

# Complementarity Problems and Applications

SIAM Optimization 2005

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# Mixture of equalities and inequalities

$$0 \leq x \quad \perp \quad F(x) \geq 0$$

$$x' F(x) = 0$$

$$x_i F_i(x) = 0, \quad i = 1, 2, \dots, n$$

either  $x_i = 0$  or  $F_i(x) = 0$

# Historical events (omitted)

- KKT conditions / Complementary slackness
- Lemke's method (bimatrix / Nash games, selfish routing, electricity pricing)
- Triangulation/homotopy
- Complexity: Lemke exponential, NP-Hard, specializations polynomial - interior points
  - Murty; Cottle, Pang and Stone;
  - Facchinei and Pang

# Aims of talk

- Interplay between nonsmoothness and complementarity
- Modeling perspective: what do complementarity problems add?
- Explicit examples from economics and engineering

# Thanks to...

- Todd Munson, Steve Dirkse
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- Joe Burke, Jeff Renfro, Vincent Acary
- Andy Philpott, Jarrad Wallace, Qian Li
  
- Alex Meeraus, Tom Rutherford
- David Gay, Bob Fourer

# Equivalent Nonsmooth Map

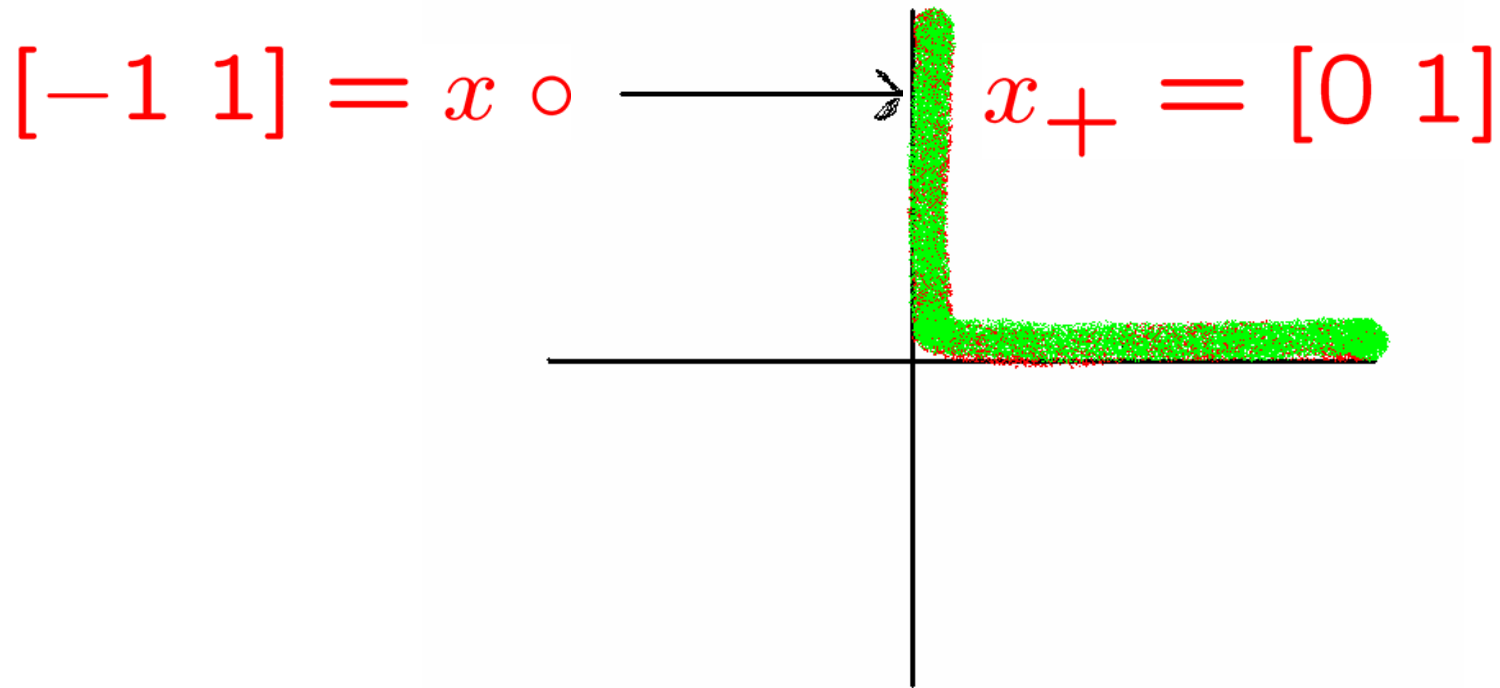
$$0 = F(x_+) + x - x_+$$

$$0 \leq x_+, \quad F(x_+) = x_+ - x \geq 0$$

$$x'_+ F(x_+) = x'_+(x_+ - x) = 0$$

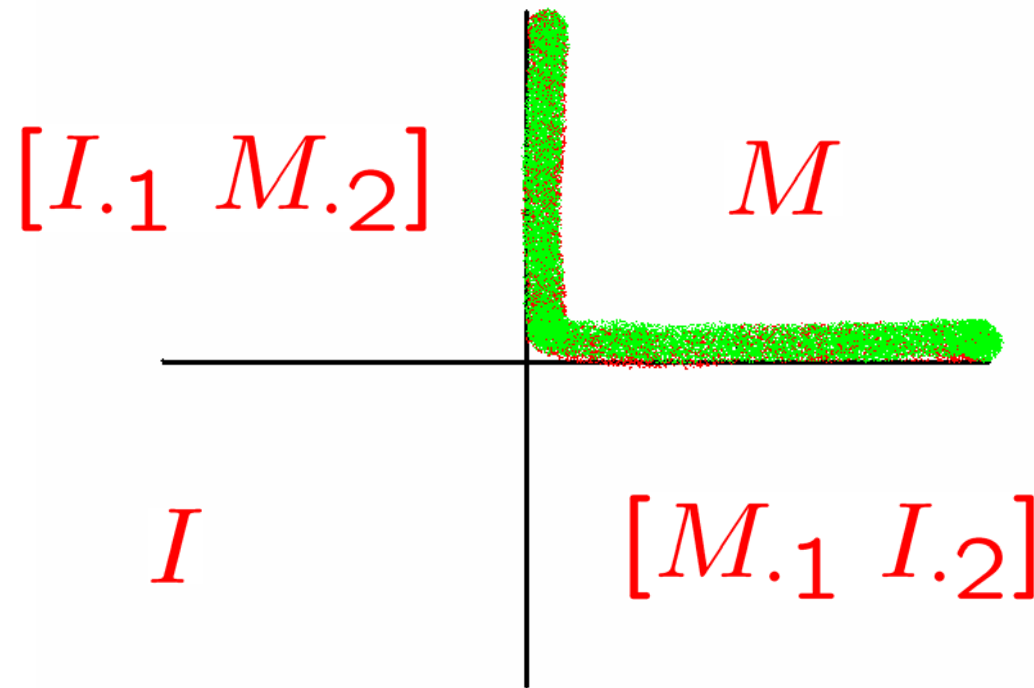
$$0 = F(\pi_C(x)) + x - \pi_C(x)$$

# Normal Manifold (I)



$$Mx_+ + q + x - x_+$$

# Normal Manifold (II)



$$Mx_+ + q + x - x_+$$



# The PATH Solver

- PATH: Newton method based on nonsmooth Normal map

$$F(x_+) + x - x_+$$

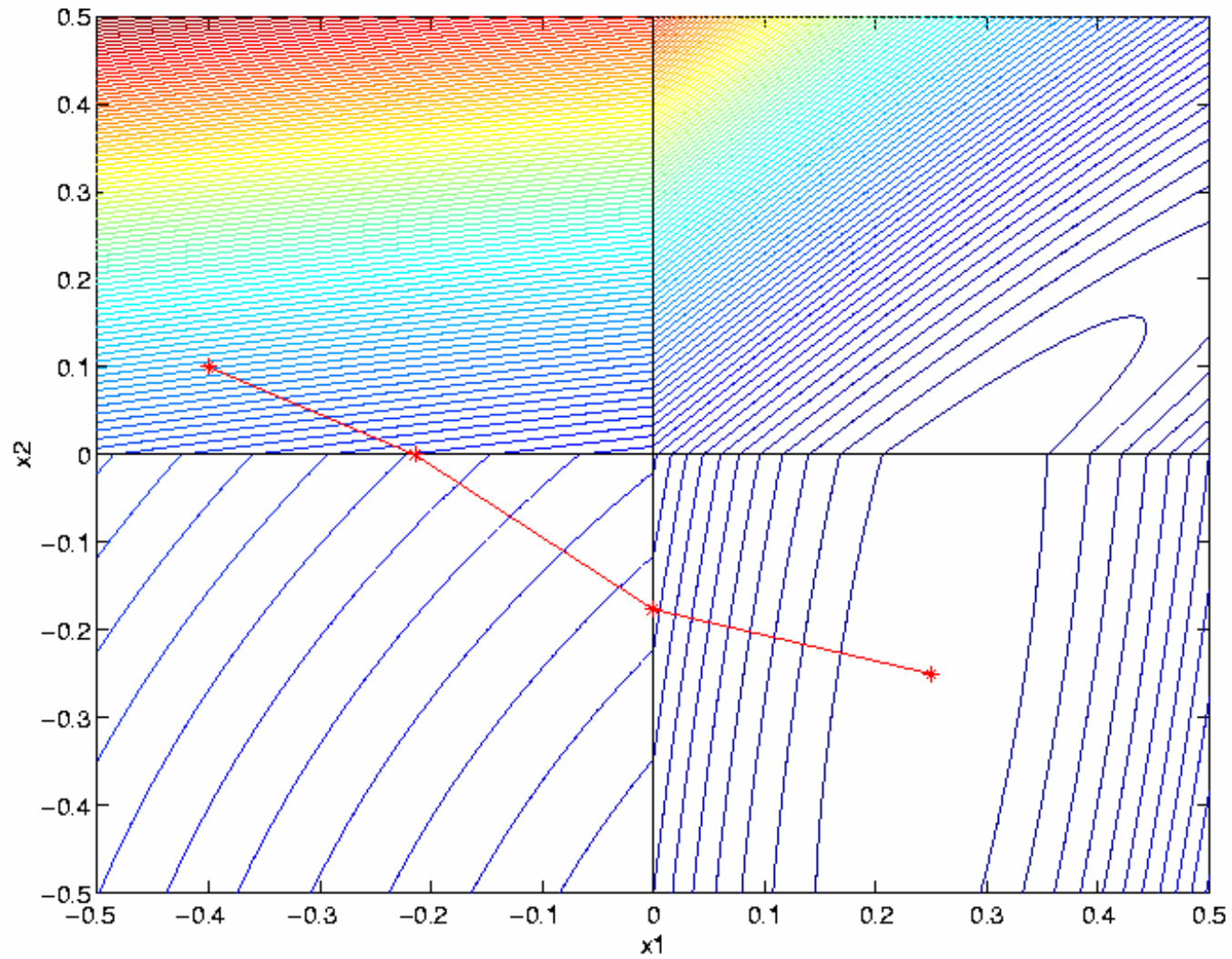
- Newton point is solution of piecewise linearization

$$F(x_+^k) + \nabla F(x_+^k)(x_+ - x_+^k) + x - x_+ = 0$$

- Uses more general projection:

$$x_+ \leftarrow \pi_{\mathcal{B}}(x)$$

# The "Newton" Step



# Key solver features

- Underlying robust theory
- Large scale linear algebra
- Ease of model generation/checking
- Globalization and merit functions
- Treat singularities/ill conditioning
- Crash methods and preprocessing
  
- Alternative: Semismooth based Newton approaches

# Market equilibrium (I)

*Supply / Production :*

$$\min \quad \frac{1}{2}x'Qx + c'x$$

$$\text{s.t.} \quad Ax \geq b$$

$$Bx \geq r^*$$

$$x \geq 0$$

$$\begin{bmatrix} Q & -A' & -B' \\ A & & \\ B & & \end{bmatrix} \begin{bmatrix} x \\ v \\ w \end{bmatrix} + \begin{bmatrix} c \\ -b \\ -r^* \end{bmatrix}$$

