

# Design Structure Matrix (DSM) methods and its application in system engineering

**Never Stand Still** 

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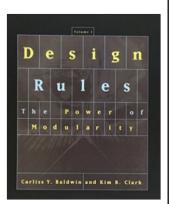
#### Who am I and why am I here?

- B.E. in Electrical Engineering, Nanjing University of Aeronautics and Astronautics(NUAA), 2004
- Ph.D. in Guidance Navigation & Control, NUAA, 2011
- · Research fellow
  - in Australian Centre for Space Research Center, UNSW Sydney, 2011-2014.
  - in Capability Systems Center (CSC), UNSW Canberra, 2014 now
- Current research area: modular analysis, trade space exploration.
- Design Structure Matrix (DSM) method has been a subject of research at the Capability Systems Centre
- Share some interesting findings about DSM methods with a range of example applications
  - Matrix-based methods to solve some system engineering problems

#### Research motivation

#### Modularity in Design

- What are designs?
  - Instructions that turn knowledge into things
  - · Span all artifacts and human activities
  - Some new designs create value forces that can change the structure of an industry
  - Small designs can "just get done" by one person or a small team; large designs require architecture
- Design Rules: The Power of Modularity C. Baldwin & K. Clark [Baldwin 2000] "...IBM gave us the prototype of modularized design...The IBM System/370 was the first modularized mainframe...Baldwin & Clark claim that their principles apply equally to social and legal institutions as well as technologies. Modularization could improve the design of almost everything." –W. Sheridan



#### Modularity in Design

- Design Rule Idea: have components depend on design parameters guaranteed to change
- · Architectural design
  - Subsystem identification: services and constraints are specified
  - Module design: modular decomposition is performed; relationships specified
- Studying the designs and correlating their changes with the value changes, the finding is that *modularity held the key*.
- Modularity in design is a financial force that can change the structure of an industry
- Its virtues:
  - Makes complexity manageable
  - Enables parallel work
  - Welcomes experimentation
  - Creates options

#### What we are doing?

- Success depends on designers' intuition and experience. Designers need to reason consequences of a change, options to accommodate a change, refactor or not, etc.
- Look for adequate design representations/algorithms to visualize and measure modularity in design
  - To help "experts" play with ideas
  - To help "beginners" learn about design
- Seek for a method/tool/algorithm for formal modeling and automated analysis which are
  - General enough: span language paradigm and system lifecycle
  - Explicitly represent decision: Design is a decision-making procedure
  - Computable
  - Analyzable
  - Scalable
  - Capture the essence of informal principles



#### Design Structure Matrix (DSM)

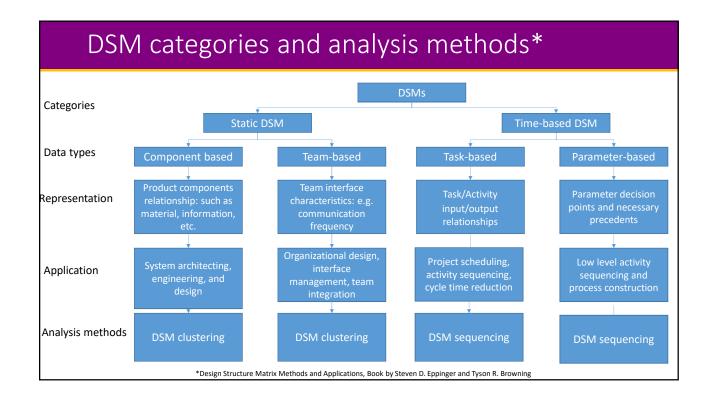
- A matrix representation of a complex system.
  - Static DSM: Represent system elements existing simultaneously
  - Time-Based DSM: Ordering of rows and columns represent a flow through time: upstream activities in a process precede downstream activities
- Well known technique to help define design decisions, elements/components/parameters, interfaces and element relationships.
- The rows and columns of a DSM are labeled by the design components and dependences between two parameters are marked.
- Ability to modularize

Powerful systems are built of many elements; power comes from elements' interplay.

