

**Dynamic Steady-State Analysis of Structures
under Uncertain Harmonic Loads
via Semidefinite Program**

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[†]University of Tokyo (Japan)

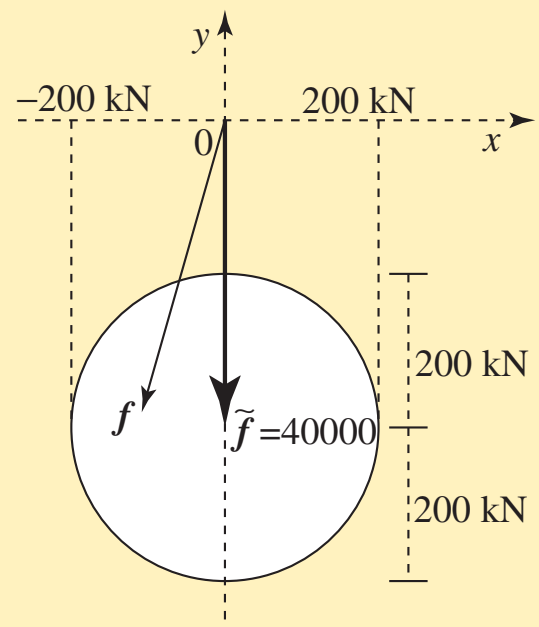
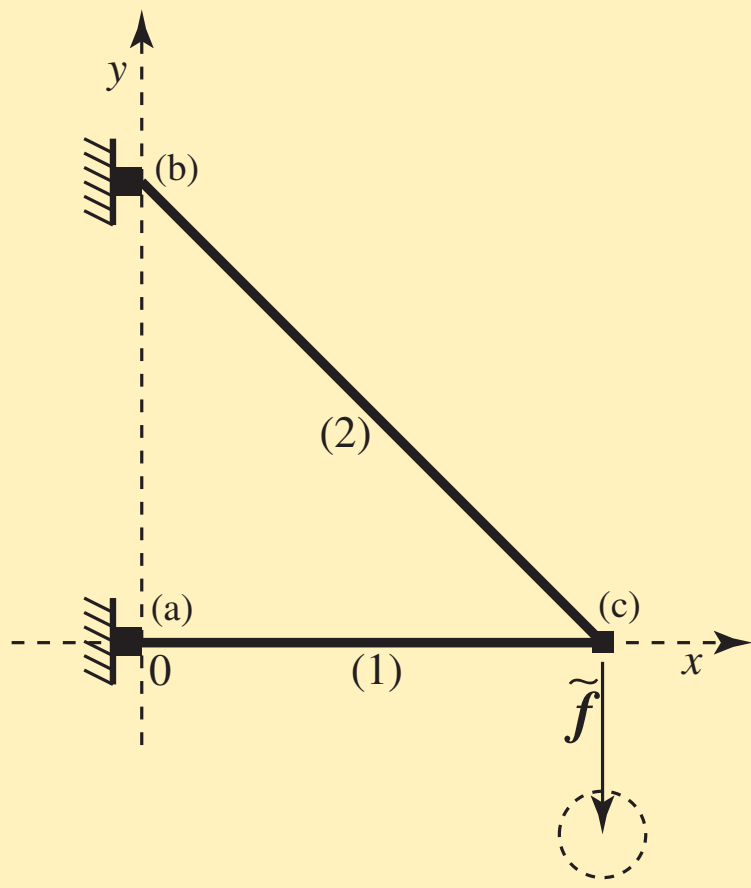
[‡]Kyoto University (Japan)

July 8, 2009



motivation (static analysis)

- 3DOF, 2-bar frame
- uncertain load & stiffness



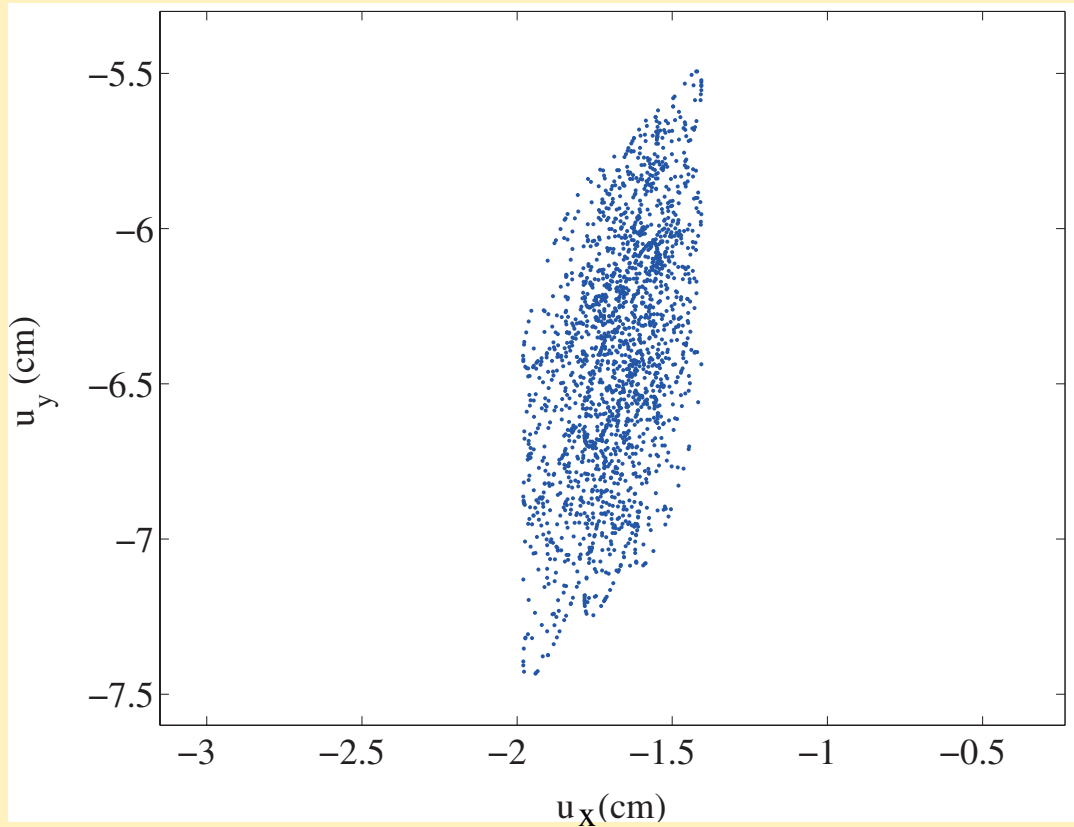
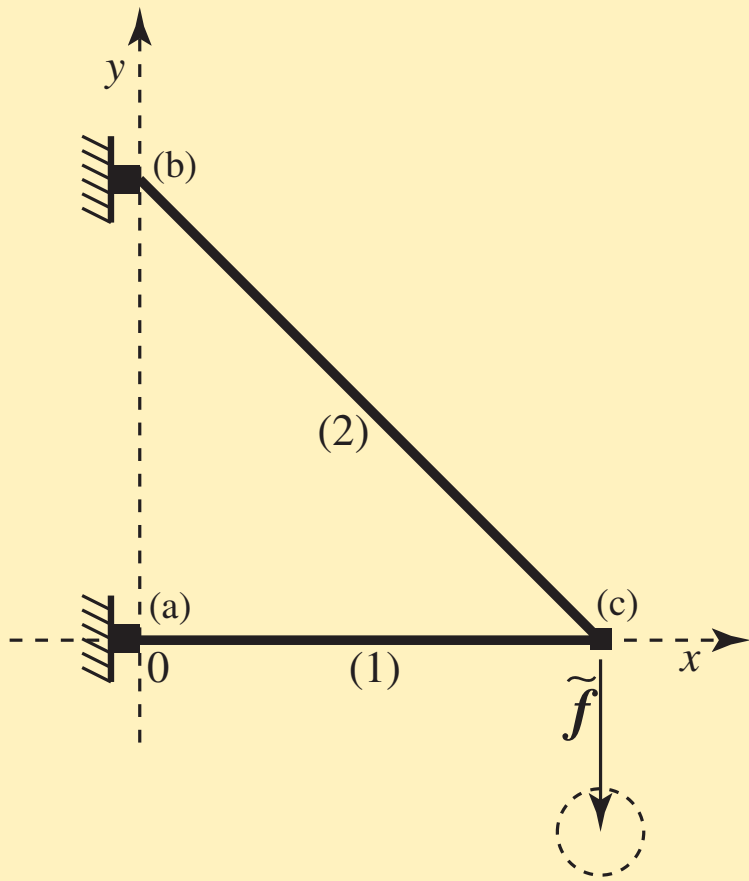
elastic modulus :

$$180 \leq E_i \leq 220 \text{ GPa}$$
$$(24.0 \text{ cm}^2, 72.0 \text{ cm}^4)$$

motivation (static analysis)

■ 3DOF, 2-bar frame [Kanno & Takewaki 06; 08]

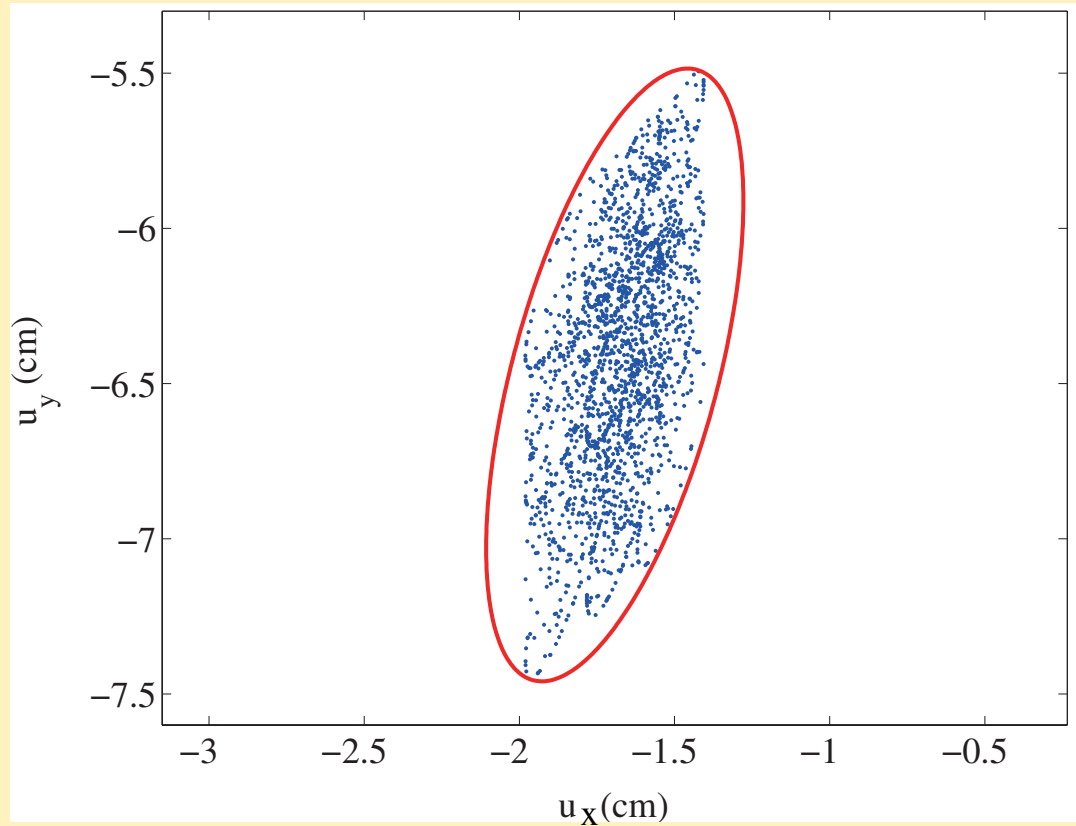
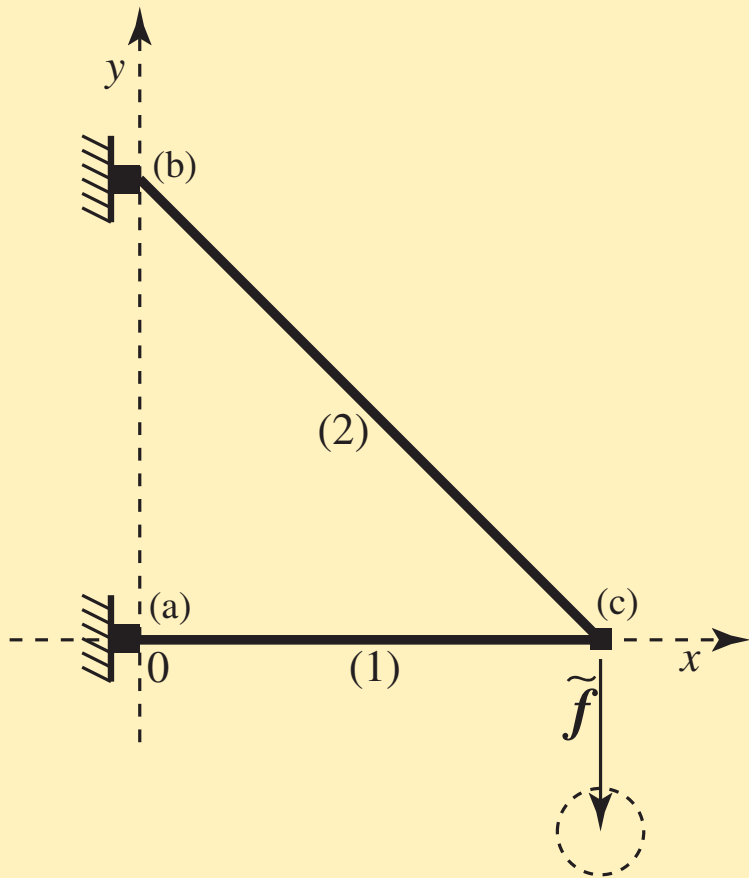
■ uncertain load & stiffness → bound of response?



distribution of nodal displacement

motivation (static analysis)

