infty$.

$$
\begin{aligned}
\text { (SP) } & \max \sum_{t=0}^{T} \beta^{t} F\left(x_{t}, x_{t+1}\right) \\
\text { s.t. } & x_{t+1} \in \Gamma\left(x_{t}\right) \quad t=0, \ldots \quad\left(x_{t+1}=\text { "final rate" }\right) .
\end{aligned}
$$

Define $V^{*}=\sup$ as before. And define the FE as before-Are Theorems (4.2), (4.3) satisfied? If yes prove it, if no show where proofs go wrong.

## Plans, Optimal Plans, Policy Rules and Policy Functions.

$\tilde{x} \in \pi\left(x_{0}\right)$ is a Feasible Plan (from $x_{0}$ ).
$\tilde{x}^{*} \in \pi\left(x_{0}\right)$ is an Optimal Plan (from $x_{0}$ ) if and only if $V^{*}\left(x_{0}\right)=u\left(\tilde{x}^{*}\right)$.
That is, the sup is attained at the plan $x^{*}$.
Note: There may be more than 1 given our assumptions so far.
Problem. Give an example with multiple optimal plans.

## Optimal plans satisfy BE.

Theorem 4.4. Under A.4.1, A.4.2, if $\tilde{x}^{*} \in \pi\left(x_{0}\right)$ is an $\mathrm{OP}, x^{*}=\left(x_{0}^{*}, x_{1}^{*}, \ldots\right)$.
Then
1.

$$
\begin{equation*}
V^{*}\left(x_{t}^{*}\right)=F\left(x_{t}^{*}, x_{t+1}^{*}\right)+\beta V^{*}\left(x_{t+1}^{*}\right) \quad t=0, \ldots \tag{9}
\end{equation*}
$$

2. $\left(x_{t+1}^{*}, \ldots\right)$ is an OP from $x_{t}^{*}$.

Proof. Since $x^{*}$ is an OP, $x_{1}^{*} \in \Gamma\left(x_{0}\right)$ and

$$
\begin{align*}
V^{*}\left(x_{0}\right) & =u\left(\tilde{x}^{*}\right)=F\left(x_{0}, x^{*}\right)+\beta u\left(\tilde{x}^{* \prime}\right)  \tag{10}\\
& \geq u(\tilde{x})=F\left(x_{0}, x_{1}\right)+\beta u\left(\tilde{x}^{\prime}\right) \quad \forall x \in \pi\left(x_{0}\right) .
\end{align*}
$$

In particular, this holds for all feasible plans with $x_{1}=x_{1}^{*}$. Now, $\quad\left(x_{1}^{*}, x_{2}, \ldots\right) \in$ $\pi\left(x_{1}^{*}\right) \Rightarrow\left(x_{0}, x_{1}^{*}, \ldots\right) \in \pi\left(x_{0}\right)$
(since $\left.x_{1}^{*} \in \Gamma\left(x_{0}\right)\right)$.
Thus, from (10), $\forall\left(x_{1}^{*}, x_{2}, \ldots\right) \in \pi\left(x_{1}^{*}\right)$,

$$
F\left(x_{0}, x_{1}^{*}\right)+\beta u\left(\tilde{x}^{* \prime}\right) \geq F\left(x_{0}, x_{1}^{*}\right)+\beta u\left(x_{1}^{*}, x_{2}, \ldots\right)
$$

so

$$
u\left(\tilde{x}^{* \prime}\right) \geq u\left(x_{1}^{*}, x_{2}, \ldots\right) \forall\left(x_{1}^{*}, x_{2}, \ldots\right) \in \pi\left(x_{0}\right) .
$$

Thus, $u\left(\tilde{x}^{* 1}\right)=V^{*}\left(x_{1}^{*}\right)$ and $\left(x_{1}^{*}, x_{2}^{*}, \ldots\right)$ is an OP from $x_{1}^{*}$ (since we just showed that it attains the sup.

This proves (1) and (2) for $t=0$. Now proceed exactly the same using induction.

## Converse

Theorem 4.5. Under A.4.1, A.4.2. If $x^{*} \in \pi\left(x_{0}\right)$ and

$$
\begin{equation*}
\limsup _{t \rightarrow \infty} \beta^{t} V^{*}\left(x_{t}^{*}\right) \leq 0 \tag{11}
\end{equation*}
$$

and (9) holds at this $\tilde{x}^{*}$. Then $V^{*}\left(x_{0}\right)=u\left(\tilde{x}^{*}\right)$ i.e., $x^{*}$ attains the sup.

Proof. Suppose $\tilde{x}^{*}$ satisfies (9) and (11). Then,

$$
\begin{aligned}
V^{*}\left(x_{0}\right)= & F\left(x_{0}, x_{1}^{*}\right)+\beta V^{*}\left(x_{1}^{*}\right) \\
= & F\left(x_{0}, x_{1}^{*}\right)+\beta\left[F\left(x_{1}^{*}, x_{2}^{*}\right)+\beta V^{*}\left(x_{2}^{*}\right)\right] \\
= & u_{1}\left(\tilde{x}^{*}\right)+\beta^{*} V^{*}\left(x_{2}^{*}\right) \\
& \vdots \\
= & u_{n}\left(\tilde{x}^{*}\right)+\beta^{n+1} V^{*}\left(x_{n+1}^{*}\right) .
\end{aligned}
$$

Taking limits then and using (11) we get

$$
V^{*}\left(x_{0}\right)=\lim u_{n}\left(\tilde{x}^{*}\right)=u\left(\tilde{x}^{*}\right)
$$

i.e. $x^{*}$ attains the sup so $x^{*}$ is an OP.

Let $G: X \Longrightarrow X$ satisfy $G(x) \subset \Gamma(x), \forall x$.
$G$ is called a "policy correspondence". It is a subset of feasible actions at $x$.
$g: X \rightarrow X$
is a "policy function" if $g$ is a "policy correspondence" AND $g(x)$ is a single point for all $x \in X$.
IF $\tilde{x}=\left(x_{0}, \ldots\right)$ satisfies $x_{t+1} \in G\left(x_{t}\right), \forall t$, then $\tilde{x}$ is said to be generated from $x_{0}$ by $G$. It's a possible path if you always follow the "policy" $G$.