(6) Power cord
(6) Power cord
(6) Bracket
(4) Bracket
(4) Bracket
(5) Lever
(2) Vibrating Head
(4) Bracket
(4) Bracket
(5) Lever
(2) Vibrating Head
(6) Power Cord
(7) Wiring
(7) Wiring
(1) Motor
(2) Vibrating Head
(2) Vibrating Head
(3) On/Off switch
(3) Lever
(2) Vibrating Head
(4) Bracket
(2) Vibrating Head
(3) On/Off switch
(4) Power Cord
(4) Power Cord
(5) Lever
(1) Vibrating Head
(4) Power Cord
(6) Power Cord
(7) Wiring
(8) Power Cord
(8) Power Cord
(9) Power Cord
(9) Power Cord
(1) Power Cord
(2) Power Cord
(2) Power Cord
(3) Power Cord
(4) Power Cord
(4) Power Cord
(5) Power Cord
(6) Power Cord
(6) Power Cord
(7) Po

Massager DSM\*

\* M. Kashkoush and H. ElMaraghy. Optimum overall product modularity. Procedia CIRP



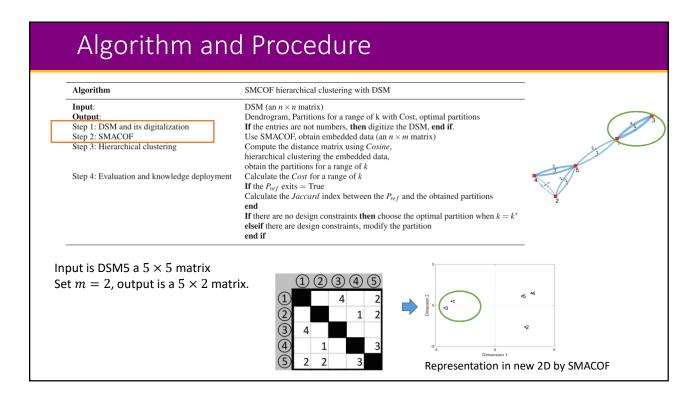
#### Design Structure Matrix (DSM)

- Our previous work\* regarding MDS clustering provides a rigorous study of its application to DSM modular analysis.
- Tailor our previous algorithm for various problems such as the structuring of design problem.
- We found
  - The ease of creating and editing design parameters enables the freedom to make changes (erasing and re-writing the matrix)
  - DSM based algorithms (e.g. clustering, sequencing derived from data mining, machine learning, graph theory, network analysis etc.) make some things automated and easier to manipulate.

Qiao, L., Efatmaneshnik, M., Ryan, M., Shoval, S.: Product modular analysis with design structure matrix using a hybrid approach based on MDS and clustering. J. Eng. Design 28(6), 433–456 (2017)

DSM Application Examples

## Product-DSM clustering



#### Algorithm and Procedure(cont.)

Algorithm SMCOF hierarchical clustering with DSM Input: DSM (an  $n \times n$  matrix) Output: Dendrogram, Partitions for a range of k with Cost, optimal partitions If the entries are not numbers, then digitize the DSM, end if. Step 1: DSM and its digitalization Step 2: SMACOF Use SMACOF, obtain embedded data (an  $n \times m$  matrix) Step 3: Hierarchical clustering Compute the distance matrix using Cosine, hierarchical clustering the embedded data, obtain the partitions for a range of k Step 4: Evaluation and knowledge deployment Calculate the Cost for a range of k If the  $P_{ref}$  exits = True Calculate the *Jaccard* index between the  $P_{ref}$  and the obtained partitions If there are no design constraints then choose the optimal partition when  $k = k^*$ elseif there are design constraints, modify the partition

Objects and clusters Distance between clusters The solutions of hierarchical clustering are called dendrogram. Represent nested clusters for DSM5.

A quantitative description of data properties.

A partition can be obtained by cutting the dendrogram at a certain

$$P_{k=2} = \{\{1,3\}, \{2,4,5\}\}\$$
  
 $P_{k=3} = \{\{1,3\}, \{4,5\}, \{2\}\}$ 

#### Algorithm and Procedure(cont.)

#### Algorithm

Input: Output

Step 1: DSM and its digitalization Step 2: SMACOF

Step 3: Hierarchical clustering

Step 4: Evaluation and knowledge deployment

SMCOF hierarchical clustering with DSM

DSM (an  $n \times n$  matrix)

Dendrogram, Partitions for a range of k with Cost, optimal partitions If the entries are not numbers, then digitize the DSM, end if. Use SMACOF, obtain embedded data (an  $n \times m$  matrix)

