

# GRAPH THEORY ANALITICS OF SD FLOW DIAGRAM

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The article advances and discusses a theory that using digraph theory to analyse SD flow diagram. First, on the basis of the concept strongly connected digraph generation out-tree and extreme out-tree, we prove two existence generation out-tree theorem and three relative propositions of flow diagrams generation out-tree. The method to define the extreme out-tree and feedback loop set are obtained in complicated SD flow diagrams, also the general laws are advanced that each variable produces corresponding increment that in the feedback loop and extreme out-tree and at the different simulation moment, one increment  $\Delta x$  is given to certain variable  $x$ , All these conclusions are useful to the debugging and the result-analysis of SD model and are also useful to analyse the effects of controll variable in system.

## I Basic Concepts

Before expounding the problems, we have to cite the following basic definitions.

Definition 1.1 A digraph is defined to be a pair  $(V, X)$ , where (1)  $V$  is a non-empty finite set  $V=V(D)$ , the elements of  $V$  is called vertices, and (2)  $X$  is a set  $X=X(D)$  of ordered pair of different elements, the elements of  $X$  is called arcs.

In accordance with the definition of digraph, the flow diagram in SD is a digraph  $D=(V, X)$ , its sets of vertices are

$$V = \{ L_i | L_i \text{ is level variable, } i=1, 2, \dots, m \} \cup \\ \{ R_i | R_i \text{ is rate variable, } i=1, 2, \dots, n \} \cup \\ \{ A_i | A_i \text{ is auxiliary variable, } i=1, 2, \dots, k \} \cup \\ \{ S_i | S_i \text{ is supplementary variable, } i=1, 2, \dots, g \} \cup \\ \{ a_i | a_i \text{ is constant, } i=1, 2, \dots, q \}$$

and its set of arcs are

$$X = \{ x_i | x_i \text{ is substance channel between two variables, } i=1, 2, \dots, \\ e \} \cup \{ y_i | y_i \text{ is information channel between two variables, } i=1, 2, \dots, \\ h \}$$

Let's take SD flow diagram as digraph, the variable symbol in SD flow diagram is called variable point by a joint name, and substance and information channel between two variables are called arc by a joint name.

Definitions about in-degree and out-degree of variable point.

Definition 1.2 For the flow diagram  $D=(V, X)$ ,  $V$  is a set of variable points and  $X$  is a set of arcs,  $x \in X$ ,  $u, v \in V$ ,  $x=(u, v)$ , in which  $u, v$  are initial endpoint and terminal endpoint of arc  $x$ . We may call them endpoint by a joint name. The number of arc which  $u$  is taken as its initial endpoint is called out-degree of  $u$ , and it is denoted  $odDu$  or  $Odu$ . Also, the number of arc which  $u$  is taken as its terminal endpoint is called in-degree of  $u$ , and it is denoted  $idDu$  or  $idu$ .

Definitions about directed walk, path, circuit(loop) etc.

Definition 1.3 For the flow diagram  $D=(V, X)$ , let's suppose there are alternate sequence of variable point and arc  $v_0, x_1, v_1, x_2, v_2$

... $x_n v_n$ , among which  $v_0, v_1, \dots, v_n$  is variable point and  $x_1, x_2, \dots, x_n$  is arc.

- a. For any  $x_i$  in sequence,  $v_{i-1}, v_i$  are taken as the endpoints, then this sequence is called directed semiwalk with length  $n$ , and variable points of the sequence are different, it is semipath.
- b. For any  $x_i$  in sequence,  $v_{i-1}$  is taken as the initial endpoint, also  $v_i$  is taken as the terminal endpoint, then this sequence is called directed walk with length  $n$ , and if variable points are different in this sequence, it is called directed path.
- c. Directed closed-walk is called directed loop.
- d. If sequence is directed path, then  $v_0$  can reach  $v_n$ .

According to definition 1.3, the feedback loop in SD Flow Diagram is directed loop.

Definition about connectivity.

Definition 1.4 In flow diagram  $D$ ,  $u, v$  are any two variable points. If there is a semipath to join them,  $D$  is weakly connected, if there is at least a variable point can be reached by another, then  $D$  is unilateral connected; if they can be reached with each other,  $D$  is strongly connected.

Definition about out-tree.

In the following we call any parts of flow diagram  $D$  subgraph and  $D$  is the subgraph of itself.