## Market equilibrium (II)

$$\begin{bmatrix} Q & -A' & -B' \\ A \\ B \end{bmatrix} \begin{bmatrix} x \\ v \\ w \end{bmatrix} + \begin{bmatrix} c \\ -b \\ -r^* \end{bmatrix}$$

*Demand* :  $r^* = q(p) = Dp + d$

*Equilibrium* :  $w = p$

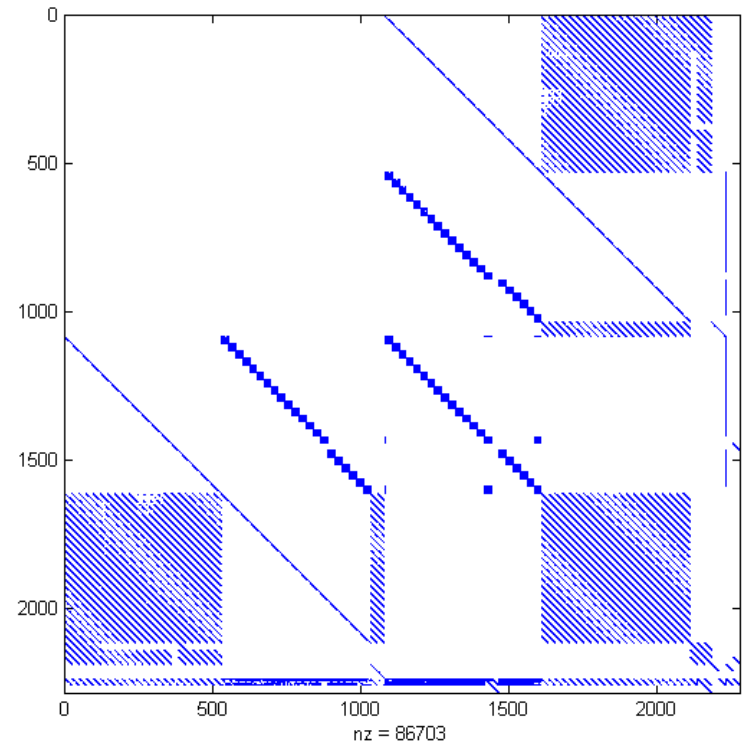
# Market equilibrium (III)

$$\begin{bmatrix} Q & -A' & -B' \\ A & & \\ B & & -D \end{bmatrix} \begin{bmatrix} x \\ v \\ p \end{bmatrix} + \begin{bmatrix} c \\ -b \\ -d \end{bmatrix}$$

$$0 \leq \begin{bmatrix} \nabla \mathcal{L}(x, u, p) \\ \tilde{g}_t(x) \\ \tilde{h}_t(x) \quad -D(p) \end{bmatrix} \perp \begin{bmatrix} x \\ u \\ p \end{bmatrix} \geq 0$$

# Application: Uruguay Round

- World Bank Project with Harrison and Rutherford
- 24 regions, 22 commodities
  - 2200 x 2200 (nonlinear)
- Short term gains \$53 billion p.a.
  - Much smaller than previous literature
- Long term gains \$188 billion p.a.
  - Number of less developed countries loose in short term
- Unpopular conclusions - forced concessions by World Bank



# Pizza Cheese

- MPC (milk protein concentrate) outside of quota restrictions
- Not allowed by law for use in cheese
- “Innovate” new MPC for use in new product: Pizza Cheese
- Model determines relative prices, and explains huge increase in MPC imports



# Definition of MPEC (MPCC)

$$\begin{array}{ll} \min & f(x, y) \\ \text{s.t.} & g(x, y) \leq 0 \end{array}$$

Add parameterization to definition of F; parameter  $y$

$$0 \leq x \perp F(x, y) \geq 0$$

Theory hard; no constraint qualification, specify  
in AMPL/GAMS

# NCP functions

Definition:  $\phi(a, b) = 0 \Leftrightarrow 0 \leq a \perp b \geq 0$

Example:  $\phi_{\min}(a, b) := \min(a, b)$

Example:  $\phi_{FB}(a, b) := \sqrt{a^2 + b^2} - a - b$

Componentwise:  $\Phi_i(x) := \phi(x_i, F_i(x))$

$\Phi(x) = 0 \Leftrightarrow 0 \leq x \perp F(x) \geq 0$

Aside: (semismooth) fact

$\Psi(x) := \Phi(x)' \Phi(x)$  cont. diffble.

