

Second-Order Cone Programming for
Complementary Energy Principle of Cable Networks

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Total potential energy principle :

- contains only displacement
- stable equilibrium \implies min. TPE

Complementary energy principle :

- continuum
 - 2nd PK stress, displacement (Hellinger, '14)
 - 1st PK stress, Biot stress, rotation (Koiter, '76)
 - 1st PK stress* (Zubov, '70; Koiter, '76)
- truss
 - internal force vector* (Mikkola, '89)
- stable equilibrium \nRightarrow min. CE

* multi-valued function

- “1st PK stress – displacement gradient” (constitutive law)
 - multi-valued inversion (Koiter, '76)

Questions :

1. Does CE principle contain only stress components?
2. Does CE always attain minimum at the stable equilibrium?
3. Is CE determined uniquely?
(Otherwise, CE may be a multi-valued function.)
4. Is CE formulated in an explicit algebraic form?

Questions :

1. Does CE principle contain only stress components?
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3. Is CE determined uniquely?
(Otherwise, CE may be a multi-valued function.)
4. Is CE formulated in an explicit algebraic form?

Our results :

— 'yes' for cable networks

which can transmit only tension force

CE principle for trusses :

small deformation :

$$\begin{aligned}
 (\Pi^C) : \min & \quad \sum_{i=1}^{n^m} w_i^C(q_i) - \mathbf{x}_0^\top \mathbf{q} \\
 \text{s.t.} & \quad \mathbf{A}\mathbf{q} + \mathbf{f} = \mathbf{0}. \quad : \text{equilibrium eqs.}
 \end{aligned}$$

finite deformation :

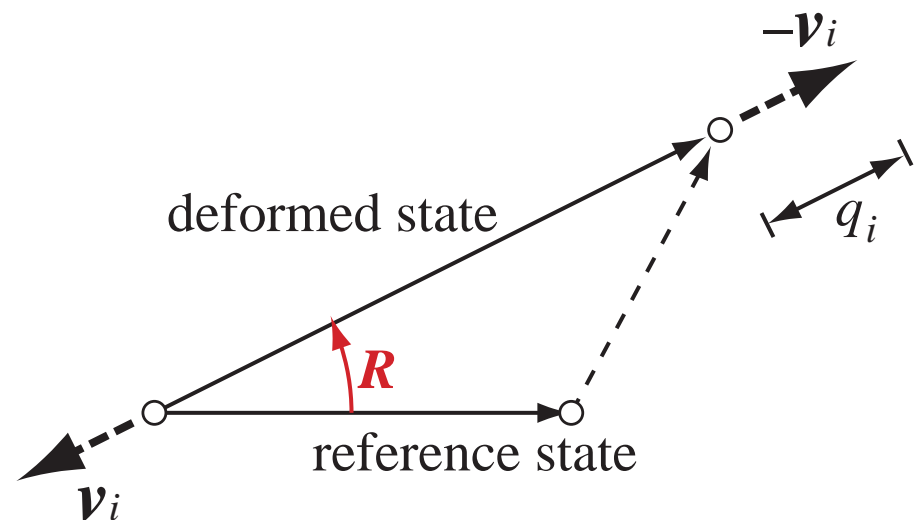
Equilibrium eqs. : $\mathbf{R}\mathbf{A}\mathbf{q} + \mathbf{f} = \mathbf{0}$. — unknown rotation

Mikkola's CE ('89) :

$$\Pi^C(\mathbf{v}) = \sum_{i=1}^{n^m} \left(w_i^C(\|\mathbf{v}_i\|) \pm l_i^0 \|\mathbf{v}_i\| - \mathbf{b}_i^\top \mathbf{v}_i \right)$$

— only stationary principle

- $q_i \in \mathbf{R}$: axial force
- $\mathbf{v}_i \in \mathbf{R}^3$: internal force vector



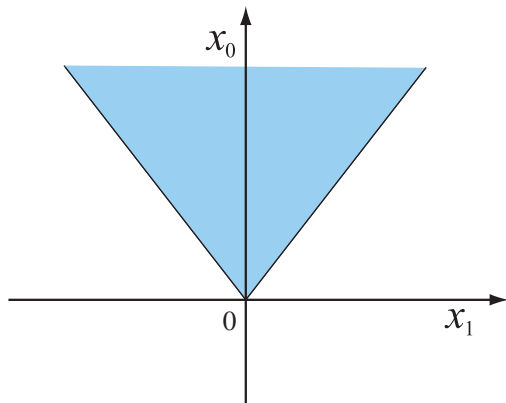
Second-Order Cone Programming : SOCP

$$\begin{aligned} \min \quad & \mathbf{c}^\top \mathbf{x} \\ \text{s.t.} \quad & \mathbf{Ax} = \mathbf{b}, \quad x_0 \geq \|\mathbf{x}_1\|. \end{aligned}$$