Compute the distance matrix using Cosine, hierarchical clustering the embedded data,

obtain the partitions for a range of k Calculate the Cost for a range of k

If the  $P_{ref}$  exits = True

Calculate the Jaccard index between the  $P_{ref}$  and the obtained partitions

If there are no design constraints then choose the optimal partition when  $k = k^*$ elseif there are design constraints, modify the partition

Compare the quality of the partition solutions using

$$\begin{aligned} Cost &= \sum IntraClusterCost + \sum ExtraClusterCost \\ &= \underbrace{\sum \left[DSM(i,j) + DSM(j,i)\right] \times d_k}_{i,j \text{ are in the same cluster}} + \underbrace{\sum \left[DSM(i,j) + DSM(j,i)\right] \times n}_{i,j \text{ are not in the same cluster}} \end{aligned}$$

When we calculate the cost for a range of partitions, the cost value first decrease as the number of cluster increase. Then, the cost value increase, as a result of an increase in the number of interactions outside the partitions. The minimum value for the cost is considered as the optimal partition.

$$P_{k=2} = \{\{1,3\},\{2,4,5\}\}$$

Cost = 72

$$P_{k=3} = \{\{1,3\},\{4,5\},\{2\}\}$$

Cost = 78

The optimal  $k^*=2$ . If there are no design constrains, We suggest the solution preference is  $P_{k^*=2}$ 

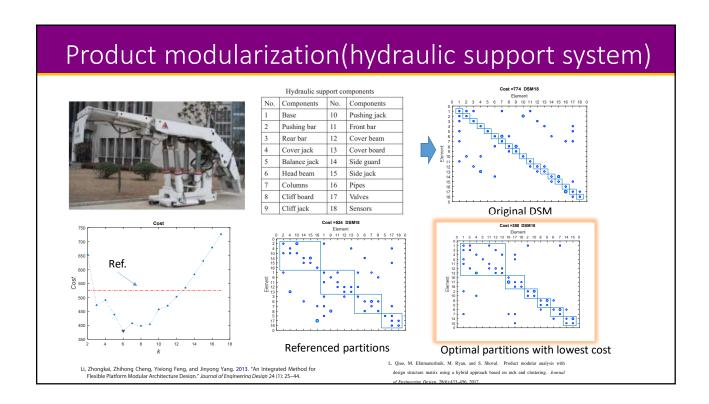
#### Algorithm and Procedure(cont.)

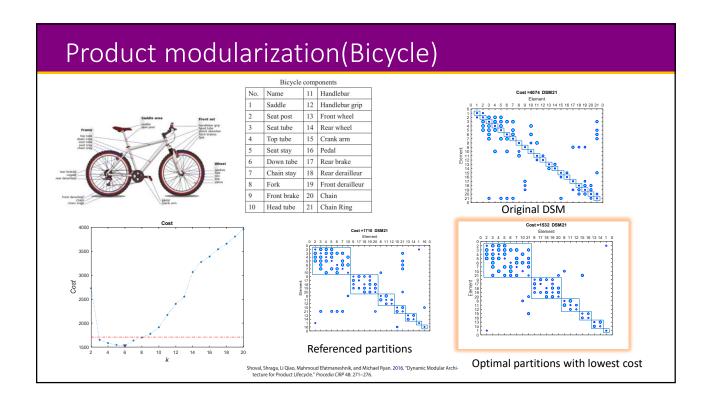
Algorithm	SMCOF hierarchical clustering with DSM DSM (an $n \times n$ matrix)		
Input:			
Output:	Dendrogram, Partitions for a range of k with Cost, optimal partitions		
Step 1: DSM and its digitalization	If the entries are not numbers, then digitize the DSM, end if.		
Step 2: SMACOF	Use SMACOF, obtain embedded data (an $n \times m$ matrix)		
Step 3: Hierarchical clustering	Compute the distance matrix using Cosine,		
	hierarchical clustering the embedded data,		
	obtain the partitions for a range of $k$		
Step 4: Evaluation and knowledge deployment	Calculate the <i>Cost</i> for a range of <i>k</i>		
	If the $P_{ref}$ exits = True		
	Calculate the <i>Jaccard</i> index between the $P_{ref}$ and the obtained partitions		
	end		
	If there are no design constraints then choose the optimal partition when $k = k$		
	elseif there are design constraints, modify the partition		
	end if		

