

# Mixed Integer Programming for Finding Tensegrity Structures

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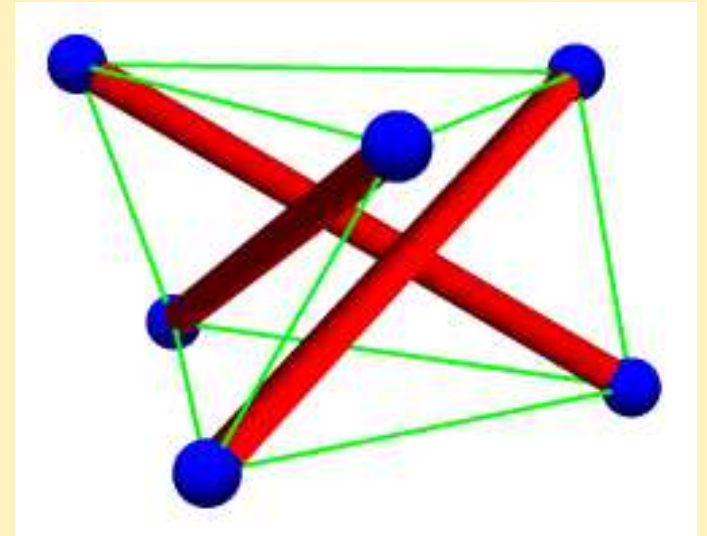
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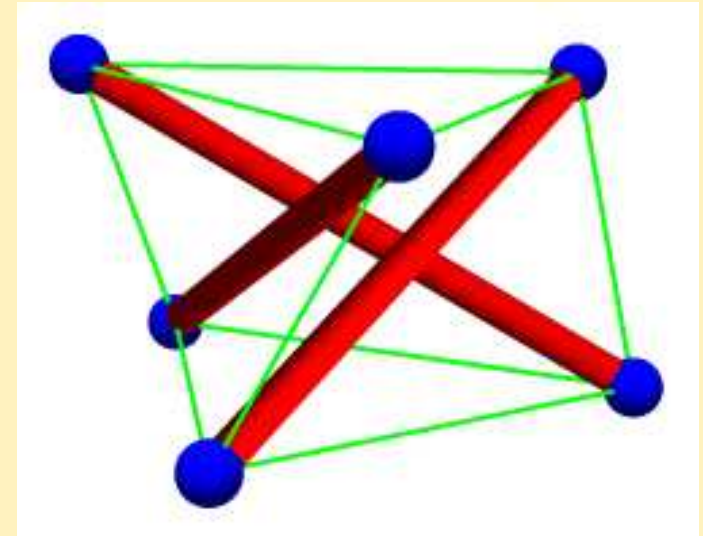
# tensegrity — definition

- [Buckminster Fuller 75]
- pin-jointed structure
  - ◆ cable — tensile force
  - ◆ strut — compressive force
- self-equilibrium condition
  - ◆ with prestresses
- discontinuity of struts
  - ◆ each node has at most one strut
- topology  $(\rightarrow)$



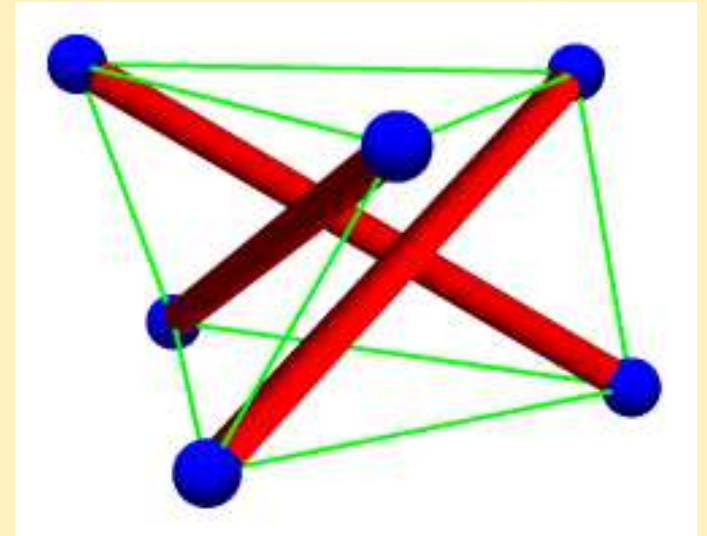
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- topology
  - ◆ connectivity
  - ◆ labeling — “cable” or “strut”
- given a topology — find locations of nodes
  - ◆ group-theoretic symmetry  
[Connelly & Terrell 95] [Connelly & Back 98]
  - ◆ rotational symmetry  
[Sultan, Corless & Skelton 02] [Masic, Skelton & Gill 05]
  - ◆ mathematical programming  
[Zhang, Ohsaki & Kanno 06]
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[Zhang, Ohsaki & Kanno 06]
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# mixed integer program (MIP)

## ■ LP (linear program)

$$\begin{array}{ll} \min & \mathbf{c}^T \mathbf{x} \\ \text{s.t.} & \mathbf{Ax} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0} \end{array}$$

variables :  $\mathbf{x}$  (continuous)

# mixed integer program (MIP)

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variables :  $\mathbf{x}$  (continuous)

## ■ MIP (mixed integer program)

$$\begin{array}{ll} \min_{\mathbf{x}} & \mathbf{c}_1^T \mathbf{x} + \mathbf{c}_2^T \mathbf{t} \\ \text{s.t.} & \mathbf{A}_1 \mathbf{x} + \mathbf{A}_2 \mathbf{t} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0}, \\ & t_i = 0 \text{ or } 1 \end{array}$$

variables :  $\mathbf{x}$  (continuous)

$\mathbf{t} \in \{0, 1\}^m$  (integer)



# MIP and algorithms

$$\begin{array}{ll} \min_{\mathbf{x}, \mathbf{t}} & \mathbf{c}_1^T \mathbf{x} + \mathbf{c}_2^T \mathbf{t} \\ \text{s.t.} & \mathbf{A}_1 \mathbf{x} + \mathbf{A}_2 \mathbf{t} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0}, \\ & t_i \in \{0, 1\} \end{array}$$

- $t_i \in \{0, 1\} \iff t_i = 0 \text{ or } 1$ 
  - ◆ integer (or binary, discrete) variable
  - ◆ LP relaxation:  $0 \leq t_i \leq 1$
- global optimization
- application