# MPEC approaches

- Implicit:  $\min f(x(y), y)$
- Auxiliary variables:  $s = F(x, y)$
- NCP functions:  $\Phi(s, x) = 0$
- Smoothing:  $\Phi_\mu(s, x) = 0$
- Penalization:  $\min f(x, y) + \mu \{s'x\}$
- Relaxation:  $s'x \leq \mu$
- Different problem classes require different solution techniques

# Parametric algorithm NLPEC

- Reftype = FB
- Initmu = 0.01
- Numsolves = 5
- Updatefac = 0.1
- Finalmu = 0
- Slack = positive

$$\begin{aligned} NLP(\mu) : \min f(x, y) \\ g(x, y) \leq 0 \\ s = F(x, y) \\ x, s \geq 0 \\ \phi_\mu(s_i, x_i) = 0 \end{aligned}$$

Reformulate problem and set up sequence of solves

# Running NLPEC

- Create the GAMS model as an MPEC
- Setup nlpec.opt
- Gams modelfile mpec=nlpec optfile=1
- Reformulated automagically
- Results returned directly to GAMS
- Modeler tip: use "convert" to get AMPL
- Modeler tip: use "kestrel" to solve GAMS models using AMPL linked solvers

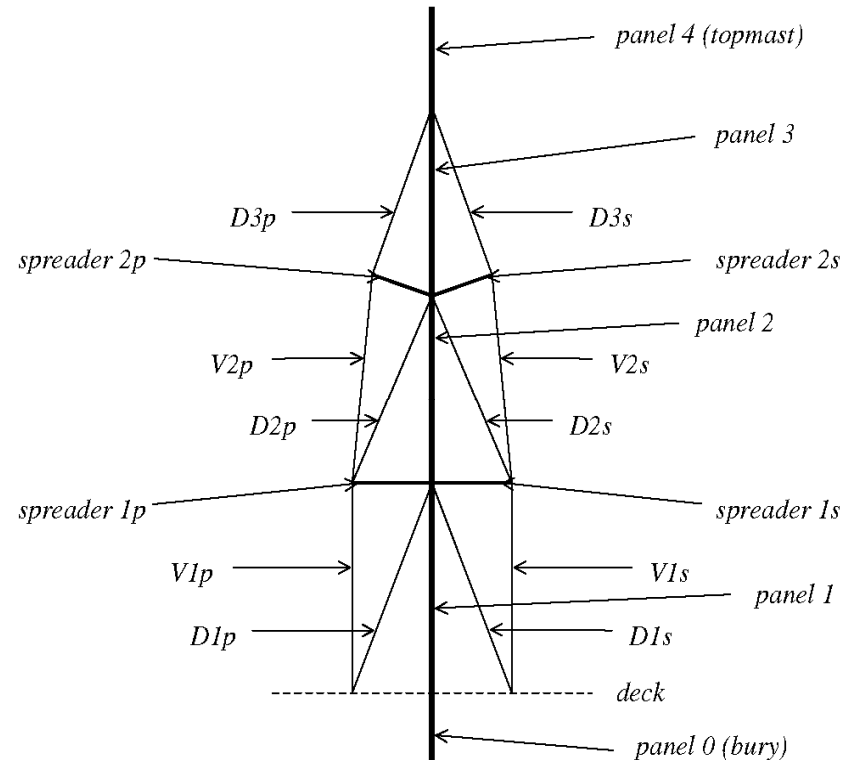
# Optimal Yacht Rig Design

- Current mast design trends use a large primary spar that is supported laterally by a set of tension and compression members, generally termed the rig
- Complementarity determines member loads and deflections for given geometry and design variables
- Reduction in either the weight of the rig or the height of the VCG will improve performance