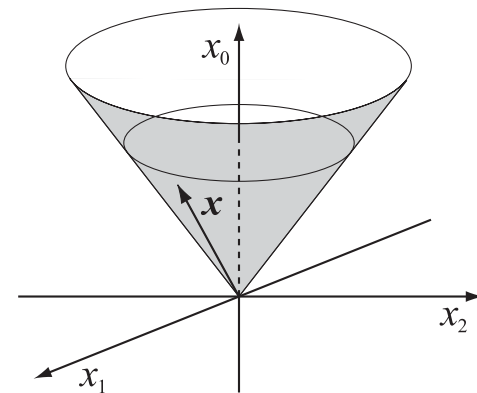
$$\|\mathbf{x}_1\| = (\mathbf{x}_1^\top \mathbf{x}_1)^{1/2} \quad : \text{Euclidean norm}$$

$$(\text{SOC}) = \{(x_0, \mathbf{x}_1) \mid x_0 \geq \|\mathbf{x}_1\|\} \quad : \text{second-order cone}$$

1. convex nonlinear programming
2. including LP, QP, etc.
3. primal-dual interior-point method (Monteiro & Tsuchiya, '00)
4. applications
 - truss topology optimization (Jarre *et al.*, '98)



SOC in 2D ($x_0 \geq |x_1|$)



SOC in 3D ($x_0 \geq \sqrt{x_{11}^2 + x_{12}^2}$)

Second-Order Cone Programming : SOCP

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min. of TPE \implies primal SOCP



Lagrangian duality

min. of CE \longleftarrow dual SOCP

Min. of TPE :

$$\begin{aligned} (\Pi) : \min \quad \Pi &= \sum_{i=1}^{n^m} w_i(y_i) - \mathbf{f}^\top \mathbf{u} \\ \text{s.t.} \quad y_i &= \|\mathcal{B}_i \mathbf{u}\|. \end{aligned}$$

Variables: y_i : member elongation \mathbf{u} : disp. of internal nodes

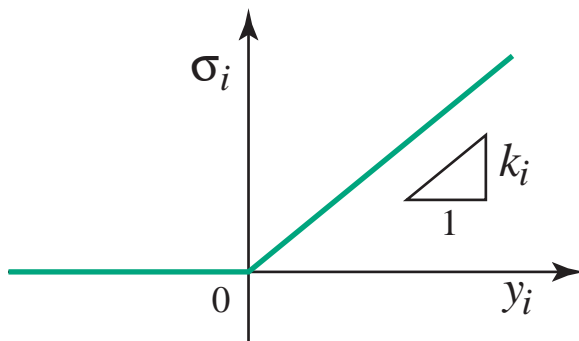
Given: \mathbf{f} : external forces l_i^0 : member unstressed length

strain energy :

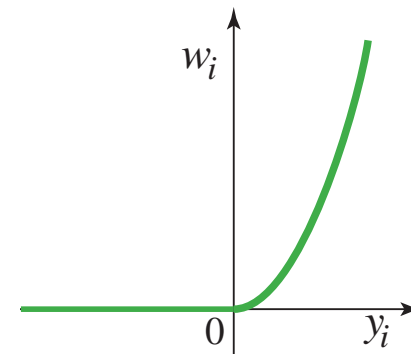
$$w_i(y_i) = \begin{cases} \frac{1}{2}k_i y_i^2 & (y_i \geq 0), \\ 0 & (y_i < 0). \end{cases}$$

compatibility :

$$y_i = \|\mathbf{B}_i(\mathbf{x}^0 + \mathbf{u}) - \mathbf{b}_i^0\| - l_i^0$$



axial force–elongation



strain energy

min. of TPE \implies primal SOCP



Lagrangian duality

min. of CE \longleftarrow dual SOCP

SOCP formulation :

1. convex relaxation

• compatibility :

$$y_i = \|\mathcal{B}_i \mathbf{u}\| \quad \Longrightarrow \quad y_i \geq \|\mathcal{B}_i \mathbf{u}\| \quad : \text{second-order cone}$$

2. strain energy

$$w_i(y_i) \quad : \text{for cable} \quad \Longrightarrow \quad \frac{1}{2}k_i y_i^2 \quad : \text{for truss}$$

SOCP formulation :