# MIP and algorithms

$$\begin{array}{ll} \min_{\mathbf{x}, \mathbf{t}} & \mathbf{c}_1^T \mathbf{x} + \mathbf{c}_2^T \mathbf{t} \\ \text{s.t.} & \mathbf{A}_1 \mathbf{x} + \mathbf{A}_2 \mathbf{t} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0}, \\ & t_i \in \{0, 1\} \end{array}$$

■  $t_i \in \{0, 1\} \Leftrightarrow t_i = 0 \text{ or } 1$

■ global optimization

- ◆ branch-and-bound method, cutting plane method
- ◆ branch-and-cut method
- ◆ software packages [CPLEX], [SCIP], [GLPK], etc

■ application

# MIP and algorithms

$$\begin{aligned} \min_{\mathbf{x}, \mathbf{t}} \quad & \mathbf{c}_1^T \mathbf{x} + \mathbf{c}_2^T \mathbf{t} \\ \text{s.t.} \quad & \mathbf{A}_1 \mathbf{x} + \mathbf{A}_2 \mathbf{t} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0}, \\ & t_i \in \{0, 1\} \end{aligned}$$

■  $t_i \in \{0, 1\} \iff t_i = 0 \text{ or } 1$

■ global optimization

■ application

◆ combinatorial optimization

◆ discrete optimization of structures

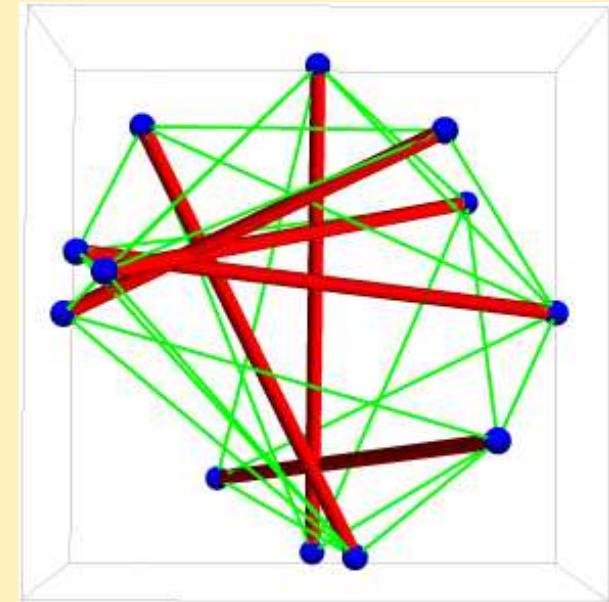
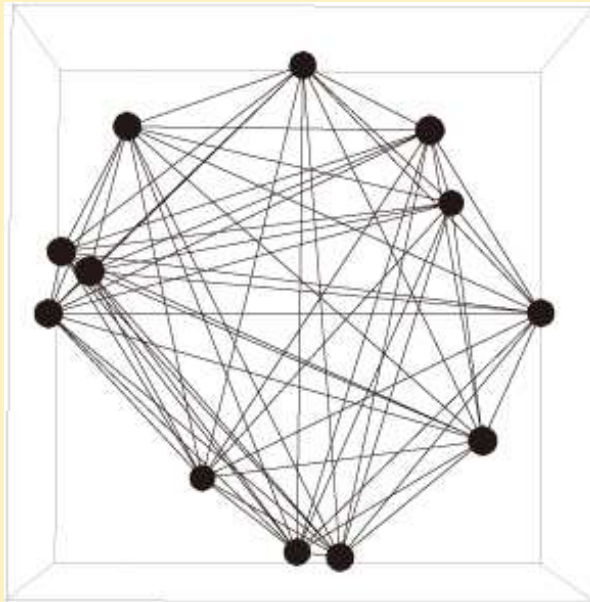
[Stolpe & Svanberg 03], [Rasmussen & Stolpe 08]

◆ worst-case analysis of uncertain structures

[Kanno & Takewaki 07], [Guo, Bai & Zhang 08]

# two-stage algorithm

- ground structure method / structural optimization



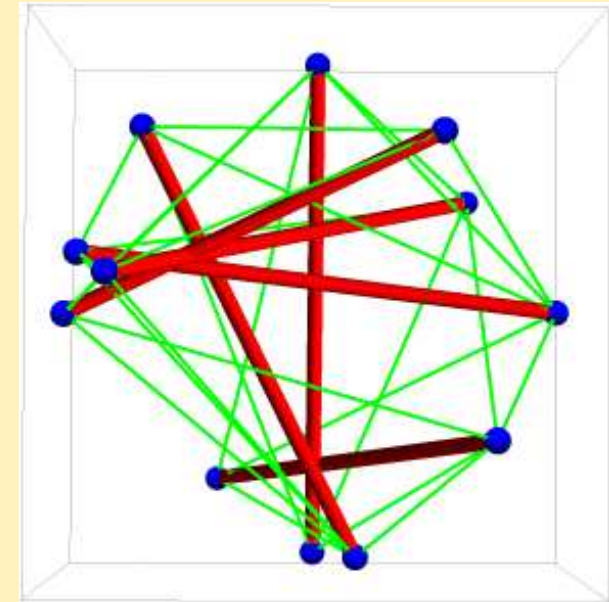
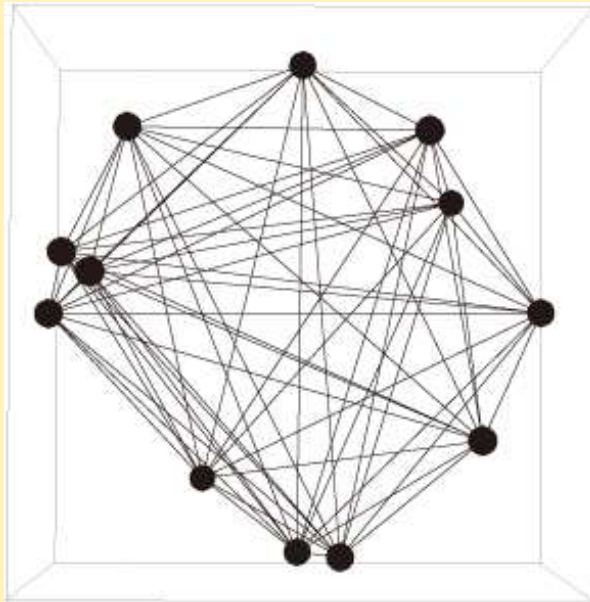
- given:

- ◆ candidate members
- ◆ locations of nodes

- variables: member cross-sectional areas

# two-stage algorithm

- ground structure method / structural optimization



- two stages:

- ◆ MIP-1: find a tensegrity (possibly with many cables)
- ◆ MIP-2: remove redundant cables

- requires no information of topology in advance

# discontinuity condition of struts

$$\sum_{i \in E(n_j)} t_i \leq 1, \quad \forall \text{nodes} \quad (\clubsuit 1)$$

$$-Mt_i \leq q_i \leq M(1 - t_i) - \varepsilon, \quad \forall \text{members} \quad (\clubsuit 2)$$

$$\blacksquare q_i \begin{cases} > 0 & : \text{cable} \\ = 0 & : \text{removed} \\ < 0 & : \text{strut} \end{cases} \quad t_i \in \{0, 1\}$$

■  $M \gg \varepsilon > 0$  : constants

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■  $M \gg \varepsilon > 0$  : constants

■  $\clubsuit 2$ :  $t_i = 1 \Leftrightarrow q_i < 0$  (i.e. strut)

■  $\clubsuit 1$ : each node can have at most one strut

■  $\max \sum t_i \Leftrightarrow \max$  “# of struts”

# MIP-1: max “# of struts”

$$\begin{aligned} \max_{\mathbf{q}, \mathbf{t}} \quad & \sum_{i \in E} t_i \\ \text{s.t.} \quad & \mathbf{H}\mathbf{q} = \mathbf{0}, && (\diamond) \\ & \sum_{i \in E(n_j)} t_i \leq 1, && \forall j \in V \quad (\clubsuit 1) \\ & -Mt_i \leq q_i \leq M(1 - t_i) - \varepsilon, && \forall i \in E \quad (\clubsuit 2) \\ & t_i \in \{0, 1\}, && \forall i \in E \end{aligned}$$

variables :  $q_i$  (axial force)

$t_i$  (label)

given:  $E$  (member candidates)

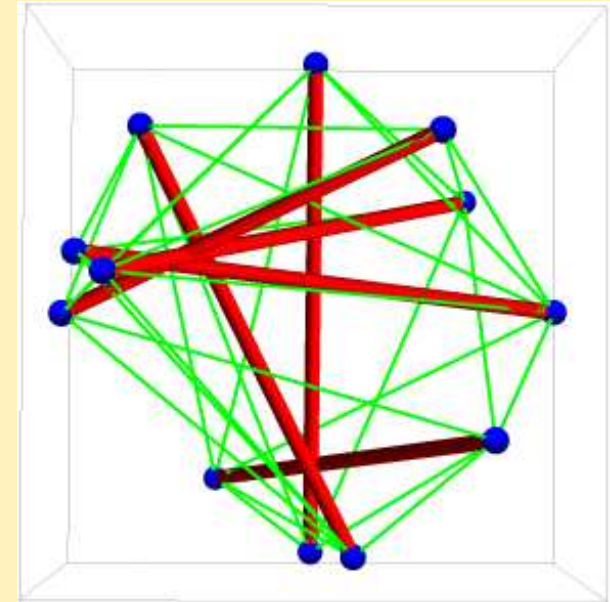
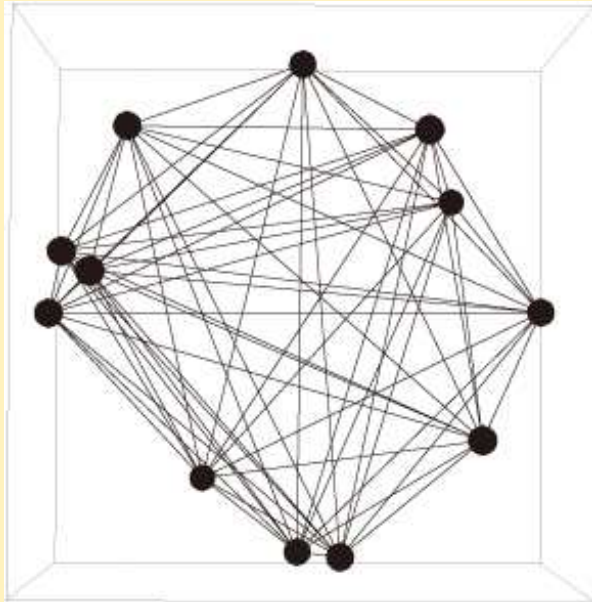
$V$  (locations of nodes)

constraints:  $\diamond$  (self-equilibrium)

$\clubsuit$  (discontinuity of struts)



# solution of MIP-1



- satisfies the discontinuous condition of struts
- possibly includes many cables
  - MIP-2: reduction of number of cables

# MIP-2: min “# of cables”

$$\begin{aligned} \min_{\mathbf{q}, \mathbf{y}} \quad & \sum_{i \in E} y_i \\ \text{s.t.} \quad & \mathbf{H}\mathbf{q} = \mathbf{0}, & (\diamond) \\ & q_i \leq -\varepsilon, & \forall i \in E_{\text{strut}} & (\heartsuit) \\ & 0 \leq q_i \leq M y_i, & \forall i \in E_{\text{cable}} & (\spadesuit) \\ & y_i \in \{0, 1\}, & \forall i \in E \end{aligned}$$

variables :  $q_i$  (axial force)  
 $y_i$  (label)

given:  $E_{\text{strut}}$  (struts)  
 $E_{\text{cable}}$  (candidates of cables)

constraints:  $\diamond$  (self-equilibrium)

# label of cable

$$\begin{array}{ll} q_i \leq -\varepsilon, & \forall \text{struts} & (\heartsuit) \\ 0 \leq q_i \leq My_i, & \forall \text{cables} & (\spadesuit) \end{array}$$

$$\blacksquare q_i \begin{cases} > 0 & : \text{cable} \\ = 0 & : \text{removed} \\ < 0 & : \text{strut} \text{ — fixed } (\heartsuit) \end{cases} \quad y_i \in \{0, 1\}$$