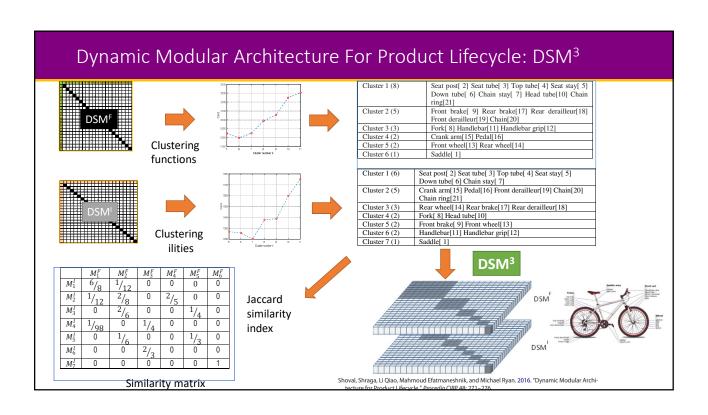
Use Jaccard index to compare partitions  $Jaccard~(X,Y) = |X \cap Y|/|X \cup Y|$ 

The number of members shared between both sets/the total number of members in both sets

- 1) Comparison of the obtained partitions with the reference partition  $P_{ref}$
- 2) Comparison within the obtained partitions  $P_2, P_3, ..., P_{n-1}$







#### Dynamic Modular Architecture For Product Lifecycle: DSM<sup>3</sup>(cont.)

- Type I clusters that are identical in both the DSM<sup>I</sup> and the DSM<sup>F</sup>.
- Type II large clusters that consist of a mixture of elements from entire smaller clusters from the other layer of the DSM<sup>3</sup>.
- **Type III** clusters that exist in one DSM layer and not in the other.





Internal hub gearing mechanism and conventional derailleur gearing mechanism

Characterized by a value of '1' in the similarity matrix, indicating that the two clusters have 100% similarity according to the *Jaccard similarity coefficient*.

No costs are associated with the transition of these clusters.

Characterized in the similarity matrix by a row or column that consists of a single non-zero value. Cluster has a single non-zero index with cluster, indicating that it is contained entirely within the larger cluster. Cluster is entirely contained within cluster. Two costs associated with it: the disconnect cost between the smaller clusters and the neighbouring clusters, which ideally are weak, and the reconnecting cost of the elements in the larger cluster.

Elements from a cluster in one layer of the DSM3 are transferred to another cluster in the other layer.

Two costs associated with each element's transition: the disconnection cost of leaving the current cluster, and the connection cost for joining the elements in the new cluster.

The upgraded internal hub-gearing mechanism, replaces the traditional derailleur gearing system. The internal hub gearing is expensive but is simpler for regular maintenance, in particular when frequent assembly and disassembly of the rear wheel is required.

### Organization- DSM clustering

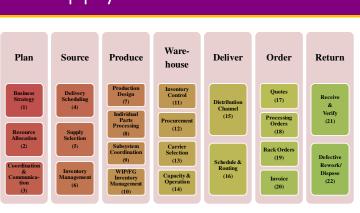
#### Supply Chain Outsourcing Problem

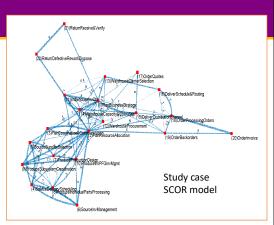
- A common strategic decision in the area of supply chain management (SCM). Despite obvious advantages, no simple guide as to when to rely on an in-house solution, versus outsourcing to a partner. The decision is therefore difficult as outsourcing can pose a threat to a corporation if the outsourcing relationship is not clearly defined and practised.
- It is reported that some 90% of manufacturing companies have some level of outsourcing.
- One of the basic outsourcing rules: If something is deemed a core competency, then you keep it inhouse; everything else you outsource. The unique business functions that allow an organization to be successful.