Finally, $G^{*}=$ optimal policy correspondence:

$$
G^{*}=\left\{y \in \Gamma(x) \mid V^{*}(x)=F(x, y)+\beta V^{*}(y)\right\} .
$$

Then from Theorem 4.2 and Theorem 4.4:
If $x^{*}$ is an OP from $x_{0}$, then $x_{t+1}^{*} \in G^{*}\left(x_{t}^{*}\right) \forall t$.

## Conversely

If

$$
\begin{aligned}
& \tilde{x}^{*} \in \pi\left(x_{0}\right) \text { AND } \\
& x_{t+1}^{*} \in G\left(x_{t}^{*}\right) \forall t \text { AND }
\end{aligned}
$$

$$
(11),
$$

then $\tilde{x}^{*}$ is an OP from $x_{0}$.
So find $G^{*}$, then $x_{t+1}^{*} \in G^{*}\left(x_{t}^{*}\right)$ defines the time series of the solution.
Thus, to solve the SP we have the following outline:

1. Find $V^{*}$.
2. Given $V^{*}$, find $G^{*}$
3. Check that (11) is satisfied.

This shows that $G^{*}=\mathrm{OP}$.
In principle one could do this using either SP or FE for (1). But, in practive it's easier to do it using FE and this solves (2) at the same time.

## Algorithm:

1. Guess $V^{0}(x)$.
2. Solve $\sup _{y \in \Gamma(x)} F(x, y)+\beta V^{0}(y)$.
3. For $\forall x$, define $G^{0}(x)=\arg \max \left\{y \in \Gamma(x) F(x, y)+\beta V^{0}(y)\right\}$
4. For all $x$, define $V^{1}$ by $V^{1}(x)=F\left(x, G^{0}(x)\right)+\beta V^{0}\left(G^{0}(x)\right)$.
5. Put $V^{1}$ into step (1) and iterate. $\rightarrow G^{1}, V^{2}, \ldots$

Suppose for some $V^{0}$ and some $T$ we find

$$
V^{T+1}(x) \equiv F\left(x, G^{T}(x)\right)+\beta V^{T}(G(x)) \equiv V^{T}(x)
$$

Then, we see that $V^{T}$ solves FE, i.e., $V^{T}=V^{*}$ ! (And $G^{T}=G^{*}$ as well).

## Questions.

What if $V^{T} \rightarrow V$ ? Will it still work? (yes)
When will $V^{T}$ converge at all? Does it depend on $V_{0}$ ? (under Blackwell's sufficient condition, $V^{T} \rightarrow V^{*}$ independent of starting place).

## Next order of business:

1. Make sure this procedure works.
2. Get some properties of $V^{*}, G^{*}$ going for us.
A.4.3. $X \subset R^{\ell}$ is convex. $\Gamma$ non-empty, compact valued and continuous. $\Gamma$ is l.h.c. if $\forall x^{*}, \forall y^{*} \in \Gamma\left(x^{*}\right), \forall x^{n} \rightarrow x^{*}, \exists y^{n} \in \Gamma\left(x^{n}\right)$ such that $y^{n} \rightarrow y^{*}$. $\Gamma$ is u.h.c. if $\forall x^{n}, \forall y^{n}$ such that $y^{n} \in \Gamma\left(x^{n}\right)$ and $\left(x^{n}, y^{n}\right) \rightarrow\left(x^{*}, y^{*}\right)$ then $y^{*} \in \Gamma\left(x^{*}\right)$.
$\Gamma$ is continuous if both of these hold.
Examples: Enter Graphs Here.
A.4.4. $F$ is bounded and continuous, $0<\beta<1$.

Problem. Show that if A.4.3 and A.4.4 then A.4.1 and A.4.2.

1. So SP is well defined.
2. Solutions $\left(V^{*}, G^{*}\right)$ of SP and FE are the same. ( $V^{*}$ is bounded.)

If $|F(x, y)| \leq B \quad \forall \quad x, y \in A$, then $\left|V^{*}(x)\right| \leq \frac{B}{1-\beta} \quad \forall x$.
Let $C(X)=\{f: F \Longrightarrow R$, continuous, bounded $\}$. Clearly, if $V^{*}$ is continuous, it is in $C(X)$.

Consider:

$$
\text { [1] } \quad v(x)=\max _{y \in \Gamma(x)} F(x, y)+\beta v(y) .
$$

For any $v \in C(X)$, the RHS of [1] has a solution (maximize a continuous function on the compact set $\Gamma(x))$ and it this maximized value is continuous.

Accordingly define the function $T: C(X) \rightarrow C(X)$
by if $f(x) \in C(X)$, then

$$
(T(f))(x)=\max _{y \in \Gamma(x)} F(x, y)+\beta v(y) .
$$

Thus [1] is $T(v) \equiv v$, i.e., $v$ is a fixed point of T .
Let $d(f, g)=\sup _{x}|f(x)-g(x)|$.

It can be shown that under metric $d, C$ is a complete metric space.
Theorem 4.6. If 4.3, and 4.4, then,

1. $T$ has a unique fixed point (which must be $V^{*}$ ).
2. And for all $V_{0} \in C(X)$,

$$
\left\|T^{n}\left(V_{0}\right)-V^{*}\right\| \leq \beta^{n}\left\|V_{0}-V^{*}\right\| \quad(\rightarrow 0)
$$

3. The opt. policy corres, $G^{*} \equiv \arg \max _{y \in \Gamma(x)}\left(F(x, y)+V^{*}(y)\right)$ is nonempty compact valued and u.h.c.

### 3.1 Some Math We Need Before the Proof

## Fixed Points

$S$ a set, $f: S \rightarrow S$ a function. $S^{*}$ is called a fixed point for $f$ if $f\left(s^{*}\right)=s^{*}$ i.e., $f$ leaves $s^{*}$ "fixed." Some $f^{\prime}$ s have fixed points and some $f^{\prime}$ s don't.

INSERT GRAPHS HERE

## Brouwer's Theorem

Let $S \subset R^{m}$ be the closed disk with interior, i.e. $S=\left\{x \in R^{m} \mid\|x\| \leq 1\right\}$. Then every continuous fct $f: S \rightarrow S$ has at least one fixed point.