■  $M \gg \varepsilon > 0$  : constants

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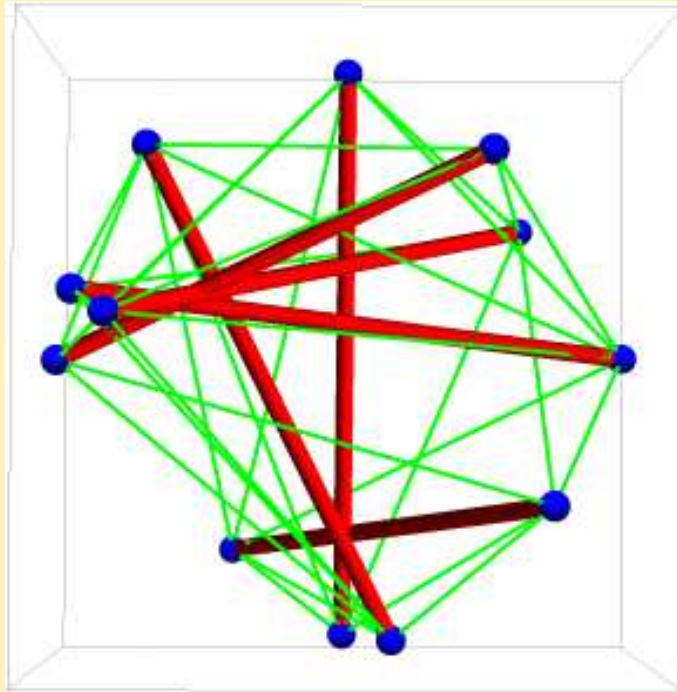
■  $M \gg \varepsilon > 0$  : constants

■  $\min \sum y_i$

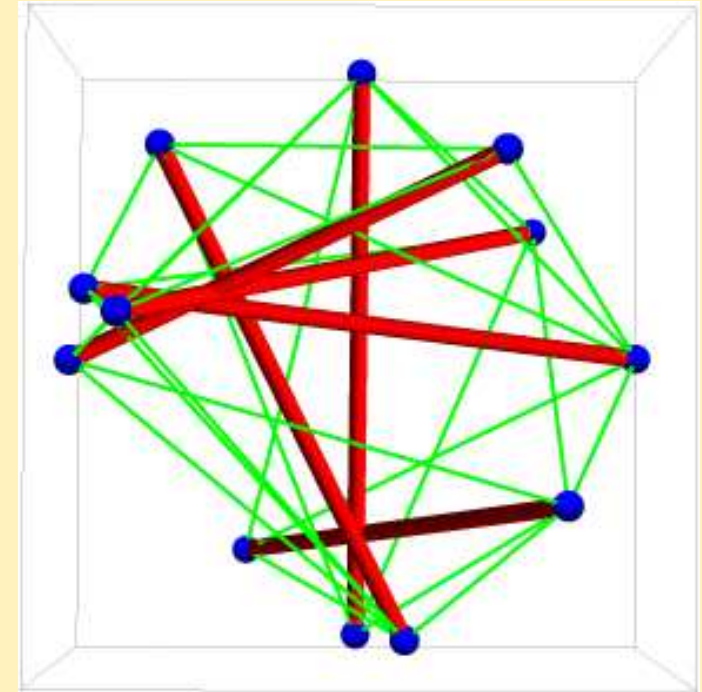
◆  $\spadesuit$ :  $y_i = 1 \Leftrightarrow q_i > 0$  (i.e. cable)

◆  $\sum y_i =$  “# of struts”

# solution of MIP-2



30 cables



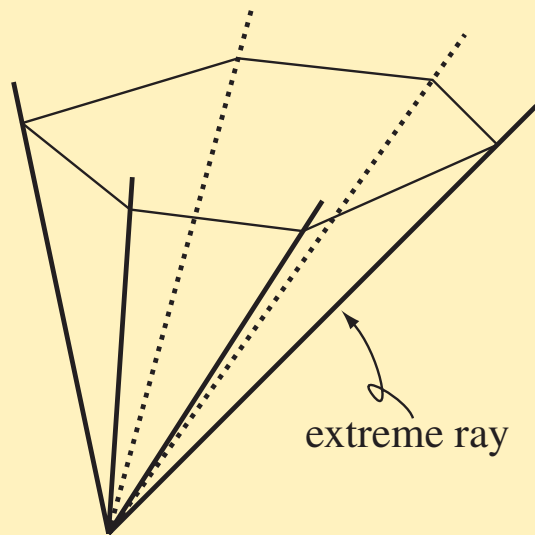
25 cables

- 6 struts
- satisfies the discontinuous condition of struts
- includes no “redundant” cables

# enumeration of tensegrities

- set of tensegrities (self-equilibrium modes)

$$\mathcal{T} = \left\{ \mathbf{q} \mid \begin{array}{l} \mathbf{H}\mathbf{q} = \mathbf{0} \\ q_i \geq 0 \ (\forall i \in E_{\text{cable}}) \\ q_j \leq 0 \ (\forall j \in E_{\text{strut}}) \end{array} \right\}$$



- $\mathbf{q} \in \mathbb{R}^{|E|}$   
( $E := E_{\text{cable}} \cup E_{\text{strut}}$ )
- $\mathcal{T} \leftrightarrow$  polyhedral cone in  $\mathbb{R}^{|E|}$
- (minimal) tensegrity  $\leftrightarrow$  extreme ray

# enumeration of tensegrities

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- enumeration of extreme rays:

- ◆ double description method

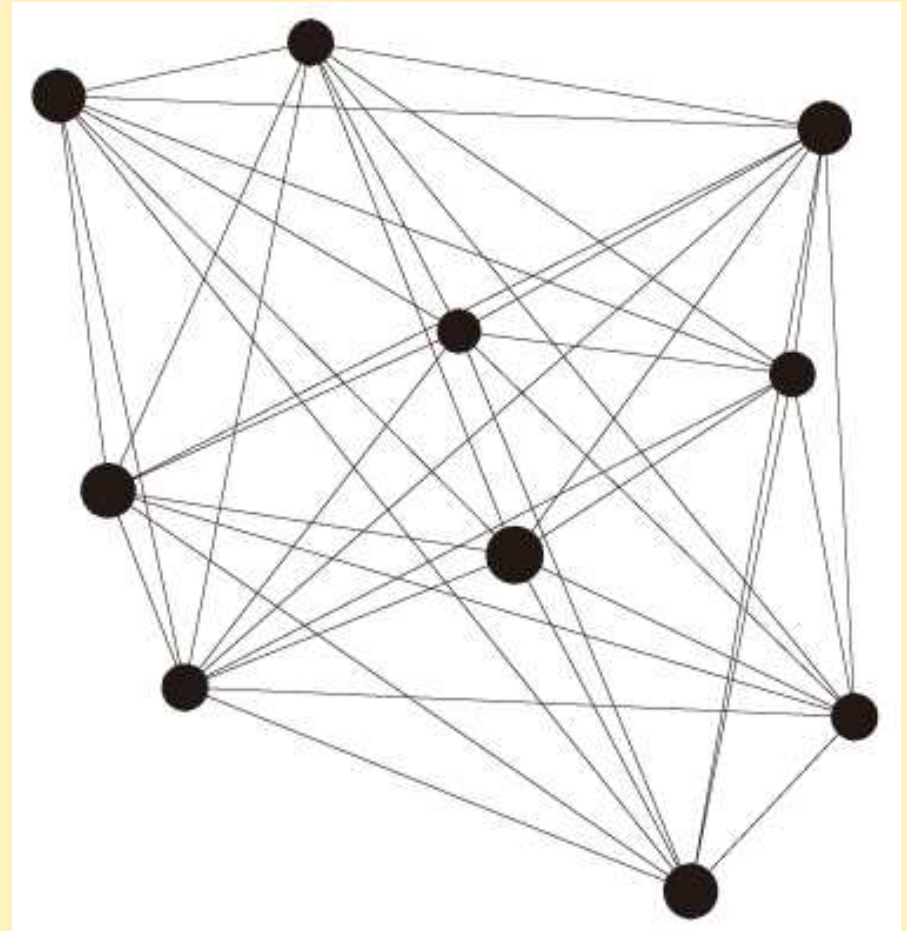
[Motzkin, Raiffa, Thompson, & Thrall 53] [Fukuda & Prodon 96]

- ◆ reverse search

[Avis & Fukuda 96]

# ex.) symmetric configuration

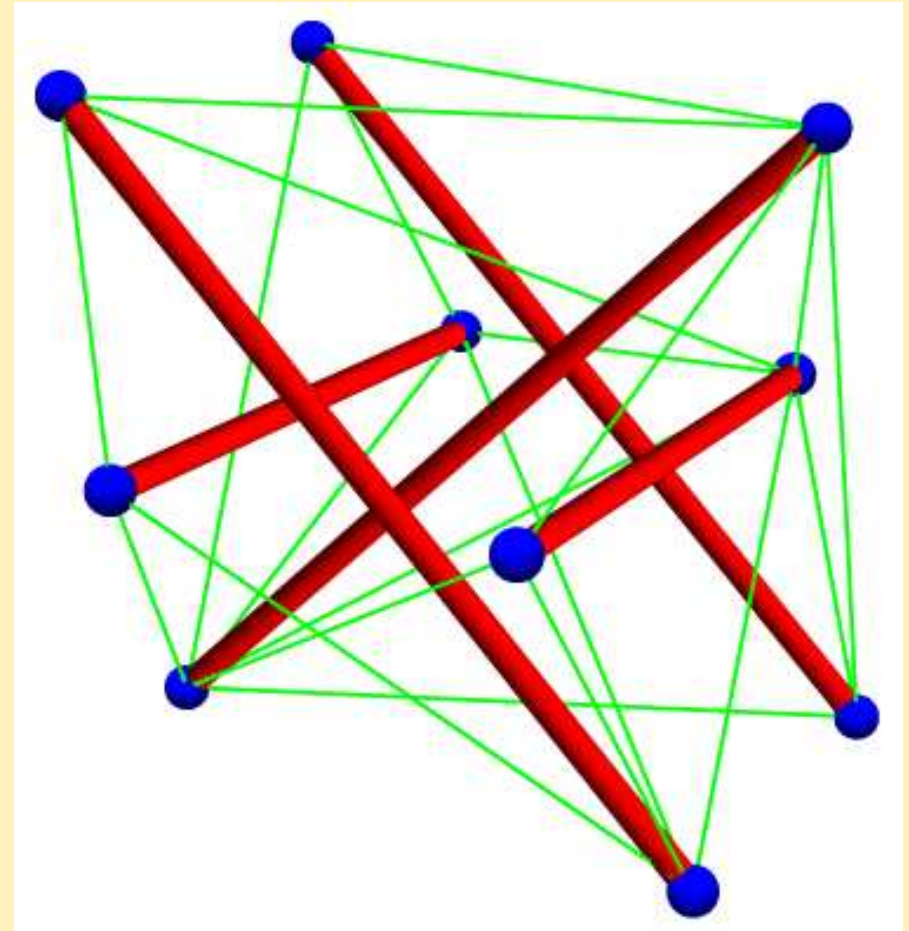
- 10 nodes
- 41 members  
(perfect graph)
- CPLEX (ver. 11.2)