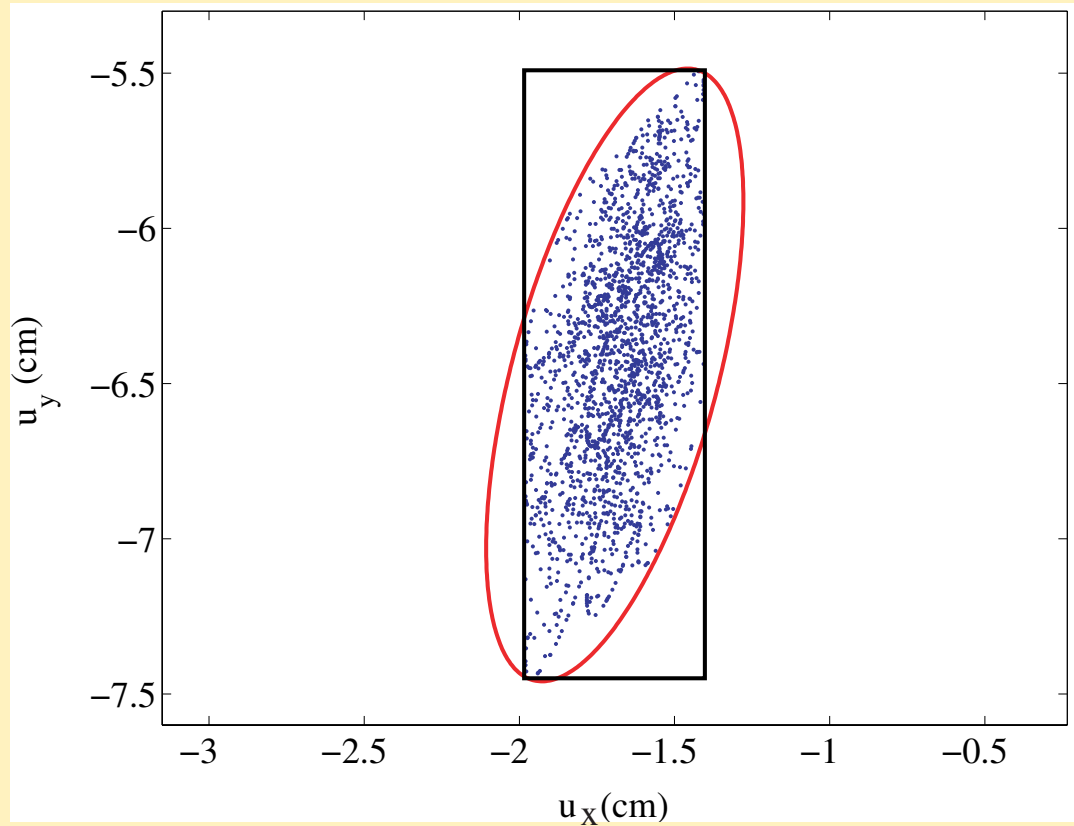
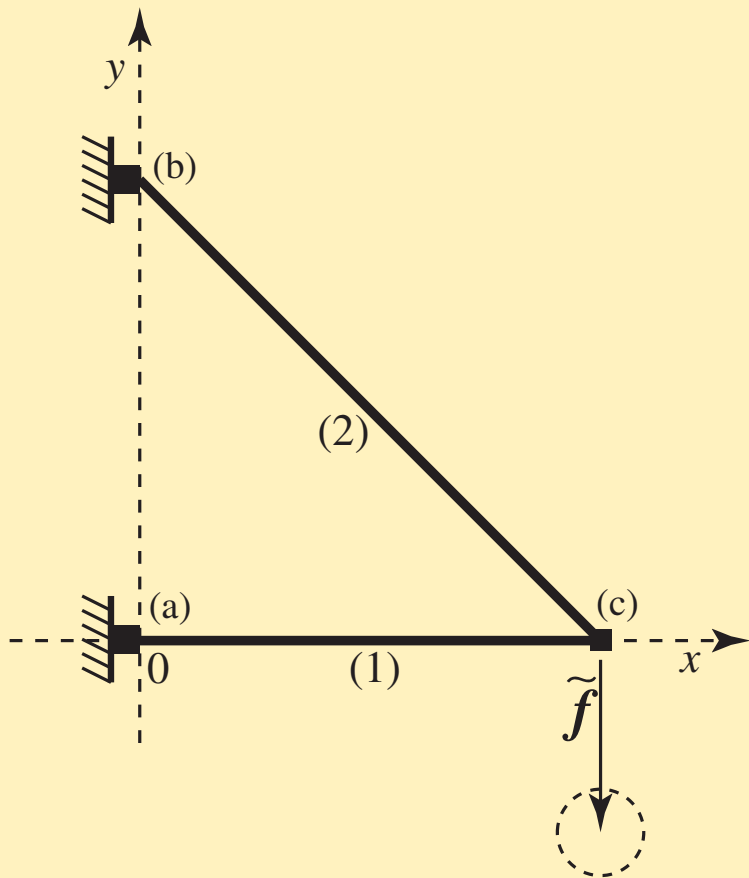
- 3DOF, 2-bar frame
- uncertain load & stiffness



bounding ellipsoid

motivation (static analysis)

- 3DOF, 2-bar frame
- uncertain load & stiffness



bounding box (interval hull)

uncertainty analysis

- stochastic model — reliability design etc.
- non-stochastic model — unknown-but-bounded parameters
 - ◆ convex model [Ben-Haim & Elishakoff 90]
 - ◆ interval analysis [Alefeld & Mayer 00], [Chen *et al.* 02], etc.
 - ◆ mathematical programming

uncertainty analysis

- stochastic model — reliability design etc.
- non-stochastic model — unknown-but-bounded parameters
 - ◆ convex model [Ben-Haim & Elishakoff 90]
 - linear approximation
 - ◆ interval analysis [Alefeld & Mayer 00], [Chen *et al.* 02], etc.
 - conservative
[Neumaier & Pownuk 07] (truss)
 - ◆ mathematical programming
 - SDP & proof of conservativeness ← ♣
[Calafiore & El Ghaoui 04] (ULE)
[Kanno & Takewaki 06] (static)
 - MIP & extremal case [Guo *et al.* 08], [Kanno & Takewaki 07]

objective: uncertainty analysis

$$K\hat{u} + C\dot{\hat{u}} + K\hat{u} = \hat{f} \quad (\text{eq. of motion})$$

- $\hat{f} = \mathbf{f}e^{i\omega t}$ — harmonic excitation
- consider the uncertainty of \mathbf{f}
- predict the distribution of \hat{u}
- do not use the 1st order approximation
→ large uncertainties
- have a proof of conservativeness

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$$\mathbf{K}\hat{\mathbf{u}} + \mathbf{C}\dot{\hat{\mathbf{u}}} + \mathbf{K}\hat{\mathbf{u}} = \hat{\mathbf{f}} \quad (\text{eq. of motion})$$

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mathematical framework

- robust optimization (RO)
- semidefinite program (SDP)
- \mathcal{S} -lemma

- confidence bound detection
 - ← optimization / robust optimization

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robust optimization

- nominal (conventional) optimization

$$\min_{\boldsymbol{x}} \{c(\boldsymbol{x}) : \boldsymbol{g}(\boldsymbol{x}) \geq \mathbf{0}\}$$

e.g.) \boldsymbol{x} : design variables

robust optimization

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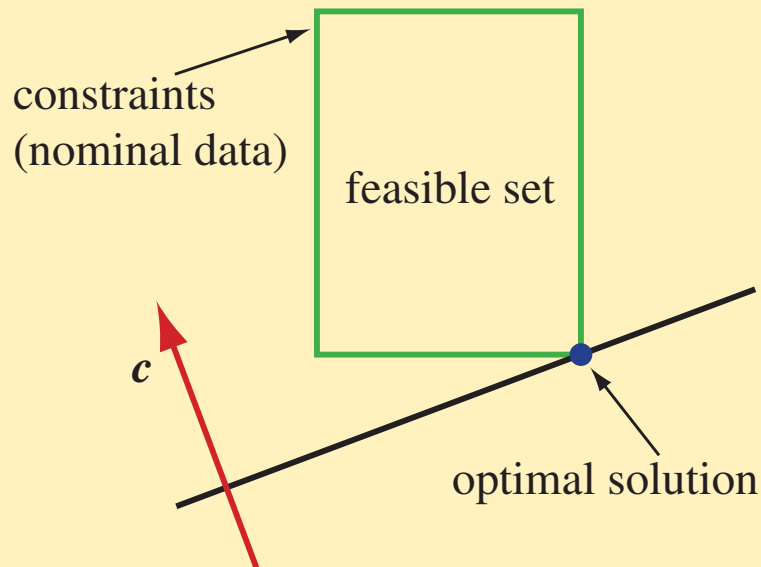
- robust optimization [Ben-Tal & Nemirovski 98; 02]

$$\min_{\mathbf{x}} \{c(\mathbf{x}) : \mathbf{g}(\mathbf{x}; \boldsymbol{\zeta}) \geq \mathbf{0} (\forall \boldsymbol{\zeta} : \alpha \geq \|\boldsymbol{\zeta}\|)\}$$

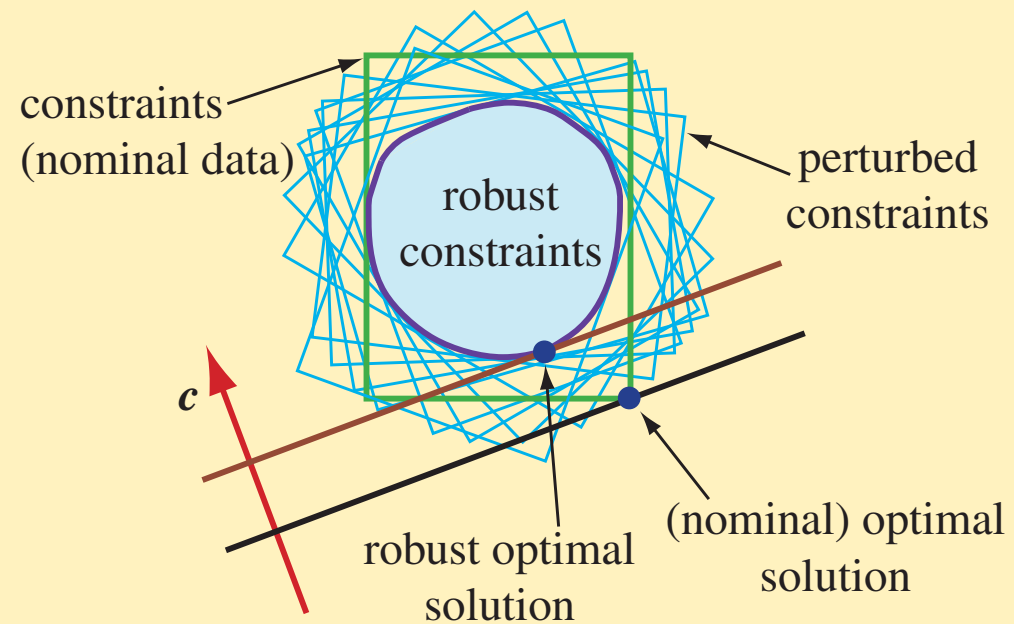
e.g.) $\boldsymbol{\zeta}$: unknown-but-bounded parameters

robust optimization

$$\min_{\mathbf{x}} \{ \mathbf{c}^T \mathbf{x} : \mathbf{g}(\mathbf{x}; \boldsymbol{\zeta}) \geq \mathbf{0} \ (\forall \boldsymbol{\zeta} : \alpha \geq \|\boldsymbol{\zeta}\|) \}$$



nominal optimization



robust optimization

semidefinite program (SDP)

$$\begin{aligned} \min \quad & \sum_{i=1}^m b_i y_i \\ \text{s.t.} \quad & \mathbf{C} - \sum_{i=1}^m \mathbf{A}_i y_i \succeq \mathbf{O} \end{aligned}$$

variables : y_1, \dots, y_m

coefficients : $b_1, \dots, b_m,$

$\mathbf{A}_1, \dots, \mathbf{A}_m, \mathbf{C} \in \mathcal{S}^n$ $n \times n$ symmetric matrices

■ $\mathbf{P} \succeq \mathbf{O}$ ($\Leftrightarrow \mathbf{P}$ is positive semidefinite) \leftarrow nonlinear, convex

■ primal-dual interior-point method

■ applications in eigenvalue optimization, etc.

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uncertainty model

$$(-\omega^2 \mathbf{M} + i\omega \mathbf{C} + \mathbf{K}) \mathbf{u} = \mathbf{f} \quad (\text{eq. of motion})$$

■ $\hat{\mathbf{f}} = \mathbf{f} e^{i\omega t}$ — harmonic excitation

uncertainty:

$$\mathbf{f} = \tilde{\mathbf{f}}_j + \mathbf{F}_0 \boldsymbol{\zeta}, \quad \boldsymbol{\zeta} \in \mathcal{Z}$$

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uncertainty:

$$\mathbf{f} = \tilde{\mathbf{f}}_j + \mathbf{F}_0 \zeta, \quad \zeta \in \mathcal{Z}$$

$\tilde{\mathbf{f}}$ nominal (best estimate) value

ζ unknown-but-bounded

\mathbf{F}_0 coefficients ('magnitudes' of uncertainties)

\mathcal{Z} closed set

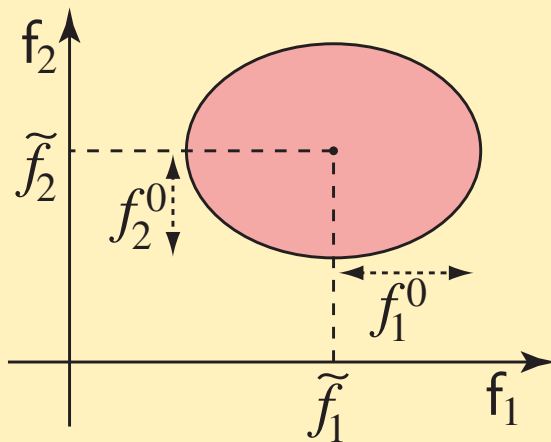
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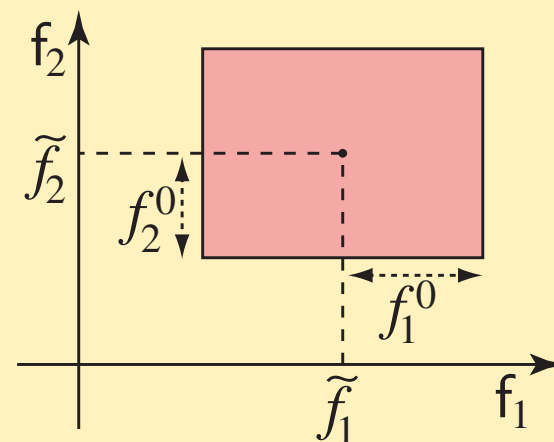
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uncertainty:

$$\mathbf{f} = \tilde{\mathbf{f}}_j + \mathbf{F}_0 \boldsymbol{\zeta}, \quad \boldsymbol{\zeta} \in \mathcal{Z}$$



$$\mathcal{Z} = \{\boldsymbol{\zeta} \mid 1 \geq \|\mathbf{T}_j \boldsymbol{\zeta}\|_2 \ (\forall j)\}$$



$$\mathcal{Z} = \{\boldsymbol{\zeta} \mid 1 \geq \|\boldsymbol{\zeta}\|_\infty\}$$

■ ‘magnitude & direction’ of amplitude of driving load are uncertain

reduction to real variables

$$(-\omega^2 \mathbf{M} + i\omega \mathbf{C} + \mathbf{K}) \mathbf{u} = \mathbf{f} \quad (\text{eq. of motion})$$

■ $\mathbf{u} \in \mathbb{C}^d$ (complex vector)

$$\begin{bmatrix} -\omega^2 \mathbf{M} + \mathbf{K} & -\omega \mathbf{C} \\ \omega \mathbf{C} & -\omega^2 \mathbf{M} + \mathbf{K} \end{bmatrix} \begin{bmatrix} \mathbf{v}_1 \\ \mathbf{v}_2 \end{bmatrix} = \begin{bmatrix} \mathbf{f} \\ \mathbf{0} \end{bmatrix}$$

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- $\begin{bmatrix} \mathbf{v}_1 \\ \mathbf{v}_2 \end{bmatrix} = \begin{bmatrix} \text{Re } \mathbf{u} \\ \text{Im } \mathbf{u} \end{bmatrix}$ (: real part)
(: imag. part) is a real vector
- for u_q (displacement amplitude):

- ◆ $|u_q|$ (modulus) — $r = \sqrt{v_{1q}^2 + v_{2q}^2}$

- ◆ $\arg u_q$ (argument) — $\tan \theta = v_{2q}/v_{1q}$

upper bound of modulus

maximum value of modulus (def.)