Definition 1.5 If there is a variable point  $v$  in a subgraph of flow diagram  $D$ , and for any variable point of  $D$ , there exists one and only one directed path which is from  $v$  to  $u$  (for  $u=v$ , we consider that there exists only one path that its length is zero which is from  $v$  to  $u$ ), then this subgraph is a out-tree,  $v$  is the root of out-tree.

Definition about spanning concept.

Definition 1.6 The directed semiwalk that include all variable points of flow diagram  $D$  is called spanning directed semiwalk. By analogy, directed walk, directed semipath, directed path, feedback loop, out-tree are called respectively spanning directed walk, spanning directed semipath, spanning directed path, spanning feedback loop, spanning out-tree.

We don't consider reference vertex (constant vertex  $a_i$ ) of flow diagram at following discuss, because the property of constant  $a_i$  in the problem we discuss can be realized by its corresponding variable point of level, rate or auxiliary variable. But in research we can make the explanation more simple without considering constant vertex  $a_i$ .

Example 1 Fig. 1.1 shows the flow diagram of SD World Model II and the spanning out-tree of this flow diagram is shown by Fig 1.2.

The root  $v$  of out-tree in the flow diagram (Birth Rate shown by Fig 1.2) can controll each variable of out-tree, with strongly practical significance. When one increment  $\Delta v$  is given a variable  $v$ , each variable produce corresponding new increment at the different simulation moment. Thus variable in practical system is found out, the crucial control variable is out. For example, in the World Model II, birth rate is a root of one of spanning out-tree, birth rate may controll each variable, moreover, we may known how to controll other variables by out-tree.

But not every flow diagram exists spanning out-tree, for example, SD traffic flow diagram in Fig 1.3 doesn't exist spanning out-



