



# The nature of dynamic optimization

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# Dynamic optimization problem

- Optimization is a predominant theme in economic analysis.
- Useful as they are, such tools are applicable only to static optimization problems
- The solution sought in such problems usually consists of a single optimal magnitude for every choice variable.
- In contrast, a dynamic optimization problem poses the question of what is the optimal magnitude of a choice variable in each period of time within the planning period (discrete-time case) or at each point of time in a given time interval, say  $[0, T]$  (continuous-time case).

# Dynamic optimization problem

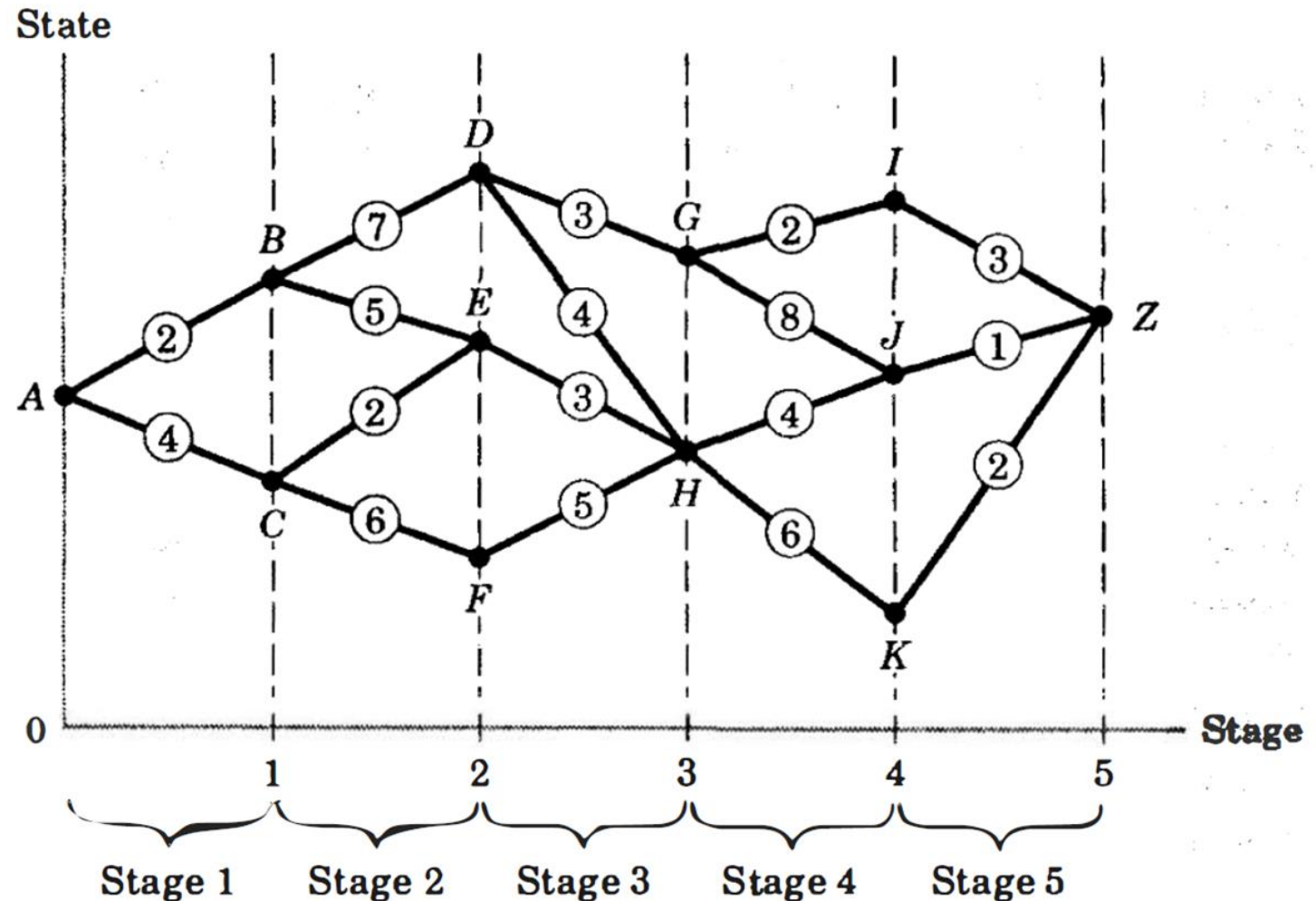
- Although dynamic optimization is mostly couched in terms of a sequence of time, it is also possible to envisage the planning horizon as a sequence of stages in an economic process.
- In that case, dynamic optimization can be viewed as a problem of multistage decision making. The distinguishing feature, however, remains the fact that the optimal solution would involve more than one single value for the choice variable.
- Suppose that a firm engages in transforming a certain substance from an initial state A (raw material state) into a terminal state Z (finished product state) through a five-stage production process.
- In every stage, the firm faces the problem of choosing among several possible alternative subprocesses, each entailing a specific cost. The question is: How should the firm select the sequence of subprocesses through the five stages in order to minimize the total cost?