Supply chain today
Source: A. Subramaniam Supply Chain Risk Management

#### Supply Chain model

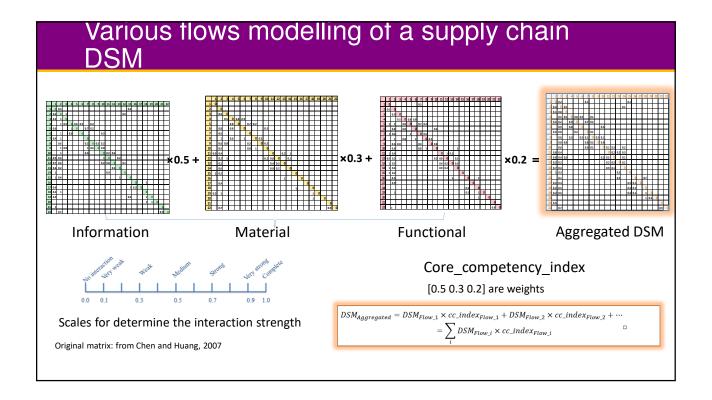


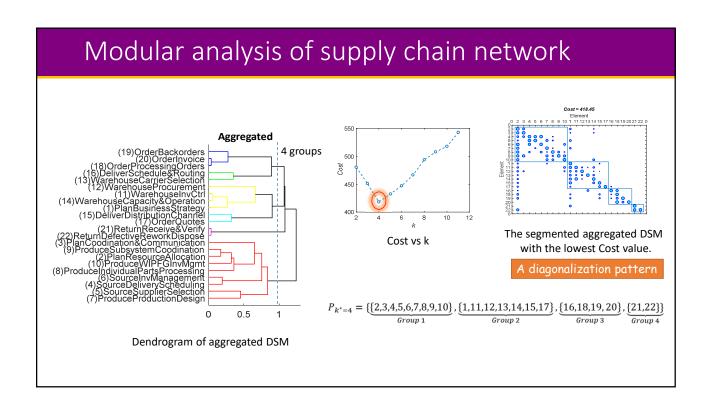


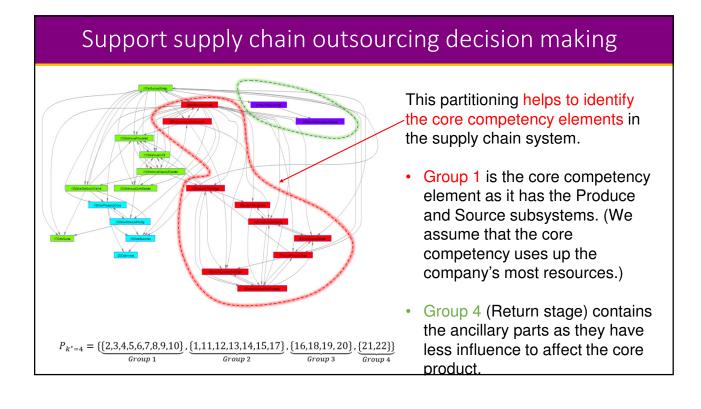
A supply chain is a complex network. There are different types of relationships (or called interactions) among these components, such as information, materiel, function and financial.

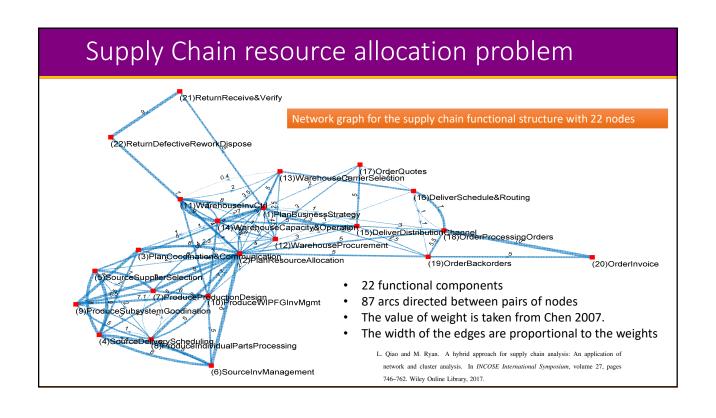
What we do: developing a systematic approach to identify and quantify the interactions and cluster the large network to reasonable number of subgroups of core competencies and