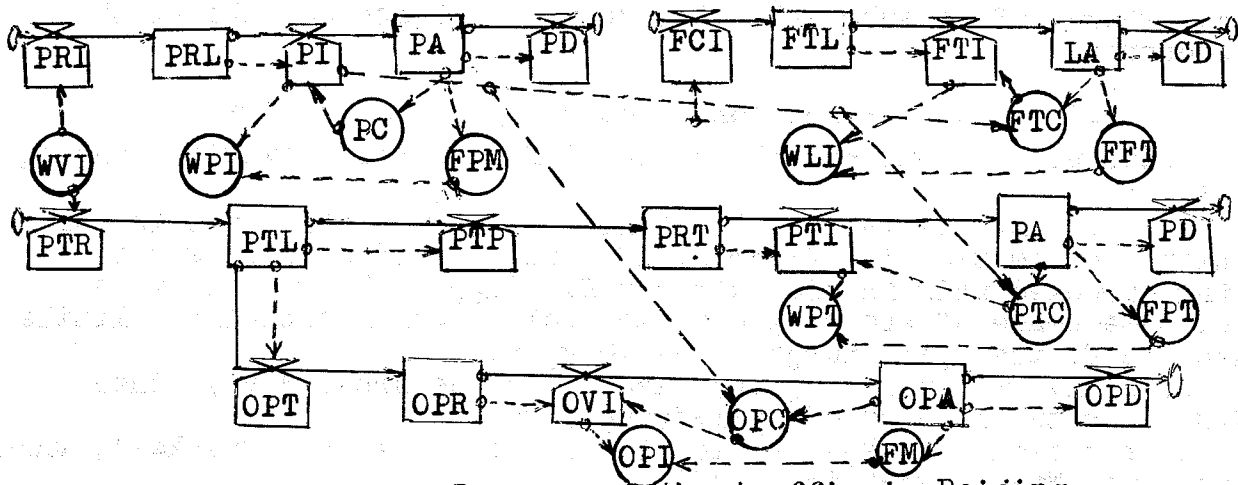


Fig 1.3 SD Flow Diagram of the traffic in Beijing

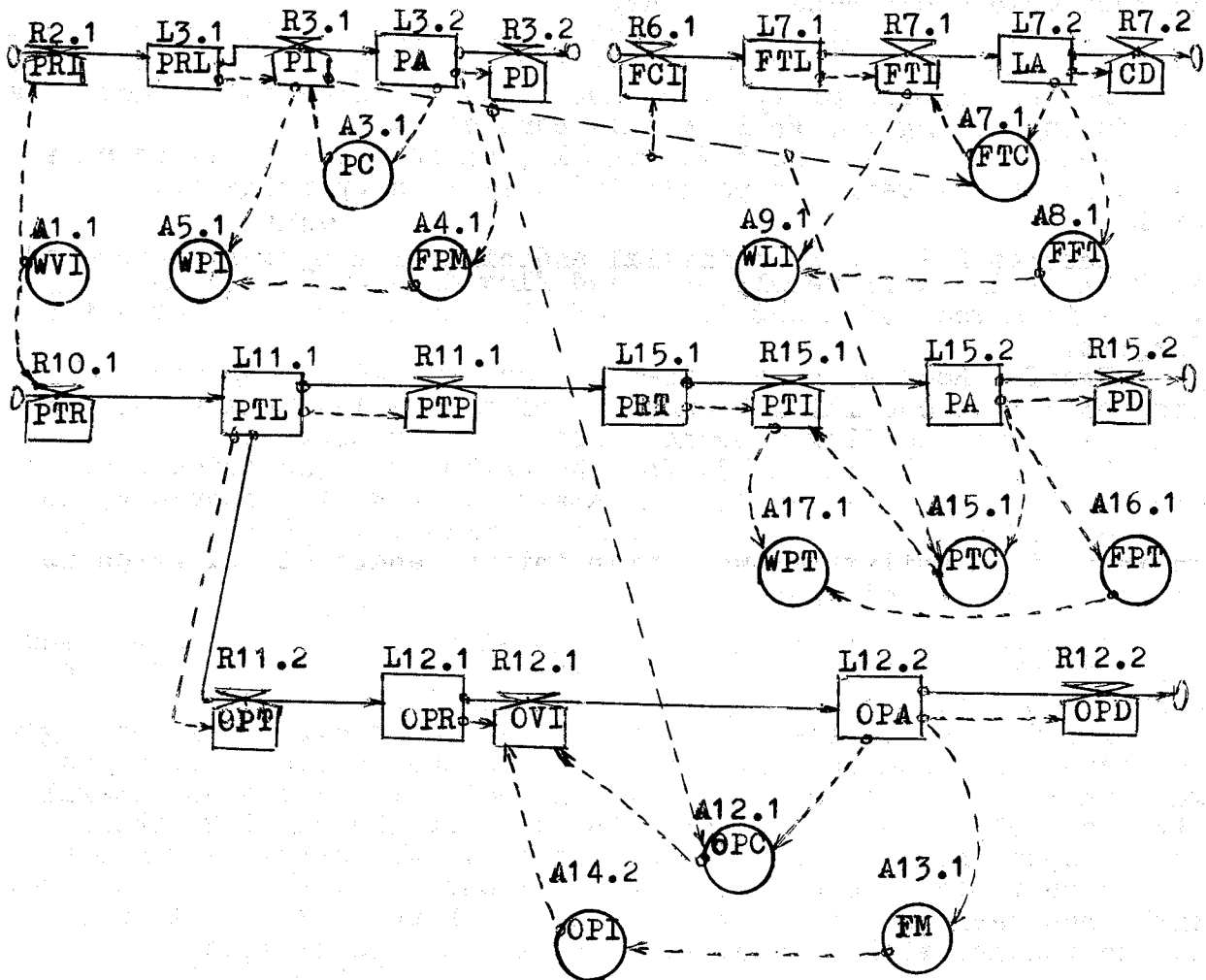


Fig 3.1

Note: SD Flow Diagram of the traffic in Beijing includes four subgraphes, they are path, freight transport, passenger traffic and other traffic subgraph. For details, please see the fifth reference.

## II The existing condition of spanning out-tree

**Theorem 2.1** Unilateral connected flow diagram exists spanning out-tree.

**Proof** By the theorem 5.6.2 in [1], a flow diagram  $D$  is unilateral connected flow diagram, if, and only if, there is a spanning directed walk in flow diagram  $D$ . Suppose  $W = v_1, v_2, \dots, v_n$  is point-sequence of spanning directed walk  $W_1$  which contains a little arcs in  $D$ , then  $j \neq 1, idv_j \geq 1, j \neq n, Odv_j \geq 1$ .

a. If  $idv_1 > 0$ , for  $(v_j, v_1)$ , leave out the arc  $(v_j, v_1)$ , then  $W_1$  becomes subgraph  $W_2$  of satisfying  $idv_1 = 0$ .

b. For each  $(v_1, v_j)$ , by leaving out each arc  $(v_k, v_j) (k \neq 1)$ , then  $W_2$  becomes  $W_3$  of  $idv_j = 1$  in  $(v_1, v_j)$ .

c. For each  $(v_j, v_k)$  satisfying each  $(v_1, v_j)$  in  $W_3$ , by the way as that in b that leave out the arc  $(v_t, v_k) (k \neq j)$ , then  $W_3$  becomes  $W_4$  that make every  $v_k$  satisfy  $idv_k = 1$ .