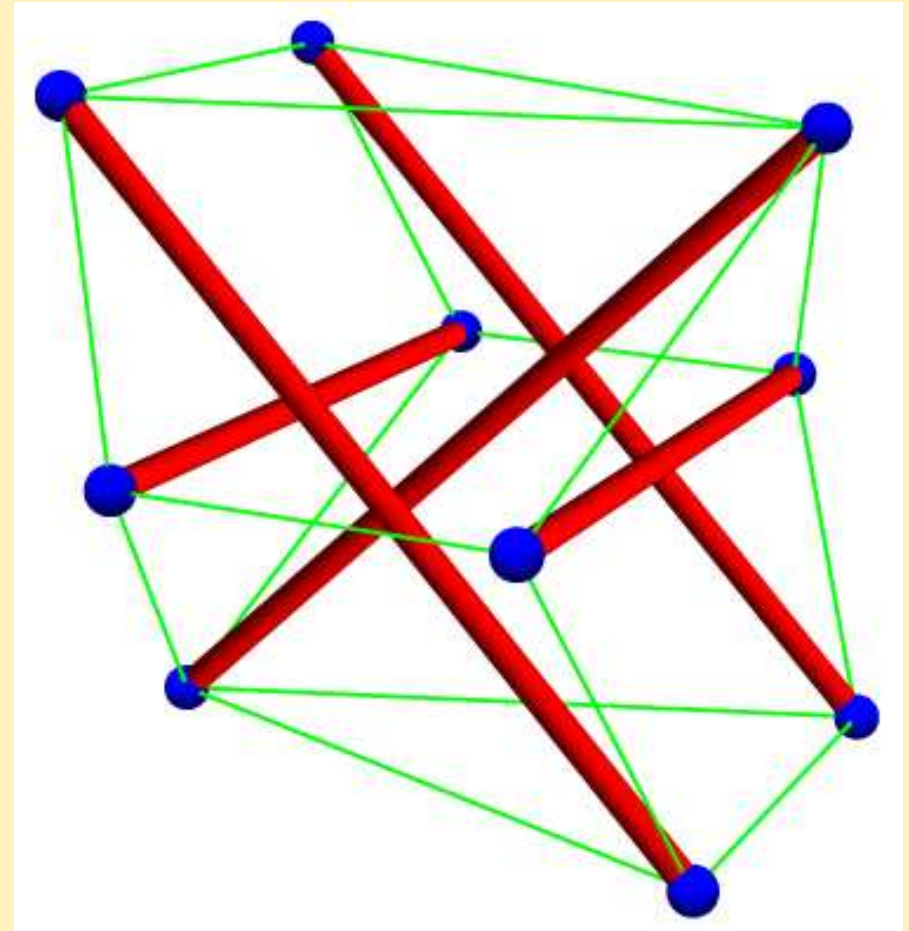
# ex.) symmetric configuration

- 10 nodes
- 41 members  
(perfect graph)
- CPLEX (ver. 11.2)
- 5 struts
- solution of MIP-1  
→ 18 cables

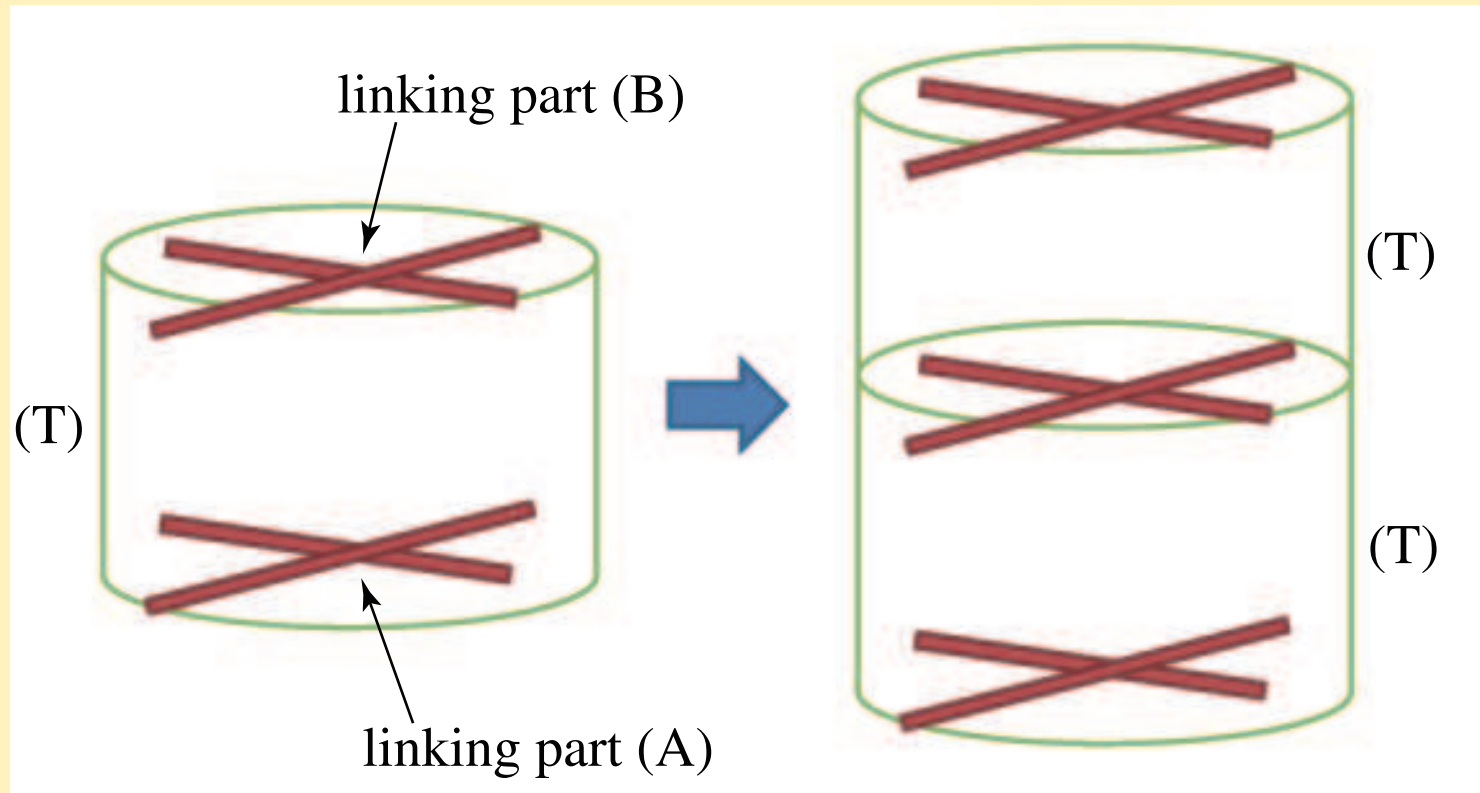


# ex.) symmetric configuration

- 10 nodes
- 41 members  
(perfect graph)
- CPLEX (ver. 11.2)
- 5 struts
- solution of MIP-2  
→ 16 cables  
kinematically & statically  
indeterminate  
(prestress stable)