$$r_{\max} = \max \{ \|\mathbf{v}_q\| \mid \mathbf{v} \text{ solves } (\spadesuit) \} \quad \mathbf{v}_q = (v_{1q}, v_{2q})^T$$

eq. of motion (w.r.t. real variables)

$$\mathbf{S}\mathbf{v} = \begin{bmatrix} \mathbf{f} \\ \mathbf{0} \end{bmatrix}, \quad \mathbf{f} \in \mathcal{F} \quad (\spadesuit)$$

- $\max\{\|\mathbf{v}_q\|\}$ — nonconvex optimization
- direct use of nonlinear programming
→ no proof of conservativeness

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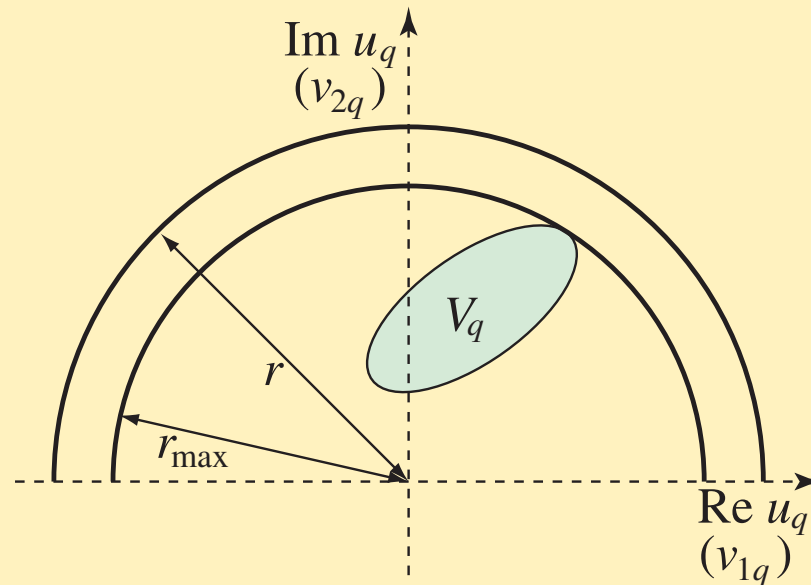
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reformulation to robust optimization

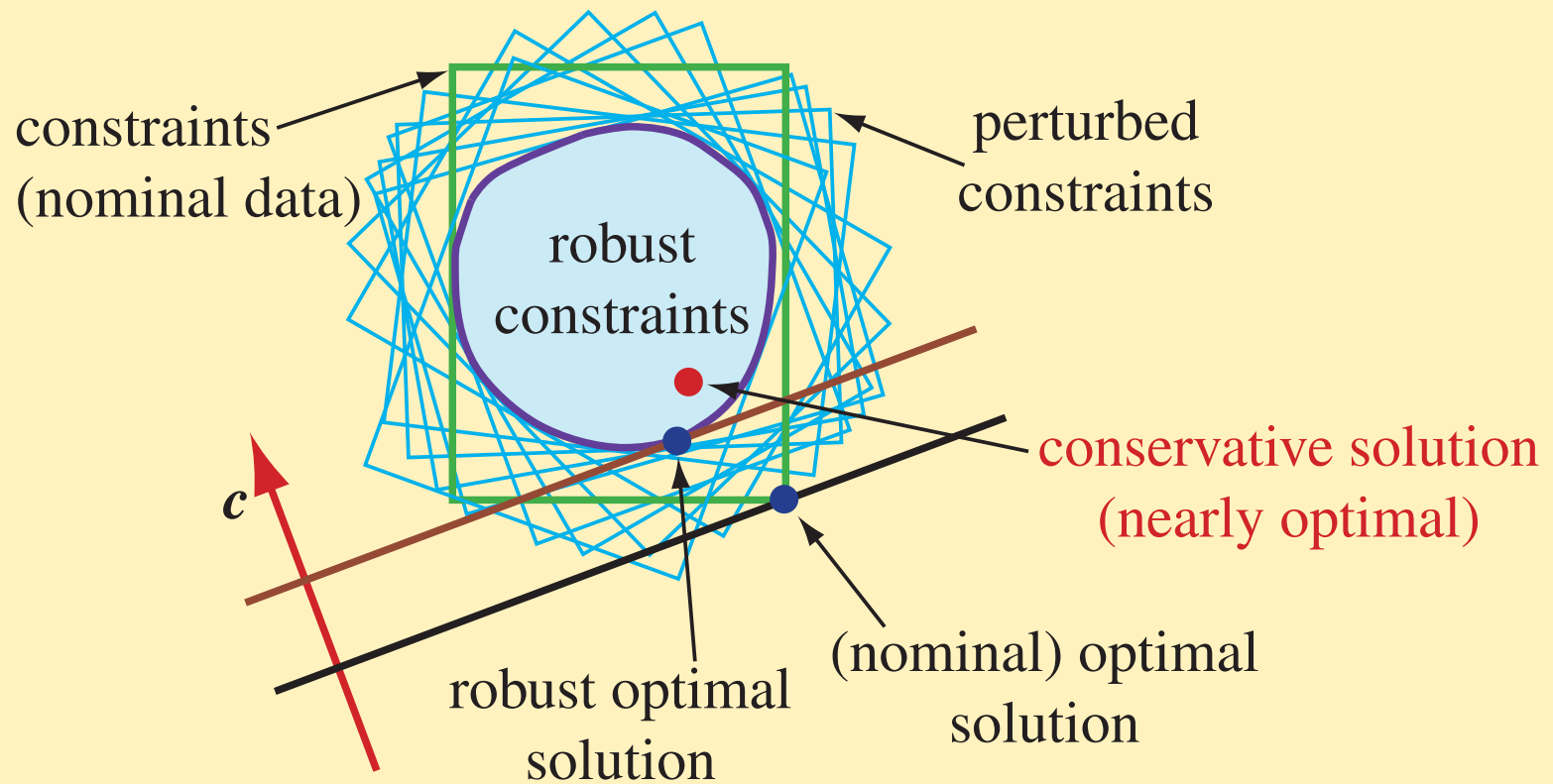
$$r_{\max} = \min \{ r \mid r \geq \|\mathbf{v}_q\| \ (\forall \mathbf{v} \in \mathcal{V}) \} \quad (\text{RO})$$



conservative method for (RO) \longrightarrow find an upper bound of r_{\max}

cf) robust optimization

$$\min_x \{ \mathbf{c}^T \mathbf{x} : \mathbf{g}(\mathbf{x}; \boldsymbol{\zeta}) \geq 0 \ (\forall \boldsymbol{\zeta} : \alpha \geq \|\boldsymbol{\zeta}\|) \}$$



- SDP relaxation technique
→ find a conservative solution

S-lemma

$f(\mathbf{x}), g(\mathbf{x})$: quadratic functions

$$(a): f(\mathbf{x}) \geq 0 \implies g(\mathbf{x}) \geq 0$$



$$(b): \exists w \geq 0, \quad g(\mathbf{x}) \geq w f(\mathbf{x}), \quad \forall \mathbf{x}$$

S-lemma

$f_1(\mathbf{x}), \dots, f_m(\mathbf{x}), g(\mathbf{x})$: quadratic functions

$$(a): f_1(\mathbf{x}) \geq 0, \dots, f_m(\mathbf{x}) \geq 0 \implies g(\mathbf{x}) \geq 0$$

↑

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■ cf.) Farkas' lemma (f_1, \dots, f_m, g : linear functions)

(a) \Leftrightarrow the system $f_1(\mathbf{x}) \geq 0, \dots, f_m(\mathbf{x}) \geq 0, g(\mathbf{x}) < 0$
does not have a solution

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$f_1(\mathbf{x}), \dots, f_m(\mathbf{x}), g(\mathbf{x})$: quadratic functions

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$$(b): \exists \mathbf{w} \geq \mathbf{0}, \quad g(\mathbf{x}) \geq \sum_{i=1}^m w_i f_i(\mathbf{x}), \quad \forall \mathbf{x} \quad \rightarrow \text{p.s.d. constraint of SDP}$$

S-lemma

$f_1(\mathbf{x}), \dots, f_m(\mathbf{x}), g(\mathbf{x})$: quadratic functions

$$(a): f_1(\mathbf{x}) \geq 0, \dots, f_m(\mathbf{x}) \geq 0 \implies g(\mathbf{x}) \geq 0$$

↑

$$(b): \exists \mathbf{w} \geq \mathbf{0}, \quad g(\mathbf{x}) \geq \sum_{i=1}^m w_i f_i(\mathbf{x}), \quad \forall \mathbf{x}$$

■ apply S-lemma to

$$r_{\max} = \min \{ r \mid r \geq \|\mathbf{v}_q\| \ (\forall \mathbf{v} \in \mathcal{V}) \} \quad (\text{RO})$$

■ obtain an **SDP** providing r^* ($\geq r^{\max}$) (conservative bound)

bounds of argument

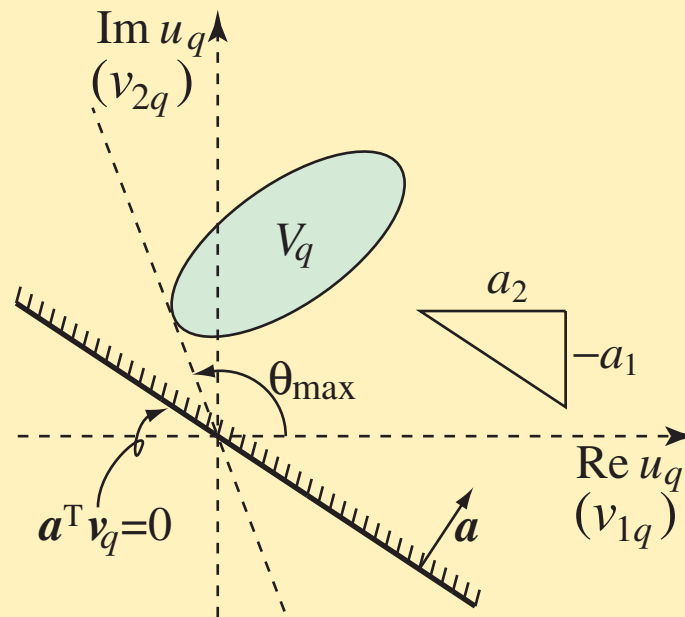
maximum value of argument (def.)

$$\theta_{\max} = \max \{ \arctan(v_{1q}/v_{2q}) \mid \mathbf{v} \in \mathcal{V} \}$$

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$$\begin{bmatrix} a_1 & a_2 \end{bmatrix} \begin{bmatrix} v_{1q} \\ v_{2q} \end{bmatrix} = 0 \quad \Rightarrow \quad \frac{v_{1q}}{v_{2q}} = -\frac{a_1}{a_2}$$

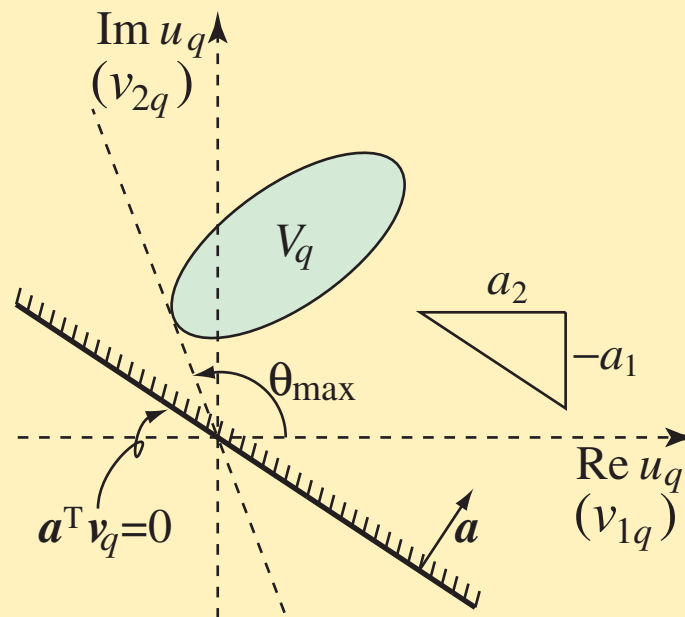
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reformulation to robust optimization

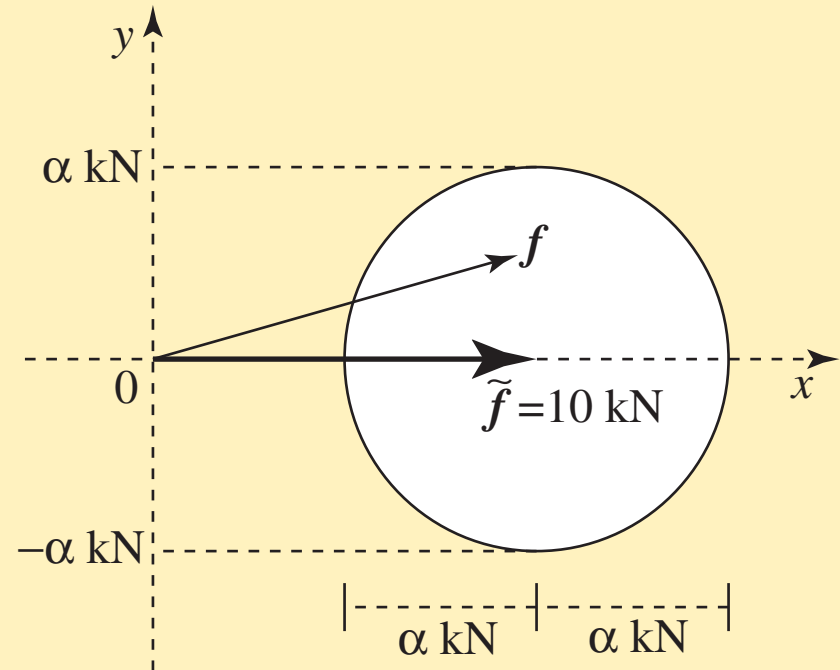
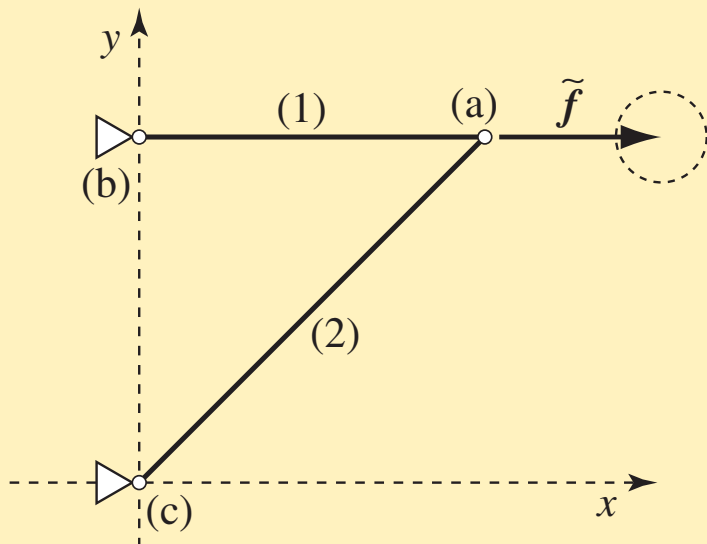
$$-1/\tan \theta_{\max} = \min \left\{ a_2 \mid \begin{bmatrix} 1 & a_2 \end{bmatrix} \begin{bmatrix} v_{1q} \\ v_{2q} \end{bmatrix} \geq 0 \quad (\forall \mathbf{v} \in \mathcal{V}) \right\} \quad (\text{RO})$$



conservative method for (RO) \longrightarrow find an upper bound of θ_{\max}

ex. (2DOF, 2-bar truss)