By analogy, subgraph  $W_n$  is obtained. The vertice sets of variable points in  $W_n$  is  $\{v_0, v_1, \dots, v_n\}$ , where  $idv_0 = 0, idv_j = 1 (j = 2, 3, \dots, n)$ .

Because in-arc of  $v_j$  which hasn't been considered are not taken out during defing  $W_n$ ,  $W_n$  is weakly connected.

According to theorem 3.4.2 in [1],  $W_n$  is a out-tree, because it includes all variable points in  $D$ , it is a spanning out-tree of  $D$ .

Q.E.D

**Theorem 2.2**  $v_1$  is a initial endpoint of a spanning directed walk  $W_n$  of the unilateral connected flow diagram  $D$ , if, and only if,  $v_1$  is a root of a out-tree  $T$  of the unilateral connected flow diagram.

**Proof** Root  $v_1$  of out-tree  $W_n$  constructed during proving theorem 2.1 is one initial endpoint of a directed walk  $W$  of unilateral connected flow diagram. Necessity is tenable.

By theorem 5.6.2 in [1], for the unilateral connected flow diagram  $D$ ,  $v_2, v_3, \dots, v_n$  exists unilateral walk  $W_{n-1}$ , because  $v_1$  is the root of out-tree  $T$ ,  $v_1$  may connect with any  $v_j (j = 2, 3, \dots, n)$ . So there is a unilateral walk with initial endpoint  $v_1$ , which is consisted by  $v_1$  and  $W_{n-1}$ .

Q.E.D

**Theorem 2.3** A flow diagram  $D$  is strongly connected, if, and only if, there exists spanning out-tree in it and each variable point is the root of certain spanning out-tree  $T$ .

**Proof** By theorem 5.6.2 in [1], a flow diagram  $D$  is strongly connected, if, and only if, there is a spanning closed directed walk in it. Therefore, each variable point  $v$  exists unilateral directed walk with initial endpoint  $v_j$ . By theorem 1.2, there exists spanning out-tree with a root  $v_j$ . Necessity is tenable.

Vice versa, because the root of spanning out-tree can connect with each variable point of out-tree, each variable point in  $D$  can be reached with each other. Sufficiency is tenable.

Q.E.D

Strongly connected flow diagram possesses very good property.

Proposition 2.1 In the strongly connected flow diagram, when one increment is given to any variable point, other variable points will produce corresponding increment.

For many flow diagrams, when their exogenous variable points and supplementary variable points are taken out, they can possess strong connectivity. For example, the World Model II is just like this. But it is very troublesome to judge the strong connectivity of a complicated flow diagram with the definition of strongly connected. The following two propositions can help us do it more simply.

Proposition 2.2 A feedback loop is a branch of strongly connected.

Proposition 2.3 Suppose  $D_i = (V(D_i), X(D_i)) (i=1,2)$  are two branches of strongly connected of flow diagram  $D = (V(D), X(D))$ , when one of the following conditions is satisfied, the derived subgraph  $D_3 = (V(D_3), X(D_3))$  of  $V(D_1) \cup V(D_2)$  is the branch of strongly connected.

1.  $V(D_1) \cap V(D_2) \neq \emptyset$ .
2. There exists arc  $x_1$ , whose initial endpoint is in  $V(D_1)$  and terminal endpoint is in  $V(D_2)$ , at the same time, there also exists arc  $x_2$ , whose initial endpoint is in  $V(D_2)$ , and terminal endpoint is in  $V(D_1)$ .

So-called derived subgraph  $D_3$  of  $V(D_1) \cup V(D_2)$ ,  $D_3$  should satisfy  $V(D_3) = V(D_1) \cup V(D_2)$  and  $u, v \in V(D_3)$ , if  $(u, v) \in X(D)$ , then  $(u, v) \in X(D_3)$ .