# Figure 1 - Cost minimization

In Figure 1, we illustrate such a problem by plotting the stages horizontally and the states vertically.

The initial state A is shown by the leftmost point (at the beginning of state 1); the terminal state Z is shown by the rightmost point (at the end of stage 5).

The other points B, C, . . . , K show the various intermediate states into which the substance may be transformed during the process.



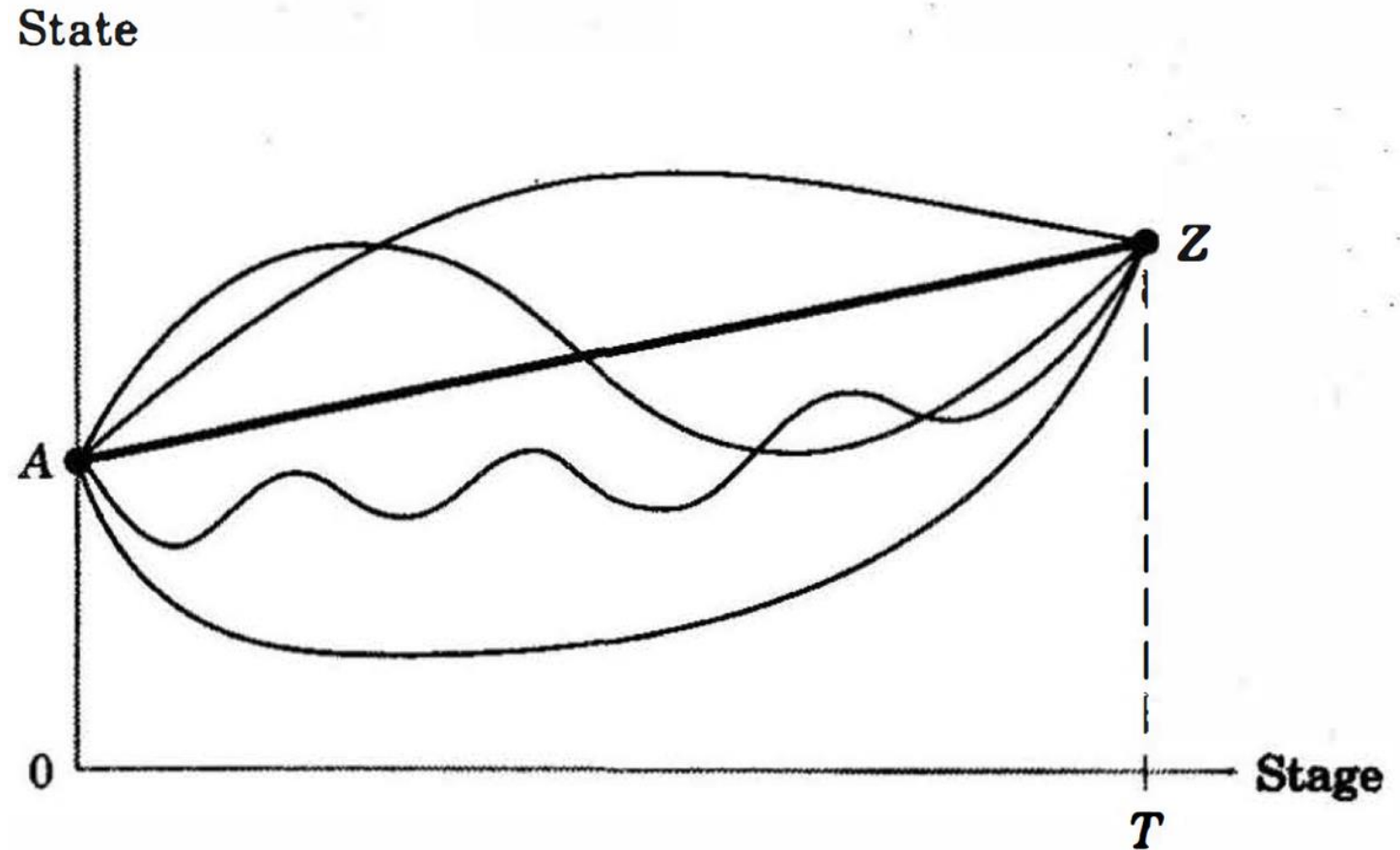
# Cost minimization problem

- Our problem is to choose a connected sequence of arcs going from left to right, starting at A and terminating at Z, such that the sum of the values of the component arcs is minimized. Such a sequence of arcs will constitute an optimal path.
- A myopic, one-stage-at-a-time optimization procedure will not in general yield the optimal path. For example, a myopic decision maker would have chosen arc AB over arc AC in the first stage, because the former involves only half the cost of the latter; yet, over the span of five stages, the more costly first-stage arc AC should be selected instead.
- The example in Fig. 1 is simple enough so that a solution may be found by enumerating all the admissible paths from A to Z and picking the one with the least total arc values. For more complicated problems, however, a systematic method of attack is needed.

## Figure 2 – The continuous variable version

In Figure 2, each possible path is now seen to travel through an infinite number of stages in the interval  $[0, T]$ . There is also an infinite number of states on each path, each state being the result of a particular choice made in a specific stage.

For concreteness, let us visualize Fig. 1.2 to be a map of an open terrain, with the stage variable representing the longitude, and the state variable representing the latitude. Our assigned task is to transport a load of cargo from location  $A$  to location  $Z$  at minimum cost by selecting an appropriate travel path.



## The continuous variable version

- For most of the problems discussed in the following, the stage variable will represent time; then the curves in Fig. 2 will depict time paths.
- As a concrete example, consider a firm with an initial capital stock equal to  $A$  at time 0, and a predetermined target capital stock equal to  $Z$  at time  $T$ .
- Each investment plan implies a specific capital path and entails a specific potential profit for the firm. In this case, we can interpret the curves in Fig. 2 as possible capital paths and their path values as the corresponding profits.
- The problem of the firm is to identify the investment plan, hence the capital path-that yields the maximum potential profit.

# The basic elements

- a simple type of dynamic optimization problem would contain the following basic ingredients:
  1. a given initial point and a given terminal point;
  2. a set of admissible paths from the initial point to the terminal point;
  3. a set of path values serving as performance indices (cost, profit, etc.) associated with the various paths; and
  4. a specified objective-either to maximize or to minimize the path value or performance index by choosing the optimal path.