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$$w_i(y_i) \quad : \text{for cable} \quad \Longrightarrow \quad \frac{1}{2}k_i y_i^2 \quad : \text{for truss}$$

$$\begin{aligned} \text{(P)} : \min \quad & \phi_P = \sum_{i=1}^{n^m} \frac{1}{2} k_i y_i^2 - \mathbf{f}^\top \mathbf{u} \\ \text{s.t.} \quad & y_i \geq \|\mathcal{B}_i \mathbf{u}\|. \end{aligned}$$

1. (P) = SOCP

2. (P) has the same optimizer as that of **min. of TPE**

3. polynomial-time algorithm — **IPM**

• Y. Kanno, M. Ohsaki and J. Ito ('02)

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min. of TPE \implies primal SOCP



Lagrangian duality

min. of CE \longleftarrow dual SOCP

LP (Linear Programming) :

$$\begin{aligned} \text{(P)} : \min \quad & \mathbf{c}^\top \mathbf{x} \\ \text{s.t.} \quad & \mathbf{Ax} = \mathbf{b}, \quad \mathbf{x} \geq \mathbf{0}. \end{aligned}$$

Lagrangian :

$$L(\mathbf{x}, \mathbf{y}, \mathbf{s}) = \begin{cases} \mathbf{c}^\top \mathbf{x} - \mathbf{y}^\top (\mathbf{Ax} - \mathbf{b}) - \mathbf{s}^\top \mathbf{x} & (\mathbf{s} \geq \mathbf{0}), \\ +\infty & \text{(otherwise)}. \end{cases}$$

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Lagrangian dual :

$$\begin{aligned} \text{(D)} : \max \quad & \mathbf{b}^\top \mathbf{y} \\ \text{s.t.} \quad & \mathbf{A}^\top \mathbf{y} + \mathbf{s} = \mathbf{c}, \quad \mathbf{s} \geq \mathbf{0}. \end{aligned}$$

“Nice” duality :

1. (D) is also LP

2. (D) does not contain “ \mathbf{x} ”

3. strong duality : $\min (\text{P}) = \max (\text{D})$

not satisfied by NLP in general

SOCP :

$$\begin{aligned} \text{(P)} : \min \quad & \mathbf{c}^\top \mathbf{x} \\ \text{s.t.} \quad & \mathbf{Ax} = \mathbf{b}, \quad \mathbf{x} \in \text{SOC}. \end{aligned}$$

(Extended) Lagrangian :

$$L(\mathbf{x}, \mathbf{y}, \mathbf{s}) = \begin{cases} \mathbf{c}^\top \mathbf{x} - \mathbf{y}^\top (\mathbf{Ax} - \mathbf{b}) - \mathbf{s}^\top \mathbf{x} & (\mathbf{s} \in \text{SOC}), \\ +\infty & (\text{otherwise}). \end{cases}$$

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“Nice” duality :

1. (D) is also SOCP

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1. self-duality :

$$\mathbf{s} \in \text{SOC} \iff \mathbf{s}^\top \mathbf{x} \geq 0 \quad (\forall \mathbf{x} \in \text{SOC})$$

2. L is linear w.r.t. \mathbf{x}

(though (P) is non-linear)

SOCP formulation :

$$\begin{aligned} \text{(P)} : \min \quad & \phi_P(\mathbf{y}, \mathbf{u}) \\ \text{s.t.} \quad & y_i \geq \|\mathcal{B}_i \mathbf{u}\|. \end{aligned}$$

(Extended) Lagrangian :

$$L(\mathbf{y}, \mathbf{u}, \mathbf{q}, \mathbf{v}) = \begin{cases} \phi_P(\mathbf{y}, \mathbf{u}) - \sum_{i=1}^{n^m} (q_i y_i + \mathbf{v}_i^\top \mathcal{B}_i \mathbf{u}) & (q_i \geq \|\mathbf{v}_i\| (\forall i)), \\ +\infty & \text{(otherwise)}. \end{cases}$$

- linear w.r.t. \mathbf{u}

SOCP formulation :

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- linear w.r.t. \mathbf{u}

Min. of TPE :

$$\begin{aligned} (\text{II}) : \min \quad & \Pi(\mathbf{y}, \mathbf{u}) \\ \text{s.t.} \quad & y_i = \|\mathcal{B}_i \mathbf{u}\|. \end{aligned}$$

Classical Lagrangian (Hellinger '14; Washizu '82):

$$L_0(\mathbf{c}, \mathbf{u}, \mathbf{q}) = \Pi(\mathbf{y}, \mathbf{u}) - \sum_{i=1}^{n^m} q_i (y_i - \|\mathcal{B}_i \mathbf{u}\|).$$

