

Variational Analysis, Terry's fest, Limoges (France), Spring 2015

A tale about bifunctions

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Convex Optimization

Convex minimization problem:

$$\min f_0(x) \text{ such that } x \in X \subset \mathbb{R}^n$$

$$f_i(x) \leq 0 , i = 1, \dots, s, \quad f_i(x) = 0 , i = s + 1, \dots, m$$

Convex Optimization

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$$F(\cdot, 0) \in \left\{ F(\cdot, u), u \in U \subset \mathbb{R}^m \right\}$$

$u \mapsto S(u) = \{x \in X \mid f_i \leq 0, f_i = 0\}$, feasibility mapping

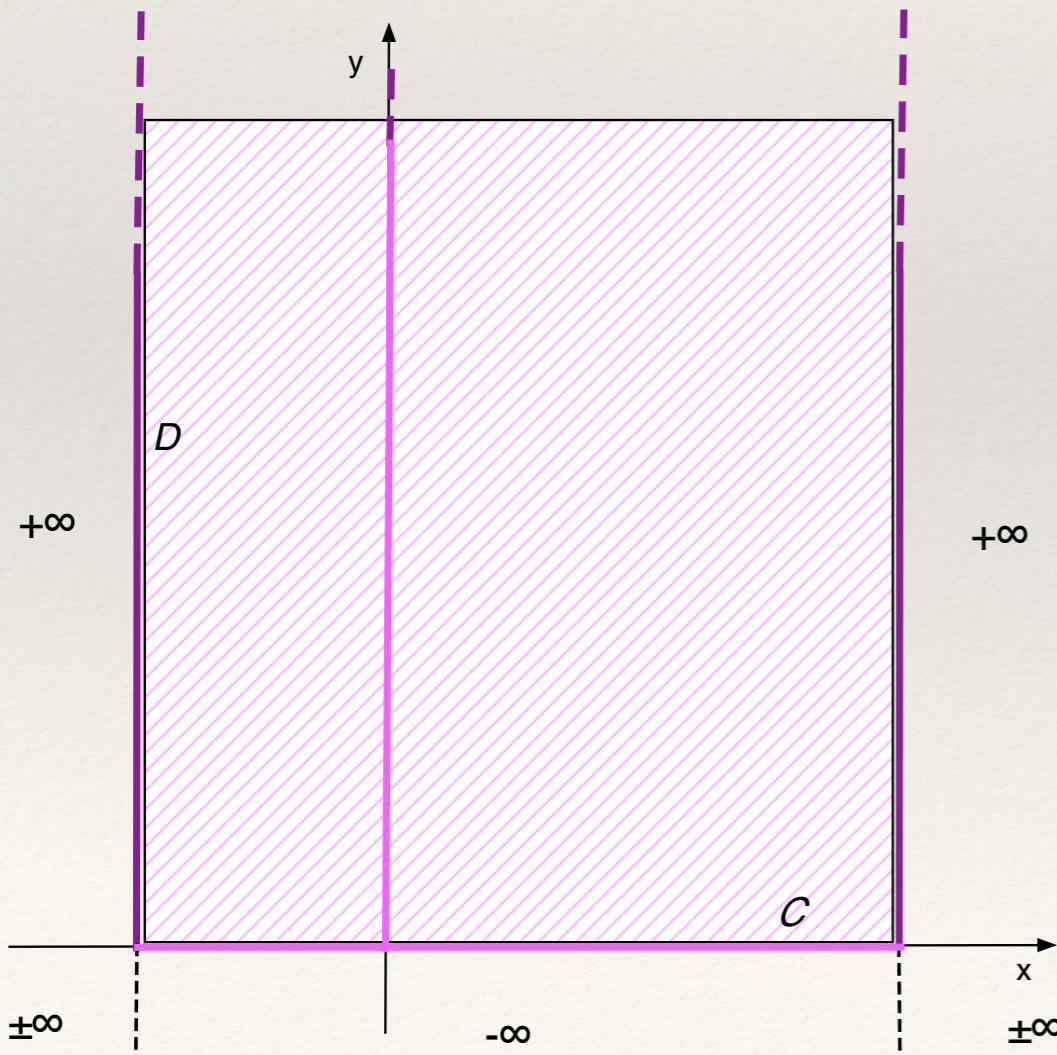
$$F(u, x) = \begin{cases} f_0(x) & \text{when } x \in S(u) \\ \infty & \text{when } x \notin S(u) \end{cases}$$

$F : \mathbb{R}^n \times \mathbb{R}^m \rightarrow \overline{\mathbb{R}}$, set $U = \mathbb{R}^m$, convex bifunction

Saddle Functions: Part VII “Convex Analysis”

$F(x, u)$ a convex bifunction on $\mathbb{R}^n \times \mathbb{R}^m \rightarrow \overline{\mathbb{R}}$

$$L(x, y) = \inf_u \{ \langle y, u \rangle - F(x, u) \} \quad \text{Lagrangian}$$



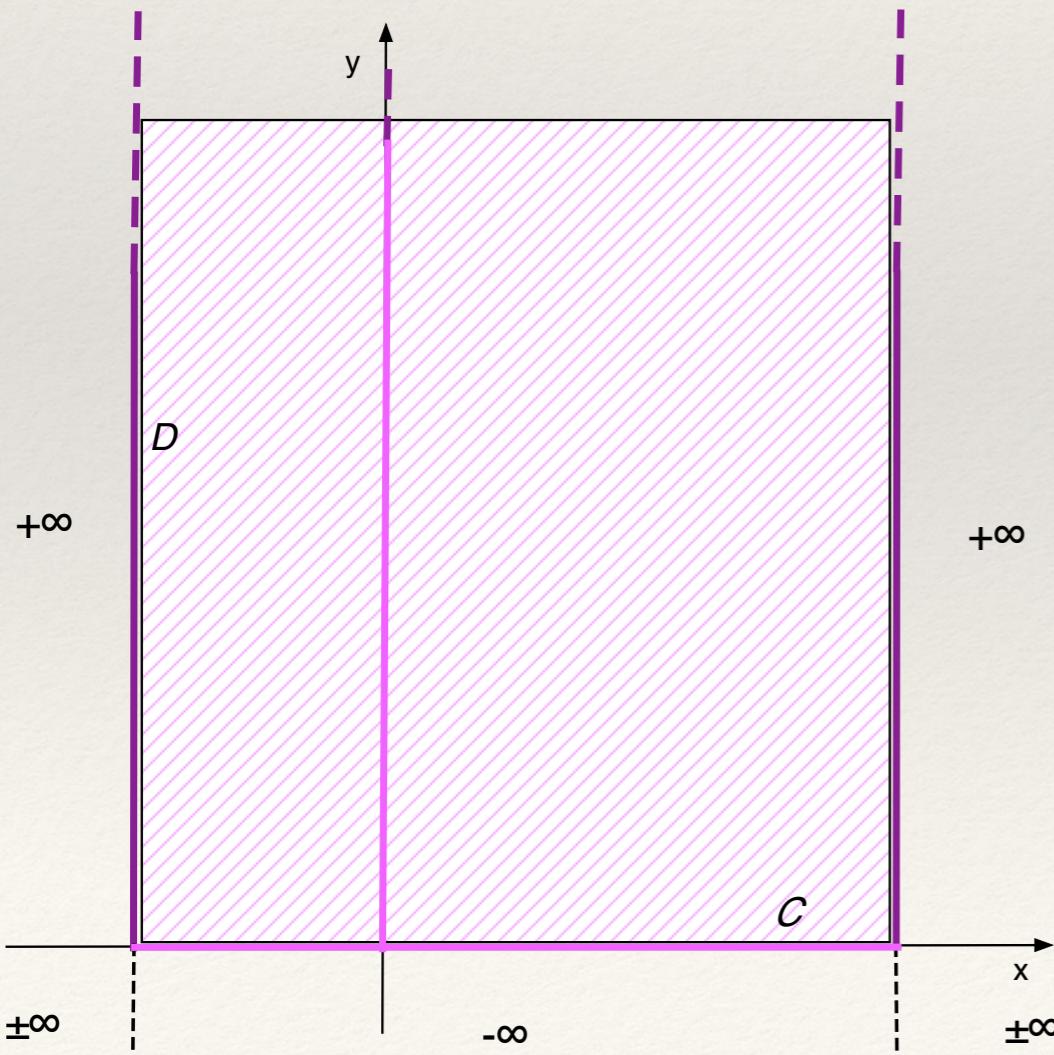
$$C = X, \quad D = \mathbb{R}_+^s \times \mathbb{R}^{m-s}$$

$$L(x, y) = \begin{cases} f_0(x) + \sum_{i=1}^n y_i f_i(x) & \text{if } x \in C, y \in D \\ +\infty & \text{if } y \in D, x \notin C \\ -\infty & \text{if } y \notin D \end{cases}$$

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early 80's: with Hedy Attouch, + Dominique Azé (later)

Convergence of Saddle Functions

$F, F^\nu : X \times Y \rightarrow \overline{\mathbb{R}}$, $(X, \tau), (Y, \sigma)$ metrizable

