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# A TECHNIQUE FOR IMPROVING READABILITY OF FORRESTER DIAGRAM IN SYSTEM DYNAMICS

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Abstract: We describe a three-pass algorithm for improving the readability of Forrester Diagram in system dynamics. The first pass converts Forrester Diagram to recurrent hierarchy. The second pass sorts the vertices on each level, with the goal of minimizing crossings. The third pass is a finite tuning of the layout that determines the horizontal positions of vertices. An illustrative example is given to verify the result.

Keywords: System Dynamics (SD), Forrester Diagram (FD), recurrent hierarchies, readability, algorithm.

## 1. INTRODUCTION

System Dynamics (SD), developed by Forrester [1], is useful in the study of continuous dynamical system, which has been mainly applied to the simulation of social and managerial systems [1, 3, 5, 9-14, 16, 20]. Simulation packages such as DYSMAP, STELLA and I-THINK are used in system dynamics helping to formulate the data flow of system and to simulate the results of models for user. But, whenever system is fluctuating or the size of problems becomes larger, it is difficult to manipulate Forrester Diagram (FD) by the modeler.

Generally speaking, it is difficult to analyze the structure of a digraph readily unless vertices are laid out in some regular form edges are drawn in such a form that paths can be readily traced by human eyes. To consider common aspects of readability we can base it on the following aesthetic principles:

- 1. Hierarchical layout of vertices.
- 2. Avoid edge crossing and sharp bends.
- 3. Keep edges short.
- 4. Favor symmetry and balance.

This paper is intended to present a method for converting FD to a visually understandable drawing of hierarchies. This is a visual aid to show the relations of all vertices, and to understand the structures of complex systems. It enables us to add or delete elements and couplings over a Forrester Diagram more clearly, and will be useful in developing the result of simulation more accurately and conveniently.

A two dimensional diagram for system dynamics contains cycles, but a cycle contains at least one level variable (variables denotes by rectangular vertices due to the semantic restrictions stated in an FD). Therefore, the cycles can be eliminated by drawing the level variables twice as described in the following section.

The definition of recurrent hierarchies in section 2 enables the application of this study to the hierarchy. The readability-improving algorithm has three passes, as shown in Figure 1. The first pass assigns vertices to level. Each vertex can be determined only after all the higher level vertices that are connected to the vertex have been determined. The second pass sets the order of vertices with levels to avoid edge crossings. We sort vertices by medians and transpose adjacent vertices. The final pass sets the actual layout coordinates of vertices. According to priority numbers, vertices can be adjusted to the best position. We will discuss the three passes in sections 3-5. An illustrative example is given to demonstrate its application in section 6. The final section concludes our discussion and future work.

```
procedure improve_read() 
begin 
   level assign();
    ordering(); 
    position(); 
end
```
#### Figure 1. Main algorithm

## 2. BASIC DEFINITIONS

The enumeration of the semantic restrictions stated in an FD, is derived from some results of Dolado and Torrealdea [4]. Each components of an FD can be drawn symbolically in Figure 2.



	$\boldsymbol{V}$	auxiliary
	$\boldsymbol{P}$	parameter
	$\cal U$	input
→	$\boldsymbol{D}$	information delay
	$\boldsymbol{E}$	material delay
	$\cal M$	multiplier
	$\cal F$	flow coupling
	$\boldsymbol{I}$	information coupling

Figure 2. Symbolic representations of quantity and coupling in FD

**Definition 1.** Properties of each element in FD are defined as:

- (a) levels: for all  $q_j \in X \Rightarrow A_c(q_j) \subseteq F \cap E_c(q_j) \subseteq I$ ,
- (b) rates: for all  $q_i \in R \Rightarrow A_c(q_i) \subseteq I \cap E_c(q_i) \subseteq F$ ,
- (c) auxiliaries: for all  $q_i \in V \Rightarrow A_c(q_i) \subseteq I \cap E_c(q_i) \subseteq I$ ,
- (d) parameters: for all  $q_i \in P \Rightarrow A_c(q_i) = \phi \cap E_c(q_i) \subseteq I$ ,
- (e) inputs: for all  $q_i \in U \Rightarrow A_c(q_i) = \phi \cap E_c(q_i) \subseteq I$ ,
- (f) information delays: for all  $q_i \in D \Rightarrow A_c(q_i) \subseteq I \cap E_c(q_i) \subseteq I$ ,
- (g) material delays: for all  $q_j \in E \Rightarrow A_c(q_j) \subseteq F \cap E_c(q_j) \subseteq FI$ ,
- (h) multipliers: for all  $q_j \in M \Rightarrow A_c(q_j) \subseteq F \cap E_c(q_j) \subseteq I$ .