We can use definition of strongly connected to prove the above proposition correct directly. In accordance with proposition 2.3, it is rather easy to judge that the World Model II is strongly connected.

III. The method to define the extreme out-tree of flow diagram

In this section, we discuss about the extreme out-tree of flow diagram.

Definition 3.1 In flow diagram  $D = (V(D), X(D))$ , if for any out-tree  $T_i = (V(T_i), X(T_i))$  of  $D$ , its out-tree  $T = (V(T), X(T))$  unsatisfies  $V(T) \subset V(T_i)$ , then out-tree  $T$  is the extreme out-tree of  $D$ .

Not every flow diagram has spanning out-tree, but any one of flow diagram has extreme out-tree.

Next we first give the method to draw a diagram of extreme out-tree of branch of strongly connected. Here is a definition.

Definition 3.2  $D_1 = (V(D_1), X(D_1))$  is the subgraph of  $D = (V(D), X(D))$ . If  $D$  is strongly connected, and for any variable point  $V \in (V(D) - V(D_1))$ , derived subgraph of  $V(D) \cup \{V\}$  doesn't possess strong connectivity, then  $D_1$  is the branch of extreme strongly connected of  $D$ .

A. The method to define spanning out-tree of branch of extreme strongly connected.

a. Choose any point  $V$  in branch of extreme strongly connected and leave out all in-arcs of point  $V$ .

b. Find out all  $U_i$  satisfied  $(V, U_i)$  and leave out all in-arcs not satisfied  $(V, U_i)$  from each  $U_i$  respectively, then define the second hierarchy variable point of out-tree ( $V$  is the first hierarchy variable point.)

c. Handle each variable point at the second hierarchy respectively according to "b", then we will get the third hierarchy variable point. By analogy, we can get the spanning out-tree  $T$ .

The exactitude of this defining method arises from the proof of theorem 2.1.

According to this method, let's consider the flow diagram of

the World Model II shown by Fig 1.1. We can take Birth Rate as the root of out-tree, then we may get the spanning out-tree shown by Fig 1.2.

B. The method to define extreme out-tree of flow diagram.

a. To define the branch of extreme strongly connected of flow diagram  $D$  with the definition of strongly connected and proposition 2.2, 2.3, and to mark different branches of strongly connected by the method that give numbers to each variable point. The way is suppose  $D_i = (V(D_i), X(D_i))$  is the code number  $i$  branch of extreme strongly connected, then level, rate, and auxiliary variable point in  $D$  are  $L_{ij}$ ,  $R_{ik}$ ,  $A_{it}$  respectively,  $j, k, t$  are  $Q$  numbers of level, rate and auxiliary variable in  $D$  respectively.

b. Suppose  $D_1, D_2, \dots, D_n$  are  $n$  branches of extreme strongly connected, and draw connected arc of branch of each extreme strongly connected, only draw one for the same direction arc. At the same time, suppose  $D_1, D_2, \dots, D_n$  are variable points, then one no loop digraph  $G$  is got.

c. Find out the extreme unilateral digraph of digraph  $G$ . If digraph  $G$  has  $G_1, G_2, \dots, G_k$  extreme unilateral digraph, then flow diagram  $D$  exists  $K$  extreme out-tree.

d. Draw the corresponding spanning out-tree of each digraph  $G_i$  by the way that draw spanning out-tree of branch of extreme strongly connected. Each spanning out-tree of this is the extreme out-tree of  $D$ .

Example 2. Draw extreme out-tree of traffic flow diagram in Fig 1.3.

P.S a. To define the branch of extreme strongly connected by the definition and proposition 2.2, 2.3 of strongly connected. Then give code numbers to each variable points. (Shown by Fig 3.1)

b. Suppose branch  $D_i$  of each extreme connected is variable point, and draw no loop digraph  $G$  as Fig 3.2 .

c. To draw the extreme unilateral digraph  $G_1, G_2, G_3$  of  $G$  as Fig 3.2 .

d. To draw the corresponding spanning out-tree of each  $G_i$ .

C. Property of extreme out-tree.

Proposition 3.1 Give one increment to any variable point  $u$  of extreme out-tree of flow diagram  $D$ , only the following two kinds of variable points will produce the corresponding increment in flow diagram.

a. the following variable points of  $u$

b. the preceding variable point  $v$  of  $u$ , this  $v$  is terminal end-point of arc whose initial endpoint is  $u$  or following variable point of  $u$ .