SCOR model structure has 7 stages/subsystems 22 functional component

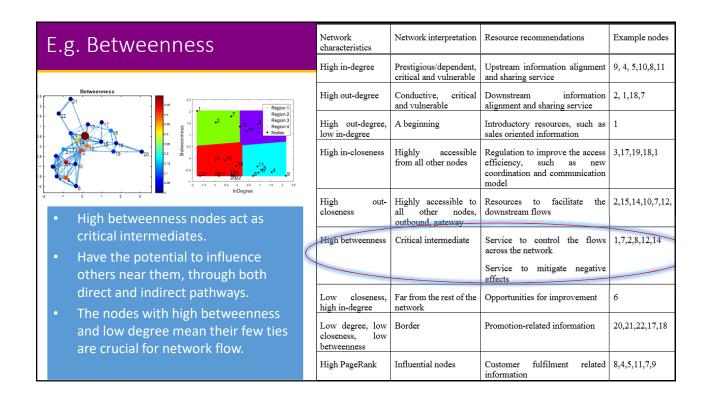




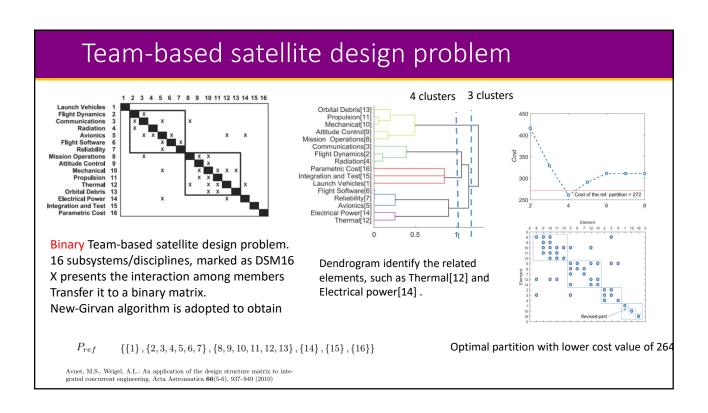




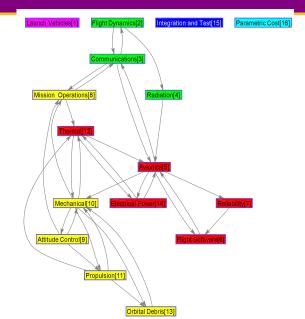
#### Algorithm: Centrality measures in graph theory and clustering algorithm Closeness PageRank DSM + social network analysis (graph theory) In-degree Out-degree In-closeness Out-closenes 57.4 0.0087 0.0255 0.0073 Centrality measures 94.7 0.0115 85.0 0.0221 10.0 0.0056 10.0 20.3 0.0078 0.0068 26.0 0.0190 PageRank 28.0 20.4 0.0056 0.0055 6.0 0.0832 0.0065 0.0069 0.0677 25.0 10.0 10.5 Betweenness 22.0 14.0 0.0029 0.0047 0.0434 0.0094 0.0623 15.0 21.5 0.0060 96.0 OutCloseness 23.4 12.0 0.0057 0.0086 83.0 0.1189 32.6 5.0 0.0046 0.0547 InCloseness 0.0040 23.7 20.1 0.0040 0.0101 0.0482 OutDegree 0.0053 0.0644 23.4 15.0 0.0055 15.0 17.8 0.0068 0.0090 0.0527 InDegree 15.0 5.4 0.0054 0.0055 0.0522 20.0 20.3 0.0057 0.0106 0.0466 15.3 11.7 0.0037 0.0106 0.0190 16 13.0 3.0 0.0059 0.0040 0.0420 Different centralities distribution 11.0 0.0 0.0076 0.0285 0.0012 18 11.0 22.5 0.0075 0.0285 If the distribution of the nodes is not even 19 16.6 5.0 0.0075 0.0005 0.0366 which suggests the existence of something 0.0042 0.0499 20 15.0 0.0 interesting. 5.0 9.0 0.0037 0.0003 0.0124 16.0 0.0030 0.0222



# Team-based DSM clustering



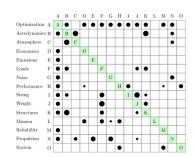
#### Team-based satellite design problem(cont.)

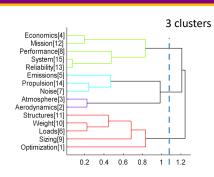


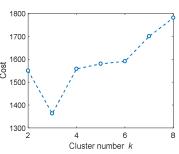
- The optimal number of cluster  $k^* = 4$ .
- Launch Vehicle (1), Integration and Test (15) and Parametric Cost (16) are included though there are not any dependencies to other disciplines. Set the design constraints here that (1), (15) and (16) must be located in independent groups. Then we revise the partition with the same lowest cost.  $k^* = 6$
- Use a colour-coded graph to indicate the hierarchical modularity of the optimal partition.
- The teams with the same colour should work more closely together.