Figure 3 summarizes the properties of each element in FD. The types of sets an element can belong to are shown on the left side. The intersection of row  $X$  with column  $A_c$  means that for all  $q_j \in X$ ,  $A_c(q_j) \subseteq F$ . The similar expressing may apply to the other corresponding elements.

	$A_c$	$E_c$
$\boldsymbol{X}$	$\overline{F}$	I
$\cal R$	I	$\boldsymbol{F}$
$\boldsymbol{V}$	I	I
$\overline{P}$	$\phi$	I
U	$\phi$	I
$\boldsymbol{D}$	I	I
$\boldsymbol{E}$	$\boldsymbol{F}$	FI
$\boldsymbol{M}$	I	I

Figure 3. Properties of each element in FD

A directed graph  $G = (L, E, n, \sigma)$  is called an *n*-level recurrent hierarchy if: (1)  $L$  is partitioned into  $n$  subsets, that is

 $L = L_1 \cup L_2 \cup \cdots \cup L_n$ , where  $L_i \cap L_j = \emptyset$ , if  $i \neq j$  besides  $L_1 = L_n$ .

(2)  $E$  is partitioned into  $n$  subsets, that is

 $E = E_1 \cup E_2 \cup \cdots \cup E_{n-1}$ , where  $E_i \subset L_i \times L_{i+1}$ , if  $i = 1, ..., n-1$ .

$$
E_i \cap E_j = \emptyset \text{, if } i \neq j.
$$

(3)  $n$ : the level numbers of hierarchies.

(4)  $\sigma = \sigma_1 \cup \sigma_2 \cup \cdots \cup \sigma_n$ , where  $\sigma_i$  is the sequence of all vertices of  $L_i$  for  $i = 1, ..., n$ .

We define the span of an edge as the magnitude of the difference found by subtracting the number of the level from which the edge originates from the number of the level at which the edge terminates. If each edge in a recurrent hierarchy has span of 1, the recurrent hierarchy is called proper. In this study, edges are directed with ascending orders of levels. This definition is slightly different from Warfield [17]-[19]. And, the definition of the  $n$ -level recurrent hierarchy is also different from Sugiyama et al. [15] in (1) (2) of the previous definition. We use hierarchy as recurrent hierarchy in this paper.

An example of 5-level recurrent hierarchy shown in Figure 4, can be described as follows:

 $G = (L, E, n, \sigma)$ , where

(1) 
$$
L=L_1 \cup L_2 \cup L_3 \cup L_4 \cup L_5
$$
,  $L_1 = \{a, b\}$ ,  $L_2 = \{c, d, e, f\}$ ,  $L_3 = \{k, l, m\}$ ,  $L_4 = \{n, o, p\}$ ,  $L_5 = \{a, b\}$   
\n(2)  $E = E_1 \cup E_2 \cup E_3 \cup E_4$ ,  $E_1 = \{\overline{ac}, \overline{ad}, \overline{af}, \overline{bd}, \overline{be}\}$ ,  $E_2 = \{\overline{cl}, \overline{dk}, \overline{ek}, \overline{em}, \overline{fm}\}$   
\n $E_3 = \{\overline{kn}, \overline{ln}, \overline{lo}, \overline{lp}, \overline{mp}\}$ ,  $E_4 = \{\overline{na}, \overline{oa}, \overline{pb}\}$ ,  
\n(3)  $n = 5$ ,  
\n(4)  $\sigma = \sigma_1 \cup \sigma_2 \cup \sigma_3 \cup \sigma_4 \cup \sigma_5$ ,  $\sigma_1 = a.b$ ,  $\sigma_2 = c.d.e.f$ ,  $\sigma_3 = k.l.m$ ,  $\sigma_4 = n.o.p$ ,  $\sigma_5 = a.b$ .

Formulas to calculate the number of crossing of  $n$ -level hierarchies have been given by Warfield [19]. The number of crossing of  $n$ -level hierarchies is defined as  $K(M)$  :