This property is useful to the debugging of SD model.

IV: The defining method of feedback loop of the finished flow diagram

The flow diagram is set up gradually. A complicated system model is always a complicated flow diagram. For example, the flow diagram of the World Model II is complicated, so it is rather troublesome to list all feedback loop of a complicated flow diagram, but for the quantitative analysis and qualitative analysis system, it's very important to find out the sets of feedback loop. So we advance the gradually-reduce method. First, here is a definition.

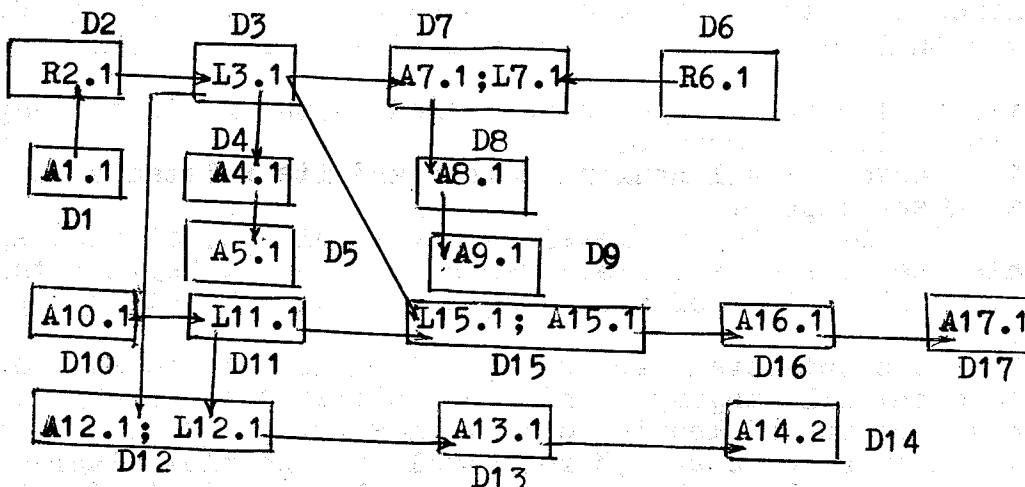


Fig 3.2 Strongly connected points

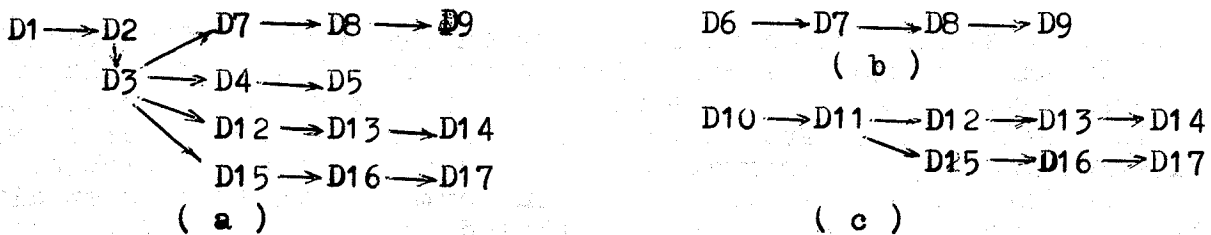


Fig 3.3 The branch of extreme unilateral connectivity

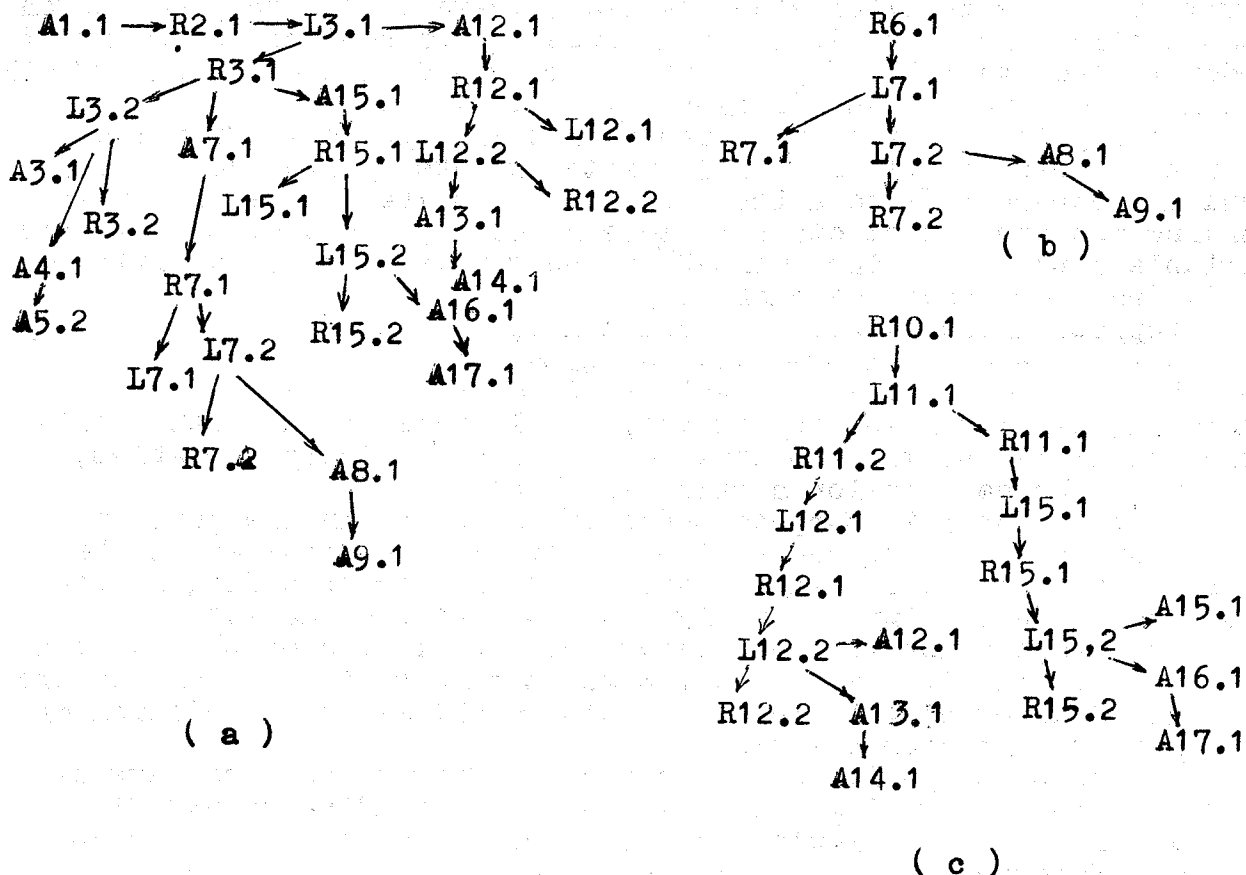


Fig 3.4 All extreme out-tree of connected flow diagram shown by Fig 3.1



Definition 4.1 In the flow diagram  $D=(V(D),X(D))$ , if  $u \in V(D)$  and satisfy with  $idu=0$  or  $Odu=0$ , then  $u$  is the hanging variable point of  $D$ .

The step of the gradually-reduce method in the feedback loop sets of finished flow diagram  $D$ .

Step 1. Leave out all hanging points and its related arcs of  $D$  to get the subgraph  $D_1$ .

Step 2. For  $D_1$ , take any level variable point  $L_i$  of subgraph  $D$  (it can also be rate or auxiliary variable point), begin with  $L_i$  find out all feedback loop of including  $L_i$  by the exhaustive way one by one.

Step 3. Leave out level variable point  $L_i$  and its related arcs, and then leave out all hanging points and related arcs which are produced in the course of leaving out, then subgraph  $D_2$  of  $D$  is got.

Step 4. Execute the step 2,3 repeatedly to the flow diagram  $D_2$ , and execute in cycles, then we may get all elements in feedback loop sets of finished flow diagram. (The example is omitted.)

#### V. General laws on $\Delta x$ increment producing corresponding variable

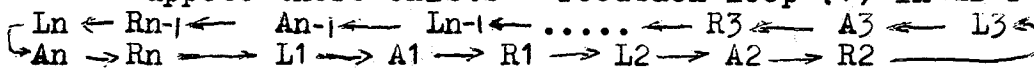
In this section, we will discuss the calculation formula and general laws on each variable produces corresponding increment that in the feedback loop and extreme out-tree and at the different simulation moment, one increment  $\Delta x$  is given to certain variable.