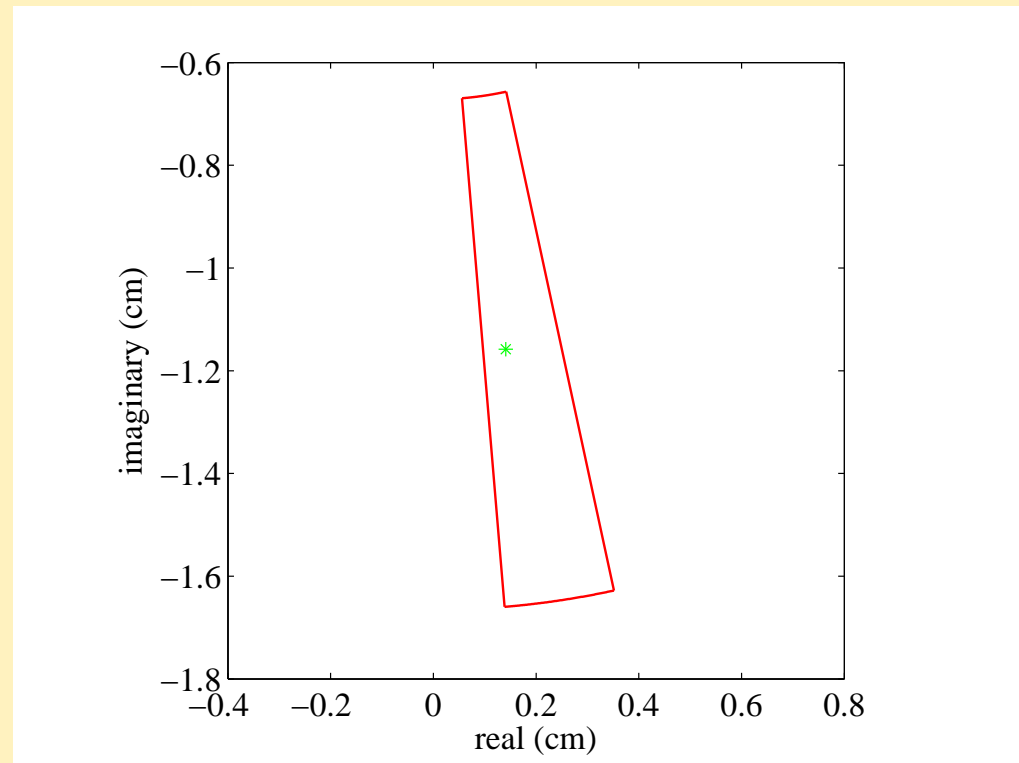
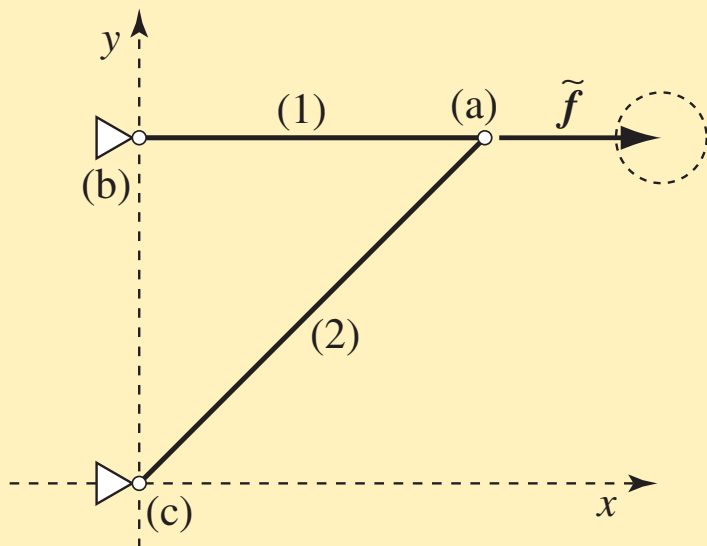
- harmonic driving load — $f e^{i\omega t}$
- uncertainty — $f = \tilde{f} + \zeta$ $\alpha \geq \|\zeta\|$
- $\alpha = 10\%$



- primal-dual interior-point method: SeDuMi 1.05 [Sturm 99]

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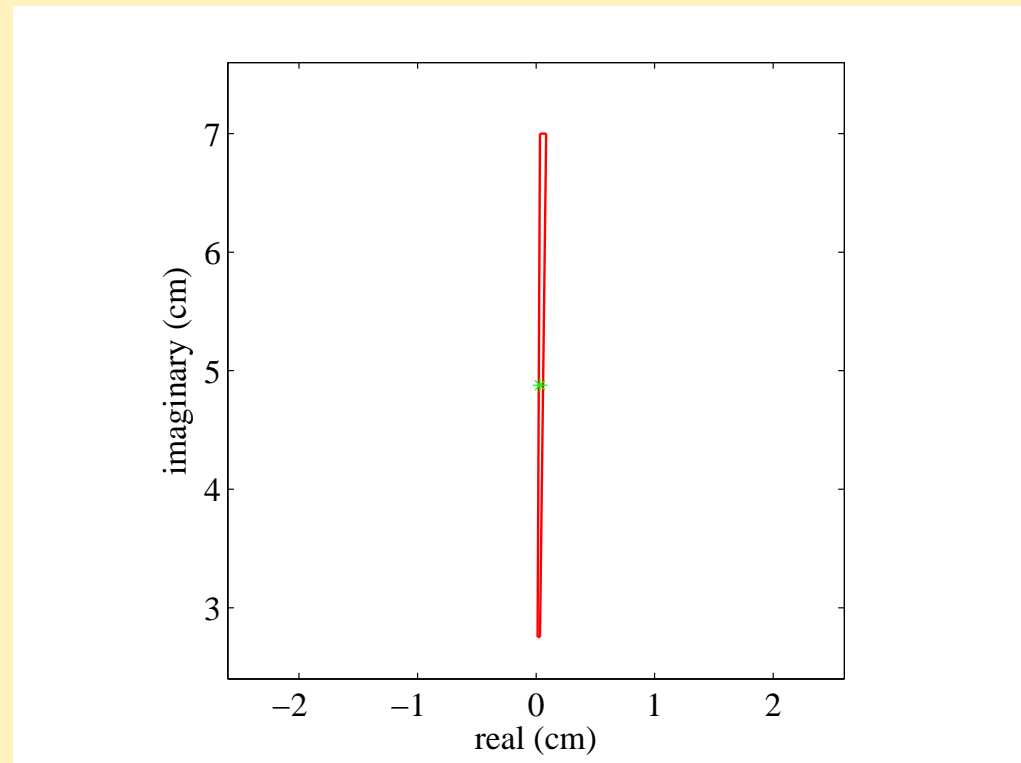
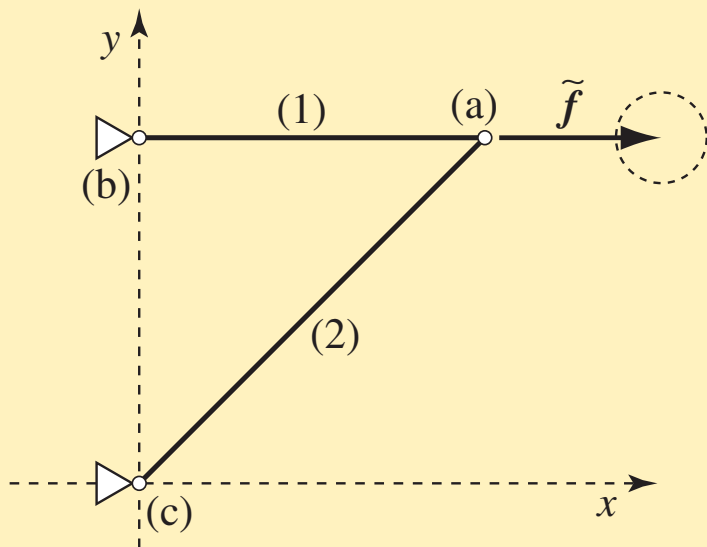
- harmonic driving load — $f e^{i\omega t}$
- uncertainty — $f = \tilde{f} + \zeta$ $\alpha \geq \|\zeta\|$
- $\alpha = 10\%$ $\omega = \omega_1^0$: fundamental circular frequency (undamped)



displacement amplitude $u_x (\in \mathbb{C})$

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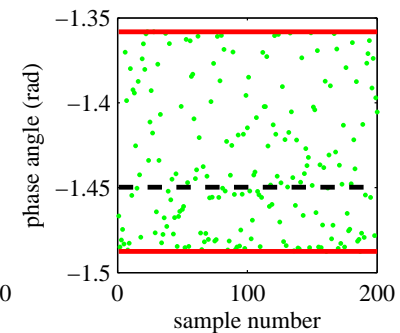
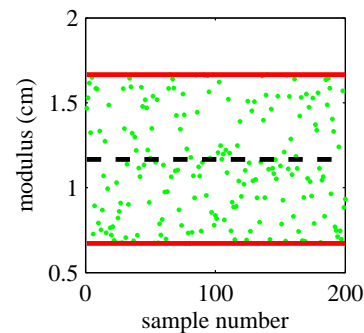
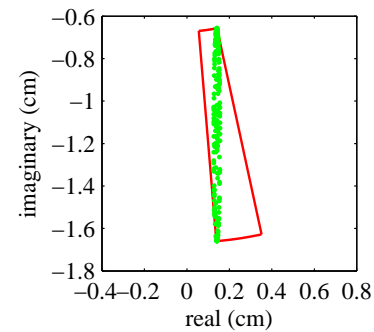
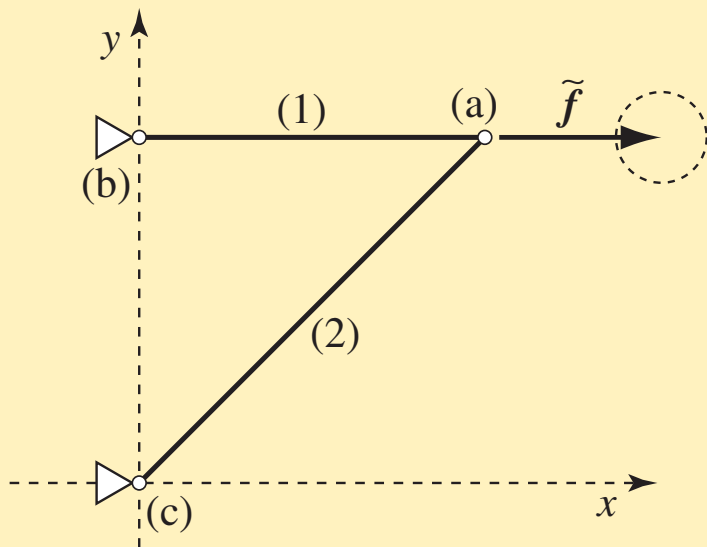
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displacement amplitude $u_y (\in \mathbb{C})$

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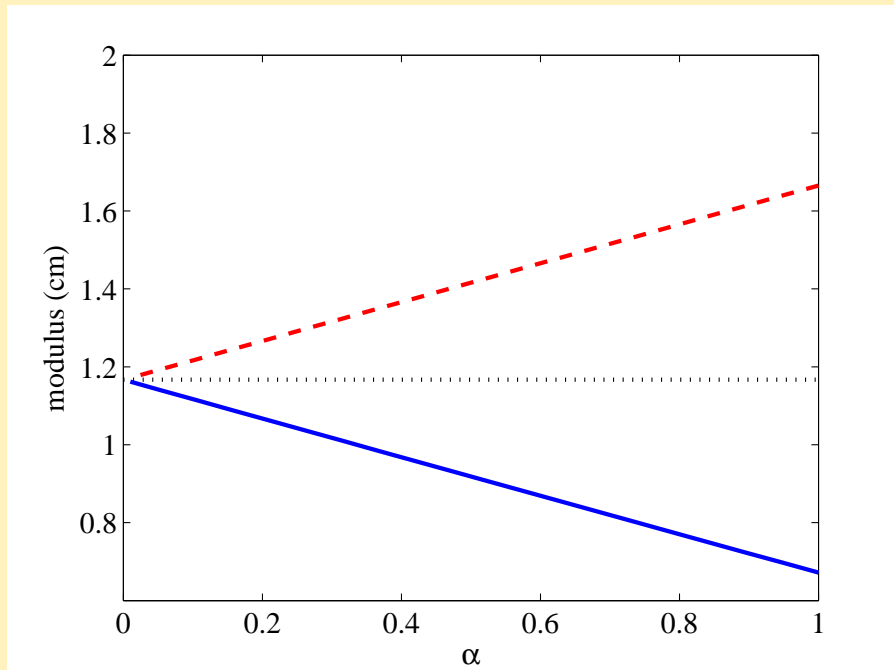
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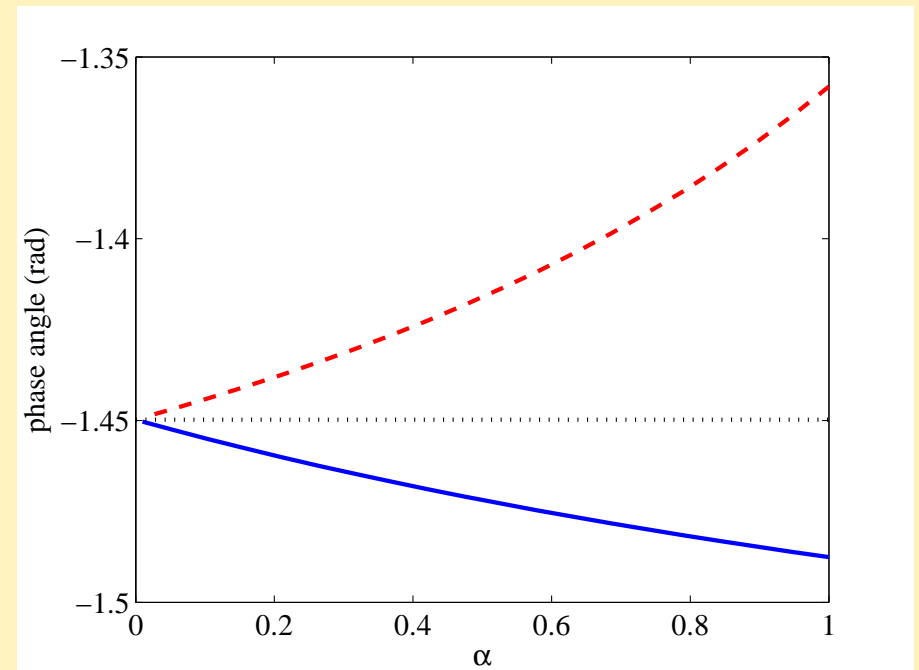
random samples (u_x)

ex. (2DOF, 2-bar truss)

- $(\omega = \omega_1^0)$ variations w.r.t. α ('magnitude' of uncertainty)