$$
K(M) = K(M^{(1)}) + K(M^{(2)}) + \dots + K(M^{(n-1)})
$$

 $\text{where } K(M^{(i)}) = \sum_{i}^{|L_i|-1} \sum_{j=1}^{|L_i|} \sum_{j=1}^{|L_i|+1|-1} \sum_{j=1}^{|L_i|+1|} m_{i,b}^{(i)} \cdot m_{k,a}^{(i)} \bigg), \hspace{0.2cm} i=1,...,n$  $= 1$   $k = j + 1$   $a = 1$   $b = a +$  $\mathcal{L} = \sum_{i=1}^{|L_i|-1} \sum_{i=1}^{|L_i|} \left( \sum_{i=1}^{|L_i|+1|-1} \sum_{i=1}^{|L_i|+1} m^{(i)}_{ik} \cdot m^{(i)}_{ka} \right), \; \; i=1,2, \ldots, N.$  $\begin{pmatrix} a=1 & b=a+1 \end{pmatrix}$  $\sum_{i}^{\lfloor L_{i} \rfloor -1} \sum_{i}^{\lfloor L_{i} \rfloor -1} \sum_{i}^{\lfloor L_{i}+1 \rfloor -1} \sum_{i}^{\lfloor L_{i}+1 \rfloor}$ 1  $k=j+1$   $a=1$   $b=a+1$  $\hat{h}^{(i)}(k) = \sum_{j=1}^{|L_i|-1} \sum_{k=j+1}^{|L_i|} \Biggl( \sum_{a=1}^{|L_i+1|-1} \sum_{b=a+1}^{|L_i+1|} m^{(i)}_{jb} \cdot m^{(i)}_{ka} \Biggr), \hspace{0.2cm} i=1,...,n-1.$  $K(M^{(1)}) = \sum_{\alpha} \sum_{\alpha} |\sum_{\alpha} m^{(1)}_{ik} \cdot m^{(1)}_{ka} |, i = 1,...,n-1.$ 



Figure 4. Example of a five-level recurrent hierarchy

The number of crossing in Figure 4 is described as

$$
K(M) = K(M^{(1)}) + K(M^{(2)}) + K(M^{(3)}) + K(M^{(4)}) = 2 + 2 + 0 + 0 = 4.
$$

In a *n*-level recurrent hierarchy, the upper priority  $P_{ik}^U$  and the lower priority  $P_{ik}^L$  are defined by the formulas:

$$
P_{ik}^U = \sum_{j=1}^{|L_i - 1|} m_{jk}^{(i-1)}, \quad i = 2,...,n, \quad k = 1,...,|L_i|,
$$
  

$$
P_{ik}^L = \sum_{l=1}^{|L_i + 1|} m_{kl}^{(i-1)}, \quad i = 1,...,(n-1), \quad k = 1,...,|L_i|.
$$

Finally, upper and lower barycenters  $B_{ik}^U$ ,  $B_{ik}^L$  of upper and lower vertices connected to the  $\,k$  th vertex  $\,L^i_k\,$  in the  $\,i$  th level are defined by

$$
B_{ik}^U=\frac{\sum\limits_{j=1}^{|L_i-1|}x_j^{i-1}m_{jk}^{(i-1)}}{P_{ik}^U},\ \ \, i=2,...,n,\ \, k=1,...,|\, L_i\mid,
$$
  

$$
B_{ik}^L=\frac{\sum\limits_{l=1}^{|L_i+1|}x_l^{i+1}m_{kl}^{(i)}}{P_{ik}^L},\ \ \, i=1,...,(n-1),\ \, k=1,...,|\, L_i\mid.
$$

where  $x_j^{i-1}$  is the horizontal position of j th vertex of  $i-1$  th level. Figure 5 shows the priority numbers and barycenters of the horizontal position in Figure 4.

	upper priority	lower priority	upper barycenter	lower barycenter
a		З		2.3
b		2		2.5
c				$\overline{2}$
d	2		1.5	
e		2	2	2
f				3
k	$\overline{2}$		2.5	
		З		9
m	2		3.5	3
n	$\mathcal{D}_{\mathcal{L}}$		1.5	
$\mathbf 0$			$\overline{2}$	
p	2		2.5	2
a	$\overline{2}$		1.5	
b			3	

Figure 5. The priority numbers and the barycenters of the horizontal positions in Figure 4.

## 3. CONVERTING FD TO HIERARCHY

In order to convert FD to hierarchy, we must solve the cycles in system dynamics. According to the semantic restrictions stated in an FD, a cycle contains at least one level variable. Therefore, the cycles can be eliminated by drawing the level variables twice at the top and bottom levels. A flowchart showing the relationship between the various steps and the iterative nature of the algorithm is given in Figure 6. Dummy vertices are added to break edges that span over more than two levels, so that the graph at the end of the first pass is a proper hierarchy.

The flowchart shows that the iteration process is required to facilitate the implementation process. A straight forward explanation that underlies the logic of the flowchart will be described as follows:

#### **Step 1:** Classify  $X, E$  and  $R$ .

Classifying those quantities whose affecter couplings is flow couplings, add to  $L_n$ . And, classifying those quantities whose affecter couplings is information couplings, add to  $L_{n-1}$ .

#### **Step 2:** Determine the levels of all vertices from  $L_{n-1}$  to  $L_2$ .

Each vertex can be determined only after all higher level vertices have been determined that is connected to the vertex. Let  $A_q(L_{n-1})$  represent the set of quantities which have couplings directed to the quantities of  $L_{n-1}$ .  $L'_{n-1}$  represents the *i* th vertex of  $n-1$  th level.