Results like this are rare! Not true for $C(X)$.
$T: C \rightarrow C \cdot f \rightarrow f+1$, i.e., $T f(x)=f(x)+1 \quad \forall x$.
$T$ is a very nice mapping but has NO fixed points.
To get a FP, in general you need strong assumptions.

## Contractions and Contraction Mapping Theorem

## Theorem 3.2 Contraction Mapping Theorem

If $(S, \rho)$ is a complete metric space and $T: S \rightarrow S$ is a contraction of modulus $\beta$, that is, $\rho(T(x), T(y)) \leq \beta \rho(x, y) \forall x, y \in S$, Then,

1. $T$ has exactly one fixed point, $s^{*}$
2. $\rho\left(T^{n}(x), s^{*}\right) \leq \beta^{n} \rho\left(x, s^{*}\right) . \quad \forall n, x \in S$.

Note: $T^{n}$ defines a difference equation on $S$, i.e., $s, T(s), T(T(s))=T^{2}(s), \quad s_{0}, s_{1}, s_{2}, \cdots$

We are asking a hard question. When is it true that $T^{n}\left(s_{0}\right) \rightarrow s^{*} \quad \forall s_{0}$ ?

INSERT GRAPHS HERE.

## Completeness

Let $X \subset R^{m}$, and define $C(X)=$ bounded continuous functions from $X \rightarrow R$.
Define $\|f\|=\sup _{x \in X}|f(x)|$.
This is known as the supnorm of $f$.
Define $d(f, g)=\|f-g\|=\sup _{x \in X}|f(x)-g(x)|$. It can be shown that $d$ is a metric - that is:

$$
\begin{aligned}
d & \geq 0 \\
d(f, g) & =d(g, f) \\
d(f, g) & \leq d(f, \widehat{f})+d(\widehat{f}, g) \quad \forall f, g, \widehat{f}
\end{aligned}
$$

Theorem $3.1(C(X),\|\cdot\|)$ is a complete metric space.
Theorem 3.2 If $(S, \rho)$ is complete and $\widehat{S} \subset S$ is closed, then $(\widehat{S}, \rho)$ is complete also.

## Blackwell's Theorem

Theorem 3.3 Let $x \subset R^{\ell}, B(x)$ be a space of bounded real valued functions with:

$$
d(f, g) \equiv \sup _{x \in X}|f(x)-g(x)| \equiv\|f-g\|
$$

Let $T: B \rightarrow B$ satisfy:
(a) $\forall f, g \in B$, such that $f(x) \leq g(x) \quad \forall x$, then $T f(x) \leq T g(x) \quad \forall x$, and
(b) $\exists \beta \in(0,1)$ such that, $\forall a \geq 0, \quad \forall f \in B, \quad(T(f+a))(x) \leq T f(x)+$ $\beta a \quad \forall x \in X$.

THEN, $T$ is a contraction of modulus $\beta$.

## Theorem of the Maximum:

Theorem 3.6 Let $x \subset R^{\ell}, y \subset R^{m}, f: X \times Y \rightarrow R$ is continuous and $\Gamma: X \rightarrow Y$ is compact valued and continuous.
Then,
(a) $h(x)=\max _{y \in \Gamma(x)} f(x, y)$ is continuous.
(b) $G(x)=\arg \max _{y \in \Gamma(x)} f(x, y)$ is non-empty, compact valued and u.h.c.

### 3.2 Back to the Proof of the Theorem

Recall what we want to show:
Theorem 4.6. If 4.3, and 4.4, then,

1. $T$ has a unique fixed point (which must be $V^{*}$ ).
2. And for all $V_{0} \in C(X)$,

$$
\left\|T^{n}\left(V_{0}\right)-V^{*}\right\| \leq \beta^{n}\left\|V_{0}-V^{*}\right\| \quad(\rightarrow 0)
$$

3. The optimal policy correspondence, $G^{*} \equiv \arg \max _{y \in \Gamma(x)}\left(F(x, y)+V^{*}(y)\right)$ is non-empty compact valued and u.h.c.

Proof: Given any $V_{0} \in C$ it follows that

$$
P(X): \max _{y \in \Gamma(x)} F(x, y)+\beta V_{0}(y)
$$

has a continuous objective function and a compact feasible set. So,
(a) $G_{V_{0}}(x)=\arg \max (\quad)$ is non-empty and compact valued.
(b) $G_{V_{0}}(x)$ is u.h.c. (Theorem of the Maximum).
(c) $V(x)=F\left(x, G_{V_{0}}(x)\right)+\beta V_{0}\left(G_{V_{0}}(x)\right)$ is bounded and continuous.

Thus, $T: C \rightarrow C$ from (c), and (3) follows from (a) and (b) at any fixed point. Thus we need show (1) and (2). These will follow from the Contraction Mapping Theorem once we show that Blackwell's sufficient conditions are satisfied by $T$.

If $f(x) \leq g(x) \quad \forall x, f, g \in C$

$$
\begin{aligned}
T(f)(x) & \equiv \max _{y \in \Gamma(x)}[F(x, y)+\beta f(y)] \\
& \leq \max _{y \in \Gamma(x)}[F(x, y)+\beta g(y)] \\
& \equiv(T g)(x) .
\end{aligned}
$$

(since it is true pointwise, and $F$ is the same).
If $f \in C, a \geq 0$, then

$$
\begin{aligned}
T(f)(x) & \equiv \max _{y \in \Gamma(x)}[F(x, y)+\beta(f+a)(y)] \\
& =\max _{y \in \Gamma(x)}[F(x, y)+\beta f(y)+\beta a] \\
& \equiv(T f)(x)+\beta a .
\end{aligned}
$$

i.e., BSC are satisfied so $T$ is a contraction, so (1) and (2) hold.

Summary Then:
Theorems 4.3 and $4.6 \Rightarrow V^{*}$ is bounded and continuous.

Theorems 4.5 and $4.6 \Rightarrow \exists$ at least one optimal plan...any plan generated by $G^{*}\left(\right.$ since $\left.\left.G^{*} \neq \varnothing\right)\right)$ implied.

Problem: Show that $F$ bounded is necessary for this. How is this true?