Epi/hypo-convergence (\sim hypo/epi-convergence)

$$\forall x^\nu \rightarrow_\tau x, \exists y^\nu \rightarrow_\sigma y: F(x, y) \leq \liminf_\nu F^\nu(x^\nu, y^\nu)$$

$$\forall y^\nu \rightarrow_\sigma y, \exists x^\nu \rightarrow_\tau x: F(x, y) \geq \limsup_\nu F^\nu(x^\nu, y^\nu)$$

\Rightarrow saddle pnts of F^ν “converge” to saddle pnts of F

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Limit functions: ν filter: \mathcal{H}

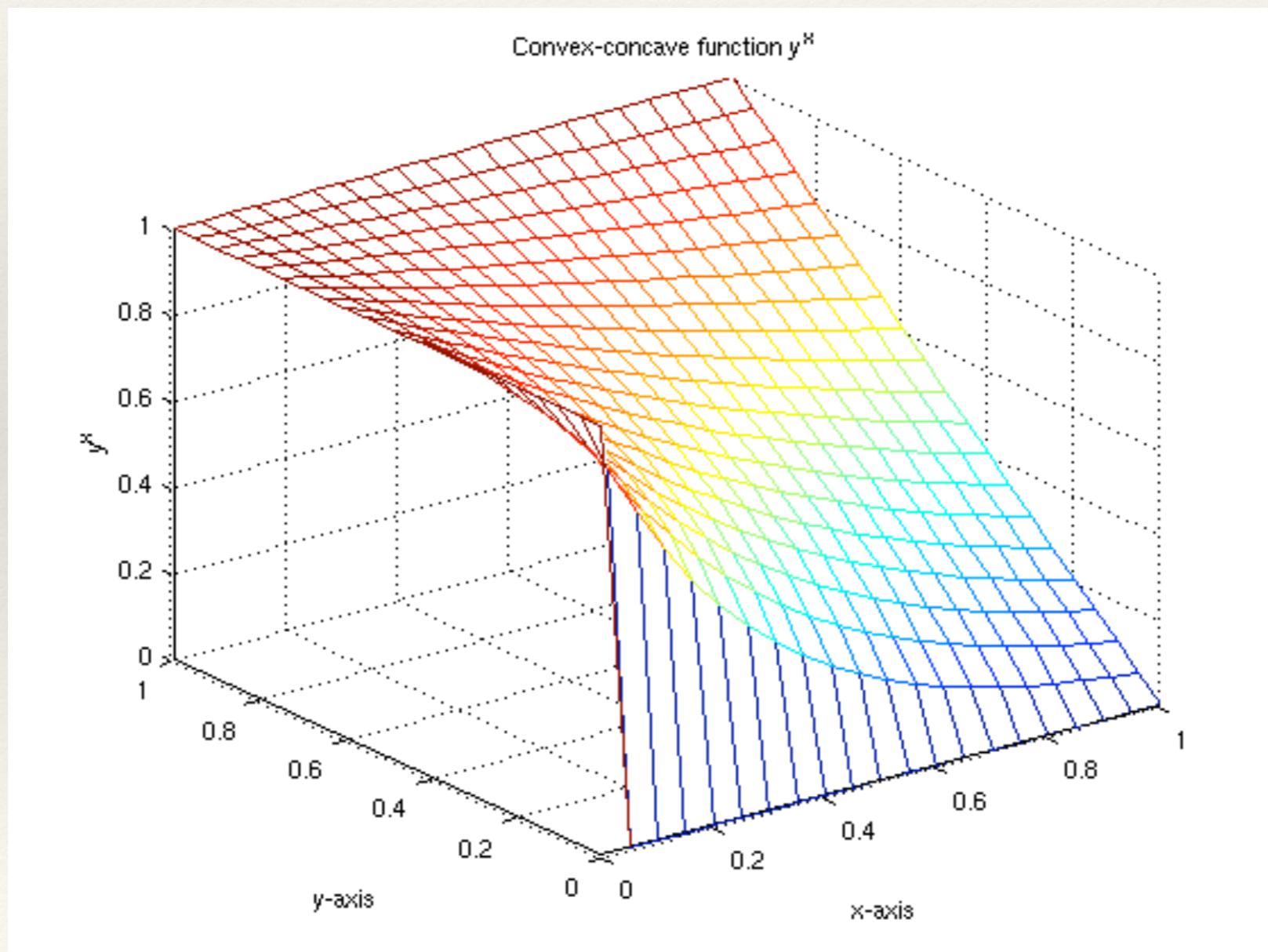
$$\text{e-limit: } l_e F^\nu = \sup_{U \in \mathcal{N}_\tau(x)} \inf_{V \in \mathcal{N}_\sigma(y)} \inf_{H \in \mathcal{H}} \sup_{\nu \in H} \sup_{v \in V} \inf_{u \in U} F^\nu(u, v)$$

$$\text{h-limit: } l_h F^\nu = \inf_{V \in \mathcal{N}_\sigma(y)} \sup_{U \in \mathcal{N}_\tau(x)} \sup_{H \in \mathcal{H}} \inf_{\nu \in H} \sup_{v \in V} \inf_{u \in U} F^\nu(u, v)$$

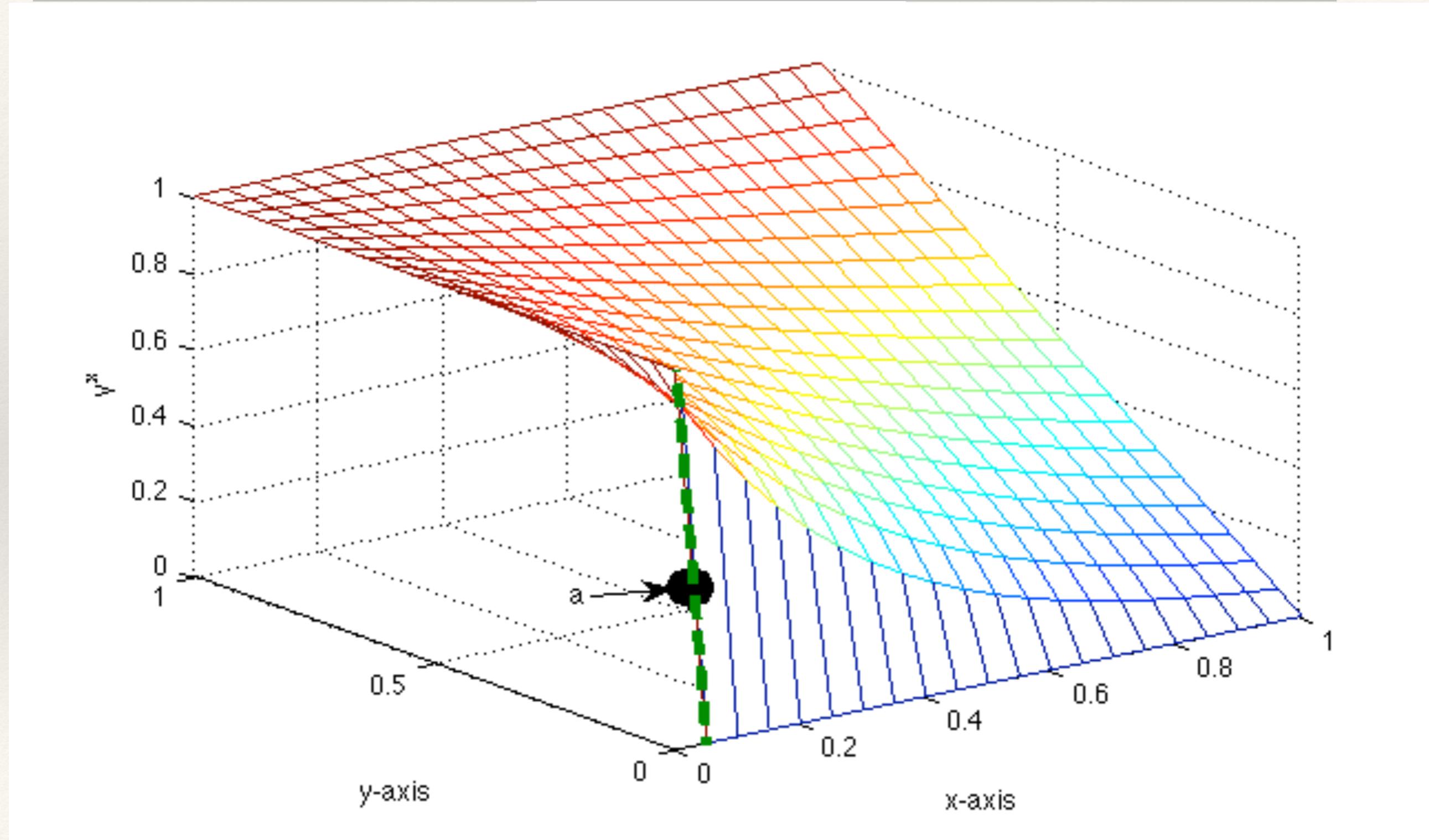
$$F \text{ an epi/hypo-limit} \iff l_e F^\nu \leq F \leq l_h F^\nu$$

Epi/hypo-convergence: not a Hausdorff topology !!