Figure 6: Flowchart for converting FD to hierarchy

For each  $q_i \in L_{n-1}$ , consider  $A_q(L'_{n-1}) \notin X \cup E$ , if  $A_q(L'_{n-1})$  have not been determined, add  $A_q(L'_{n-1})$  to  $L_{n-1}$ , otherwise, if  $A_q(L'_{n-1})$  and  $L'_{n-1}$  in the same level, add  $A_q(L'_{n-1})$  to  $L_{n-2}$  and subtract the same from  $L_{n-1}$ . When all the quantities of  $L_{n-1}$  have been determined, proceed the next loop, substitute *n* by *n*-1. If *n* ≠ 2, the whole determined process has not been accomplished, then proceed to step 2, otherwise, proceed to the next step. Assigning the vertices of  $L_n$  to  $L_1$  can be accompl ished.

#### **Step 3:** Convert the hierarchy into proper.

If the hierarchy is improper, it can be replaced with a proper hierarchy by introducing additional dummy vertices are required to make all spans equal to 1. Let  $E_q(L_j)$  represents the set of vertices which have edges directed away from  $L_j$ . And  $s_{ij}$ represents the dummy vertices. Now all vertices have been finally determined, and the proper hierarchy can be delineated. The detailed algorithm is presented in Appendix.

## 4. REDUCTION OF THE NUMBER OF CROSSINGS

Two common methods for reducing the number of crossings are the barycenter function and the median function. Let  $v$  be a vertex and  $P$  the list of positions of its incident vertices on the appropriate adjacent level. Note that the position of an adjacent the weight of  $\nu$  as the average of elements in  $P$ . The median method defines the node is only its ordinal number in the current ordering. The barycenter method defines weight of v as the median of elements in  $P$ . When the number of elements in  $P$  is even, there are two medians. This gives rise to two median methods: always using the left median, and always using the right median. The median method consistently performs better than the barycenter method and has a slight theoretical advantage since Ea des and Wormald [6] have shown that the median layout of a two level graphs has no more than three times the minimum number of crossings. No such bound is known for the barycenter method [2, 15, 19].

we use an interpolated valued biased toward the side where vertices are more closely packed. The second improvement uses an additional heuristic to reduce obvious is locally optimal wit h respect to interchange of adjacent vertices. The study of reduction of the number of crossings is a refinement of the median method with two major innovations. First, when there are two median values, crossing after the vertices have been sorted, transforming a given ordering the one that

It is an iterative method that computes at each iteration a tentative iteration works from level max level  $-1$  to level 1, and uses the down median. Successive iterations alternate between top-down and bottom-up scanning of the levels. A flowchart of the algorithm is given in Figure 7. The detailed algorithm is presented in Appendix. placement. The first iteration scans the graph from level 2 to max\_level, where at level  $i$  ( $i = 1, \ldots, \text{max}$  level) the vertices are sorted according to the up median. The second



Figure 7: Flowchart for reducing the number of edge crossings

## 5. ADJUSTMENT OF THE HORIZONTAL POSITIONS OF VERTICES

Adjusting the horizontal positions of vertices according to priority numbers given to vertices is introduced to improved readability of hierarchies. Priority numbers given to the other vertices are the connectivity of the vertices calculated by the previous definition in section 2. This method satisfies the following conditions:

- (a) The order of vertices of each level should be preserved.
- (b) The principle to improve the position of a vertex is to minimize the difference between the present position of the vertex and the upper (or lower) barycenter of the vertex.
- (c) The horizontal position of the vertex should be integer, otherwise replace it with approximate integer value. And, it can not be equal to the positions of the other vertices in the same level.



Figure 8. Flowchart for adjusting the horizontal positions of vertices

A flowchart of the algorithm is given in Figure 8. A straight forward explanation underlies the logic of flowchart is described as follows:

Step 1: Initials values of horizontal positions of vertices in each level.

We let  $L_i^k = x_0 + k, k = 1, ..., |L_i|, i = 1, ..., n$ , where  $x_0$  is a given integer.

Step 2: Positions of vertices in each level are determined one by one according to their priority numbers.

Positions of vertices in level 1 are improved according to the lower priority and the lower barycenter. The improvements of the positions of vertices in level  $2,...,n$  are made according to the upper priority and the upper barycenter. The highest priority number is given to dummy vertices to improve the readability.

**Step 3:** Delete the dummy vertices and edges, and then regenerate the corresponding long span. Now all vertices have been finally adjusted, and the resulting hierarchy can be available. The detailed algorithm is presented in Appendix.