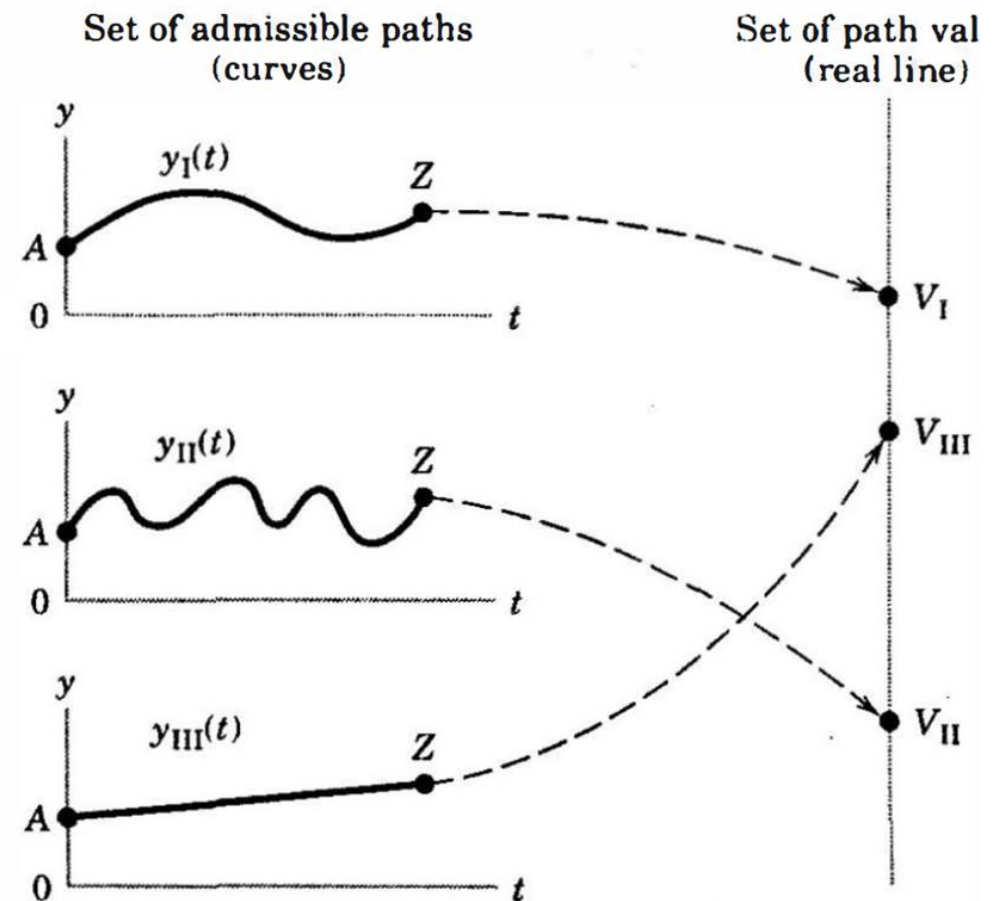
# The concept of a functional

- A functional is a mapping from paths (curves) to real numbers (performance indices). Let us think of the paths in question as time paths, and denote them by  $y_I(t)$ ,  $y_{II}(t)$ , and so on.
- Then the mapping is as shown in Fig. 3, where  $V_I$ ,  $V_{II}$  represent the associated path values. The general notation for the mapping should therefore be  $V[y(t)]$ . In the symbol  $V[y(t)]$  the  $y(t)$  component comes as an integral unit - to indicate time paths - and therefore we should not take  $V$  to be a function of  $t$ . Instead,  $V$  should be understood to be a function of " $y(t)$ ".
- This type of mapping is given a distinct name: functional.
- To further avoid confusion, many writers omit the " $(t)$ " part of the symbol and write the functional as  $V[y]$ .

# Example of a functional

- When the symbol  $y$  is used to indicate a certain state, it is suffixed, and appears as, say,  $y(0)$  for the initial state or  $y(T)$  for the terminal state.
- In contrast, in the path connotation, the  $t$  in  $y(t)$  is not assigned a specific value.
- When we want to stress the specific time interval involved in a path or a segment thereof, we shall use the notation  $y[0, T]$  or  $y[0, \tau]$ .
- The optimal time path is then denoted by  $y^*(t)$ , or the  $y^*$  path.