- dual problem contains \mathbf{u}

min. of TPE \implies primal SOCP



Lagrangian duality

min. of CE \longleftarrow dual SOCP

$$\begin{aligned}
 (\Pi) : \min \quad & \Pi(\mathbf{y}, \mathbf{u}) \\
 \text{s.t.} \quad & y_i = \|\mathcal{B}_i \mathbf{u}\|.
 \end{aligned}$$

$$\begin{aligned}
 (\Pi^C) : \min \quad & \Pi^C(\mathbf{v}) \quad : \text{CE} \\
 \text{s.t.} \quad & \sum_{i=1}^{n^m} \mathbf{B}_i^\top \mathbf{v}_i + \mathbf{f} = \mathbf{0}. \quad : \text{equilibrium eqs.}
 \end{aligned}$$

$$\Pi^C(\mathbf{v}) = \sum_{i=1}^{n^m} \frac{\mathbf{v}_i^\top \mathbf{v}_i}{2k_i} + \sum_{i=1}^{n^m} l_i^0 \|\mathbf{v}_i\| + \sum_{i=1}^{n^m} (\mathbf{h}_i^0 - \mathbf{b}_i)^\top \mathbf{v}_i$$

Strong duality :

$\exists \mathbf{v}$ satisfying “equilibrium eqs.” \implies

(i) \exists optimal solutions of (Π) and (Π^C)

(ii) $\text{TPE}^* = -\text{CE}^*$

(iii) \mathbf{v}_i^* is optimum \iff KKT conditions

- (iii) $\iff \mathbf{v}_i^* : \text{internal force vector}$ at the equilibrium uniquely exists

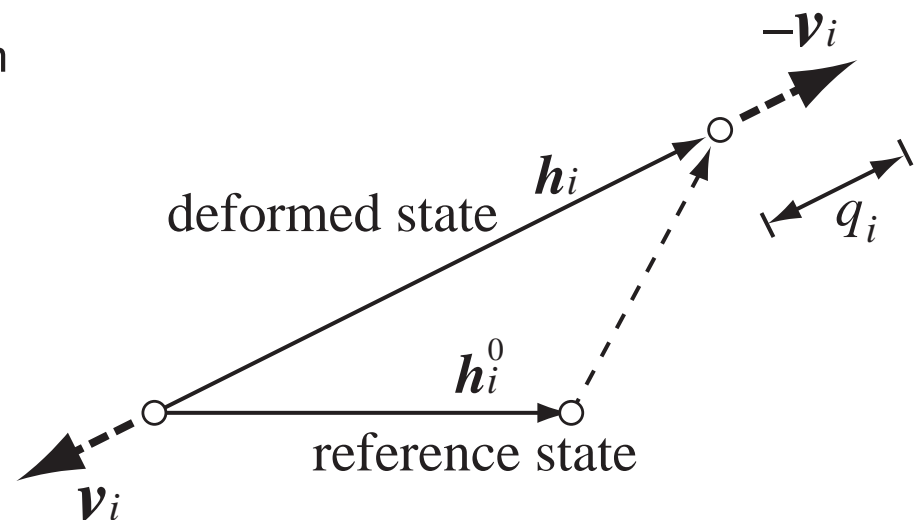
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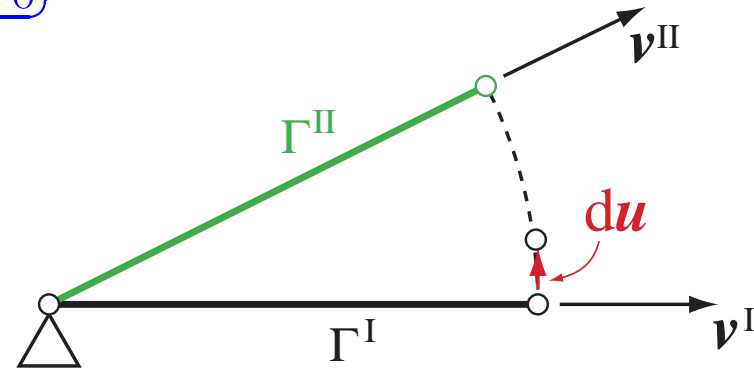
1. (Π^C) contains only $\mathbf{v}_i \in \mathbf{R}^3$ (= internal force vector)
2. CE attains minimum at the equilibrium
3. CE is determined uniquely