### 6. EXAMPLE

The casual diagram and Forrester Diagram chosen for demonstration of the algorithm discussed in this study are shown in Figure 9 and Figure 10 which are based upon the residential community model excerpted from Goodman [8]. The names of quantities and associated designators are exhibited in Table 1.



Figure 9: Causal diagram of a residential community model [8]

Quantities	Name
$q_1$	Population
$q_2$	In-migration rate
$q_3$	Attractiveness for migration multiplier perceived
$q_4$	Attractiveness for migration multiplier
$q_{5}$	Departure migration multiplier
$q_6$	Out-migration rate
$q_7$	Net death rate
$q_8$	Housing
$q_9$	Housing construction rate
$q_{10}$	Housing construction multiplier
$q_{11}$	Housing ratio
$q_{12}$	Housing desired
$q_{13}$	Land availability multiplier
$q_{14}$	Land fraction occupied
$q_{15}$	Housing demolition rate
$q_{16}$	Land
$q_{17}$	Land per unit
$q_{18}$	Average lifetime of housing
$q_{19}$	Normal housing construction
$q_{20}$	Units per person
$q_{21}$	Normal out-migration
$q_{22}$	Death rate factor
$q_{23}$	Normal in-migration

Table 1: Quantities show in residential community model

The process of the first pass is as follows:

**Step 1:** Classify  $X_1$  and  $X_8$  then add  $\{X_1, X_8\}$  to  $L_8$ ; classify  $R_2, R_6, R_7, R_9$ and  $\, R_{15} \,$  add  $\, \{ R_2, R_6, R_7, R_9, R_{15} \} \,$  to  $\, L_7$  .

**Step 2:** Consider all quantities which have couplings directed toward  $R_2$  we add  $\{D_3, P_{23}\}\;$  to  $L_6$ . The similar operations may apply to  $\{R_6, R_7, R_9, R_{15}\}\;$ , add  $\{M_5,$  $P_{21}, P_{22}, M_{10}, M_{13}, P_{19}, P_{18}$ } to  $L_6$ .

Because  $L_7$  is empty, we classify the quantities of  $L_6$ , then add  $\{M_4, V_{11}, V_{14}\}$ to  $L_5$ .  $L_6$  is empty, proceed the next loop, consider  $V_{11}$ , the affecter quantity of  $M_4$ .

 $V_{11}$  and  $M_4$  are in the same level, so add  $V_{11}$  to  $M_4$ , and subtract the same from  $L_5$ . Furthermore, add  $\{P_{16}, P_{17}\}\;$  to  $L_4$ .

Again proceed to the loop of  $L_4$  and  $L_3$ , we add  $\{V_{12}\}\;$  to  $L_3$ ,  $\{P_{20}\}\;$  to  $L_2$ . And, assign  $L_8$  to  $L_1$ .

**Step 3:** Add  $\{S_1, S_2, S_3, S_4, S_5, S_6, S_7\}$  to  $L_2$ ,  $\{S_8, S_9, S_{10}, S_{11}, S_{12}, S_{13}\}$  to  $L_3$ ,  ${S_{14}, S_{15}, S_{16}, S_{17}, S_{18}, S_{19}}$  to  $L_4$ ,  ${S_{20}, S_{21}, S_{22}, S_{23}, S_{24}, S_{25}}$  to  $L_5$ , and  ${S_{26}, S_{27}}$ ,  $S_{28}, S_{29}, S_{30}$  to  $L_6$ . The first pass is accomplished. The number of edge crossings is shown as  $K(M) = 24$ . The proper hierarchy is presented in Figure 11.



Figure 10: FD of a residential community model [8]



Figure 11: The proper hierarchy of the residential community model

The process and result of applying pass 2 is given as follows:

The first iteration sorts the vertices from level 2 to level 8 according to the up\_median. The orders of all vertices are no change in level 2 − 4. In level 5, we interchange the order of  $S_{20}$ ,  $V_{14}$ . There are no changes in level 6 – 8. The number of edge crossings is reduced from 24 to 20.

Then, the second iteration sorts the vertices from level 7 to level 1 according to down median. The order of all the vertices in level 7 is no change. By exchanging the sequence of the vertices in level 6, we obtain  $\sigma_6 = {\langle P_{23}, D_3, S_{26}, M_5, P_{21}, S_{27}, P_{22}, S_{28}, P_{22}, S_{26}, P_{22}, P_{23}, P_{24}, P_{25}, P_{26}, P_{27}, P_{28}, P_{29}, P_{20}, P_{21}, P_{22}, P_{23}, P_{24}, P_{25}, P_{26}, P_{27}, P_{28}, P_{29}, P_{20}, P_{21}, P_{22}, P_{23}, P_{24}, P_{2$  $M_{10}, M_{13}, P_{19}, S_{29}, P_{18}, S_{30}$ . For level 2 – 5 we have  $\sigma_5 = \{M_4, S_{21}, S_{22}, S_{23}, S_{20}, V_{14}, S_{24},$  ${S_{25}}$ ,  $\sigma_4 = {S_{14}, V_{11}, S_{15}, S_{16}, P_{16}, P_{17}, S_{17}, S_{18}, S_{19}}$ ,  $\sigma_3 = {S_8, V_{12}, S_9, S_{10}, S_{11}, S_{12}, S_{13}}$ ,  $\sigma_2 = {\bf S}_2, P_{10}, S_1, S_3, S_4, S_5, S_6, S_7$ . The number of edge crossings is shown as  $K(M) = 4$ .