Activity-based DSM clustering

#### Activity-based DSM for aircraft design problem







Plot of cost vs.k suggests the optimal  $k^*=3$ .

Activity-based DSM15 for aircraft design problem.

15 elements, presenting various decision-making activities of the whole design problem.

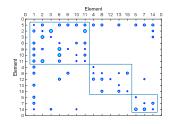
Entities represent the information flow between elements.

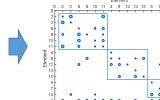
Larger dots denote stronger coupling between the disciplines.

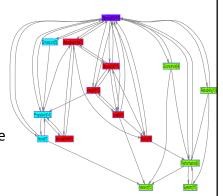
The dendrogram represents nested clusters for DSM.

Lambe, A.B., Martins, J.R.R.A.: Extensions to the design structure matrix for the description of multidisciplinary design, analysis, and optimization processes Struct. Multidisciplinary Optim. 46(2), 273–284 (2012)

#### Activity-based DSM for aircraft design problem(cont.)







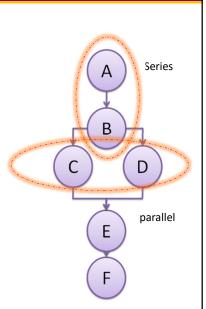
- $P_{k=3}$  is not satisfied as element Optimization(1) is a bus-like element which has links to most of the rest activities.
- Look for a partition with low cost and in which the Optimization[1] is isolated.
- Revised our preferred partition to  $P_{k=4}$ .
- The rest elements group very well as very few interactions are outside the cluster.

The activities with the same colour should work more closely together.

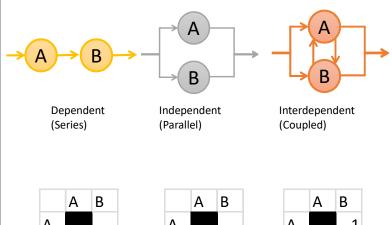
# Parameter-based DSM sequencing

#### DSM sequencing

- Project management is hard...We needs tools to help...
- Network-based (graph theory) methods
  - CPM (Critical Path Method),
  - PERT(Program Evaluation and Review Technique)
- Design Structure Matrix: A system engineering tool.
  - Simple
  - Compact
  - Visual representation of a complex system



# 3 Possible Sequences for 2 tasks



В

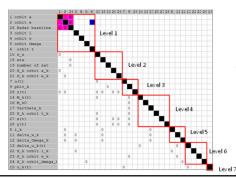
 Sequencing analysis: analysis of the process DSM through logical ordering of the activities, identifying sequential, parallel, and coupled sets of activities.

#### Satellite Formation flying design problem

Parameter-based DSM29

В

- Ssequencing algorithm identifies the concurrent activities and cycles.
- Use the values of the marks to order to rows into a lower triangular form
- Division is based on the concurrency while the high level activities are grouped based on function

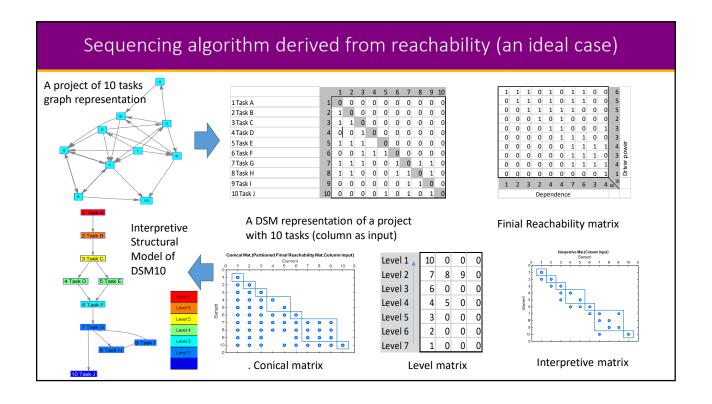


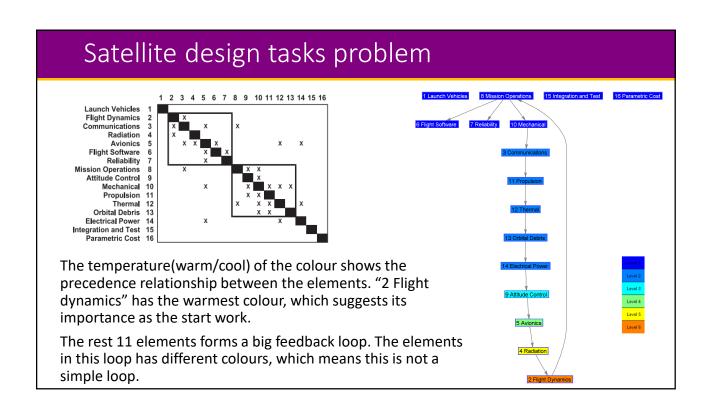
Matrices have 7 levels.