$F^\nu = y^x$ on $[0, 1]$ with $\pm\infty$ convex-concave extensions



epi/hypo-limit: $F = F^\nu$ on $[0, 1]^2 \setminus \{0, 0\}$, $F(0, 0) = a \in [0, 1]$



Equivalence Classes!

F, G are equivalent $\text{cl}_x F = \text{cl}_x G$ and $\text{cl}_y F = \text{cl}_y G$ 1970

convergence of equivalence classes

1995 notes (for us) shows that epi/hypo convergence

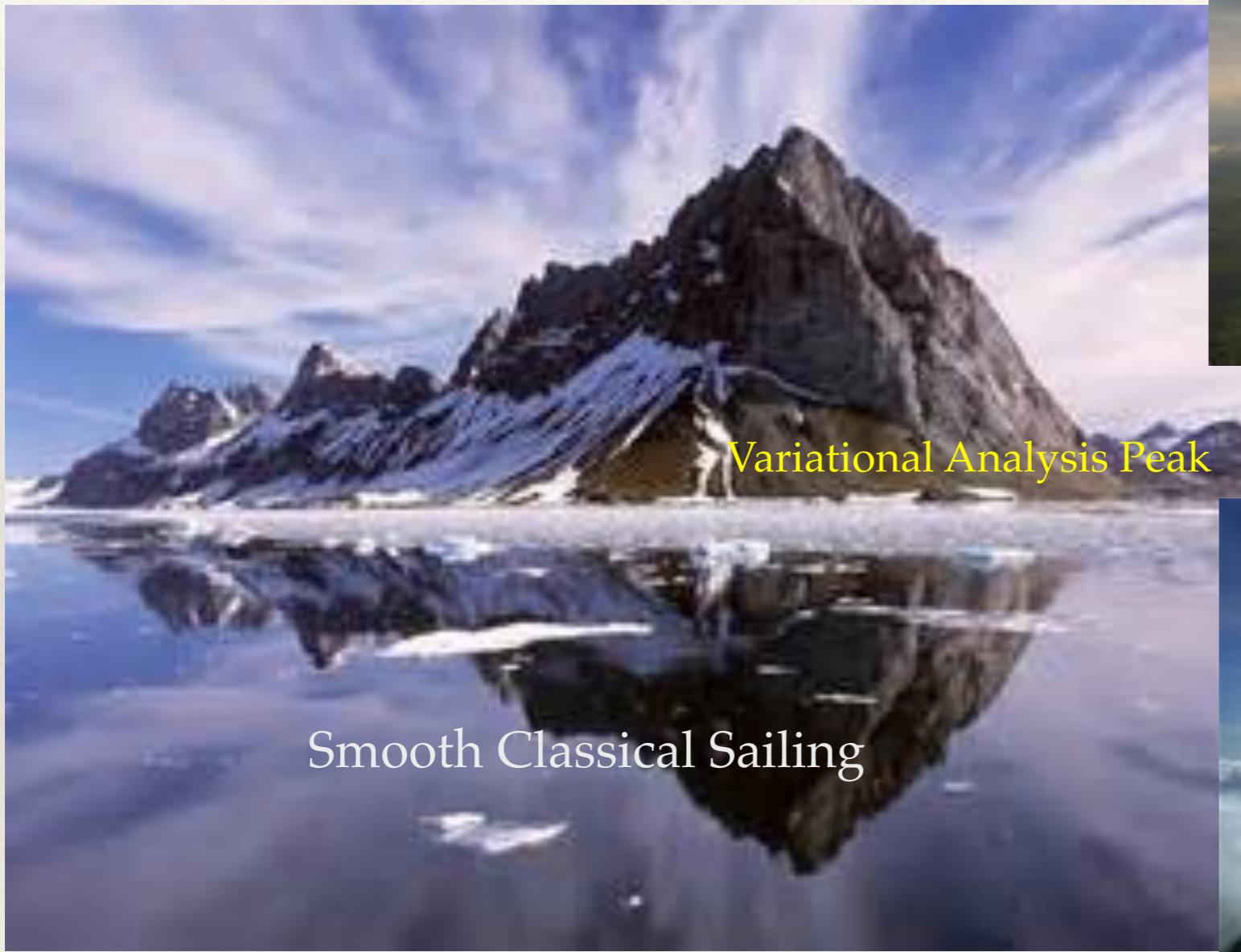
- is consistent with
- and can be formulated in terms of equivalence classes



Variational Analysis Peak

Smooth Classical Sailing





Celebrating your 50th anniversary of your 30th birthday

2nd-order Subderivatives

- ❖ attempt at integrating subdifferentiability of 2nd order with epi/hypo-limits (RTR)
- ❖ obstacle: lack of uniqueness!
- ❖ Chi Do



a bleak picture

A new paradigm

- ❖ Jean-Pierre Aubin, office neighbor at IIASA, working with Ivar Ekeland on “Applied Nonlinear Analysis”
- ❖ from saddle point to convergence of just MaxInf-points
- ❖ Lopsided Convergence for extended-real valued bifunctions (1983, CRAS)

Lopsided Convergence

$F, F^\nu : X \times Y \rightarrow \overline{\mathbb{R}}$, $(X, \tau), (Y, \sigma)$ metrizable

Epi/hypo-convergence

$$\begin{aligned} \forall x^\nu \rightarrow_\tau x, \exists y^\nu \rightarrow_\sigma y: \quad & F(x, y) \leq \liminf_\nu F^\nu(x^\nu, y^\nu) \\ \forall y^\nu \rightarrow_\sigma y, \exists x^\nu \rightarrow_\tau x: \quad & F(x, y) \geq \limsup_\nu F^\nu(x^\nu, y^\nu) \end{aligned}$$

saddle points converge

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MaxInf-points converge

“only”

Equilibrium as a MinSup

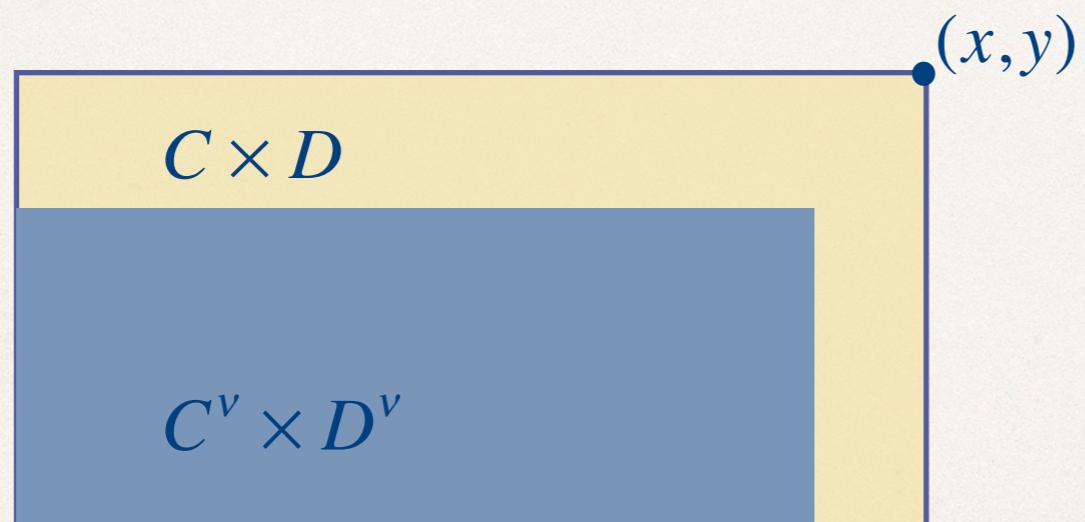
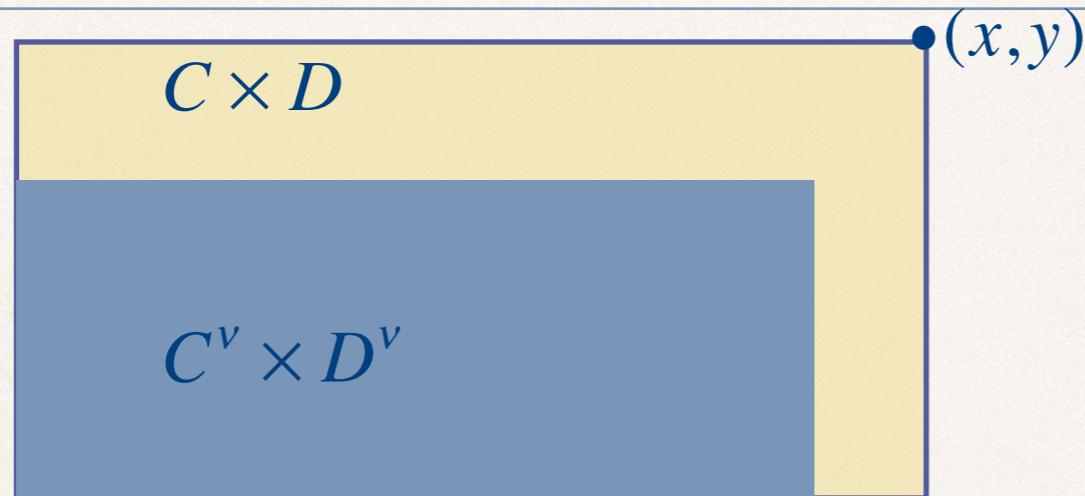
Actually
MaxInf