Precede the next successive iterations; sort the vertices from level 2 to level 8 according to the up\_median. The orders of all vertices are no further change in level 2 − 4. For level 5 – 6 we have exchange  $\sigma_5 = {\{S_{21}, M_4, S_{20}, S_{22}, S_{23}, V_{14}, S_{24}, S_{25}\}}$ ,  $\sigma_6 = {\{P_{23}, P_{24}, P_{24}, S_{25}\}}$  $S_{26}, D_3, M_5, P_{21}, M_{10}, S_{27}, P_{22}, S_{28}, M_{13}, P_{19}, S_{29}, P_{18}, S_{30}\}$  . There are no changes in level 7 − 8. The number of edge crossings is reduced to 3.

Then, sort the vertices from level 7 to level 1 according to down\_median. The order of the all vertices in level 7 is no change. By exchanging the sequence of the vertices from level 6 to level 2, we obtain  $\sigma_6 = \{P_{23}, S_{26}, D_3, M_5, P_{21}, S_{27}, P_{22}, S_{28},$  $M_{10}, M_{13}, P_{19}, S_{29}, P_{18}, S_{30}$ ,  $\sigma_5 = \{S_{21}, M_4, S_{22}, S_{23}, S_{20}, V_{14}, S_{24}, S_{25}\}$ ,  $\sigma_4 = \{S_{14}, S_{15}, V_{11},$  $S_{16}, P_{16}, P_{17}, S_{17}, S_{18}, S_{19}$ ,  $\sigma_3 = \{S_8, S_9, V_{12}, S_{10}, S_{11}, S_{12}, S_{13}\}, \sigma_2 = \{S_2, S_3, P_{20}, S_1, S_4, S_5,$  $S_6, S_7$ . The number of edge crossings is shown as  $K(M) = 2$ .

The next iteration is executed, sorting the vertices from level 2 to level 8 according to the up median. By exchanging the sequence of the vertices from level 2 to level 8, we obtain  $\sigma_2 = {\{S_4, S_2, S_3, P_{20}, S_1, S_5, S_6, S_7\}}$ ,  $\sigma_3 = {\{S_{10}, S_8, S_9, V_{12}, S_{11}, S_{12}, S_{13}\}}$ ,  $\sigma_4 = \{S_{16}, S_{14}, S_{15}, V_{11}, P_{16}, P_{17}, S_{17}, S_{18}, S_{19}\}, \ \sigma_5 = \{S_{23}, S_{21}, S_{22}, M_4, S_{20}, V_{14}, S_{24}, S_{25}\},\$  $\sigma_6 = \{P_{22}, S_{28}, P_{23}, S_{26}, S_{27}, D_3, M_5, P_{21}, M_{10}, M_{13}, P_{19}, S_{29}, P_{18}, S_{30}\}$ . The number of edge crossings is reduced to 1.

Then, sort the vertices from level 7 to level 1 according to down\_median. The order of all the vertices in level 6 and level 5, we obtain  $\sigma_6 = \{P_{22}, S_{28}, S_{26}, P_{23}, D_3, S_{27},$  $M_5, P_{21}, M_{10}, M_{13}, P_{19}, S_{29}, P_{18}, S_{30}$ ,  $\sigma_5 = \{S_{23}, S_{21}, M_4, S_{22}, S_{20}, V_{14}, S_{24}, S_{25} \}$ . The orders of all vertices are no change in level  $1 - 4$ . The number of edge crossings is shown as  $K(M) = 2$ . It does not decrease, so the second pass is completed. The result is displayed in Figure 12, the number of crossings is reduced from 24 to 1.

The process and result of applying pass 3 is given as follows:

First, we improve the position of vertices in level 1. The position of  $X_1$  is improved, since it has the highest priority number  $(=4)$ . The horizontal position of  $X_1$ is 2.75  $\left(\frac{1+2+3+5}{4} = 2.75\right)$  $\left(\frac{1+2+3+5}{4}\right)$  = 2.75, so we get 3 as the best horizontal position of  $X_1$ . And, the

position of  $X_8$  can be adjusted to its horizontal position  $7\left(\frac{6+7+8}{3}\right)=7\right)$ .