# Complementarity Feature

- Stays are tension-only members (in practice) - Hookes Law
- When tensile load becomes zero, the stay goes slack (low material stiffness)

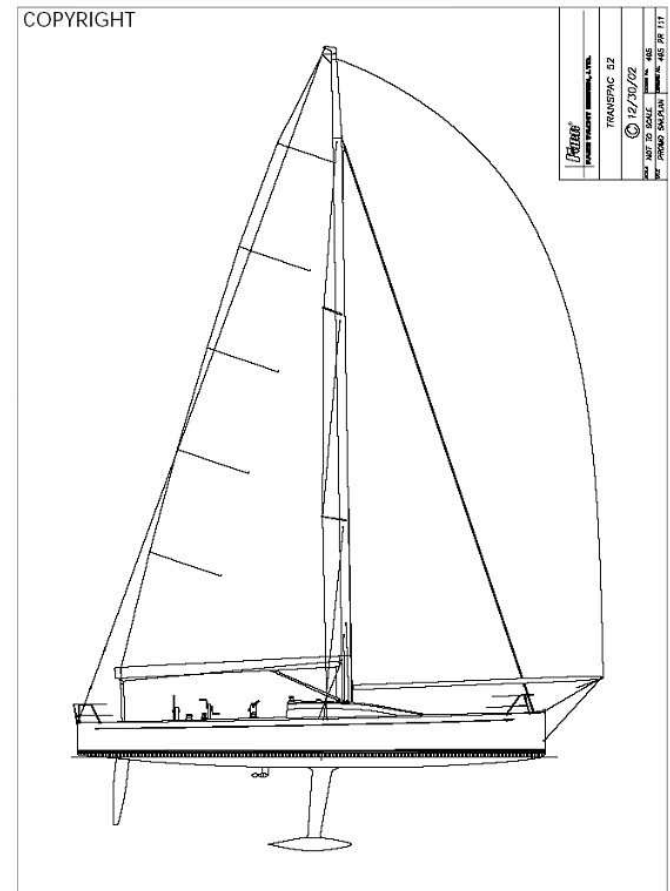


$$0 \geq s \perp s - k * dl \leq 0$$

$s$ : axial load  
 $k$ : member spring constant  
 $dl$ : member length extension

# MPEC extension for design

- TransPac 52' (TP52)
- Optimal rig design minimum weight problem using NLPEC
- One/two-spreader rig
- NLP starting value is a solution from CP
- Optimal val = 10.0873





# Benefits/Drawbacks

- Easy to adapt existing models
- Large-scale potential
- Customizable solution to problem
- Available within GAMS right now
- Models hard to solve
- Local solutions found
- Alternatives: Filter, LOQO, KNITRO

# What can we model via CP?

$$\min(G(x), H(x)) \leq y$$

$$\min(F^1(x), F^2(x), \dots, F^m(x)) = 0$$

$$\text{kth-largest}(F^1(x), F^2(x), \dots, F^m(x)) = 0$$

$$\text{Switch off: } g(x)h(x) \leq 0, h(x) \geq 0$$

$$\text{Variational Inequality: } VI(F, C)$$

# Chemical Phase Equilibrium

$$f(\alpha) = \sum_i y_i - x_i$$
$$y_i = K_i x_i, \quad x_i = \frac{z_i}{K_i \alpha + 1 - \alpha}$$