- * $\forall a \in A: d_a(p) \in \arg \max \left\{ u_a(x_a) \mid \langle p, x_a \rangle \leq \langle p, e_a \rangle \right\}$
- * $s(p) = \sum_a (e_a - d_a(p))$ excess supply
- * find $\bar{p} \in \Delta$ (unit simplex) so that $s(\bar{p}) \geq 0$
- * Walrasian: $W(p, q) = \langle q, s(p) \rangle$ Ky Fan fcn
- * $\bar{p} \in \maxinf W, W(\bar{p}, \cdot) \geq 0 \Leftrightarrow s(\bar{p}) \geq 0$
- * conditions: $u_a^\nu \rightarrow_{hypo} u_a, e_a^\nu \rightarrow e_a \in \text{int dom } u_a \Rightarrow$
- * Convergence: W^ν lop-converges ancillary-tight to W

MaxInf but not MinSup

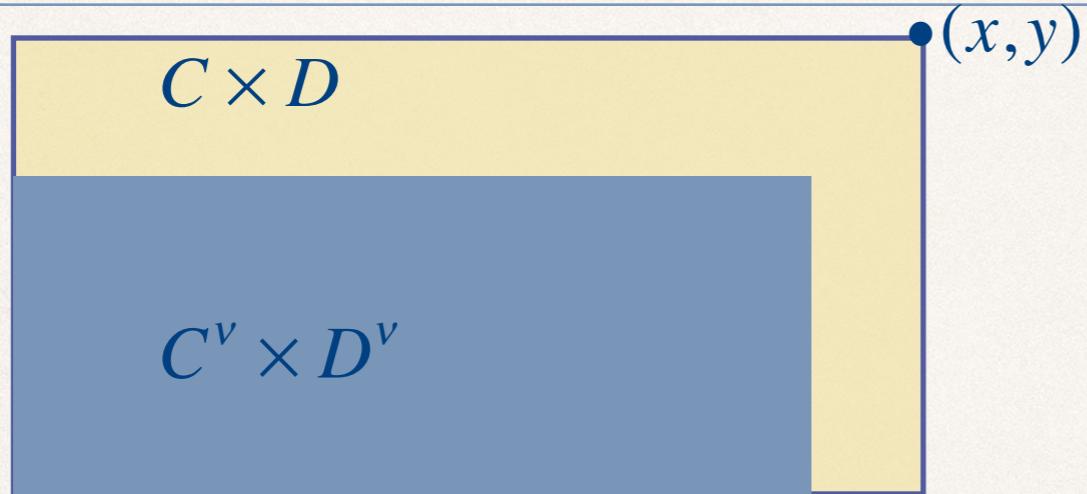
- Variational Inequality: $-G(x) \in N_C(x)$: $F(x, y) = \langle -G(y), y - x \rangle$ on $C \times C$
- Nash Equilibrium, non-cooperative game: $\min r_i(x_i, x_{-i})$, $i \in \mathcal{I}$,
 $F(x, y) = \sum_{\mathcal{I}} (r_i(x_i, x_{-i}) - r_i(y_i, x_{-i}))$
- Complementarity: $0 \leq x \perp H(x) \geq 0$, $F(x, y) = \langle H(x), y - x \rangle$ on $\mathbb{R}_+^n \times \mathbb{R}_+^n$
- Fixed point: $S(x) \ni x$ (on C): $F(x, y) = \sup \{ \langle y - x, z - x \rangle \mid z \in S(x) \subset C \}$
- MPEC: $\max g(x)$, $x \in S(x)$: $F(x, y) = g(x) + \sup \{ \langle y - x, z - x \rangle \mid z \in S(x) \}$
- “Classical” bifunctions: Lagrangian, augmented Lagrangian, Hamiltonian, optimality functions (Polak), ..
- New domains: PDE (Mountain Pass Theorem), minimal surfaces, ???

Convergence finite-valued on product sets



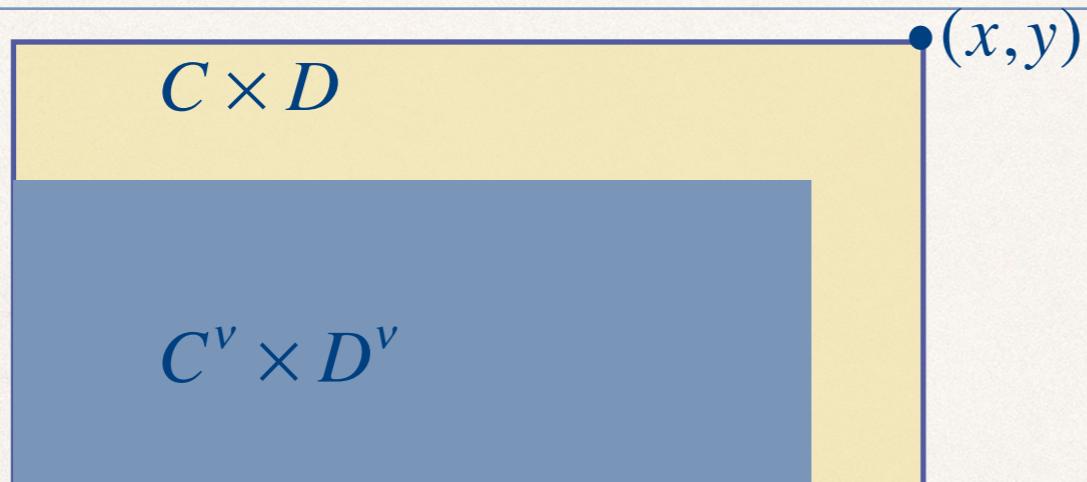
Lopsided Convergence

finite-valued on product sets

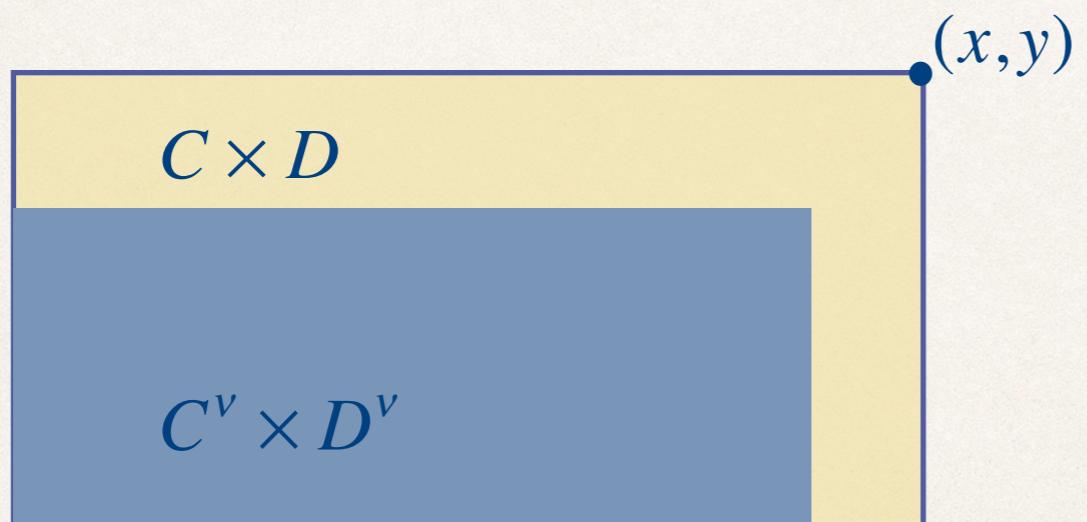


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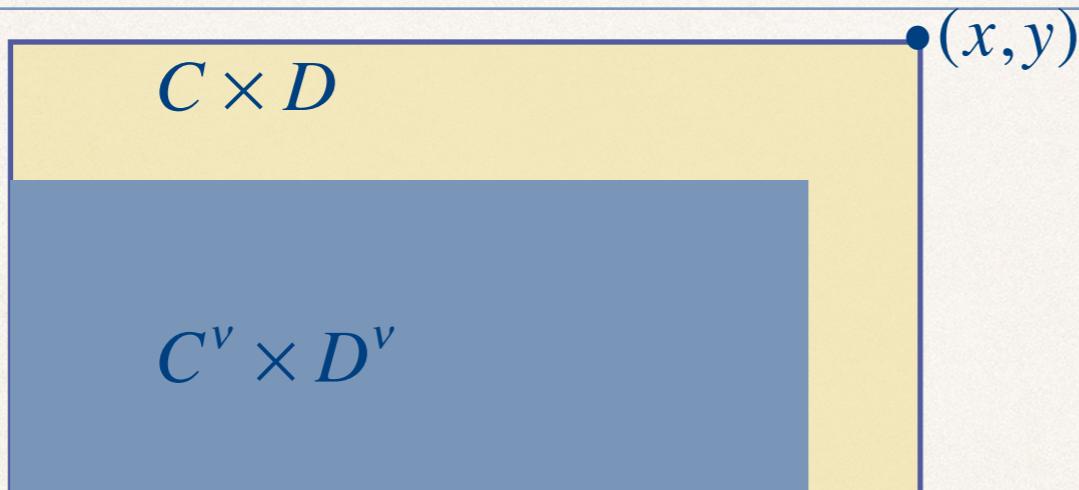
$\forall y \in D, \forall x^\nu \in C^\nu \rightarrow x$