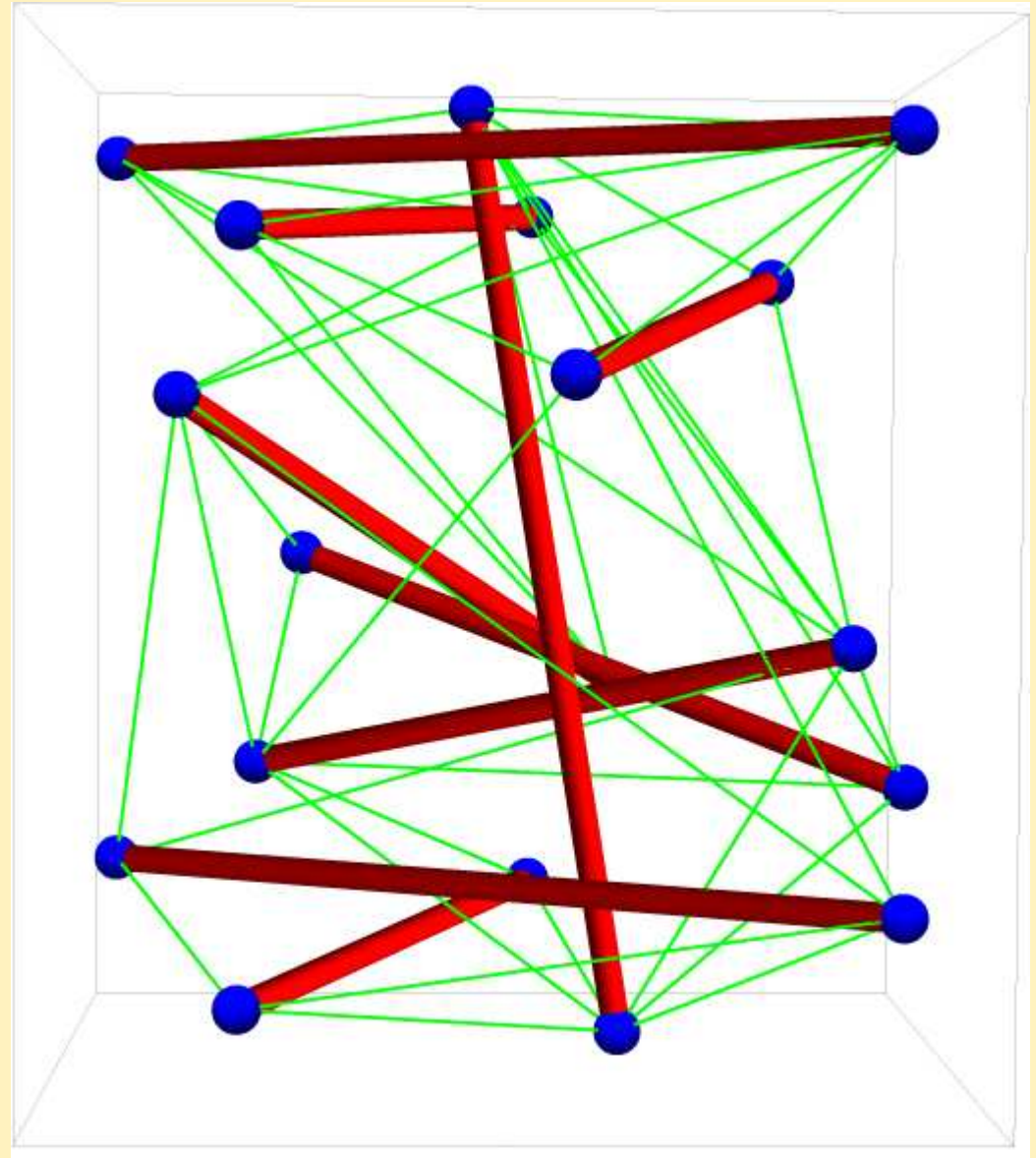
# tensegrity module



- tensegrity module (T)
- “struts of (A)” are parallel to “struts of (B)”
- merge duplicate linking parts  $\Rightarrow$  (T)(T)⋯(T) : tensegrity