The coupled cycle highlight in pink

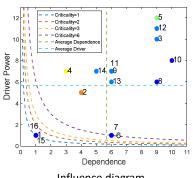
Parameter(s)	Meaning¤	Parameter(s)□	Meaning¤
1-orbit-a□	Reference satellite orbit semimajor axis¤	16·M_k0□	Add-on satellite initial mean anomaly¤
2-orbit-e□	Reference-satellite-orbit- eccentricity□	17-Vartheta_k(0 <sub>k</sub> )□	Cartwheel design parameter□
3 orbit i¤	Reference-satellite-orbit- inclination	18·eta·(η)¤	Cartwheel design parameter□
4 orbit ·w ·(ω)□	Reference-satellite-orbit- argument-of perigee□	19 number of sat□	Number of add-on- satellites□
5 orbit Omega (Ω)¤	Reference satellite orbit- right ascension of the ascending node	20-S_k-orbit-a_k-(a <sub>k</sub> )□	Add-on satellite orbit- semimajor axis¤
6∵orbit t(τ)□	Time of reference satellite perigee passing point	21·S k orbit e k (ak)□	Add-on satellite orbit eccentricity¤
7 u(t)¤	Reference-satellite-orbit- Intersection-angle□	22 S_k orbit i_k (i <sub>k</sub> )□	Add-on satellite orbit inclination□
8 delta i_k (Δi <sub>k</sub> )¤	Inclination difference in formation□	23 S k orbit w k (ω <sub>k</sub> ) <sup>Ω</sup>	Add-on satellite argument of perigee□
9-phiv_k-(φ <sub>k</sub> )□	Cartwheel design parameter: Add-on- satellite initial phase	24·S k· orbit Omega k(Ω <sub>k</sub> )¤	Add-on satellite□
10 <u>w_s (ws)</u> ¤	Add-on-satellite-mean- angular-rate□	25-S k-orbit-t k(tk)	Time of add-on satellite perigee passing point
11 delta_w_k-(Δwk)□	Change in argument of perigee	26-Radar-baseline□	High-level-activity- presents all-the radar- requirements
12· delta Omega k(ΔΩk)¤	Modal separation	27-x(t)¤	Radial difference between the two satellites¤
13 delta_u_k(t)□	Add-on-satellite change in intersection angle:	28·y(t)¤	Along-track difference between the two satellites
14- <u>M_k(t)</u> □	Add-on satellite mean anomaly¤	29-z(t)□	Cross-track-difference- between the two- satellites
15 <u>u_k(t)</u> ¤	Add-on satellite intersection angle¤	¤	¤

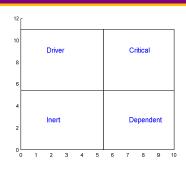
29 parameters in satellite formation flying problem

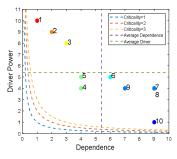




#### Satellite design tasks problem(cont.)







Influence diagram (Drive vs. Dependence plot)

Classification of elements into four sectors

Influence diagram of ideal case

- The driver sector elements influences many other elements. The dependent sector elements are influenced by other elements. For ideal case, the warmer nodes are located in the upper left part and the cooler nodes are located in the lower right. The distribution of the dots indicates the degree of complexity. The satellite design problem is much more complex than the ideal case.
- These three isolated nodes(1,15,16) are located in the equal criticality line (Criticality=1). We can eliminate these nodes for investigation in the next step.

#### Conclusion of our DSM research

- Knowledge about the structure of a problem is important for deepening understanding of design.
- Useful tool to model analysis and manage the complexity of design problems.
- Simple and compact
  - The ease of creating and editing to make changes (erasing and re-writing the matrix)
  - The ease of manipulating the matrix (various DSM based algorithms can support its analysis such as clustering, sequencing derived from data mining, graph theory etc.)
- "This really should be done with a computer". Think about DSM based method. It may help...