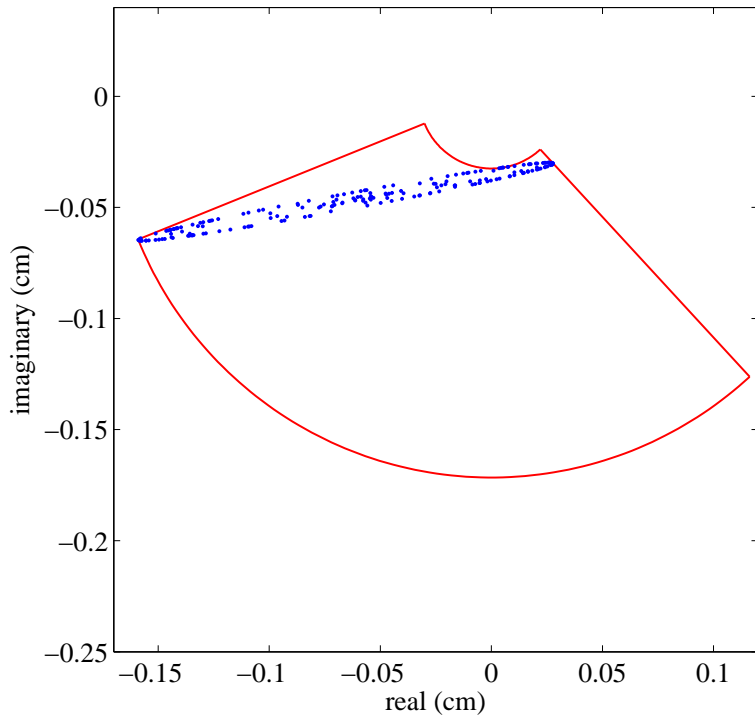
$|u_x|$



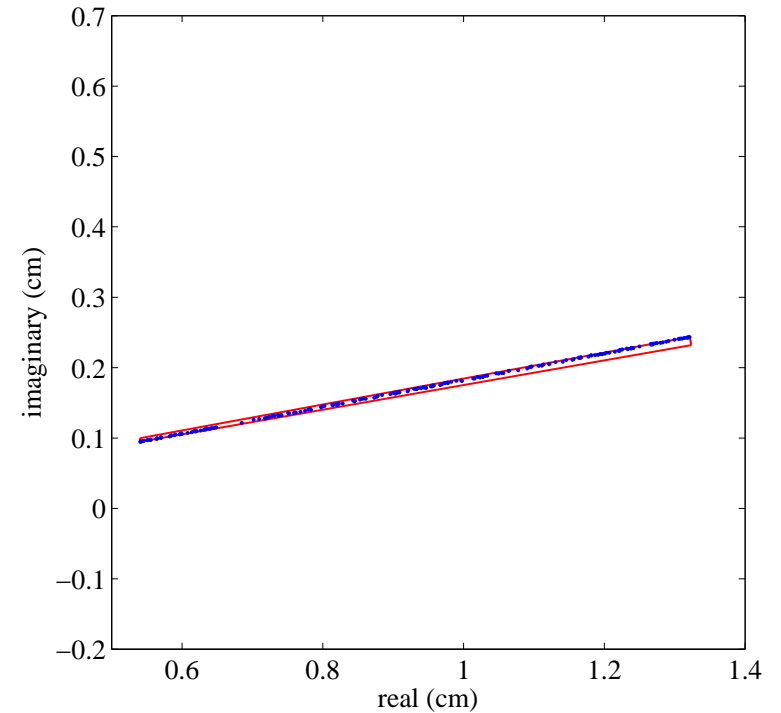
$\arg u_x$

ex. (2DOF, 2-bar truss)

■ driving load $f e^{i\omega t}$ ($\omega = 1.1\omega_1^0$)



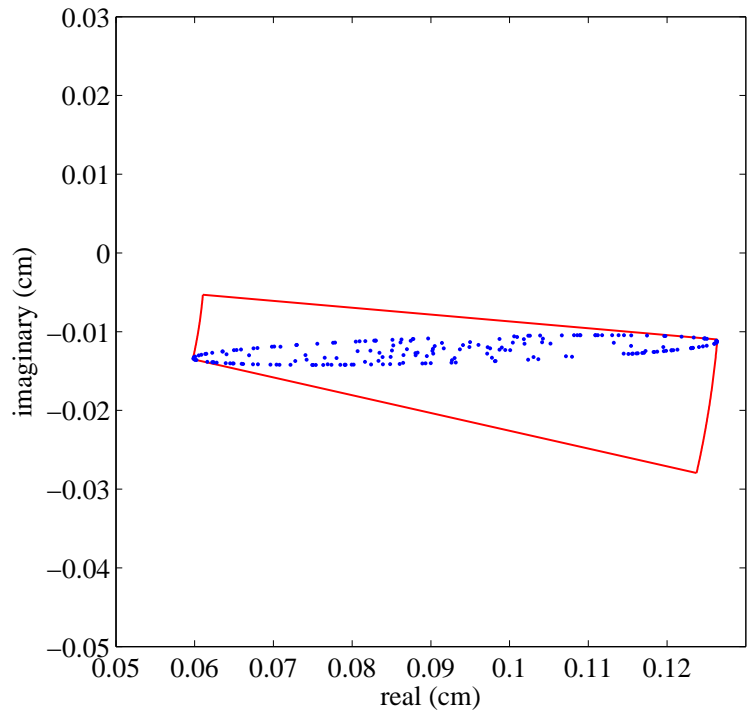
displacement amplitude u_x



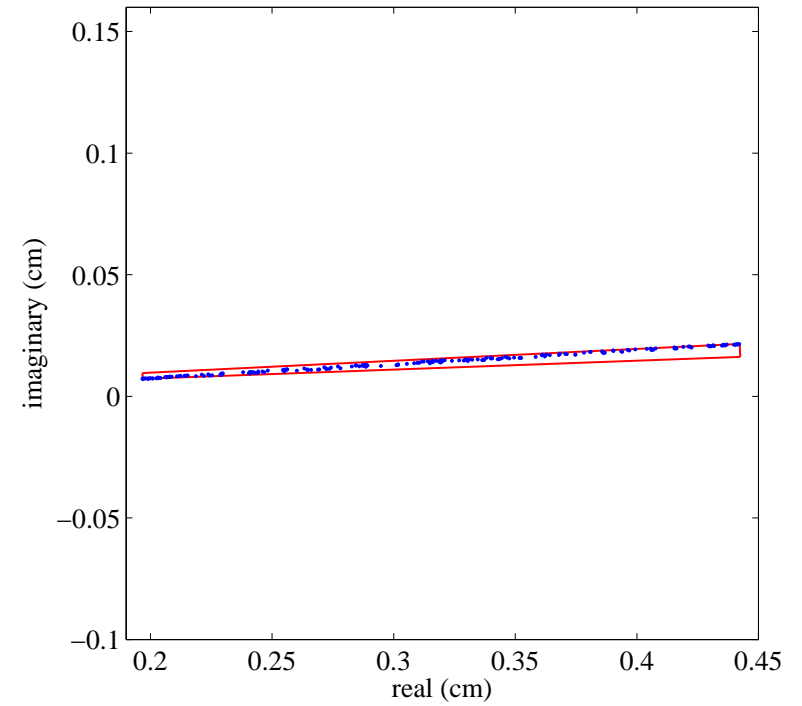
displacement amplitude u_y

ex. (2DOF, 2-bar truss)

■ ($\omega = 1.3\omega_1^0$)



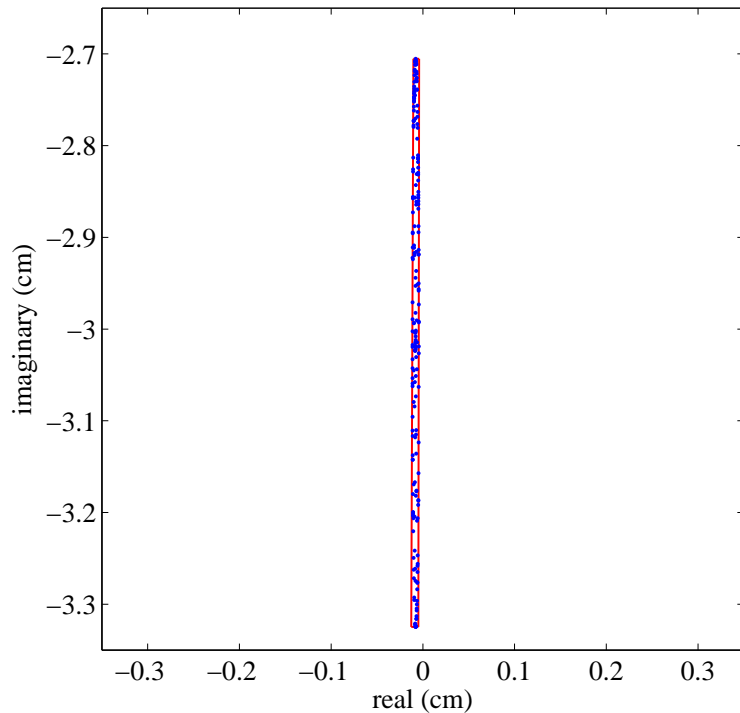
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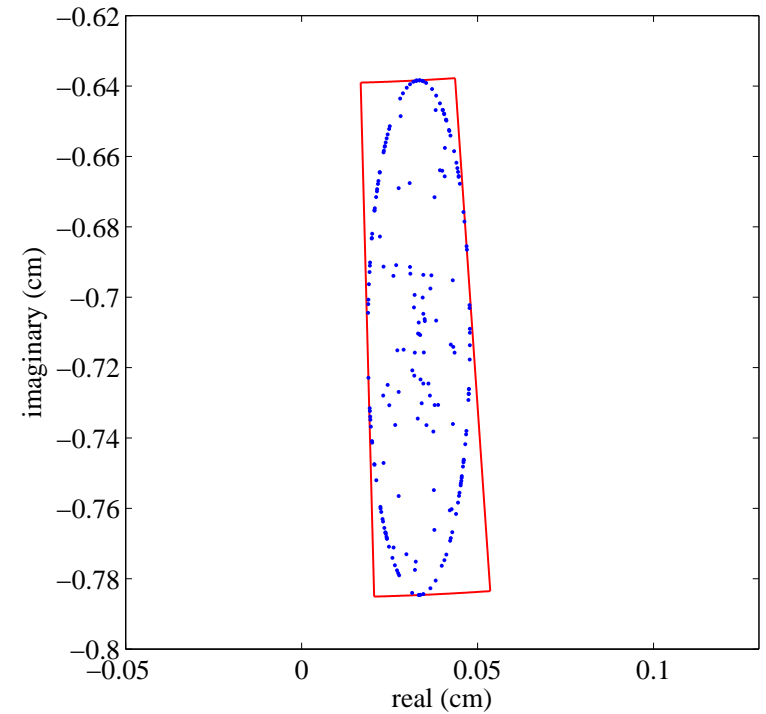
displacement amplitude u_y

ex. (2DOF, 2-bar truss)

- $(\omega = \omega_2^0)$: 2nd fundamental frequency (undamped)



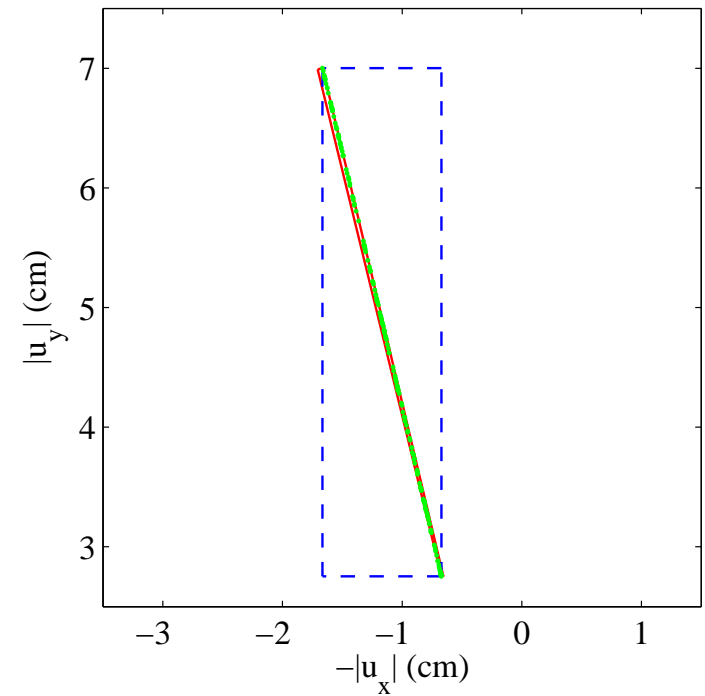
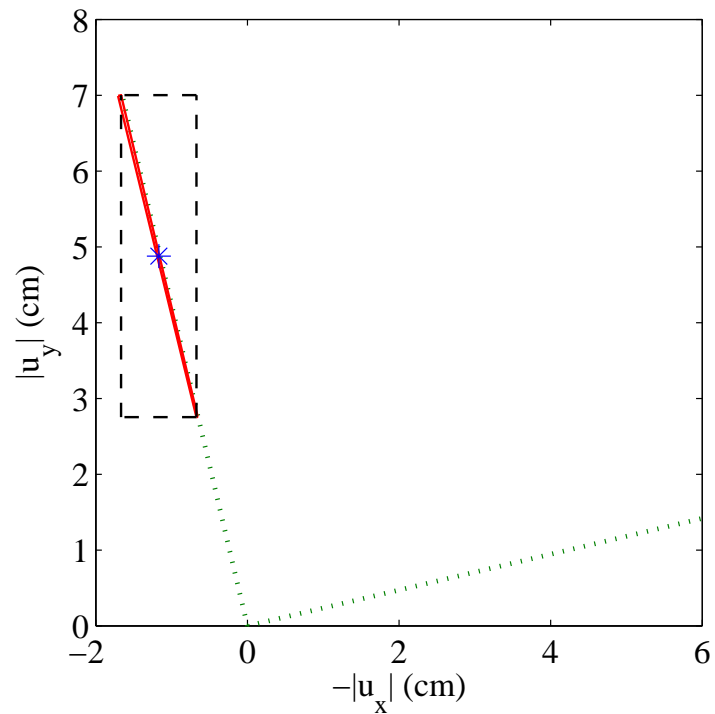
displacement amplitude u_x



displacement amplitude u_y

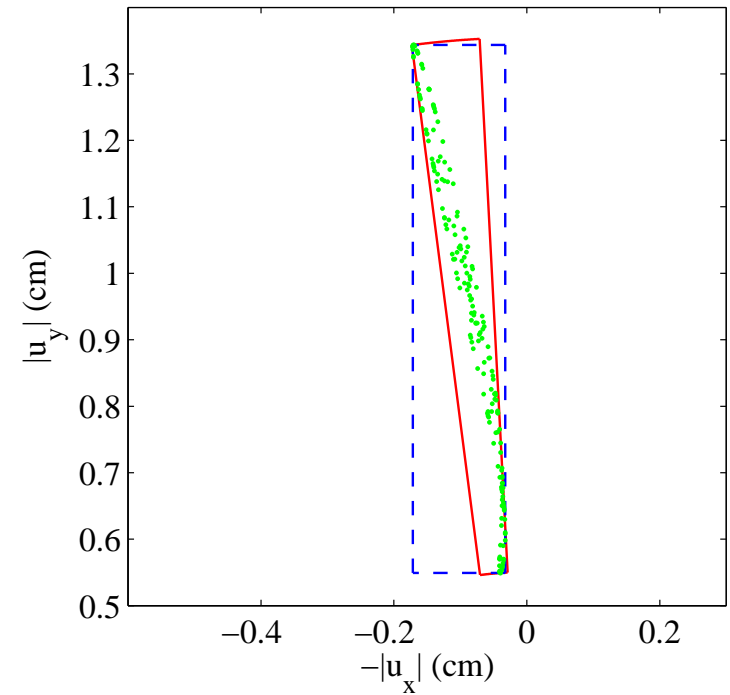
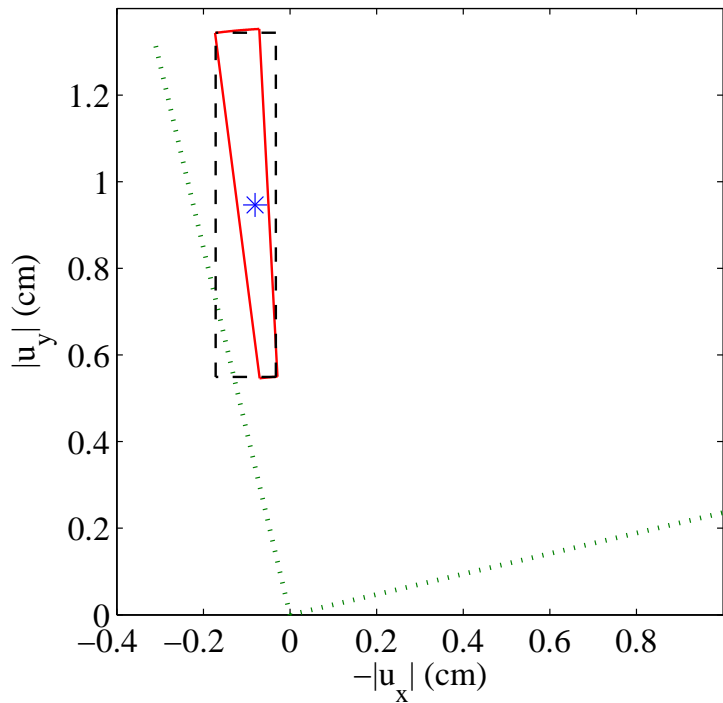
ex. (2DOF, 2-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = \omega_1^0$)