Lopsided Convergence

finite-valued on product sets

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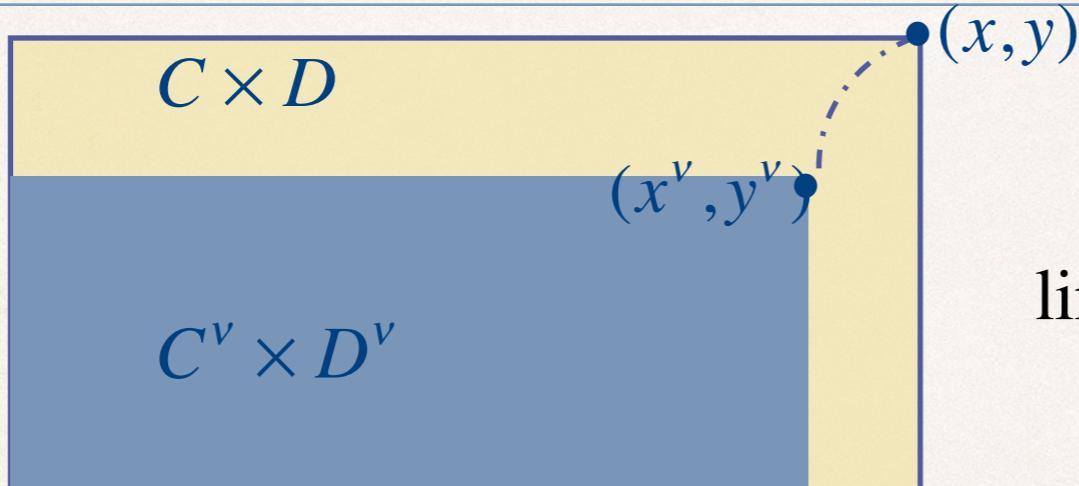


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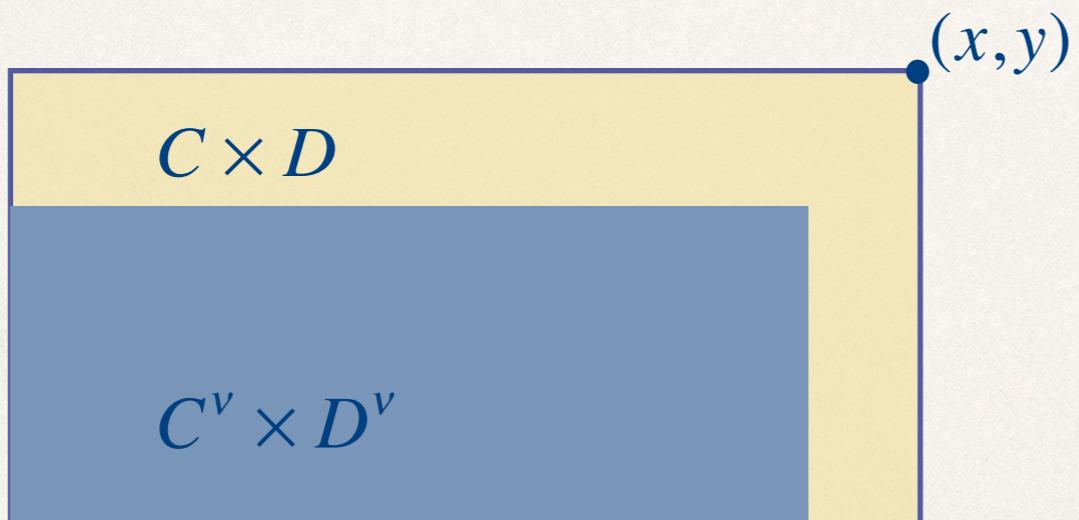
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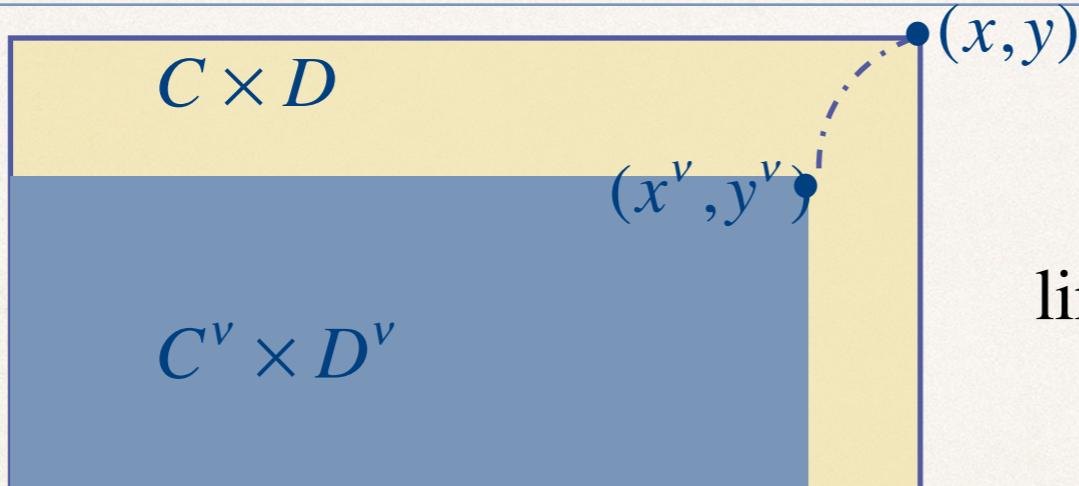
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$\liminf_\nu K^\nu(x^\nu, y^\nu) \geq K(x, y)$ when $x \in C$