Figure 3 – Examples of functional



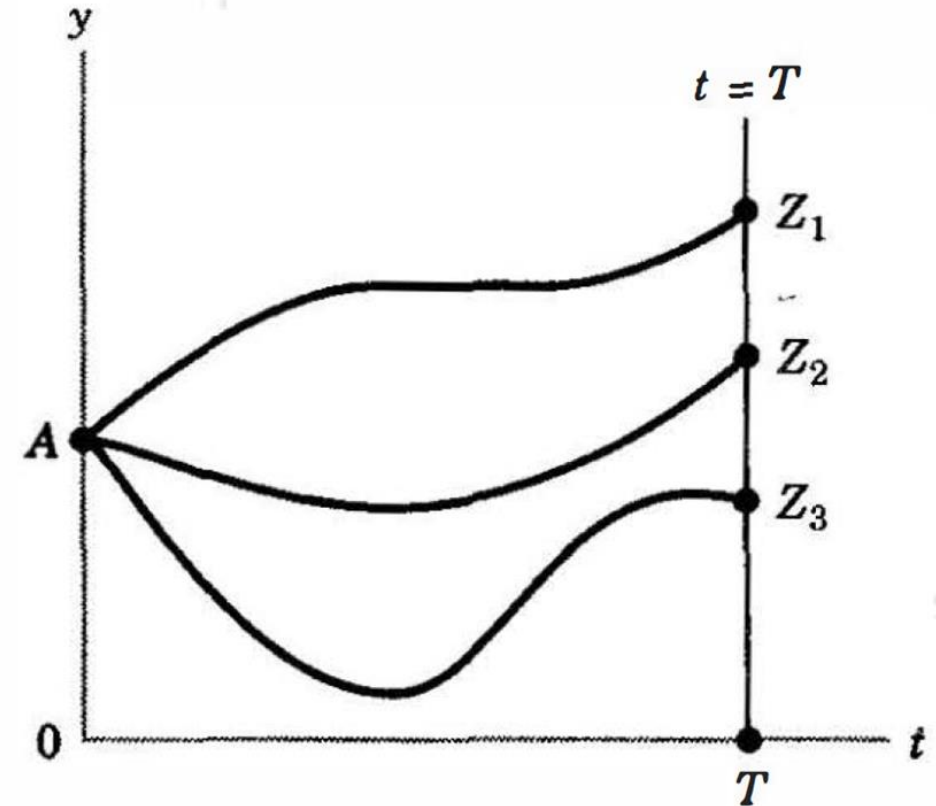
# VARIABLE ENDPOINTS AND TRANSVERSALITY CONDITIONS

- In the usual problem, the optimizing plan must start from some specific initial position, say, the current position.
- The terminal position, on the other hand, may very well turn out to be a flexible matter, with no inherent need for it to be predetermined.
- We may, for instance, face only a fixed terminal time, but have complete freedom to choose the terminal state.
- On the other hand, we may also be assigned a rigidly specified terminal state, but are free to select the terminal time.
- In such a case, the terminal point becomes a part of the optimal choice.
- We shall take the stage variable to be continuous time.
- We shall also retain the symbols  $0$  and  $T$  for the initial time and terminal time.
- The symbols  $A$  and  $Z$  for the initial and terminal states.

# Vertical terminal-line problem

- As the first type of variable terminal point, we may be given a fixed terminal time  $T$ , but a free terminal state.
- In Fig. 4a, while the planning horizon is fixed at time  $T$ , any point on the vertical line  $t = T$  is acceptable as a terminal point, such as  $Z_1$ ,  $Z_2$ , and  $Z_3$ .
- This type of problem is commonly referred to as a fixed-time-horizon problem, or fixed-time problem.
- Alternatively, we may refer to the fixed-time problem as the vertical-terminal-line problem.

Figure 4a – Vertical terminal-line problem.



# Horizontal terminal-line problem.

- The second type of variable terminal point occurs when the terminal state  $Z$  is stipulated, but the terminal time is free.
- In Fig. 4b, the horizontal line  $y = Z$  constitutes the set of admissible terminal points. Each of these, depending on the path chosen, may be associated with a different terminal time, as exemplified by  $T_1$ ,  $T_2$ , and  $T_3$ .
- This type of problem is commonly referred to as a fixed-endpoint problem.
- Alternatively, we may refer to the fixed-endpoint problem as the horizontal-terminal-line problem.