By improvement in level 3,  ${S_1, S_8, S_9, V_{12}, S_{11}, S_{12}, S_{13}}$  are displaced to {1,2,3, 5,6,7,8} of the horizontal positions. For level 4, we have the horizontal positions 1,2,3,8, 9,10 for the dummy vertices  $S_{16}$ ,  $S_{14}$ ,  $S_{15}$ ,  $S_{17}$ ,  $S_{18}$ ,  $S_{19}$ , and add  $V_{11}$ ,  $P_{16}$ ,  $P_{17}$  to position 5, 6, and 7.

The dummy vertices  ${S_{23}, S_{21}, S_{22}, S_{20}, S_{24}, S_{25}}$  are displaced to  ${1,2,3,6,9,10}$ of the horizontal positions in level 5.  $V_{14}$  has the largest priority number (=3) and its horizontal position is  $7\left(\frac{6+7+8}{3}\right)$ , so we get 7 is the best horizontal position of  $V_{14}$ . Then, add  $M_4$  to position 5. For level 6, we have the horizontal positions 2,4,5, 12,14 for the dummy vertices  $S_{28}, S_{26}, S_{27}, S_{29}, S_{30}$ , and add  $P_{22}, P_{23}, D_3, M_5, P_{21}, M_{10}, M_{13},$  $\frac{116}{3}$  = 7 , so we get 7 is the best horizontal position of  $V_{14}$  $P_{19}, P_{18}$  to position 1,3,6,7,8,9,10,11,13.

Proceed to level 7,  $R_9$  has the largest priority number (=4) and its horizontal position is  $10.5 \left( \frac{9+10+11+12}{4} - 10.5 \right)$  $\frac{1+12}{1}$  = 10.5, so we get 11 is the best horizontal position  $R_9$ . Next,  $R_2, R_6$  has the second largest priority number, adjust  $R_2$  to horizontal position 4  $\left(\frac{3+4+5}{3}=4\right)$ and  $R_6$  to horizontal position  $7\left(\frac{5+7+8}{3}\right)=6.7$ ). The processes of  $R_7$ ,  $R_{15}$  are so as  $R_2$ , add  $R_7$  to position 2 and  $R_{15}$  to position 14.

Finally, for level 8, the position of  $X_1$  is improved, since it has the largest priority number (=3). The horizontal position of  $X_1$  is 4.3  $\left(\frac{2+4+7}{3}\right)=4.3$  $\Big\}$ , so we get 4 is the best horizontal position of  $X_1$ . And, the horizontal position of  $X_8$  is 12.5  $\left(\frac{11+14}{2}\right)=12.5$ , so we get 13 is the best horizontal position of  $X_8$ . Then, dummy vertices and edges are deleted, and the corresponding long edges are regenerated. The third pass is accomplished. Further, the final map of hierarchy is available in Figure 13.

### 7. CONCLUSION

We have presented a method for improving readability of FD, which consists of three passes. The first pass converts FD to recurrent hierarchy. The second pass sorts the vertices on each level to avoid edge crossings. The third pass adjusts the horizontal positions of vertices. The study proposed here can make up a deficiency of the past work in manipulating FD in system dynamics. Converting FD to the hierarchies is useful to realize the relations of all vertices in complex systems, but also operate elements and couplings over an FD more clearly and conveniently. Moreover, permits easy implementation by the modeler.

By developing the theoretical algorithms, we can recognize the nature of the problem to generate the readable representation of FD in system dynamics. On the other hand, by developing the heuristic algorithms, we enlarge the size of the problems we can deal with.



Figure 13. Results of hierarchical graph visualization

Finally, the following studies are envisaged for future research:

- (1) understand how to modify the graph or its layout to enhance readability,
- (2) developments of methods for readable drawing of undirected graphs, and
- (3) associate with graph-processing tool to develop the tool of computer simulation in system dynamics.