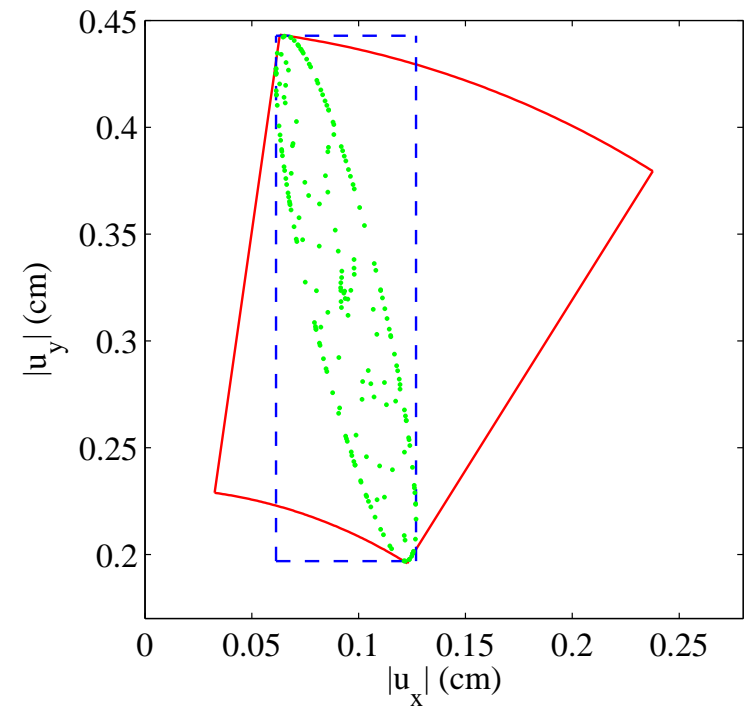
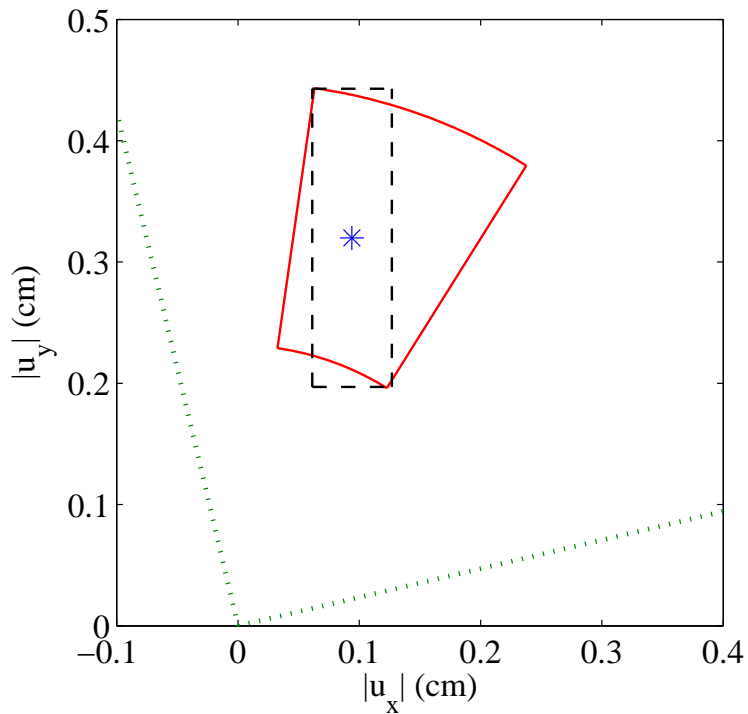
ex. (2DOF, 2-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = 1.1\omega_1^0$)



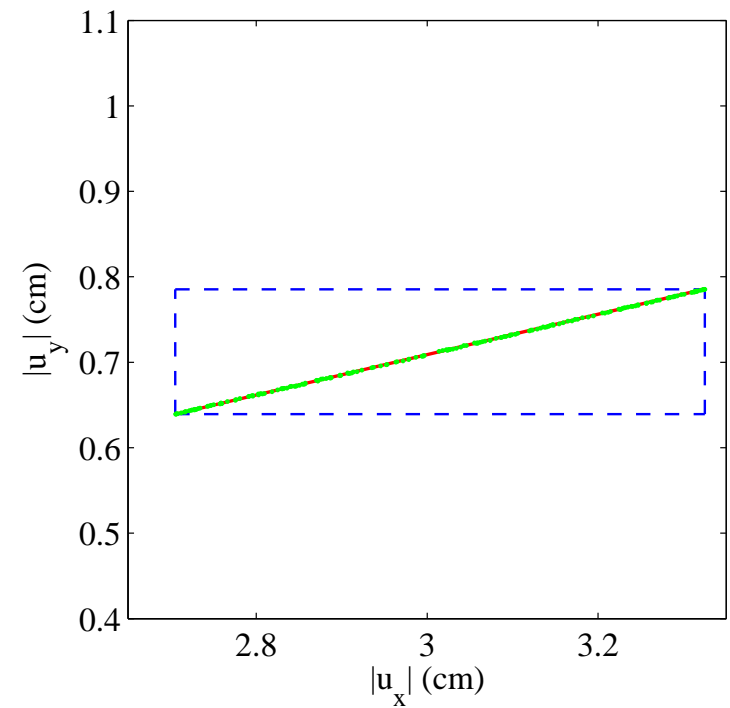
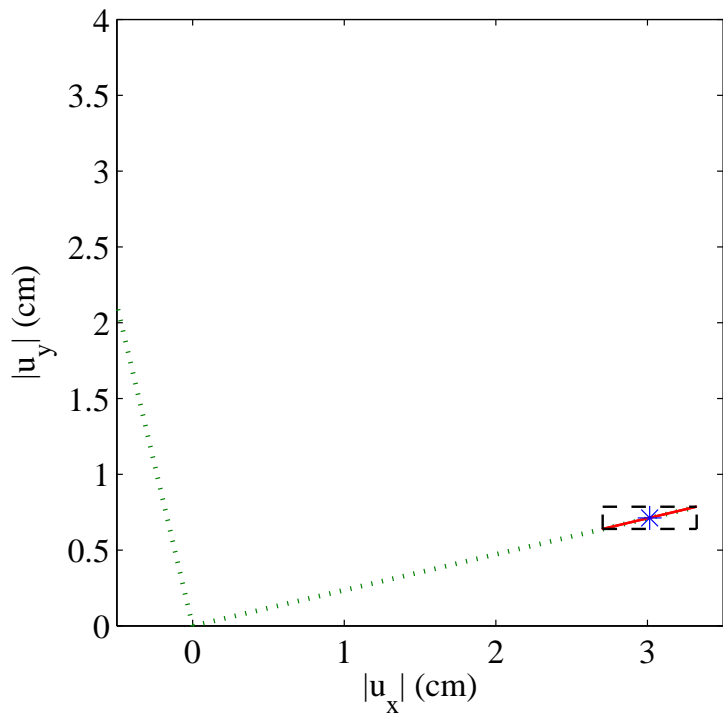
ex. (2DOF, 2-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = 1.3\omega_1^0$)

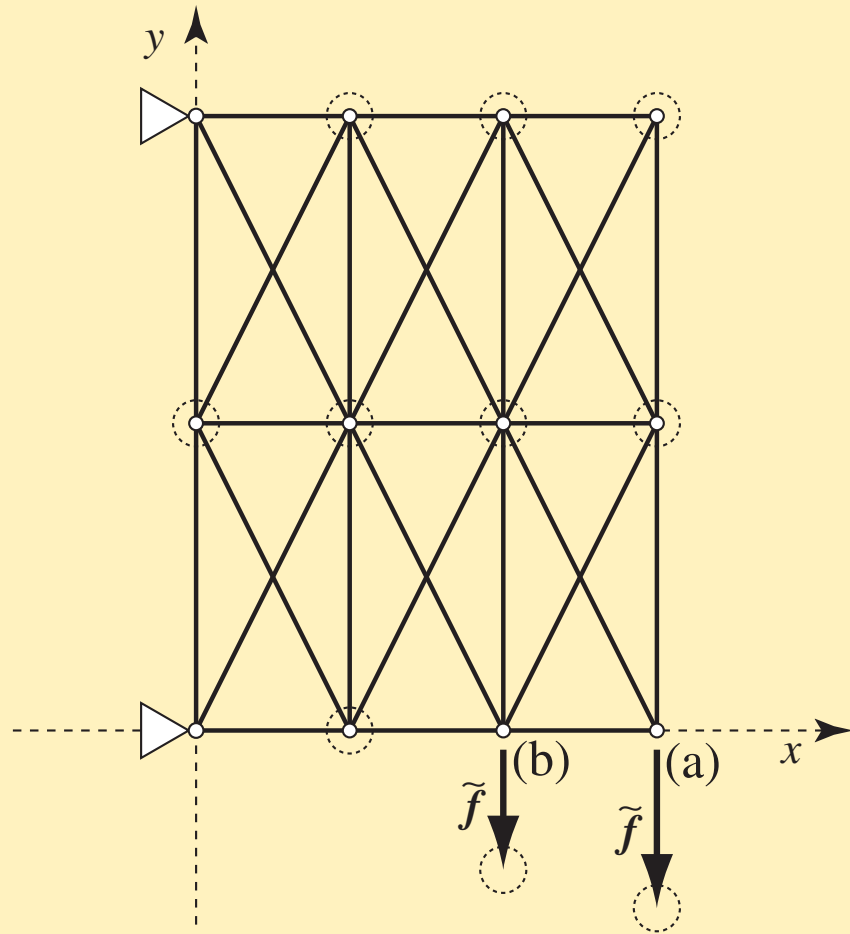


ex. (2DOF, 2-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = \omega_2^0$)



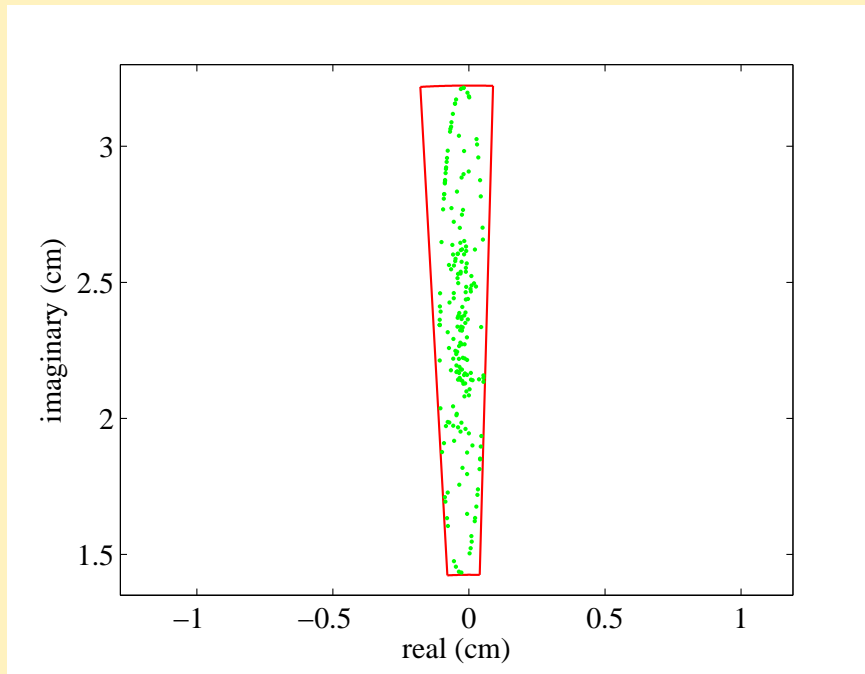
ex. (20DOF, 29-bar truss)



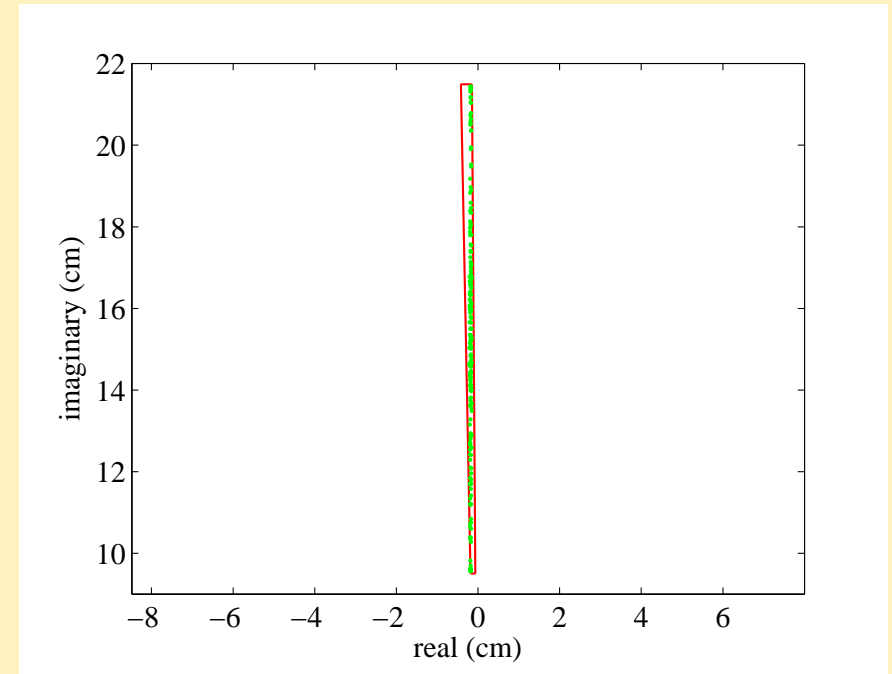
- nominal driving load
 \tilde{f} : 8 kN, 12 kN
- uncertainty nodal loads
 - ◆ at all the nodes
 - ◆ perturb independently
- complex damping:
 $\omega \mathbf{C} = 2\beta \mathbf{K}$ ($\beta = 0.02$)

ex. (20DOF, 29-bar truss)

- displacement amplitude (bottom-right node) ($\omega = \omega_1^0$)