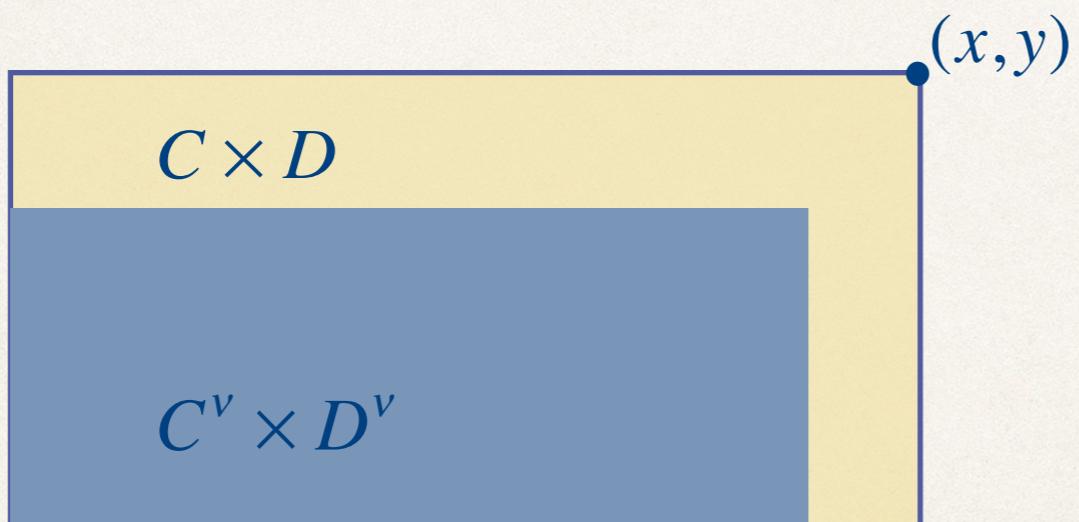
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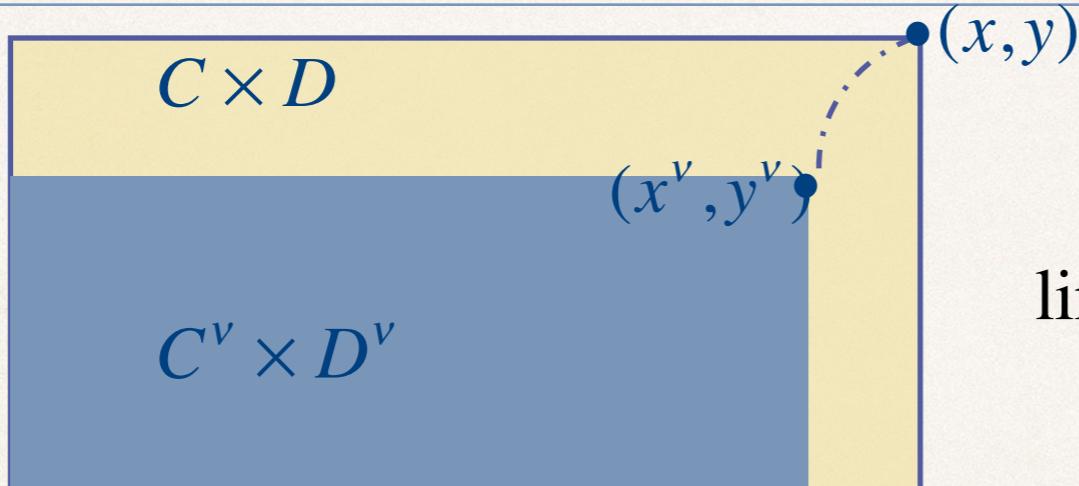
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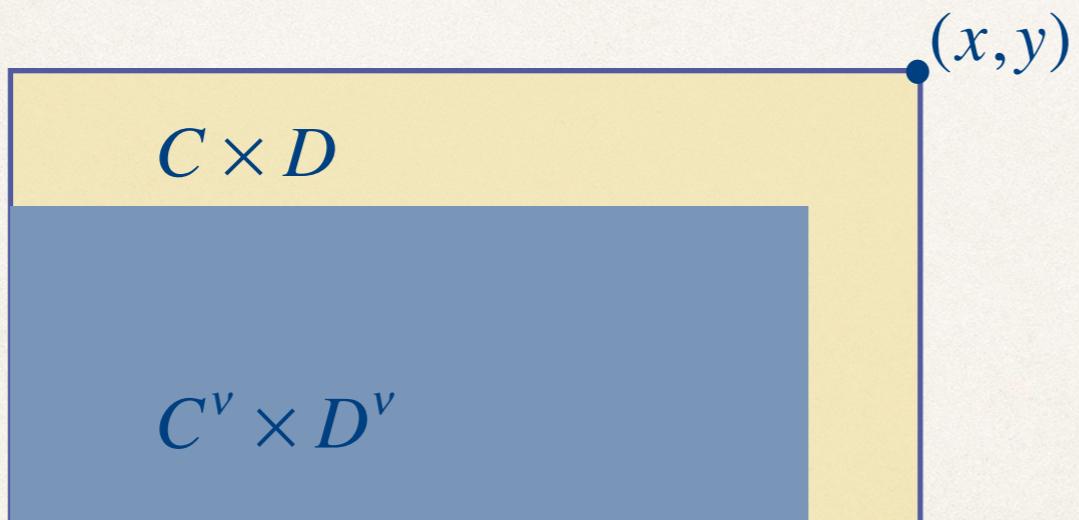
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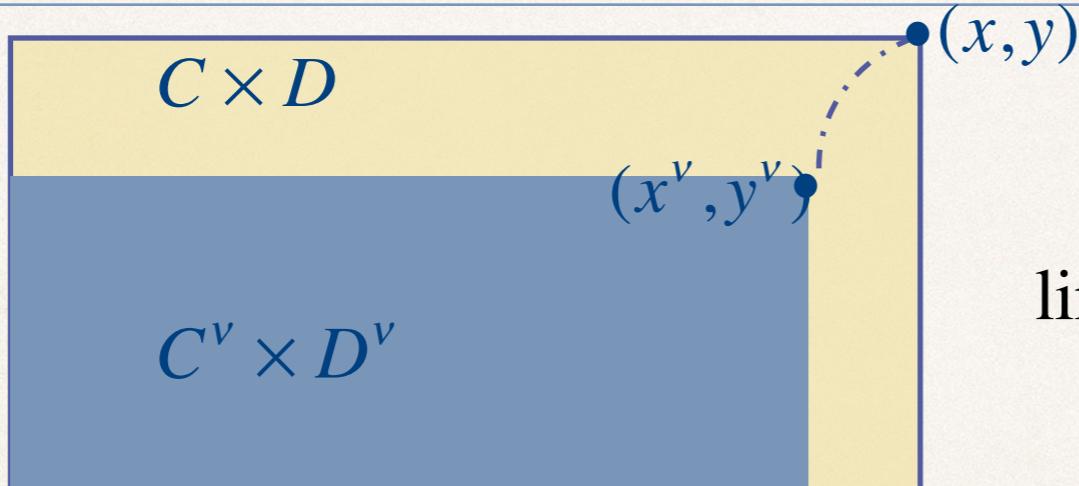
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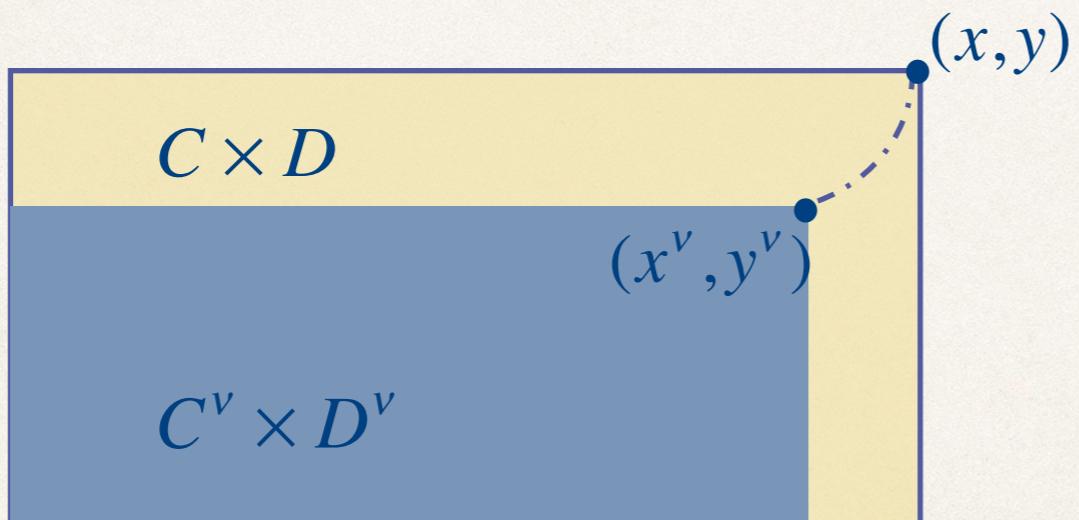
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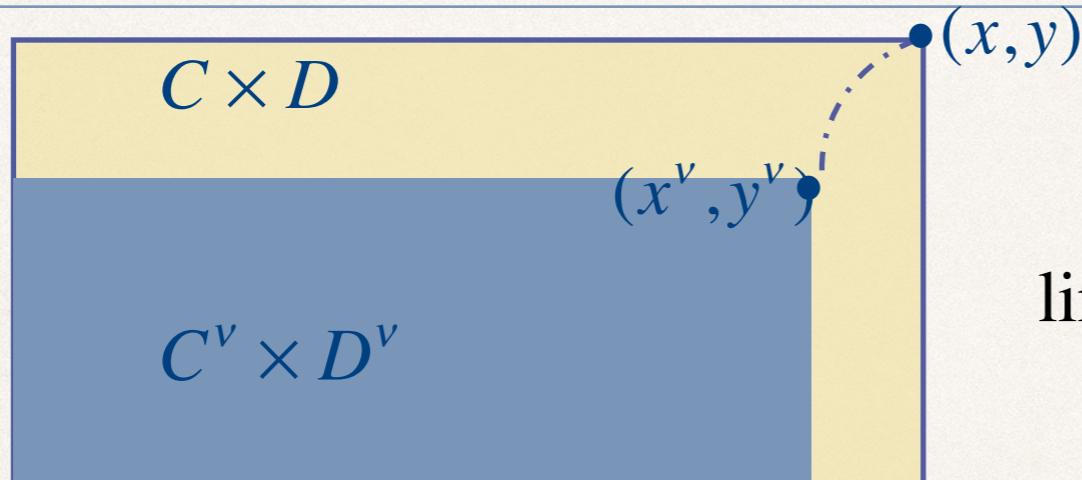
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$\limsup_\nu K^\nu(x^\nu, y^\nu) \leq K(x, y)$ when $y \in D$

$K^\nu(x^\nu, y^\nu) \rightarrow -\infty$ when $y \notin D$

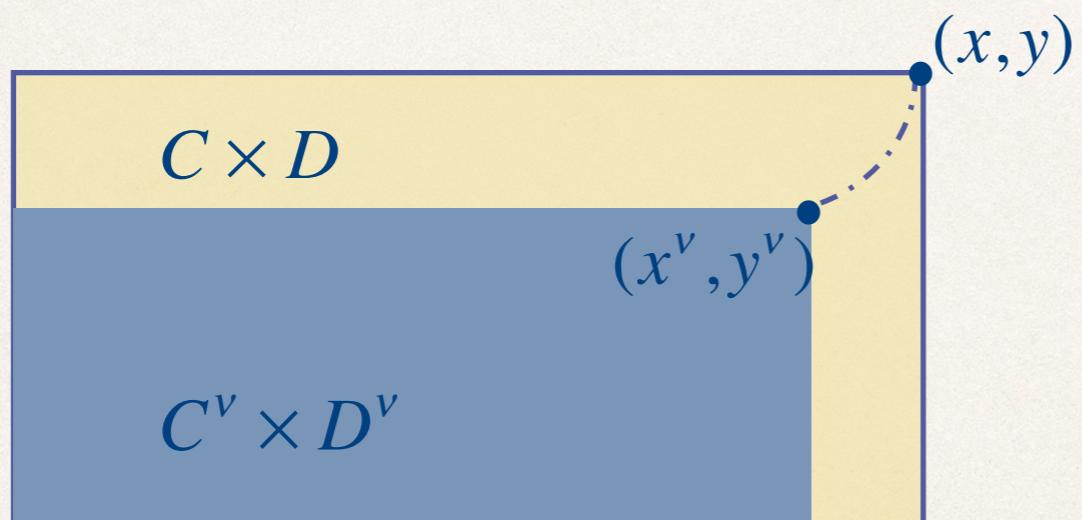
Epi/Hypo-Convergence finite-valued on product sets