## 4 Properties of $V^{*}, G^{*}$

A4.5 $\forall y, F(x, y)$ is strictly increasing in $x$ (but not necessarily in $y$.)
A4.6 $x \leq x^{\prime}$ (vector sense) $\Rightarrow \Gamma(x) \subseteq \Gamma\left(x^{\prime}\right)$.
Theorem 4.7 If A4.3-4.6 hold and $V^{*}$ is unique solution to:
[1] $\quad v^{*}(x) \equiv \max _{y \in \Gamma(x)}\left[F(x, y)+\beta v^{*}(y)\right]$,
then, $V^{*}$ is strictly increasing.
Proof: Let $C^{\prime}(x)$ be the set bounded increasing functions and let $C^{\prime \prime}$ be those that are strictly increasing. $C^{\prime \prime}$ is a closed subset of $C$ and hence, it is also complete under the sup norm. By A4.5 and A4.6, if $v \in C^{\prime}(x) \Rightarrow T(v) \in$ $C^{\prime \prime}(x)$, i.e., $T=C^{\prime} \rightarrow C^{\prime \prime}$. Thus, the unique F.P. of $T$ is in $C^{\prime \prime}$. To see this, pick any $V \in C^{\prime}$, and consider $T^{n}(V) \in C^{\prime \prime}$. From above, $T^{n}(V) \rightarrow V^{*}$ - the F.P. of $T$. Thus, since $C^{\prime}$ is closed, $V^{*} \in C^{\prime}$. But $V^{*}=T\left(V^{*}\right)$ and hence, $V^{*}=T\left(V^{*}\right) \in C^{\prime \prime}$ (since $T(V) \in C^{\prime \prime} \quad \forall V \in C^{\prime}$ ).

A4.7 $F$ is strictly concave.

$$
\begin{aligned}
F\left(\theta(x, y)+(1-\theta)\left(x^{\prime}, y^{\prime}\right)\right) & \geq \theta F(x, y)+(1-\theta) F\left(x^{\prime}, y^{\prime}\right) \\
\forall(x, y),\left(x^{\prime}, y^{\prime}\right) & \in A, \quad \forall \theta \in(0,1) .
\end{aligned}
$$

Moreover, the inequality is strict if $x \neq x$.
A4.8 $\Gamma$ is convex-(really graph of $\Gamma$ is convex).

$$
\begin{aligned}
\forall \theta \in & {[0,1], \quad \forall x, x^{\prime}, y^{\prime}, y^{\prime} \ni y \in \Gamma(x), y^{\prime} \in \Gamma\left(x^{\prime}\right) \Rightarrow } \\
& \theta y+(1-\theta) y^{\prime} \in \Gamma\left(\theta x+(1-\theta) x^{\prime}\right) .
\end{aligned}
$$

Note: This rules out IRS across $x$. e.g., $x \in R, \quad \Gamma(x)=\{y \mid 0 \leq y \leq f(x)\}$. $\Gamma(x)$ is convex $\forall x$, but $A$ is not if $f$ is $\operatorname{IRS}$ !

## INSERT GRAPH HERE

Theorem 4.8 If A4.3, A4.4, A4.7 and A4.8 are satisfied, then $V^{*}$ is strictly concave and $G^{*}$ is a continuous function.

Proof: Let $C^{\prime}=$ bounded, continuous, weakly concave functions and let $C^{\prime \prime}$ $=$ those that are strictly concave. $C^{\prime}$ is closed in $C$. We will show $T\left(C^{\prime}\right) \subset C^{\prime \prime}$. Suppose $V \in C^{\prime}$ and $x_{0} \neq x, \theta \in(0,1), x_{\theta}=\theta x_{0}+(1-\theta) x_{1}$. Let $y_{i} \in G\left(x_{i}\right)$, $i=0,1$, and define $y_{\theta}=\theta y_{0}+(1-\theta) y_{1}$.

Then by $4.8, y_{\theta} \in \Gamma\left(x_{\theta}\right)$ for all $\theta$.
Thus,

$$
\begin{aligned}
T V\left(x_{\theta}\right) & \geq F\left(x_{\theta}, y_{\theta}\right)+\beta V\left(y_{\theta}\right) \quad\left(\text { since } y_{\theta} \in \Gamma\left(x_{\theta}\right)\right) \\
& >\theta\left[F\left(x_{0}, y_{0}\right)+\beta V\left(y_{0}\right)\right]+(1-\theta)\left[F\left(x_{1}, y_{1}\right)+\beta V\left(y_{1}\right)\right]
\end{aligned}
$$

(strict concavity of $F$, A.4.7, weak concavity of $V$ )
$=\theta T V\left(x_{0}\right)+(1-\theta) T V\left(x_{1}\right) \quad$ as desired.
i.e., $T\left(C^{\prime}\right) \subset C^{\prime \prime}$, since $C^{\prime}$ is closed, it follows that the unique FP of $T \in C^{\prime \prime}$. Since $V^{*}, F$ are strictly concave, it follows that $\forall x$ there is a unique solution to:

$$
\max _{y \in \Gamma(x)} F(x, y)+\beta V^{*}(y)
$$

that is, $G^{*}(x)$ is a function. Since it is uhc, it is continuous.

### 4.1 Other Related Results

## Convergence of Approximating Policy Functions:

Theorem 4.9 Suppose $V_{0}$ is bounded continuous and concave. Define $V_{n}$ and $g_{n}$ by

$$
\begin{aligned}
V_{n+1} & =T V_{n} \\
g_{n} & =\arg \max _{y \in \Gamma(x)} F(x, y)+\beta V_{n}(y)
\end{aligned}
$$

Then,

1. $g_{n}(x) \rightarrow g(x) \forall x$
2. if $X$ is compact, $\left\|g_{n}-g\right\| \rightarrow 0$.

## Differentiability of $V^{*}$ :

Theorem 4.11 A4.3-4.4, 4.7, 4.8 and $F$ is $C^{1}$ on $\operatorname{int}(A)$, if $x_{0} \in \operatorname{int}(X)$, and $g\left(x_{0}\right) \in \operatorname{int}\left(\Gamma\left(x_{0}\right)\right)$, then $V$ is continuously differentiable at $x_{0}$, and

$$
\left.\frac{\partial V}{\partial x_{0}}\right|_{x_{0}}=\left.\frac{\partial F}{\partial x_{i}}\right|_{\left(x_{0}, g,\left(x_{0}\right)\right)}
$$

Proof: Choose a neighborhood of $x_{0}, U$, such that, $g\left(x_{0}\right) \in \operatorname{int}\left(\Gamma\left(x_{0}\right)\right)$ for all $x \in U$.