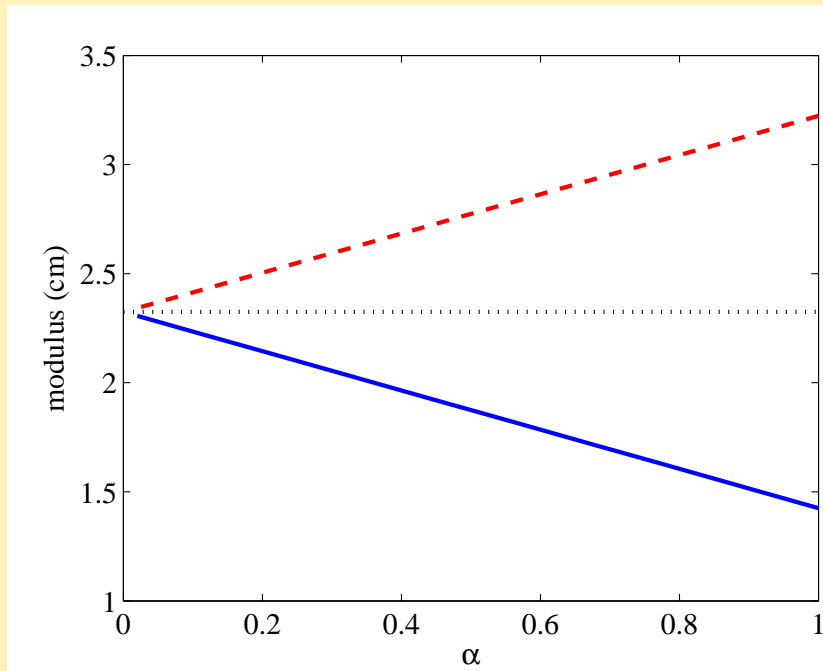
U_x



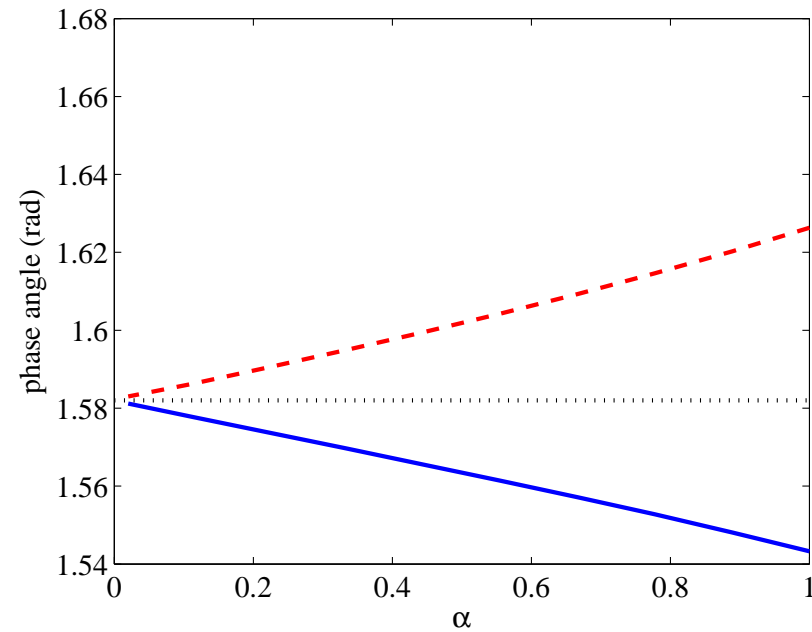
U_y

ex. (20DOF, 29-bar truss)

- displacement amplitude (bottom-right node) variations w.r.t. α ('magnitude' of uncertainty)



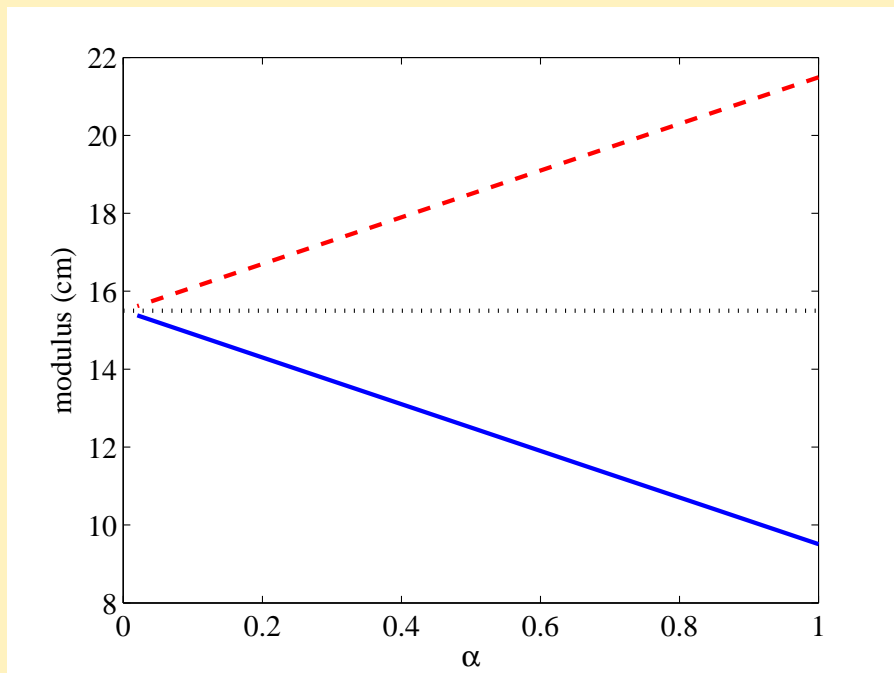
$|u_x|$



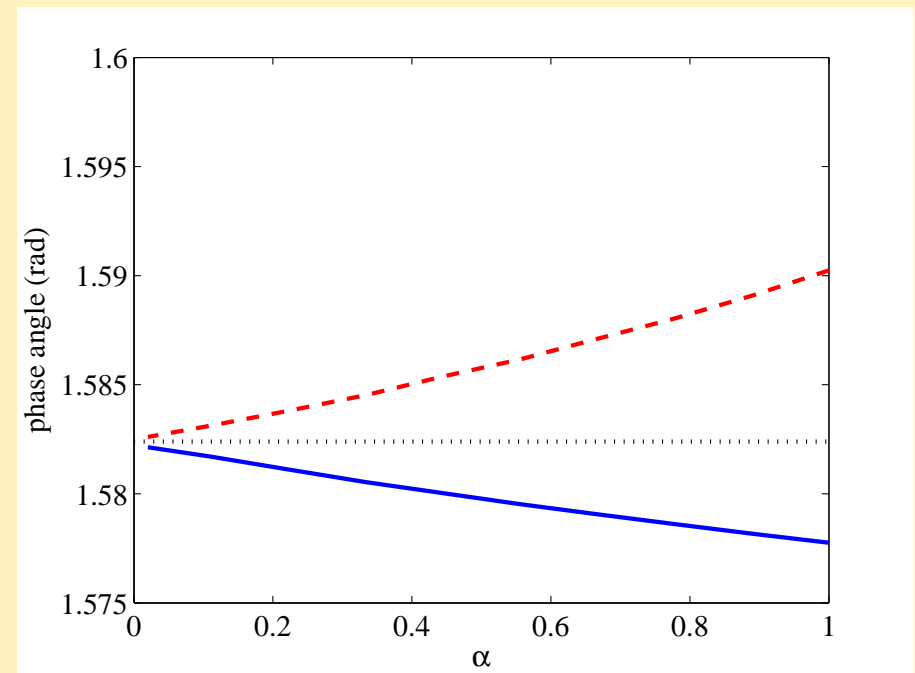
$\arg u_x$

ex. (20DOF, 29-bar truss)

- displacement amplitude (bottom-right node)
variations w.r.t. α ('magnitude' of uncertainty)



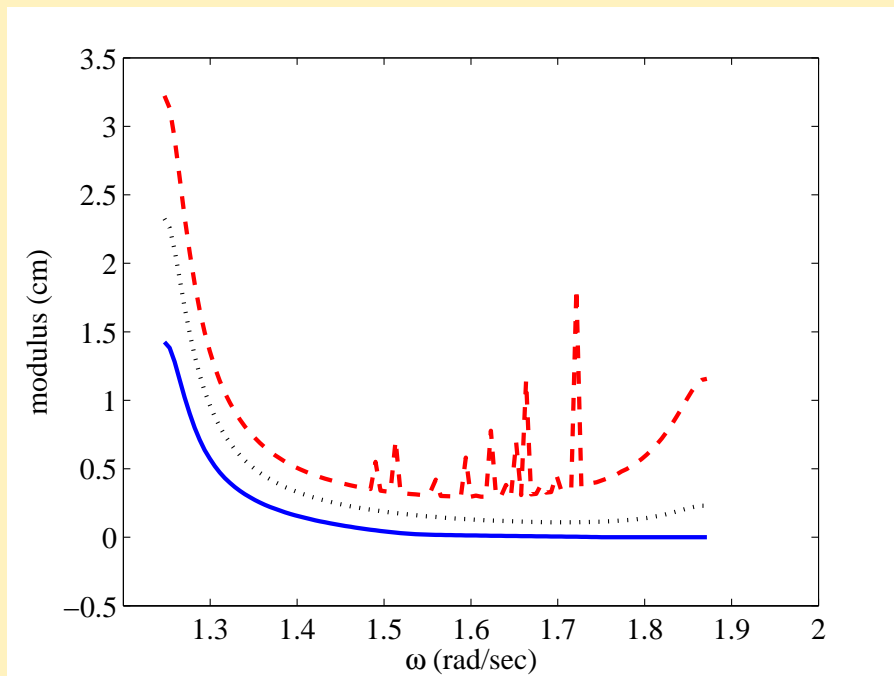
$|u_y|$



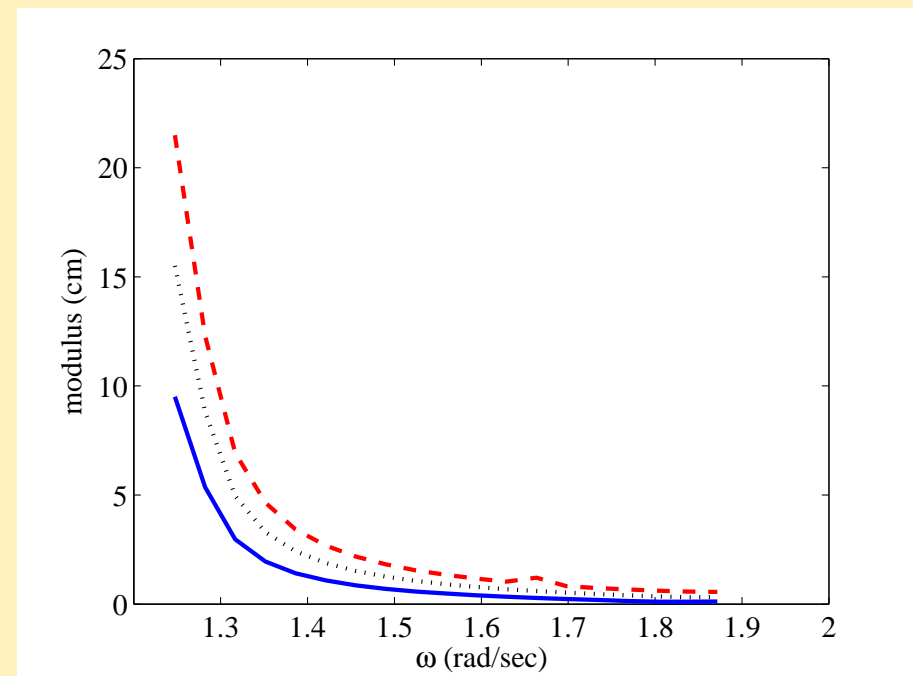
$\arg u_y$

ex. (20DOF, 29-bar truss)

- displacement amplitude (bottom-right node) variations w.r.t. ω (circular frequency)



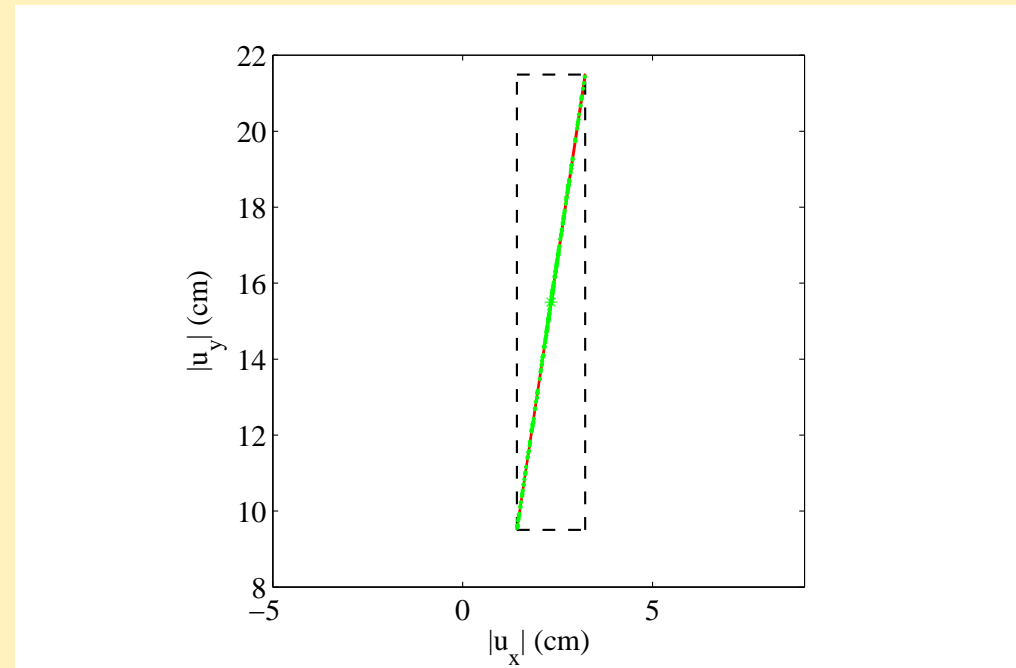
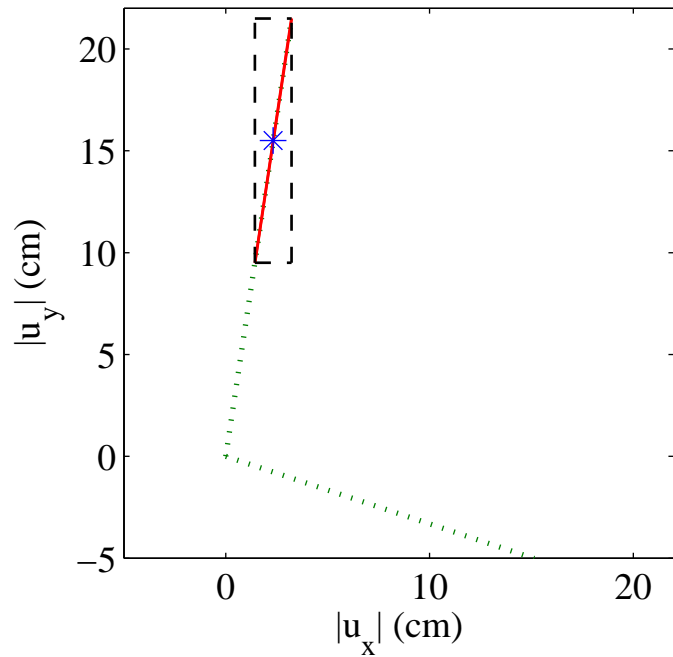
$|u_x|$