- CE depends on the reference state



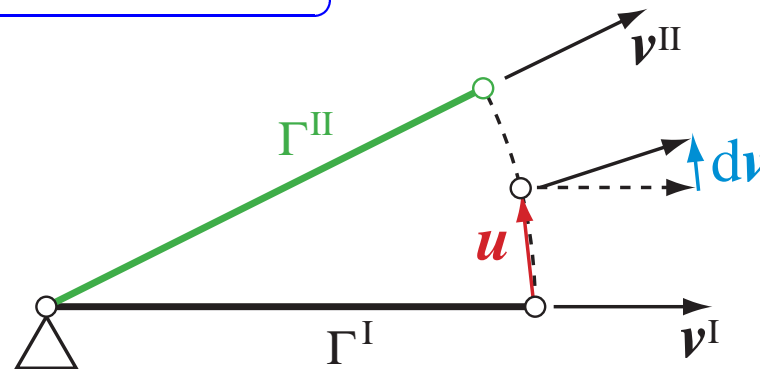
Rigid body rotation

$$\text{work : } dW = \mathbf{v}^\top d\mathbf{u} = 0$$



$$\mathbf{v}^\top d\mathbf{u} = 0$$

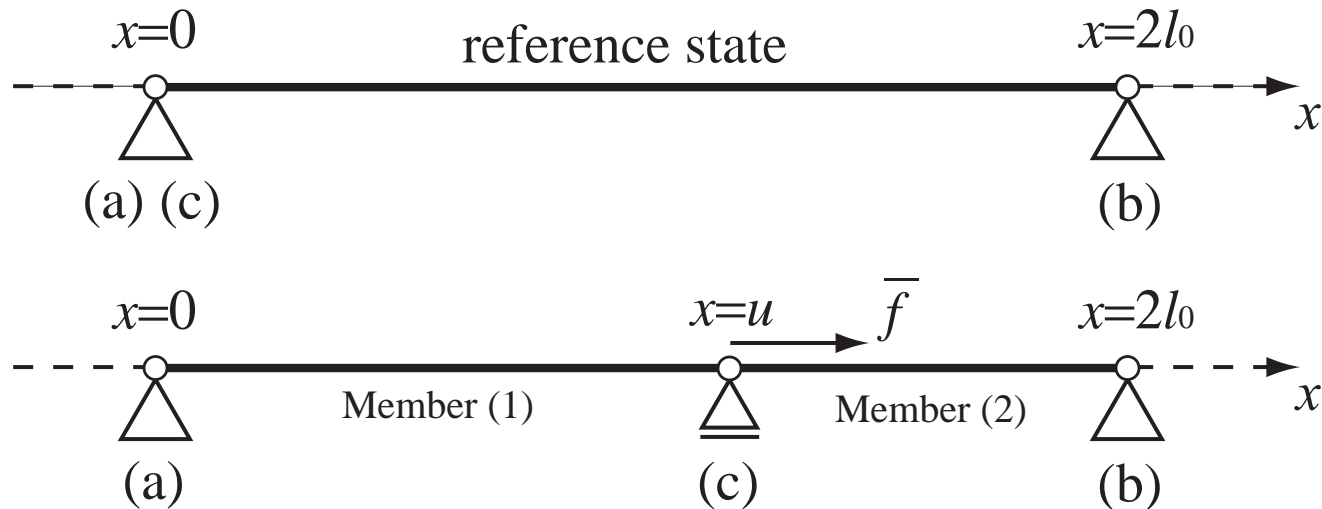
$$\text{complementary work : } dW^C = \mathbf{u}^\top d\mathbf{v}$$



$$\mathbf{u}^\top d\mathbf{v} \neq 0$$

- $\Gamma^I \Rightarrow \Gamma^{II} : W^C \neq 0$
- CE depends on the rigid body rotation

Example :



$$\begin{aligned}
 (\Pi^C) : \min \quad & \Pi^C = \frac{1}{2k}(v_1^2 + v_2^2) + l^0(|v_1| + |v_2|) - 2l^0v_2 \\
 \text{s.t.} \quad & v_1 + v_2 + f = 0.
 \end{aligned}$$

- optimal solution : $(v_1^*, v_2^*) = (-f, 0)$ — member (2) is slackening

CE for small deformation : $\Pi_{\text{LIN}}^C = \frac{1}{2k}(v_1^2 + v_2^2) - 2l^0v_2$

- optimal solution : $(v_1^*, v_2^*) = \left(-kl^0 + \frac{3f}{2}, kl^0 - \frac{f}{2}\right)$

Conclusions :

1. CE principle for cable networks

- min. of TPE — primal SOCP
- min. of CE — dual SOCP
- contains only **stress components**

2. CE function for large deformation

- uniquely determined
- formulated explicitly
- always attains minimum at the equilibrium
- agrees with the complementary work

3. Strong duality between **min. of TPE** and **min. of CE**

- $TPE^* = -CE^*$
- existence and uniqueness of solution