Definition 5.1 Variable  $y$  is in certain simulation step division, because there exists  $\Delta x$  of related variable  $x$ , and  $\Delta y = y(\text{now available value}) - y(\text{original value}) \neq 0$ , then the variable  $y$  produces a corresponding increment  $\Delta y$  of order 1. If from  $j_0$  simulation step division to  $j$  simulation step division, there exists the phenomenon that  $k$  simulation step division produced corresponding increment of order 1, then variable  $y$  produced  $k$  corresponding increment of order  $k$   $j$  simulation and is denoted by  $\Delta^{(k)}y$  ( $k=1,2,\dots$ ).

When  $y$  is multifactor variable of  $x_1, x_2, \dots, x_n$  and if from the simulation step division  $j_0$  to  $j$ , factor  $x_k$  makes  $y$  produce corresponding increment  $\Delta^{(k)}y$  and  $k$  isn't smaller than the orders of corresponding increment that other factors  $x_j$  make  $y$  produce, then we say variable  $y$  produce increment  $\Delta^{(k)}y$  to the simulation step division  $j$ .

##### A. Problems about feedback loop

Suppose there exists feedback loop (1) in SD F.D.



where  $L_i, A_i, R_i$  denote respectively level, auxiliary and rate variable and  $A_i$  may be the abbreviation of many auxiliary variables,  $R_i$  may be the combination  $n$  rate variables.

Proposition 5.1 Suppose there are  $L_i, A_i, R_i$  in the path of F.D.  $D$  and before them one variable  $x$  exists increment  $\Delta x$  at the  $j_0$  simulation division, then orders of their corresponding increments are same in simulation division  $j > j_0$  at each moment.

The proposition is true because of the provide of DYNAMO language in SD. That is, at the same simulation division  $j$ ,  $A_i$  and  $R_i$  are calculated after calculating  $L_i$ . This result is the foundation of that next two theorem are true.

We know by proposition 5.1 that only after we get the laws of  $L_i$ 's changing, we will get the laws of corresponding  $A_i$  and  $R_i$ .

Theorem 5.1 In simulation, with the condition without considering feedback effect and in  $R_n$  of feedback loop (1), we add increment with thus laws (shown by table 1) from  $j_0$  simulation division.

j	$j_0$	$j_0+DT$	$j_0+2DT$	$j_0+3DT$	...	LENGTH
Rn	Rn	Rn	Rn	Rn	...	Rn

where  $j_0$  is integer multiple of  $DT$ , then the orders of corresponding increment that each variable produce in the feedback loop (1) should satisfy the following formula,

For  $\Delta^{(k)} Li(i=1,2,\dots,n)$ ,

$$k = \begin{cases} 0 & j_0 \leq j \leq j_0 + (i-1)DT \\ \lfloor (j - j_0 - (i-1)DT) / DT \rfloor & j_0 + iDT < j \leq \text{LENGTH} \end{cases}$$

For  $\Delta^{(k)} Ri$ , considering feedback effect,

$$k = \begin{cases} 0 & j_0 \leq j \leq j_0 + (n-1)DT \\ \lfloor (j - j_0 - (n-2)DT) / DT \rfloor & j_0 + nDT < j \leq \text{LENGTH} \end{cases}$$

other  $Ai$  and  $Ri$  produce corresponding increments with the same orders of  $Li$ .

#### B. The problems about out-tree

**Definition 5.2** Suppose  $T$  is the out-tree including  $n$  variables of SD flow diagram, then out-tree  $T$  is out-tree of  $n$  orders.

**Corollary 5.1** Suppose  $v$  is the root of  $n$  out-tree  $T$  of SD flow diagram. If one increment  $\Delta v$  is given to  $v$  just at the simulation step division  $j_0$  ( $j_0$  is integer multiple of  $DT$ ), then

a. When  $v$  is non-level variable point, at most to the step division ( $j_0+nDT$ ), each variable point of out-tree will produce corresponding increment; When  $v$  is level variable point, at most to the step division  $j_0+(n-1)DT$ , each variable of out-tree will produce corresponding increment.

b. If there are  $k$  level variables from  $v$  to  $v_1$ , when  $v$  is non-level variable,  $v_1$  will produce a corresponding increment at most to the simulation division ( $j_0+kDT$ ). When  $v$  is level variable point, it can be reduced a step;  $v_1$  will produce at least corresponding increment of  $(n-k)$  orders when it simulates to the division ( $j_0+nDT$ ).

We have achieved very good results in applying above-mentioned theory in debugging the model of System Dynamics in Jianxi provincial scientific program.

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