$|u_y|$

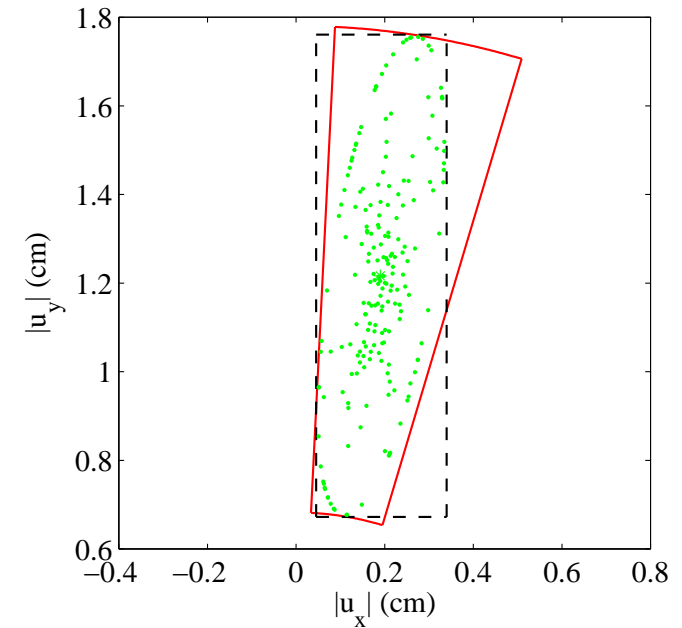
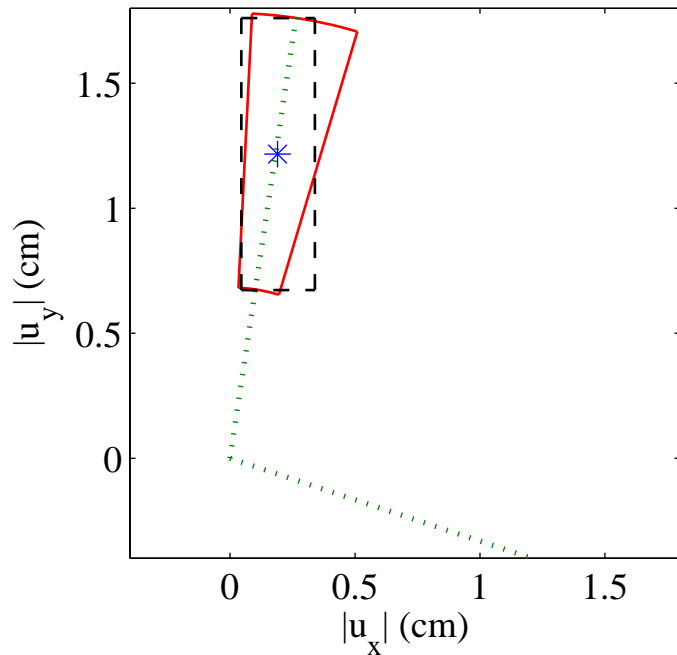
ex. (20DOF, 29-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = \omega_1^0$)



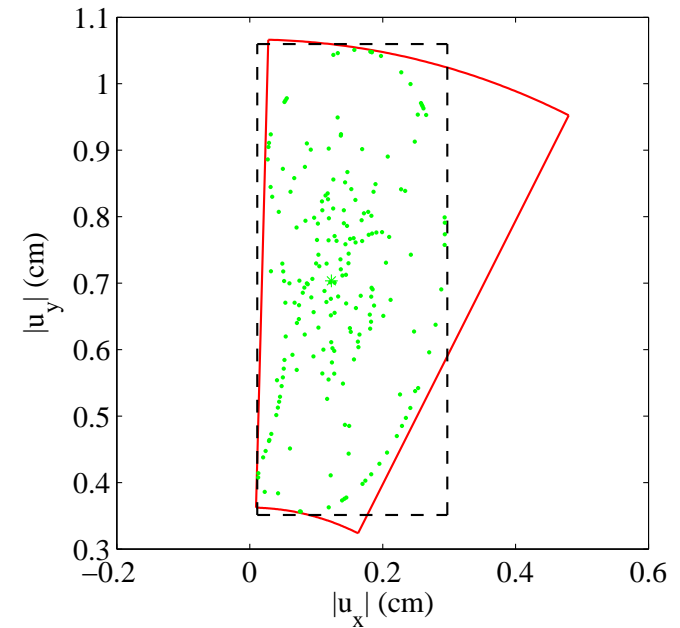
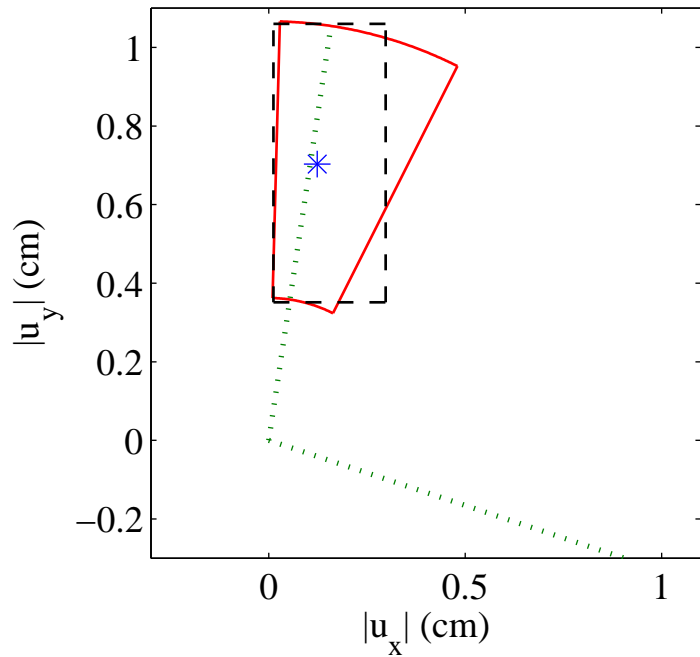
ex. (20DOF, 29-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = 1.2\omega_1^0$)



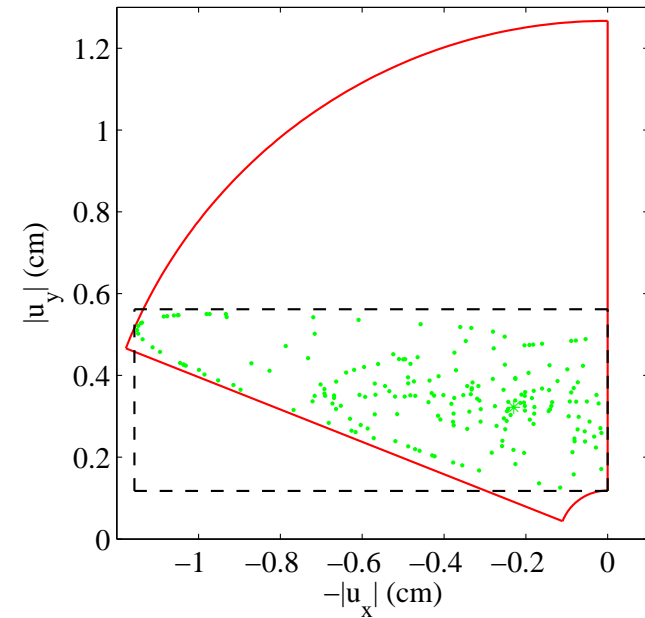
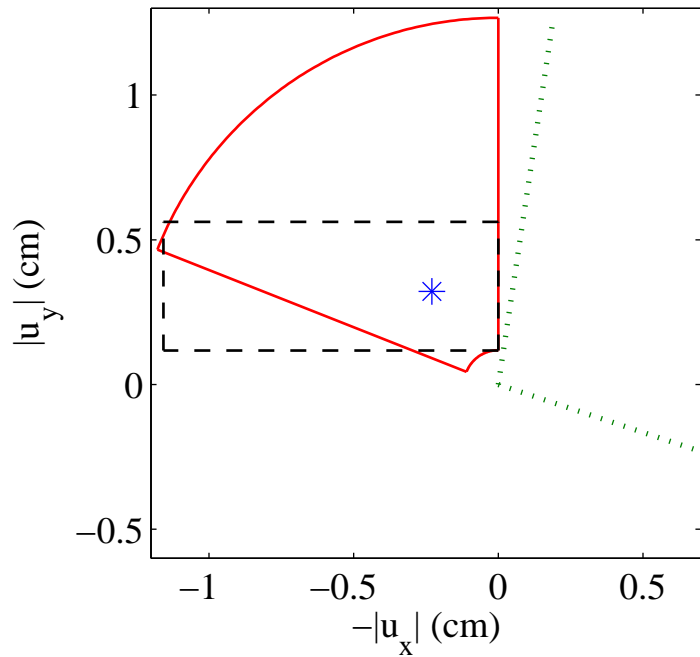
ex. (20DOF, 29-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = 1.3\omega_1^0$)



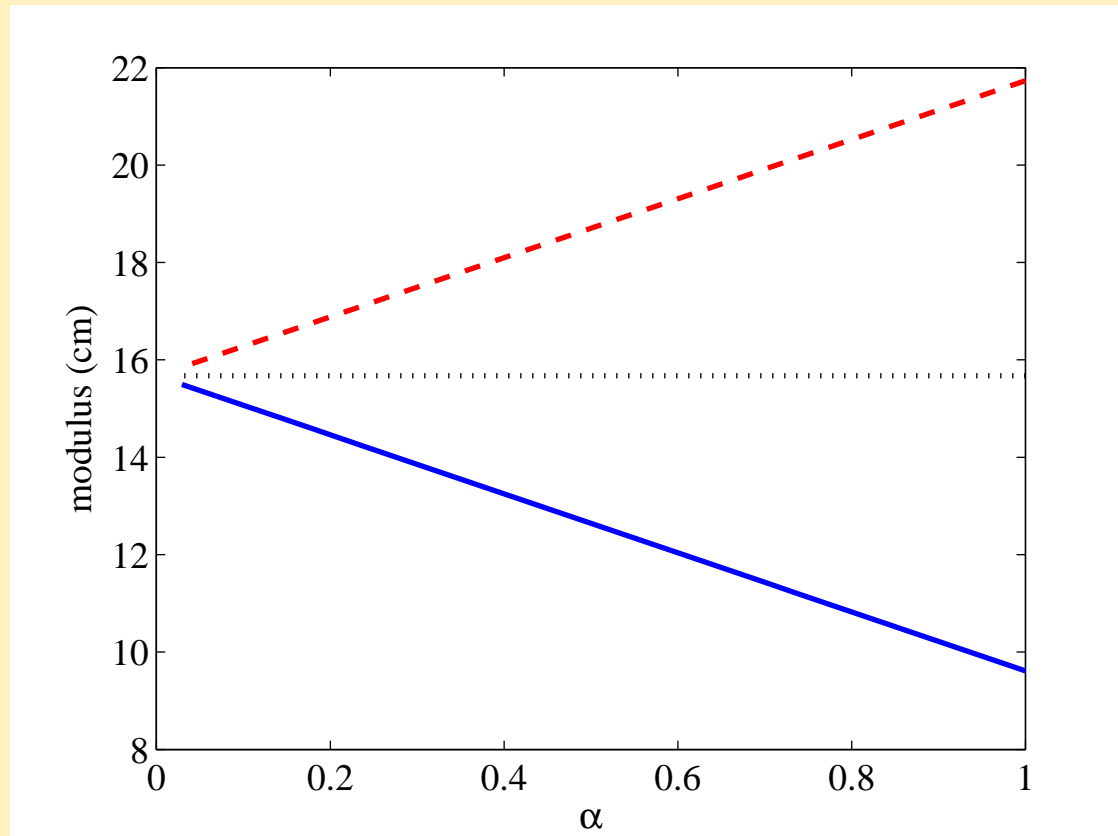
ex. (20DOF, 29-bar truss)

■ distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$ ($\omega = \omega_2^0$)



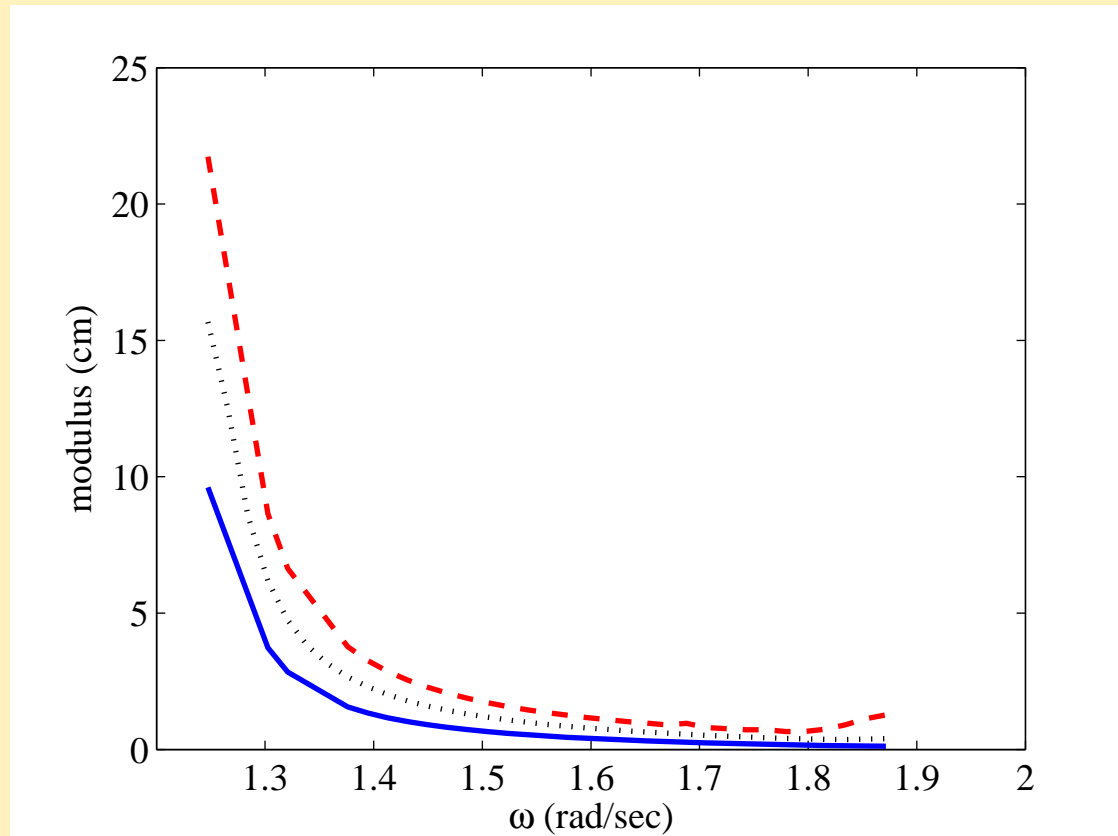
ex. (20DOF, 29-bar truss)

- distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$
variation w.r.t. α ('magnitude' of uncertainty)



ex. (20DOF, 29-bar truss)

- distribution of the vector $\begin{bmatrix} |u_x| \\ |u_y| \end{bmatrix}$
variation w.r.t. ω (circular frequency)



- uncertainty of dynamic load

- ◆ uncertainty of harmonic exciting load
- ◆ steady state of a damped structure

- bounds of response

- ◆ modulus & argument of displacement amplitude
- ◆ RO formulation
- ◆ SDP approximation
- ◆ conservativeness
 - ← an approximate optimal solution of (RO)