Define

$$
W(x)=F\left(x, g\left(x_{0}\right)\right)+\beta V\left(g\left(x_{0}\right)\right)
$$

Then,

1. $W(x) \leq V(x) \quad \forall x \in U \quad$ (since $\left.g\left(x_{0}\right) \in \Gamma(x) \quad \forall x \in U\right)$.
2. $W\left(x_{0}\right)=V\left(x_{0}\right)$.
3. $W$ is concave and differentiable, since $F$ is. And, $\beta V\left(g\left(x_{0}\right)\right)$ is a constant.

## INSERT GRAPH HERE

Thus (Rockafeller) $V$ is differentiable at $x_{0}$ and

$$
\left.\frac{\partial V}{\partial x_{i}}\right|_{x_{0}}=\left.\frac{\partial W}{\partial x_{0}}\right|_{\left(x_{0}\right)}=\left.\frac{\partial F}{\partial x_{i}}\right|_{\left(x_{0}, g,\left(x_{0}\right)\right)}
$$

## 5 Examples

Examples of closed form solutions are rare. (Well, there are 2 or 3 ).

## Example 1 Full depreciation, Log/Cobb-Douglas.

$$
\begin{array}{ll} 
& u=\sum \beta^{t} \log c_{t} \\
\text { s.t. } & c_{t}+k_{t+1} \leq A k_{t}^{\alpha} .
\end{array}
$$

Then,

$$
\begin{aligned}
V^{*}(k)= & \\
& \frac{\log A}{(1-\beta)(1-\alpha \beta)}+\frac{1}{1-\beta}\left[\log (1-\alpha \beta)+\frac{\alpha \beta}{(1-\alpha \beta)} \log (\alpha \beta)\right] \\
& +\frac{\alpha}{(1-\alpha \beta)} \log k
\end{aligned}
$$

Proof Just show that $V^{*}$ is an fixed point for $T$ !

This does not give a lot of insight however.
Alternative:
Guess that $k^{\prime}=g_{k}(k)$ is given by $k^{\prime}=\varphi f(k)$, (constant, savings rate- you might guess this because $k \uparrow \quad r \downarrow$, but under $\log , c / W$ independent of $r$ for some $\varphi$.)
If correct, this implies that

$$
k_{t+1}=\varphi f\left(k_{t}\right)=\varphi A k_{t}^{\alpha} \forall t
$$

and

$$
c_{t}=(1-\varphi) f\left(k_{t}\right)=(1-\varphi) A k_{t}^{\alpha} .
$$

Thus,

$$
\begin{aligned}
k_{1} & =\varphi A k_{0}^{\alpha}, k_{2}=\varphi A k_{1}^{2}=\varphi A\left(\varphi A k_{0}^{\alpha}\right)^{\alpha}=(\varphi A)^{1+\alpha} k_{0}^{\alpha^{2}} \\
k_{3} & =\varphi A k_{2}^{\alpha}=\varphi A\left[(\varphi A)^{1+\alpha} k_{0}^{\alpha^{2}}\right]^{\alpha}=(\varphi A)^{1+\alpha+\alpha^{2}} k_{0}^{\alpha^{3}} \\
k_{t} & =(\varphi A)^{1+\alpha+\ldots \alpha^{t-1}} k_{0}^{\alpha^{t}}
\end{aligned}
$$

Hence,

$$
\begin{aligned}
c_{t} & =(1-\varphi) A k_{t}^{\alpha}=(1-\varphi) A\left[(\varphi A)^{1+\alpha+\ldots+\alpha^{t-1}} k_{0}^{\alpha^{t}}\right]^{\alpha} \\
& =(1-\varphi) A[\varphi A]^{\alpha+\alpha^{2}+\ldots \alpha^{t}} k_{0}^{\alpha^{t+1}}
\end{aligned}
$$

Thus,

$$
\begin{aligned}
u(\varphi)= & \sum \beta^{t} \log c_{t}=\sum \beta^{t}\left(\log \left[(1-\varphi) A \cdot[\varphi A]^{\alpha+\ldots+\alpha^{t}} k_{0}^{\alpha^{t+1}}\right]\right) \\
= & \sum \beta^{t}\left\{\log [(1-\varphi) A]+\left(\alpha+\ldots+\alpha^{t}\right) \log [\varphi A]+\alpha^{t+1} \log \left(k_{0}\right)\right\} \\
= & \frac{\log [(1-\varphi) A]}{1-\beta}+\log [\varphi A] \sum_{t=0}^{\infty} \beta^{t} \sum_{s=1}^{t} \alpha^{s} \\
& +\alpha \log \left(k_{0}\right) \sum_{t=0}^{\infty}(\beta \alpha)^{t}
\end{aligned}
$$

This uses:

$$
\begin{aligned}
\left(\alpha+\ldots+\alpha^{t}\right)(1-\alpha) & =\alpha+\ldots+\alpha^{t}-\alpha^{2}-\alpha^{3}-\ldots-\alpha^{t+1} \\
& =\alpha-\alpha^{t+1}=\alpha\left(1-\alpha^{t}\right) \text { so } \\
\alpha+\alpha^{2}+\ldots+\alpha^{t} & =\frac{\alpha(1-\alpha)}{(1-\alpha)}
\end{aligned}
$$

Hence,

$$
\begin{aligned}
u(\varphi)= & \frac{\log (1-\varphi)}{(1-\beta)}+\frac{\log A}{(1-\beta)}+\frac{\log (\varphi A)}{(1-\alpha)} \sum_{0}^{\infty} \beta^{t} \alpha\left(1-\alpha^{t}\right)+\frac{\alpha}{1-\alpha \beta} \log k_{0} \\
= & \frac{\log (1-\varphi)}{(1-\beta)}+\frac{\log A}{(1-\beta)}+\frac{\alpha}{(1-\alpha)} \log (\varphi A)\left[\sum_{0}^{\infty} \beta^{t}-\sum_{0}^{\infty}(\beta \alpha)^{t}\right] \\
& +\frac{\alpha}{1-\alpha \beta} \log k_{0} \\
= & \frac{\log (1-\varphi)}{(1-\beta)}+\frac{\log A}{(1-\beta)}+\frac{\alpha \beta}{(1-\beta)(1-\alpha \beta)} \log \varphi \\
& +\frac{\alpha \beta}{(1-\beta)(1-\alpha \beta)} \log A+\frac{\alpha}{(1-\alpha \beta)} \log k_{0}
\end{aligned}
$$