$$\text{Vapor} : f(\alpha) \geq 0, \quad \alpha = 1$$

$$\text{TwoPhase} : f(\alpha) = 0, \quad 0 \leq \alpha \leq 1$$

$$\text{Liquid} : f(\alpha) \leq 0, \quad \alpha = 0$$

$$\text{median}\{\alpha, \alpha - 1, -f(\alpha)\} = 0$$

# Other applications

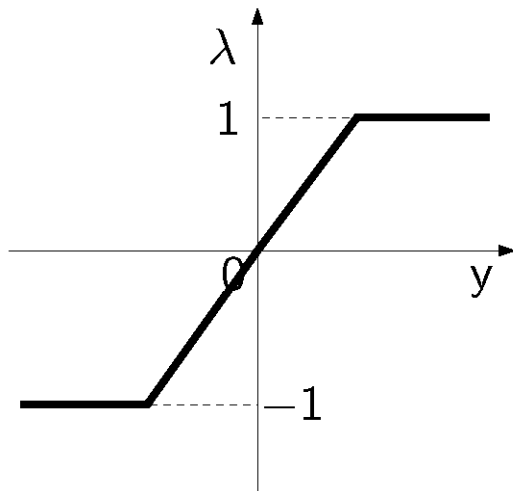
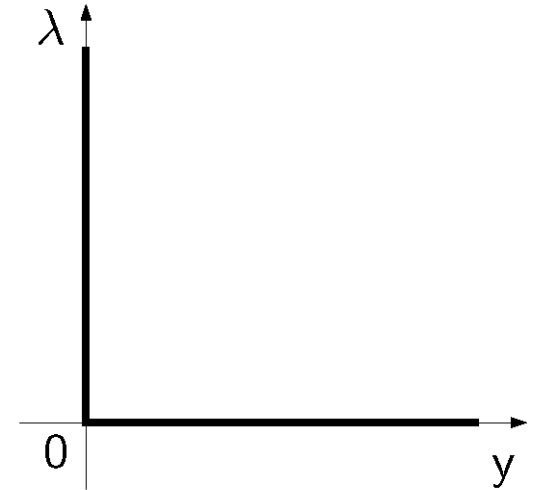
- Option pricing (electricity market)
- Contact problems (with friction)
- Free boundary problems
- Optimal control (ELQP)
- Earthquake propagation
- Structure design
- Dynamic traffic assignment

# Complementarity Systems

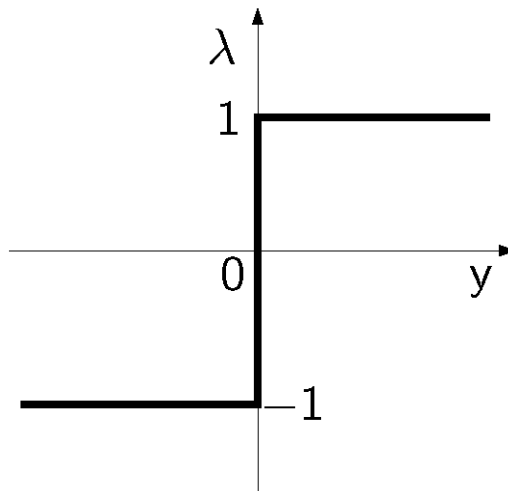
$$\frac{dx}{dt}(t) = f(x(t), \lambda(t))$$

$$y(t) = h(x(t), \lambda(t))$$

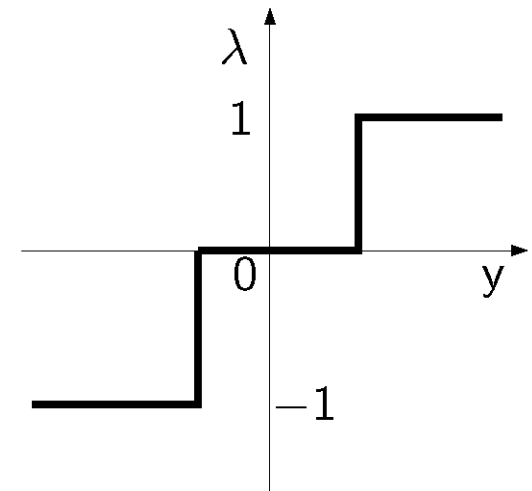
$$0 \leq y(t) \perp \lambda(t) \geq 0$$



saturation



Relay



Relay with dead zone

# Future Challenges

- MPEC/EPEC
  - theory and computation
- All solutions
  - Structure failure, Nash equilibria
- Large scale iterative solvers
  - Factors not available in RAM
- Complementarity Systems / Projected dynamical systems
- New application areas

# Solver/Example Availability

- Student version downloadable (full license downloadable yearly)
- AMPL/GAMS (also MILES, NLPEC)
- Matlab, Callable library, NEOS
- MCPLIB
- GAMSWORLD