

A (new) input format for conic optimization

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 - Semidefinite optimization
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General conic optimization

$$\min c^T x$$

$$Ax = b$$

$$x \in \mathcal{K}$$

$$\max b^T y$$

$$A^T y + s = c$$

$$s \in \mathcal{K}^*$$

The cone \mathcal{K} can be

Linear: $x \geq 0$

Second-order: $x_0 \geq \|x\|_2$

Rotated second-order: $x_0 x_1 \geq \|x_{2:n}\|$, and $x_0 \geq 0$

Semidefinite: x is (can be assembled into) a symmetric,
positive semidefinite matrix, or a

product of these.

Semidefinite optimization

- Standard form

$$\begin{array}{ll} \min C \bullet X & \max b^T y \\ \mathcal{A}X = b & \mathcal{A}^*y + S = C \\ X \succeq 0 & S \succeq 0, \end{array} \quad (\text{P-D})$$

where $b, y \in \mathbb{R}^m, X, S, C \in \mathbb{R}^{n^2}, \mathcal{A} : \mathbb{R}^{n^2} \rightarrow \mathbb{R}^m$

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- Linear operator \mathcal{A}

$$\begin{aligned}
 \mathcal{A}X &= (A_i \bullet X)_{i=1}^m \\
 \mathcal{A}^*y &= \sum_{i=1}^m A_i y_i
 \end{aligned}$$

\Rightarrow too restrictive

Special forms

- Rank one, low rank A_i

$$A_i = aa^T, A_i \bullet X = a^T X a$$

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 - $0 \preceq X_1 = X_2 \preceq U$
 - n^2 new equalities and variables!

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 - PCSDP (rank-1 data matrices)
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- Modelling languages
 - CVX
 - Yalmip

General requirements

- Portability
 - text-based
- *Reasonable* compatibility with existing formats
- Easily generated/modified by the user
- Powerful modelling capabilities
- Straightforward processing
- In-place preprocessing

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- More cones
 - power cones
 - exponential cone

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- More cones
 - power cones
 - exponential cone
- More objectives
 - quadratic
 - polynomial
 - log det

Potential candidates

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- XML
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 - only feasible together with a modelling environment
- A new format

The proposed format – problem layout

F 2	L- 4	S 3
$x_{1:2}$	$x_{3:7} \leq 0$	$\text{mat}(x_{8:16}) \succeq 0$

\mathcal{C}_1	\mathcal{C}_2	\mathcal{C}_3	=	3	0-		
\mathcal{A}_{11}	\mathcal{A}_{12}	\mathcal{A}_{13}			\preceq	1	E 1
\mathcal{A}_{21}	\mathcal{A}_{22}	\mathcal{A}_{23}			\succeq	0	S- 3
\mathcal{A}_{31}	\mathcal{A}_{32}	\mathcal{A}_{33}					L 2

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- Declare variables and constraints
- Define the $\mathcal{C}_j, \mathcal{A}_{ij}$ mappings and the RHS
 - sparse: only the nonzero blocks
 - several choices for one block (sparse, dense, rank-one, operator, etc.)

The proposed format – declarations

- Variables in arbitrary order
 - F, L, Q, R, S and more (SL, RL, B, I, E)

F 3 L 5 S 7 7 7 L 2 R 5 F 2 S 5

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 - repetition

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The proposed format – declarations

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 - negative cones: S-, L-

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- Constraints in arbitrary order
 - E, L, Q, R, S and more (SL, RL, B, I, O)
 - dual variables
 - objective is declared with O+, O-
 - repetition
 - “less than” S-, L-

E 5 L 5 S 3 S- 5

The proposed format – problem data

- Vectors
 - Dense vector
D 1 8 4 -6 8 3 9.2
 - Sparse vector
S 3, 1.3 2.8 -4, 1 13 20
- Matrices are treated similarly
- Special \mathcal{A}_{ij} blocks: dictionary

Code	Form	Data
D or S	generic block	the matrix
LD	$\log \det(X)$	\emptyset
A1	$AX + XA$	A
A2	$AX + XA^T$	A
A3	$AXB + BXA$	A, B
L1	$\mathcal{A}_{ij} = aa^T$	a

...

2 3 L1

D 1 8 4 -6 8 3 9.2

Conclusions

- Barebone modelling language
- Little overhead on the data
- Similar to existing formats
- Flexible
- Extends to more general cones
- Work in progress (pre alpha)
- To be featured in pSeDuMi

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