What is the optimal choice of $\varphi$ ?

$$
\begin{aligned}
& \max _{\varphi \in(0,1)} u(\varphi) \\
\max _{\varphi} \widehat{u}(\varphi) \text { where } \widehat{u}(\varphi) & =\log (1-\varphi)+\frac{\alpha \beta}{(1-\alpha \beta)} \log \varphi
\end{aligned}
$$

The rest is constants (Note, it had to end up independent of $k_{0}$, if this guess is correct otherwise the optimal $\varphi$ would end up depending on $k, \Rightarrow \operatorname{constant} \varphi$ would have to be wrong!)

## FOC

$$
\begin{aligned}
\frac{1}{1-\varphi} & =\frac{\alpha \beta}{1-\alpha \beta} \frac{1}{\varphi} \\
1-\varphi & =\frac{1-\alpha \beta}{\alpha \beta} \cdot \varphi \\
1 & =\varphi\left[\frac{1-\alpha \beta}{\alpha \beta}+1\right]=\varphi\left[\frac{1-\alpha \beta+\alpha \beta}{\alpha \beta}\right]=\frac{1}{\alpha \beta} \varphi
\end{aligned}
$$

That is

$$
\varphi^{*}=\alpha \beta
$$

So, if a policy of this firm is optional then $\varphi=\alpha \beta$.
To show that this is in fact optimal substitute $\varphi^{*}$ into $u(\varphi)$ to get:

$$
\begin{aligned}
u\left(\varphi^{*}\right)= & \frac{\log (1-\alpha \beta)}{(1-\beta)}+\frac{\log A}{(1-\beta)}\left[1+\frac{\alpha \beta}{1-\alpha \beta}\right] \\
& \quad+\frac{\alpha \beta}{(1-\beta)(1-\alpha \beta)} \log (\alpha \beta)+\frac{\alpha}{1-\alpha \beta} \log \left(k_{0}\right) .
\end{aligned}
$$

Thus, if our guess is correct,

$$
\begin{gathered}
V^{*}(k)=\frac{\log A}{(1-\beta)(1-\alpha \beta)}+\frac{1}{(1-\beta)}\left[\log (1-\alpha \beta)+\frac{\alpha \beta}{1-\alpha \beta} \log (\alpha \beta)\right] \\
\quad+\frac{\alpha}{1-\alpha \beta} \log k
\end{gathered}
$$

and $g^{*}(k)=\alpha \beta A k^{\alpha}$.
To show that this is correct, it is necessary and sufficient to verify that $V^{*}$ defined this way is an fixed point of $T$, i.e.

$$
V^{*}(k)=\left[\log \left((1-\alpha \beta) A k^{\alpha}\right)+\beta V^{*}\left(\alpha \beta A k^{\alpha}\right)\right]
$$

or equivalently $g(k)=\alpha \beta A k^{\alpha}$ solves

$$
\max _{0 \leq y \leq A k^{\alpha}}\left[\log \left(A k^{\alpha}-y\right)+\beta V^{*}(y)\right] .
$$

Problem. Do this.

## Alternative Guess and Verify Strategy:

1. Guess that $V^{*}(k)=D_{0}+D_{1} \log k$ for some choices of $D_{0}, D_{1}$.
2. For each $D_{0}, D_{1}$ find

$$
g_{D_{0}, D_{1}}(k)=\arg \max _{0 \leq y \leq A k^{\alpha}}\left[\log \left(A k^{\alpha}-y\right)+\beta\left[D_{0}+D_{1} \log y\right]\right] .
$$

3. Use (2) to find

$$
V_{D_{0}, D_{1}}(k) \equiv \log \left(A k^{\alpha}-g_{D_{0}, D_{1}}(k)\right)+\beta\left[D_{0}+D_{1} \log \left(g_{D_{0}, D_{1}}(k)\right)\right] .
$$

4. Find $D_{0}^{*}, D_{1}^{*}$ so that $V_{D_{0}^{*}, D_{1}^{*}}(k)=D_{0}^{*}+D_{1}^{*} \log k$.
I.e., use this procedure to form an Educated Guess for $V^{*}$.
5. Verify by showing that $V_{D_{0}^{*}, D_{1}^{*}}$ is a FP of $T$.

Example 2:L-Q Problems

Example 3: $A k$ Models
Problems
1.

$$
\begin{array}{ll}
\max & \sum \beta^{t} \log c_{t} \\
\text { s.t. } & c_{t}+k_{t+1} \leq A k_{t}^{\alpha}+(1-\delta) k_{t} \quad \delta<1
\end{array}
$$

Guess that $V^{*}(k)=B_{0}+B_{1} \log k$ for some $B_{0}, B_{1}$. What happens when you "Smart Guess"?
2.

$$
\begin{array}{ll}
\max & \sum \beta^{t} \frac{c_{t}^{1-\sigma}}{1-\sigma} \quad \sigma>0, \quad \sigma \neq 1 \\
\text { s.t. } & c_{t}+k_{t+1} \leq A k_{t}^{\alpha}
\end{array}
$$

as above.
3.

$$
\begin{aligned}
& \max \sum \beta^{t} \log c_{t} \\
& \text { s.t. } c_{t}+k_{t+1} \leq A\left[\alpha k_{t}^{\rho}+(1-\alpha) 1^{\rho}\right]^{\frac{1}{\rho}} \\
& \rho \leq 1, \quad \rho \neq 0 .
\end{aligned}
$$

(Note: this comes from $\bar{n}_{t}=1 \forall t, F(k, n)=u\left[\alpha k^{\rho},(1-\alpha) n^{\rho}\right]^{\frac{1}{\rho}}$, $u(c, \ell)=\log c+0 \cdot \log \ell$.