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### APPENDIX

#### Algorithm 1: Converting FD to hierarchy.

```
procedure level_assign() 
begin 
     r = 1;
      s = 1;for i = 1 to |Q|if q_i \in X \cup E then
                   q_i \rightarrow L_j;
                    r = r + 1;
             elseifq_i \in R then
                    q_i \rightarrow L_{i-1};
                    s = s + 1;
              endif 
      next i
      t = |Q| - r - s;
      p = 2;
      k = 1;do while k \leq tu=1;do while u \le |L_{j-1}|if A_q(L_{i-1}^u) = \phi then
                         u = u + 1;
                         k = k + 1 ;
                   elseif (visited A_q(L_{j-1}^\mu) = .true. ) then
                         { if [L_{j-1}^u \cap A_q(L_{j-1}^u)] \in L_{j-1} then
                                 L_{j-1} - A_q(L_{j-1}^u) \to L_{j-1};
                                 A_q(L_{j-1}^u) \to L_{j-2};
                                  k = k - 1; else
                                  u = u + 1;
                                  k = k + 1;
                          endif }
                   elseif A_q(L_{j-1}^u) \in X \cup E then
                         u = u + 1;
                         k = k + 1;
                    else
```

```
A_q(L_{j-1}^u) \to L_{j-2};
                  endif 
            enddo 
            j = j - 1;p = p + 1 ;
      enddo 
     n=2;
    do while n \leq p + 1L_i \rightarrow L_n;n = n + 1;
            j = j + 1 ; enddo 
     L_n \rightarrow L_1;
proper() 
end
```
#### Algorithm 2: Converting the hierarchy into proper.

```
procedure proper() 
begin 
     for i=1 to n-1for j = 1 to |L_i|Q_i = E_q(L_i^j) - L_i^j - [E_q(L_i^j) \cap L_{i+1}];
                    do while |Q_j| \neq 0\{| L_{i+1} | + 1 \rightarrow u ;L_{i+1} \cup s_u \rightarrow L_{i+1};
                           E_q(L_i^j) \cup s_u \to E_q(L_i^j);
                           Q_i \rightarrow E_q(s_u);
                          | L_{i+1} + 1 \rightarrow | L_{i+1} |;| Q_i | -1 \rightarrow | Q_i |; } enddo 
             next j
              do while [E_q(s_p) = E_q(s_q)] {
                     A_q(s_q) \rightarrow A_q(s_p);
                    delete s_q;
               } enddo 
      next i
```
end

#### Algorithm 3: Reduction of the number of crossings.

```
procedure ordering() 
begin 
    order = init order();best = order; 
    for i = 1 to max_iterations do
           wmedian(order, i); interchange(order);
           if crossing(order) < crossing(best) then 
                best = order; 
            endif 
     end 
     return best; 
end
```
### Algorithm 4: The median procedure.

```
procedure wmedian(order, iter) 
begin 
    if (iter mod 2)=0 then 
           for r = 2 to max level do
                for v in order [r] do
                     median[v] =median_value( v, r - 1 );
                 end 
           sort(order [r], median);
            end 
     else 
           for r = (max level - 1) to 1 do
                for v in order [r] do
                     median [v] =median_value( v, r + 1 );
                 end 
           sort(order[r], median);
            end 
     endif 
end 
procedure median_value(v, adj\_level)begin
```
 $p = adj$  position(v, adj level);

```
m = | p | / 2;if |p|=0 then
           return 0; 
    elseif (|p| \mod 2) = 1 then
           return p[m]; 
    elseif |p|=2 then
          return (p[0] + p[1])/2;
     else 
          left = p[m-1] - p[0];right = p[|p|-1] - p[m];return (p[m-1]* right + p[m]* left)/(left + right); endif 
end
```
#### Algorithm 5: The interchange procedure.

```
procedure interchange(level) 
begin 
     inproved=.true.; 
    while improved do 
            improved=.false.; 
           for r = 1 to max level do
                 for i = 0 to |\text{level}[r]| - 2 do
                      v = level[r][i];
                      w = \text{level}[r][i+1];
                      if crossing (v, w) > crossing (w, v) then
                              improved=.true.; 
                             exchange(level[r][i], level[r][i+1]);
                       endif
                  end 
            end 
     end 
end
```
## Algorithm 6: Adjustment of the horizontal positions of vertices.

```
procedure position() 
begin 
   for i=1 to nfor k = 1 to |L_i|L_i^k = x_0 + k ;
```

```
next\boldsymbol{k} next i
      compute P_{1k}^L;
     do while L_1 \neq \phi {
P_{1k}^L is highest in L_i;
                    adjust L_i^k;
                    L_i = L_i - L_i^k;
               }
      enddo 
     for i = 3 to n
             for \,k\!=\!1\, to \,|\,L_i\,|if (L_i^k is dummy vetex) then
                    adjust L_i^k;
              else 
P_{ik}^U = \sum_{i}^{|L_i-1|} m_{ik}^{(i-1)};
                           =\sum_{j=1}^{|L_i-1|}m_{jk}^{(i-1)}1
                        U = \sum_{i=1}^{|L_i - 1|} m(i)P_{ik}^U = \sum\limits_{j=1}^K \, m_{jk}^{(l)} endif 
      next k
             do while L_i \neq \phi\{P_{ik}^U is highest in L_i;
                          adjust L_i^k;
                          L_i = L_i - L_i^k ; \label{eq:li} }
              enddo 
      next i
end
```