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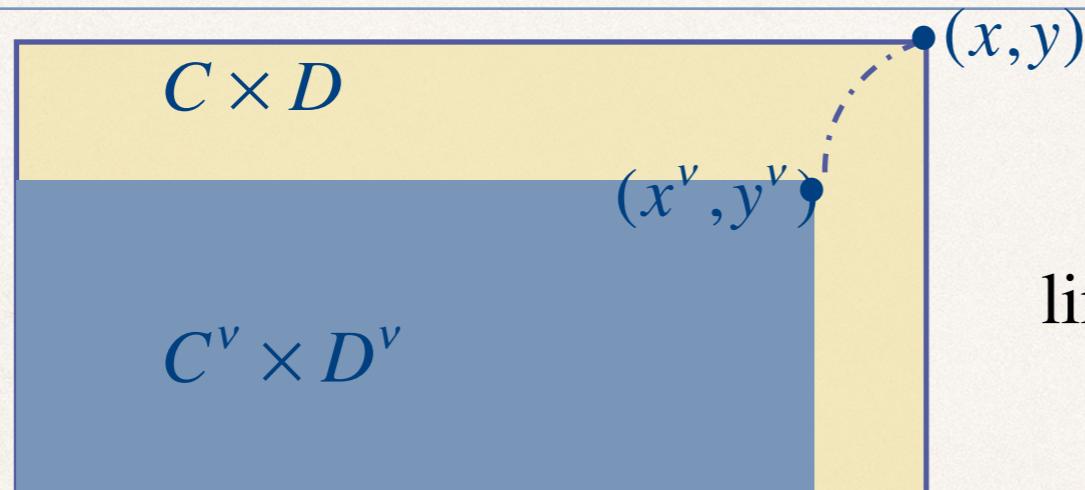
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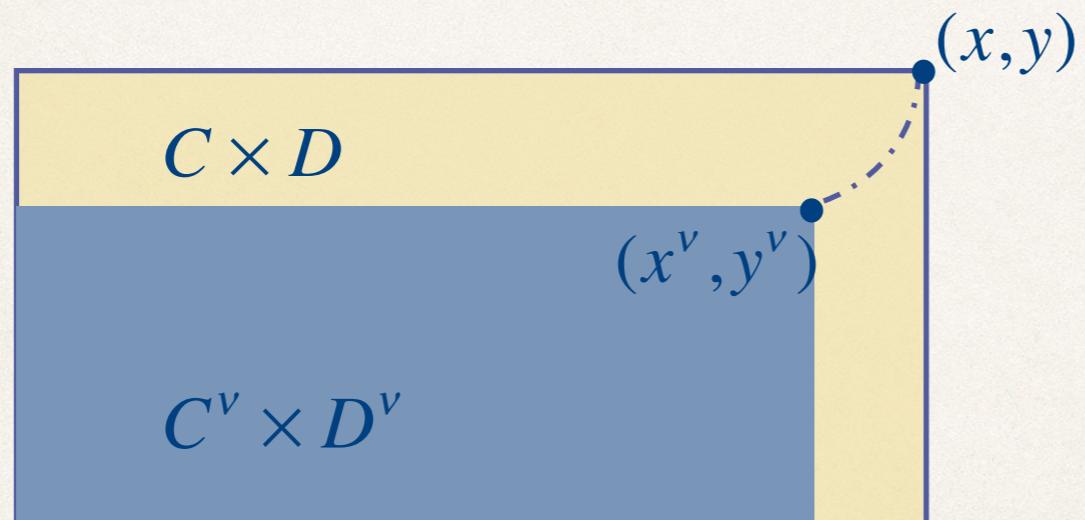
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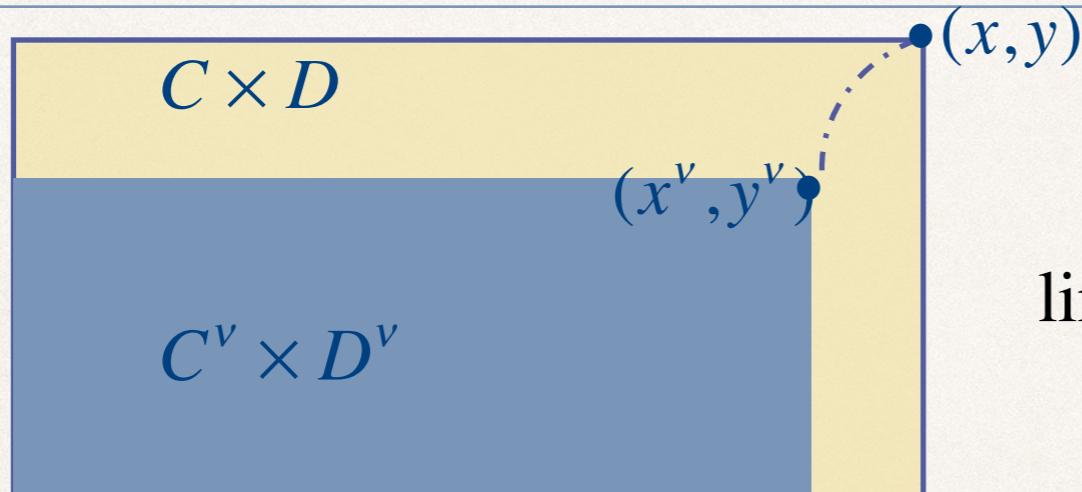
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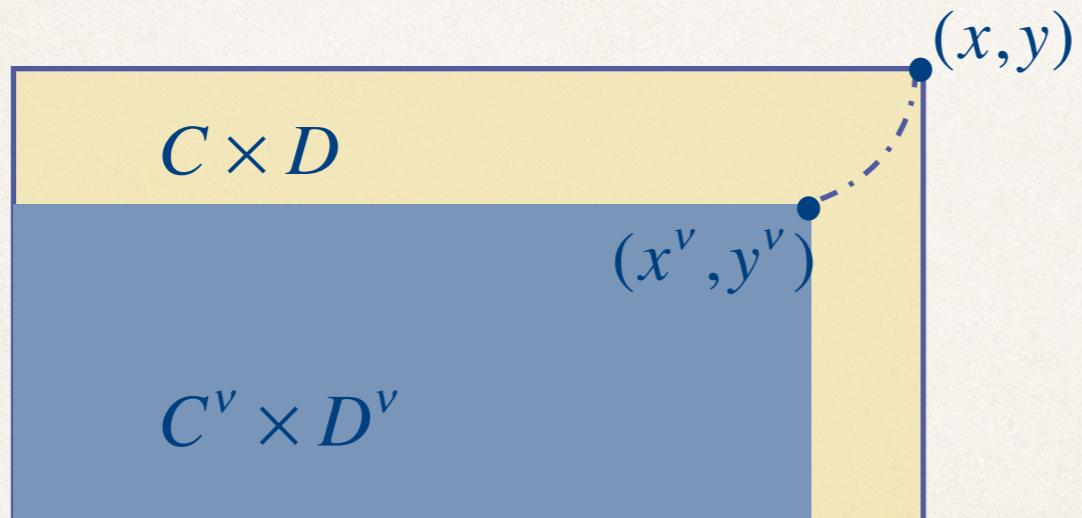
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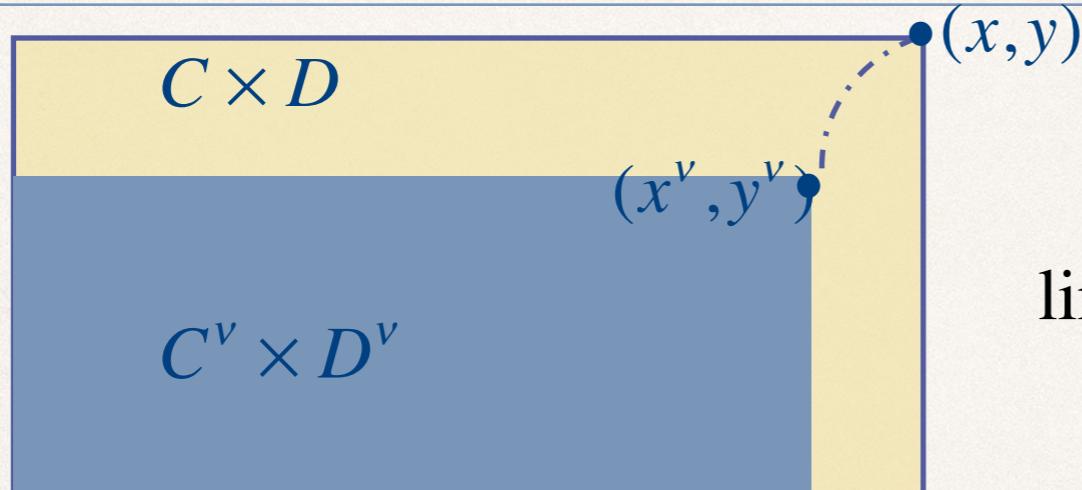
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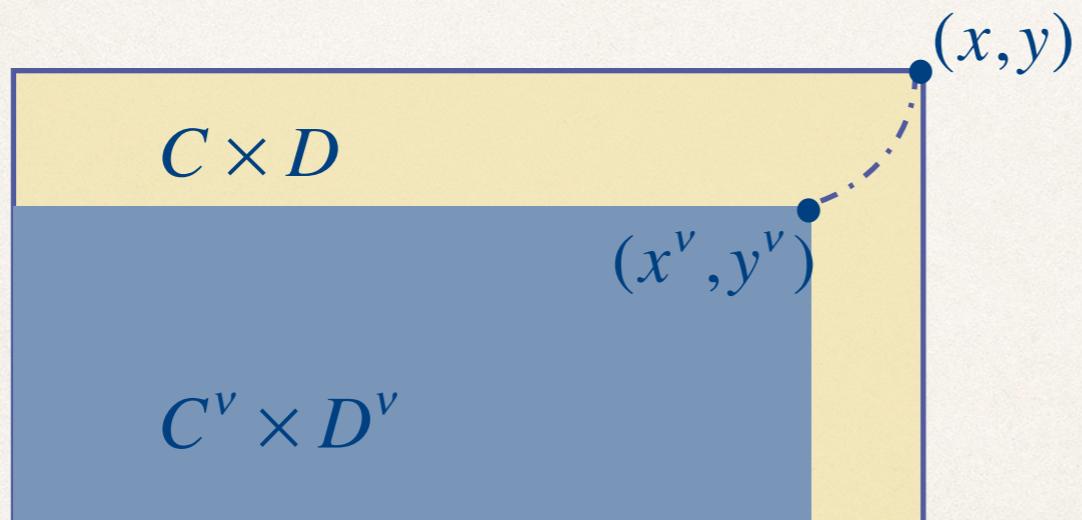
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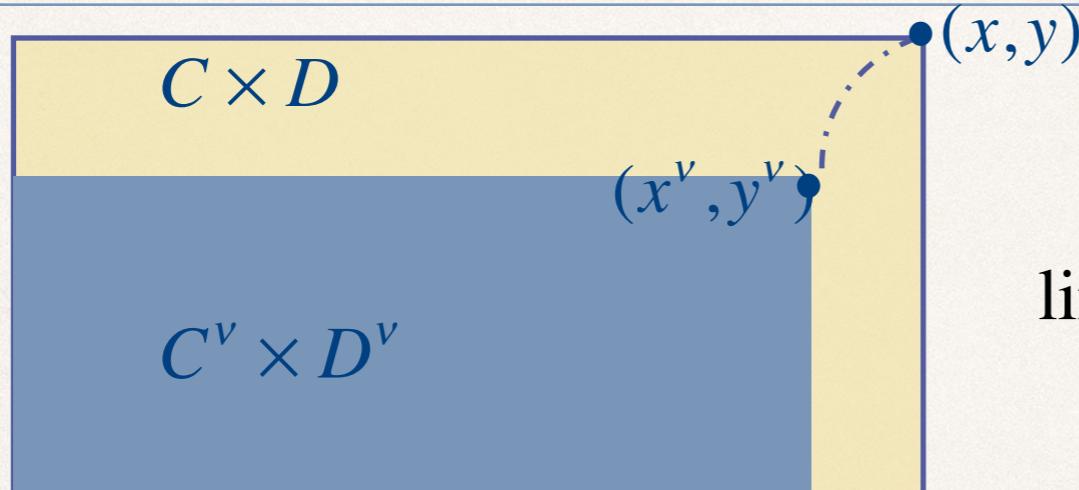