## 6 Applying the Methods

Growth Model with Inelastic Labor Supply

$$
\begin{align*}
& \max \sum \beta^{t} u\left(c_{t}\right)  \tag{SP}\\
& \text { s.t. } c_{t}+k_{t+1} \leq F\left(k_{t}, 1\right)+(1-\delta) k_{t} \\
x_{t} \geq & 0 \quad k_{t+1} \geq(1-\delta) k_{t} \quad c_{t} \geq 0 .
\end{align*}
$$

Assume that non-negativity is not binding and let:

$$
\begin{align*}
f\left(k_{t}\right)= & F\left(k_{t}, 1\right)+(1-\delta) k_{t} . \\
& \max \sum \beta^{t} u\left(c_{t}\right)  \tag{SP}\\
& c_{t}+k_{t+1} \leq f\left(k_{t}\right) .
\end{align*}
$$

So,

$$
\begin{array}{ll} 
& \max \sum \beta^{t} u\left(f\left(k_{t}\right)-k_{t+1}\right) \\
\text { s.t. } & 0 \leq k_{t+1} \leq f\left(k_{t}\right)
\end{array}
$$

where

$$
\begin{aligned}
F & =u\left(f\left(k_{t}\right)-k_{t+1}\right) \\
\Gamma\left(k_{t}\right) & =\left[0, f\left(k_{t}\right)\right] .
\end{aligned}
$$

States: What is $x ? x_{t}=k_{t}$ or $x_{t+1}=\left(k_{t+1}, \ell_{t}\right)$.

### 6.1 Assumptions

## Utility

u1. $0<\beta<1$;
u2. $u$ is continuous;
u3. $u$ is strictly increasing;
u4. $u$ is strictly concave;
u5. $u$ is $C^{1}$.

## Technology

t1. $f$ is continuous;
t2. $f(0)=0, \exists \bar{k}>0$ such that

$$
\left.\begin{array}{rl}
\bar{k} \geq f(k) \geq k & \forall k \in[0, \bar{k}] . \\
f(k) & <k
\end{array} \quad \forall k \in(\bar{k}, \infty) .\right] \bar{k}=\max \text { sustainable capital stock. }
$$

## [INSERT PICTURE HERE]

(Feasibility implies $k$ must fail if $k_{0}>\bar{k}$ under this condition.)
t3. $f$ is strictly increasing;
t4. $f$ is weakly concave;
t5. $f$ is $C^{1}$.

## FE

$$
V^{*}(k) \equiv \max _{0 \leq y \leq f(k)}\left[u(f(k)-y)+\beta V^{*}(y)\right] .
$$

Let $X=[0, \bar{k}]$.

### 6.2 Results

Then the results from the general case imply under these assumptions: (Not all assumptions are necessary for all parts).
a) $\mathrm{SP} \Longleftrightarrow \mathrm{FE}$.
b) There is a unique bounded continuous function solving FE, $V^{*}$, and $G^{*}$ is non-empty and u.h.c. Thus, $\forall k_{0} \in[0, \bar{k}], \exists\left(k_{0}^{*}, k_{1}^{*}, \ldots\right)$ solving (SP).
c) $V^{*}$ is strictly increasing.
d) $V^{*}$ is strictly concave, $G^{*}=g^{*}$ is a function that is continuous.
e) If $g^{*}(k) \in(0, f(k))$, then $V^{*}$ is differentiable at $k \in(0, \bar{k})$ and $V^{* \prime}(k)=$ $U^{\prime}\left(f(k)-g^{*}(k)\right) f^{\prime}(k)$.
f) If $f^{\prime}(0)=\infty, U^{\prime}(0)=\infty$, then $0<g^{*}(k)<f(k) \forall k \in[0, \bar{k}]$. (Inada Conditions)

## Characterizing $g^{*}$ :

Recall that $g^{*}$ solves

$$
\max _{0 \leq y \leq f(k)} U(f(k)-y)+\beta V^{*}(y) .
$$

FOC and ENV are:

$$
\begin{align*}
& U^{\prime}\left(f(k)-g^{*}(k)\right)=\beta V^{* \prime}\left(g^{*}(k)\right) .  \tag{FO}\\
& V^{* \prime}(k)=U^{\prime}\left(f(k)-g^{*}(k)\right) f^{\prime}(k) . \tag{Env}
\end{align*}
$$

g) From FOC suppose $k$ is increased. $k_{0} \rightarrow k_{1}$ with $k_{1}>k_{0}$. If $g^{*}\left(k_{1}\right) \leq$ $g^{*}\left(k_{0}\right)$ then $f\left(k_{0}\right)-g^{*}\left(k_{0}\right)<f\left(k_{1}\right)-g^{*}\left(k_{1}\right)\left(\right.$ since $\left.f\left(k_{1}\right)>f\left(k_{0}\right)\right)$. Thus, from the concavity of $U$ :

$$
U^{\prime}\left(f\left(k_{0}\right)-g^{*}\left(k_{0}\right)\right)>U^{\prime}\left(f\left(k_{1}\right)-g^{*}\left(k_{1}\right)\right) .
$$

Thus, using the FOC

$$
V^{* \prime}\left(g^{*}\left(k_{0}\right)\right)>V^{* \prime}\left(g^{*}\left(k_{1}\right)\right) .
$$

Thus, since $V^{*}$ strictly concave, $g^{*}\left(k_{0}\right)<g^{*}\left(k_{1}\right)$, contradiction. Thus, $g^{*}$ is strictly increasing.
h) Since $V^{*}$ concave,

$$
\begin{aligned}
k & \uparrow g^{*}(k) \uparrow \\
& \Rightarrow V^{* \prime}\left(g^{*}(k)\right) \downarrow \\
& \Rightarrow U^{\prime}\left(f(k)-g^{*}(k)\right) \downarrow \\
& \Rightarrow\left(f(k)-g^{*}(k)\right) \uparrow(U \text { is concave }), \\
\text { i.e., } c^{*}(k) & =f(k)-g^{*}(k) \text { is increasing in } k \text { too! }
\end{aligned}
$$

[INSERT PICTURE HERE]
This result is a bit of an oddity... this is just a 2 variable budget problem, and we've just shown that both demand curves are increasing in Wealth. Why can't either $c$ or $k^{\prime}$ be an inferior good?