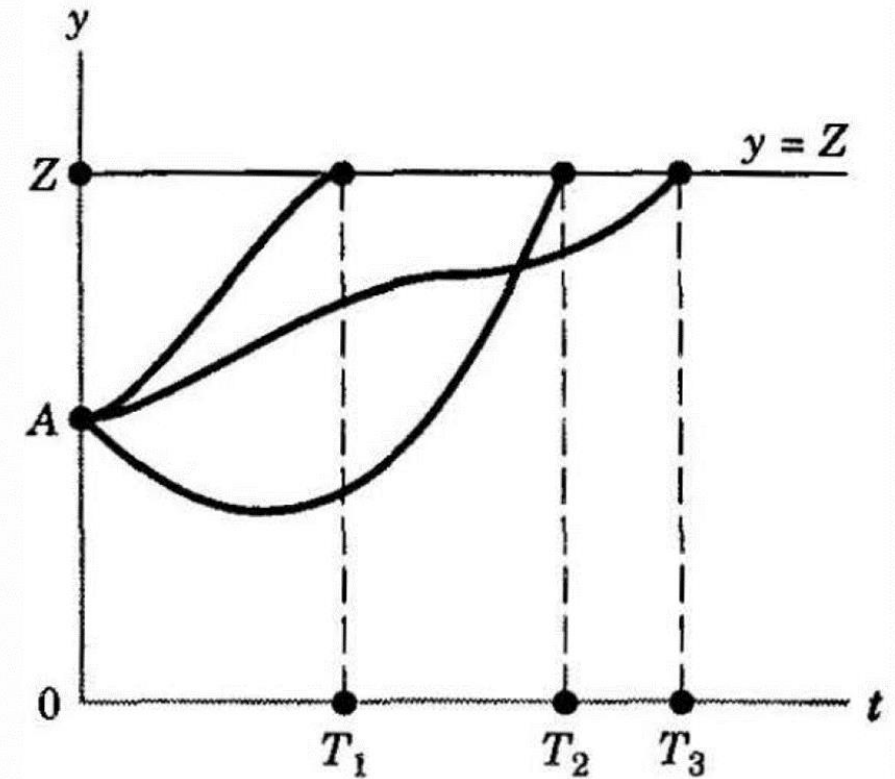
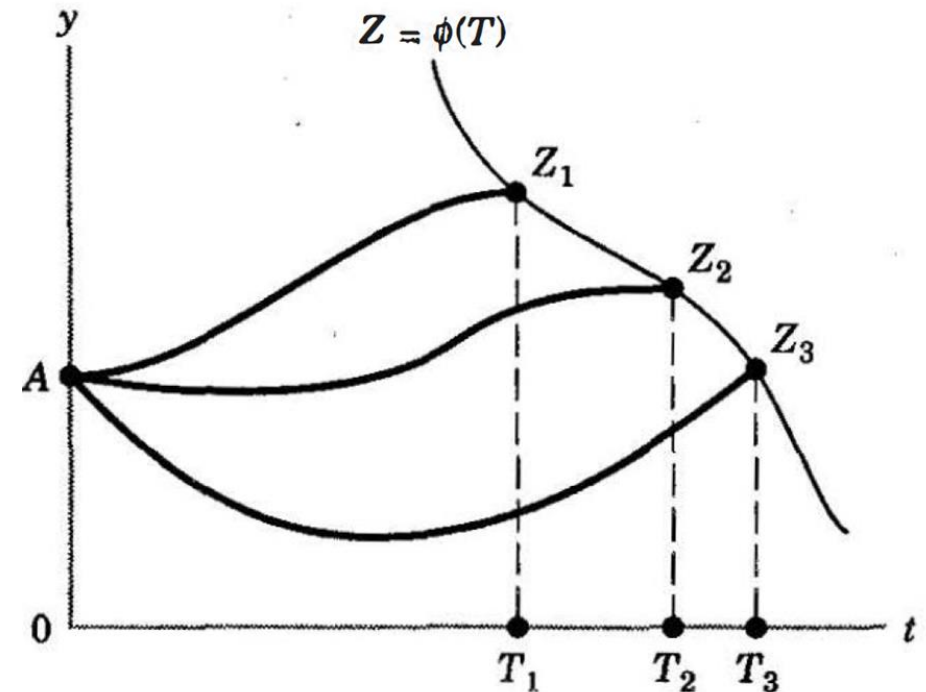


Figure 4b – Horizontal terminal-line problem.

# Terminal curve problem

- In the third type of variable terminal point problem, neither the terminal time  $T$  nor the terminal state  $Z$  is individually preset, but the two are tied together via a constraint equation of the form  $Z = \phi(T)$ .
- In Fig. 4c, such an equation plots as a terminal curve (or, in higher dimension, a terminal surface) that associates a particular terminal time (say,  $T_1$ ) with a corresponding terminal state (say,  $Z_1$ ).
- Even though the problem leaves both  $T$  and  $Z$  flexible, the planner actually has only one degree of freedom in the choice of the terminal point.
- This type of problem is commonly referred to as terminal-curve (or terminal-surface) problem .

Figure 4c – Terminal curve problem



# Transversality Condition

- The common feature of variable-terminal-point problems is that the planner has one more degree of freedom than in the fixed-terminal-point case.
- But this fact automatically implies that, in deriving the optimal solution, an extra condition is needed to pinpoint the exact path chosen.
- Compare the boundary conditions for the optimal path in the fixed-versus the variable-terminal-point cases. In the former, the optimal path must satisfy the boundary (initial and terminal) conditions:  
(1)  $y(0) = A$  and  $y(T) = Z$ ; ( $T$ ,  $A$ , and  $Z$  all given)

# Transversality Condition

- In the variable-terminal-point case, the initial condition  $y(0) = A$  still applies by assumption. But since  $T$  and  $Z$  are now variable, the terminal condition  $y(T) = Z$  is no longer capable of pinpointing the optimal path for us.
- What is needed, therefore, is a terminal condition that can conclusively distinguish the optimal path from the other admissible paths.
- Such a condition is referred to as a transversality condition, because it normally appears as a description of how the optimal path crosses the terminal line or the terminal curve.