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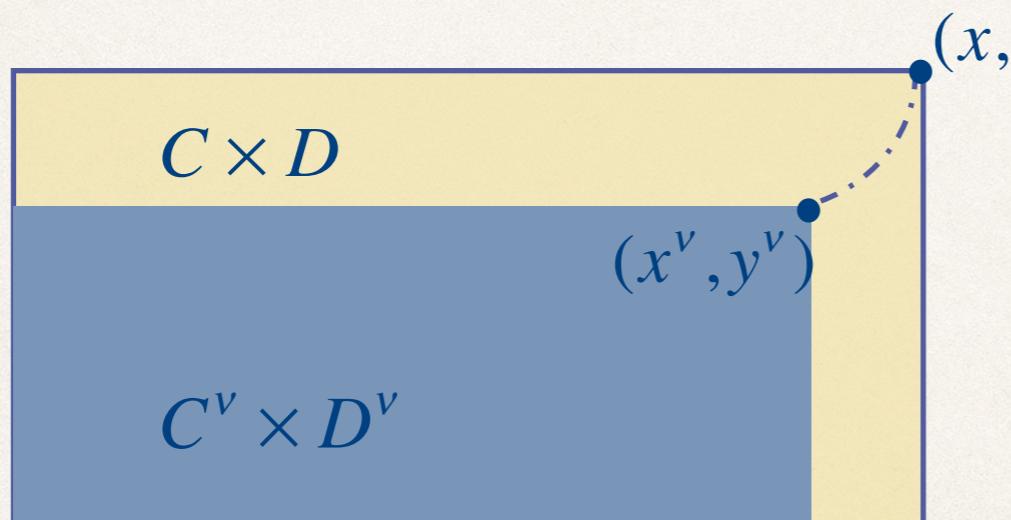
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Fenchel rehabilitation ?

Convergence solutions and of approximating solutions

$F_{C^\nu \times D^\nu}^\nu \rightarrow F_{C \times D}$ lop. ancillary-tightly (\sim relaxed-compact in y)

(i) $x^\nu \in \varepsilon\text{-MnSp } F_{C^\nu \times D^\nu}^\nu$, \bar{x} cluster point of $\{x^\nu\}_{\nu \in \mathbb{N}}$
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Under **tight-lop**: convergence of the full ε_ν -maxinf sets
and convergence of values

more about Equivalence Classes

sup-projection: $h(x) = \sup_y F(x, y)$, $h : C' \subset C \rightarrow \mathbb{R}$

$$F^\nu \xrightarrow{\text{lqp}} F \implies h^\nu \xrightarrow{e} h \text{ epi-convergence}$$

F, G in the same *equivalence class* if their sup-projections coincide.

? Induced metric: $d_{bifcns}(F, G) = d(h_F, h_G)$?

L'oeuf de Colombe



some connection(s) for saddle functions

L'oeuf de Colombe



MinSup-framework or MaxInf-framework
some connection(s) for saddle functions

Uniqueness Theorem: MaxInf-Framework

Limit functions ν filter: \mathcal{H}

$$\text{e-limit: } l_e F^\nu = \sup_{U \in \mathcal{N}_\tau(x)} \inf_{V \in \mathcal{N}_\sigma(y)} \inf_{H \in \mathcal{H}} \sup_{\nu \in H} \sup_{v \in V \cap D^\nu} \inf_{u \in U \cap C^\nu} F^\nu(u, v)$$

$$\text{upper-lop: } lop_u - F^\nu = \sup_{U \in \mathcal{N}_\tau(x)} \inf_{V \in \mathcal{N}_\sigma(y)} \sup_{H \in \mathcal{H}} \inf_{\nu \in H} \sup_{v \in V \cap D^\nu} \inf_{u \in U \cap C^\nu} F^\nu(u, v)$$

F is lop-limit if $l_e F^\nu \leq F$ and $\forall y \in D$,

$$x \in C : lop_u - F^\nu(x, y) \geq F(x, y), \quad x \notin C : lop_u - F^\nu(x, y) \geq \infty$$

Uniqueness Theorem: MaxInf-Framework

Limit functions ν filter: \mathcal{H}

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UNIQUENESS *of lopsided limits in the MaxInf-framework*

Uniqueness Theorem: MaxInf-Framework

Limit functions

ν filter: \mathcal{H}

$$\text{e-limit: } l_e F^\nu = \sup_{U \in \mathcal{N}_\tau(x)} \inf_{V \in \mathcal{N}_\sigma(y)} \inf_{H \in \mathcal{H}} \sup_{\nu \in H} \sup_{v \in V \cap D^\nu} \inf_{u \in U \cap C^\nu} F^\nu(u, v)$$

$$\text{upper-lop: } \text{lop}_u\text{-}F^\nu = \sup_{U \in \mathcal{N}_\tau(x)} \inf_{V \in \mathcal{N}_\sigma(y)} \sup_{H \in \mathcal{H}} \inf_{\nu \in H} \sup_{v \in V \cap D^\nu} \inf_{u \in U \cap C^\nu} F^\nu(u, v)$$

F is lop-limit if $l_e F^\nu \leq F$ and $\forall y \in D$,

$x \in C : \text{lop}_u\text{-}F^\nu(x, y) \geq F(x, y)$, $x \notin C : \text{lop}_u\text{-}F^\nu(x, y) \geq \infty$

UNIQUENESS *of lopsided limits in the MaxInf-framework*

applies also in the SupInf-framework (with a different lop-limit, as expected)

for Saddle Functions: the MaxInf- and SupInf-lop limits
bracket the epi/hypo-equivalent class



Terry!
to Minimal Surfaces