Steady States i.e. $g\left(k^{*}\right)=k^{*}$
i) $g(0)=0$ - feasibility
j) If $k^{*}=g\left(k^{*}\right)$ use FOC and the ENV to get

$$
U^{\prime}\left(f\left(k^{*}\right)-k^{*}\right)=\beta U^{\prime}\left(f\left(k^{*}\right)-k^{*}\right) f^{\prime}\left(k^{t}\right)
$$

so

$$
\frac{1}{\beta}=f^{\prime}\left(k^{*}\right)
$$

k) If $f^{\prime}(0)=\infty, f^{\prime}(\infty)<\frac{1}{\beta}$ (e.g. $f^{\prime}(\infty)=0$ ). There is at least one strictly positive solution to this. If $f$ is strictly concave, there is exactly one.
l) If $f^{\prime}\left(k^{*}\right)=\frac{1}{\beta}$ then $g\left(k^{*}\right)=k^{*}$.

From Env:

$$
V^{* \prime}\left(k^{*}\right)=U^{\prime}\left(f\left(k^{*}\right)-g^{*}\left(k^{*}\right)\right) f^{\prime}\left(k^{*}\right)
$$

i.e.

$$
\beta V^{*^{\prime}}\left(k^{*}\right)=U^{\prime}\left(f\left(k^{*}\right)-g^{*}\left(k^{*}\right)\right) .
$$

From FOC:

$$
U^{\prime}\left(f\left(k^{*}\right)-g^{*}\left(k^{*}\right)\right)=\beta V^{* \prime}\left(g^{*}(k)\right) .
$$

Thus

$$
\begin{aligned}
\beta V^{* \prime}\left(k^{*}\right) & =\beta V^{* \prime}\left(g^{*}\left(k^{*}\right)\right) \\
\Rightarrow k^{*} & =g^{*}\left(k^{*}\right)
\end{aligned}
$$

since $V^{*}$ is strictly increasing.

## Global Dynamics:

First a little Math Result:
If $W(z)$ is strictly concave and differentiable then $\left(W^{\prime}(z)-W^{\prime}(\hat{z})\right)(z-\hat{z}) \leq$ 0 with equality $\Leftrightarrow z=\hat{z}$.
Proof.

$$
\begin{array}{ll}
z<\hat{z} \Rightarrow\left(W^{\prime}(z)-W^{\prime}(\hat{z})\right)>0, & (z-\hat{z})<0 \\
z>\hat{z} \Rightarrow\left(W^{\prime}(z)-W^{\prime}(\hat{z})\right)<0, & (z-\hat{z})>0 \\
z=\hat{z} \rightarrow 0
\end{array}
$$

Thus, since $V^{*}$ is strictly concave and differentiable on $(0, \bar{k}], z=k, \hat{z}=g(k)$ gives

$$
\begin{equation*}
\left[V^{* \prime}(k)-V^{* \prime}\left(g^{*}(k)\right)\right]\left[k-g^{*}(k)\right] \leq 0 \quad \forall k \in(0, \hat{k}] \tag{}
\end{equation*}
$$

with equality iff $k=g(k)$.
From ENV

$$
V^{* \prime}(k)=U^{\prime}\left(f(k)-g^{*}(k)\right) f^{\prime}(u) .
$$

From FOC

$$
V^{* \prime}(g(k))=\frac{1}{\beta} U^{\prime}\left(f(k)-g^{*}(k)\right) .
$$

Thus * is

$$
\begin{gather*}
{\left[U^{\prime}\left(f(k)-g^{*}(k)\right) f^{\prime}(k)-\frac{1}{\beta} U^{\prime}\left(f(k)-g^{*}(k)\right]\left[k-g^{*}(k)\right] \leq 0\right.}  \tag{}\\
\text { equality } \Leftrightarrow k=g(k) .
\end{gather*}
$$

or

$$
\begin{align*}
{\left[f^{\prime}(k)-\frac{1}{\beta}\right]\left[k-g^{*}(k)\right] } & \leq 0  \tag{*}\\
\text { equality } & \Leftrightarrow k=g(k) \tag{1}
\end{align*}
$$

Thus, since $f^{\prime}\left(k^{*}\right)=\frac{1}{\beta} \Rightarrow k^{*}=g\left(k^{*}\right)$ as desired. But we already showed that $\exists$ ! positive stationary point so that $k \neq g(k)$ for $k \neq k^{*}, k>0$. Thus

$$
\left[f^{\prime}(k)-\frac{1}{\beta}\right]\left[k-g^{*}(k)\right]<0
$$

if $k \neq k^{*}$.

1. If $k<k^{*} \Rightarrow f^{\prime}(k)>\frac{1}{\beta} \Rightarrow\left[f^{\prime}(k)-\frac{1}{\beta}\right]>0 \Rightarrow\left(k-g^{*}(k)\right)<0 \Rightarrow$ $k<g^{*}(k)$, and since $g$ is monotone, $k<k^{*} \Rightarrow k<g(k)<g\left(k^{*}\right)=k$, $g(k) \in\left(k, k^{*}\right)$.
2. If $k>k^{*} \Rightarrow f^{\prime}(k)<\frac{1}{\beta} \Rightarrow\left[f^{\prime}(k)-\frac{1}{\beta}\right]<0 \Rightarrow\left(k-g^{*}(k)\right)>0 \Rightarrow$ $k>g^{*}(k)$, and since $g$ is monotone $k>k^{*}, k>g(k)>g\left(k^{*}\right)=k^{*}$, $g(k) \in\left(k^{*}, k\right)$.

## [INSERT PICTURE HERE]

Proposition. In the growth model, there are 2 steady states $k=0, k=k^{*}$ $\left(f\left(k^{*}\right)=\frac{1}{\beta}\right)$. If $k_{0}>0, k_{0}<k^{*}, k_{t+1}^{*}>k_{t}^{*} \forall t$ and $k_{t}^{*} \rightarrow k^{*}$. If $k^{*}<k_{0}<$ $\bar{k} \ldots . . k_{t+1}^{*}<k_{t}^{*}$ and $k_{t}^{*} \rightarrow k^{*}$.
[INSERT PICTURE HERE]
Does it always work this nice? NO!

Theorem 6.1 (Boldrin \& Montrucchio) Let $X \subset R$ be compact, $g: X \rightarrow$ $X, C^{2}$. Then $\exists F, \beta$, and $\Gamma$ such that $g^{*}=g($ and $\Gamma(x) \equiv X)$.