# The integral form of functional

- Figure 1 suggests that three pieces of information are needed for *arc* identification:
  1. the starting stage (time);
  2. the starting state;
  3. the direction in which the arc proceeds.
- With continuous time, since each *arc* is infinitesimal in length, these three items are represented by, respectively:
  1.  $t$ ;
  2.  $y(t)$ ;
  3.  $y'(t) = \frac{dy}{dt}$
- For instance, on a given path  $y_I$ , the *arc* associated with a specific point of time  $t_0$  is characterized by a unique value  $y_I(t_0)$  and a unique slope  $y'_I(t_0)$ . If there exists some function,  $F$ , that assigns a *arc* values to *arcs*, then the value of the said *arc* can be written as:  
(2)  $F[t_0, y_I(t_0), y'_I(t_0)]$

## The integral form of functional

- It follows that the general expression for *arc* values is  $F[t, y(t), y'(t)]$ , and the path-value functional-the sum of arc values-can generally be written as the definite integral:

$$(3) \quad V[y] = \int_0^T F[t, y(t), y'(t)] dt$$

- The symbol  $V[y]$  emphasizes that it is the variation in the  $y$  path ( $y_I$  versus  $y_{II}$ ) that alters the magnitude of  $V$ . Each different  $y$  path consists of a different set of *arcs* in the time interval  $[0, T]$ , which, through the *arc-value-assigning* function  $F$ , takes a different set of *arc* values.
- The definite integral sums those *arc* values on each  $y$  path into a path value.

## The integral form of functional

- If there are two state variables,  $y$  and  $z$ , in the problem, the *arc* values on both the  $y$  and  $z$  paths must be taken into account.
- The objective functional should then appear as:

$$(4) \quad V[y, z] = \int_0^T F[t, y(t), z(t), y'(t), z'(t)] dt$$

- A problem with an objective functional in the form of (3) or (4) constitutes the standard problem.
- For simplicity, we shall often suppress the time argument ( $t$ ) for the state variables and write the integrand function more concisely as  $F(t, y, y')$  or  $F(t, y, z, y', z')$ .

## A macroeconomic example

- Let the social welfare of an economy at any time be measured by the utility from consumption,  $U = U(C)$ .
- Consumption is by definition that portion of output not saved (and not invested). If we adopt the production function  $Q = Q(K, L)$ , and assume away depreciation, we can then write:

$$(5) \quad C = Q(K, L) - I = Q(K, L) - K'$$

- where  $K' \equiv I$  denotes net investment. This implies that the utility function can be rewritten as:

$$(6) \quad U = U[Q(K, L) - K']$$

## A macroeconomic example

- If the societal goal is to maximize the sum of utility over a period  $[0, T]$ , then its objective functional takes the form:

$$(7) \quad V[y, z] = \int_0^T U[Q(K, L) - K'] dt$$

- This exemplifies the functional in (4), where the two state variables  $y$  and  $z$  refer in the present example to  $K$  and  $L$ , respectively.
- Note that while the integrand function of this example does contain both  $K$  and  $K'$  as arguments, the  $L$  variable appears only in its natural form unaccompanied by  $K'$ . Moreover, the  $t$  argument is absent from the  $F$  function, too.

# The Calculus of Variations

- The usual problem can be represented by the following general formulation:

$$\begin{array}{ll} \text{Maximize or minimize} & V[y] = \int_0^T F[t, y(t), y'(t)] dt \\ (8) \text{ Subject to} & y(0) = A \quad (A \text{ given}) \\ \text{and} & y(T) = Z \quad (T \text{ and } Z \text{ given}) \end{array}$$

- Such a problem, with an integral functional in a single state variable, with completely specified initial and terminal points, and with no constraints, is known as the fundamental problem (or simplest problem) of calculus of variations.

# The Calculus of Variations

- In order to make such problems meaningful, it is necessary that the functional be integrable (i.e., the integral must be convergent).
- We shall assume this condition is met whenever we write an integral of the general form, as in (8).
- Furthermore, we shall assume that all the functions that appear in the problem are continuous and continuously differentiable.
- This assumption is needed because the basic methodology underlying the calculus of variations closely parallels that of the classical differential calculus.
- The main difference is that, instead of dealing with the differential  $dx$  that changes the value of  $y = f(x)$ , we will now deal with the "variation" of an entire curve  $y(t)$  that affects the value of the functional  $V[y]$ .