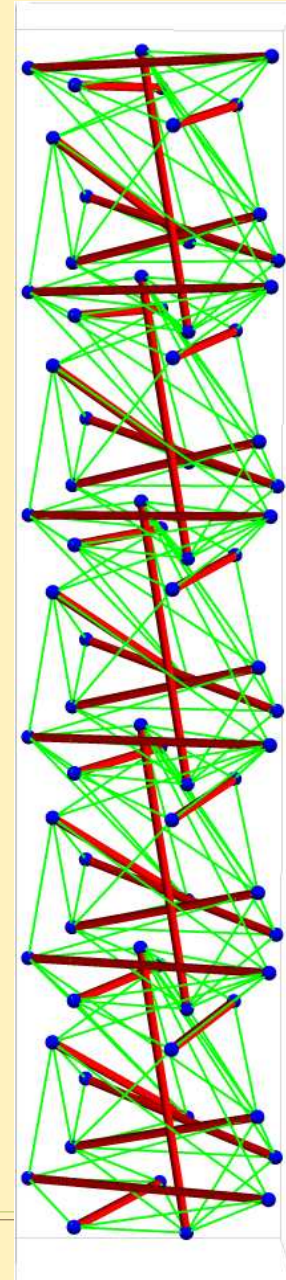
# ex.) tower-type module

- 18 nodes
- perfect graph  
→ 9 struts



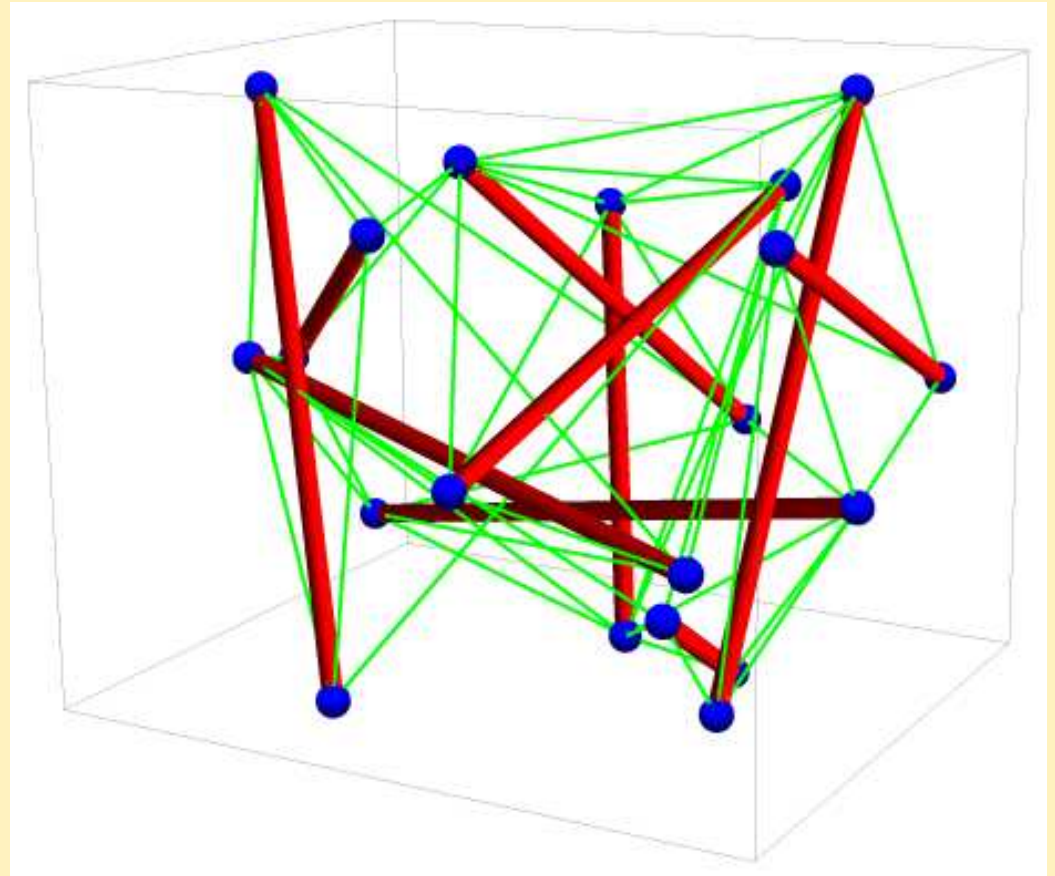
# ex.) tower-type module

- 18 nodes
- perfect graph  
→ 9 struts
- 5 modules  
discontinuity condition  
is still satisfied



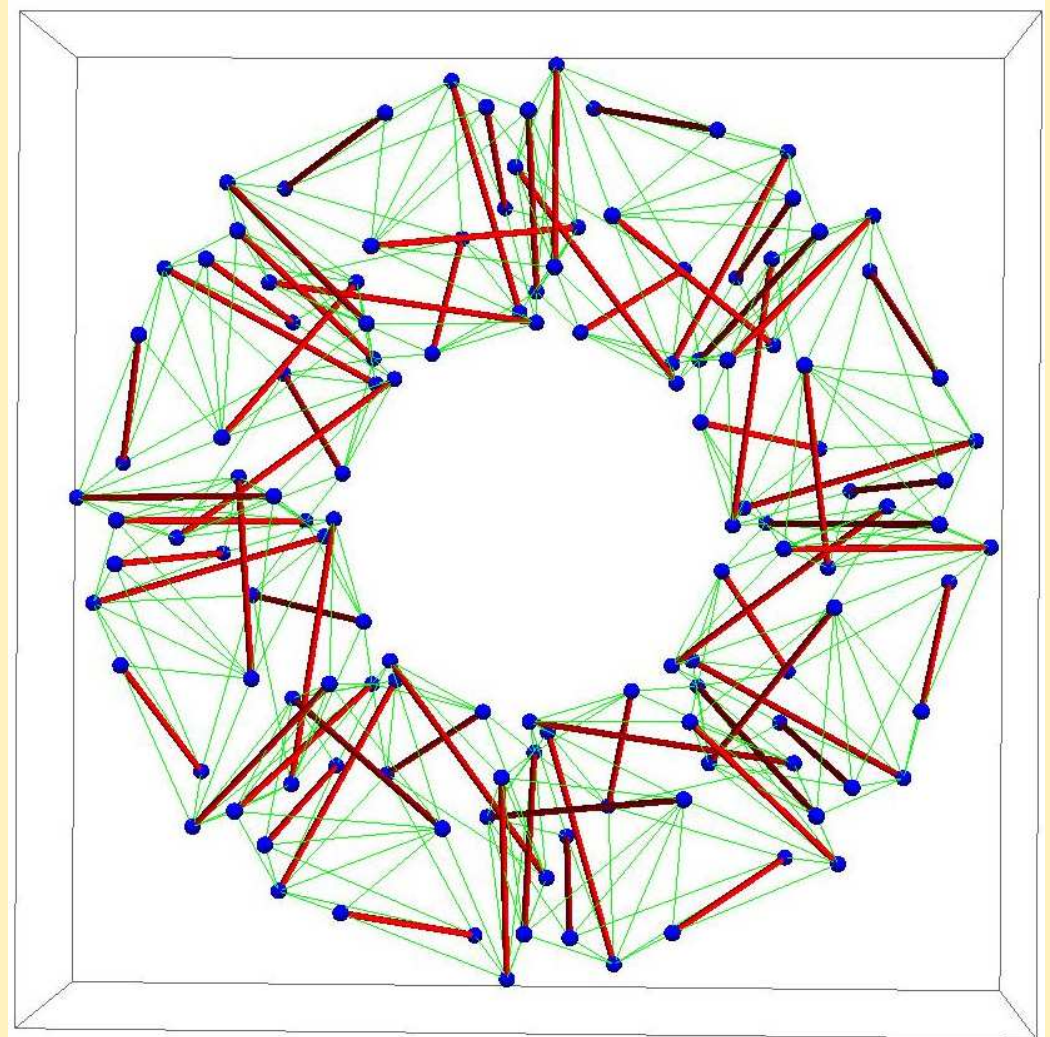
# ex.) ring-type module

- 18 nodes
- perfect graph  
→ 9 struts



# ex.) ring-type module

- 18 nodes
- perfect graph  
→ 9 struts
- 8 modules  
discontinuity condition  
is still satisfied



## ■ tensegrity

- ◆ self-equilibrium configuration
- ◆ discontinuous condition of struts
- ◆ topology — connectivity of “cables & struts”

## ■ two-stage algorithm

- ◆ ground structure method
- ◆ Mixed Integer Programming
  - MIP-1: max “# of struts”
  - MIP-2: min “# of cables”
- ◆ requires no information of topology in advance