

# Linear-Programming

Julian Parsert

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## Abstract

We use the previous formalization of the general simplex algorithm to formulate an algorithm for solving linear programs. We encode the linear programs using only linear constraints. Solving these constraints also solves the original linear program. This algorithm is proven to be sound by applying the weak duality theorem which is also part of this formalization [5].

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## 1 Related work

Our work is based on a formalization of the general simplex algorithm described in [3, 6]. However, the general simplex algorithm lacks the ability to optimize a function. Boulmé and Maréchal [2] describe a formalization and implementation of Coq tactics for linear integer programming and linear

arithmetic over rationals. More closely related is the formalization by Al-  
lamigeon et al. [1] which formalizes the simplex method and related results.  
As part of Flyspeck project Obua and Nipkow [4] created a verification mech-  
anism for linear programs using the HOL computing library and external  
solvers.

**theory** *More-Jordan-Normal-Forms*

**imports**

*Jordan-Normal-Form.Matrix-Impl*

**begin**

**lemma** *set-comprehension-list-comprehension:*

*set [f i . i <- [x..<a]] = {f i | i. i ∈ {x..<a}}*

*<proof>*

**lemma** *in-second-append-list: i ≥ length a ⇒ i < length (a@b) ⇒ (a@b)!i ∈ set b*

*<proof>*

## 2 General Theorems used later, that could be moved

**lemma** *split-four-block-dual-fst-lst:*

**assumes** *split-block (four-block-mat A B C D) (dim-row A) (dim-col A) = (U, X, Y, V)*

**shows** *U = A V = D*

*<proof>*

**lemma** *append-split-vec-distrib-scalar-prod:*

**assumes** *dim-vec (u @<sub>v</sub> w) = dim-vec x*

**shows** *(u @<sub>v</sub> w) · x = u · (vec-first x (dim-vec u)) + w · (vec-last x (dim-vec w))*

*<proof>*

**lemma** *append-dot-product-split:*

**assumes** *dim-vec (u @<sub>v</sub> w) = dim-vec x*

**shows** *(u @<sub>v</sub> w) · x = (∑ i ∈ {0..< dim-vec u}. u \$ i \* x \$ i) + (∑ i ∈ {0..< dim-vec w}. w \$ i \* x \$(i + dim-vec u))*

*<proof>*

**lemma** *assoc-scalar-prod-mult-mat-vec:*

**fixes** *A :: 'a::comm-semiring-1 mat*

**assumes** *y ∈ carrier-vec n*

**assumes** *x ∈ carrier-vec m*

**assumes** *A ∈ carrier-mat n m*

**shows** *(A \*<sub>v</sub> x) · y = (A<sup>T</sup> \*<sub>v</sub> y) · x*

*<proof>*

### 3 Vectors

**abbreviation**  $\text{singleton } V \ ([-]_v)$  **where**  $\text{singleton } V \ e \equiv (\text{vec } 1 \ (\lambda i. e))$

**lemma** *elem-in-singleton* [simp]:  $[a]_v \ \$ \ 0 = a$   
 ⟨proof⟩

**lemma** *elem-in-singleton-append* [simp]:  $(x \ @_v \ [a]_v) \ \$ \ \text{dim-vec } x = a$   
 ⟨proof⟩

**lemma** *vector-cases-append*:  
**fixes**  $x :: 'a \ \text{vec}$   
**shows**  $x = vNil \ \vee \ (\exists v \ a. x = v \ @_v \ [a]_v)$   
 ⟨proof⟩

**lemma** *vec-vec-induct* [case-names *vNil append*, *induct type: vec*]:  
**assumes**  $P \ vNil$  **and**  $\bigwedge a \ v. P \ v \implies P \ (v \ @_v \ [a]_v)$   
**shows**  $P \ v$   
 ⟨proof⟩

**lemma** *singleton-append-dotP*:  
**assumes**  $\text{dim-vec } z = \text{dim-vec } y + 1$   
**shows**  $(y \ @_v \ [x]_v) \cdot z = (\sum_{i \in \{0..<\text{dim-vec } y\}} y \ \$ \ i * z \ \$ \ i) + x * z \ \$ \ \text{dim-vec } y$   
 ⟨proof⟩

**lemma** *map-vec-append*:  $\text{map-vec } f \ (a \ @_v \ b) = \text{map-vec } f \ a \ @_v \ \text{map-vec } f \ b$   
 ⟨proof⟩

**lemma** *map-mat-map-vec*:  
**assumes**  $i < \text{dim-row } P$   
**shows**  $\text{row } (\text{map-mat } f \ P) \ i = \text{map-vec } f \ (\text{row } P \ i)$   
 ⟨proof⟩

**lemma** *append-rows-access1* [simp]:  
**assumes**  $i < \text{dim-row } A$   
**assumes**  $\text{dim-col } A = \text{dim-col } B$   
**shows**  $\text{row } (A \ @_r \ B) \ i = \text{row } A \ i$   
 ⟨proof⟩

**lemma** *append-rows-access2* [simp]:  
**assumes**  $i \geq \text{dim-row } A$   
**assumes**  $i < \text{dim-row } A + \text{dim-row } B$   
**assumes**  $\text{dim-col } A = \text{dim-col } B$   
**shows**  $\text{row } (A \ @_r \ B) \ i = \text{row } B \ (i - \text{dim-row } A)$   
 ⟨proof⟩

**lemma** *append-singleton-access* [simp]:  $(\text{Matrix.vec } n \ f \ @_v \ [r]_v) \ \$ \ n = r$   
 ⟨proof⟩

Move to right place

**fun** *mat-append-col* **where**

*mat-append-col*  $A$   $b = \text{mat-of-cols } (\text{dim-row } A) (\text{cols } A @ [b])$

**fun** *mat-append-row* **where**

*mat-append-row*  $A$   $c = \text{mat-of-rows } (\text{dim-col } A) (\text{rows } A @ [c])$

**lemma** *mat-append-col-dims*:

**shows** *mat-append-col*  $A$   $b \in \text{carrier-mat } (\text{dim-row } A) (\text{dim-col } A + 1)$

*<proof>*

**lemma** *mat-append-row-dims*:

**shows** *mat-append-row*  $A$   $c \in \text{carrier-mat } (\text{dim-row } A + 1) (\text{dim-col } A)$

*<proof>*

**lemma** *mat-append-col-col*:

**assumes**  $\text{dim-row } A = \text{dim-vec } b$

**shows**  $\text{col } (\text{mat-append-col } A \ b) (\text{dim-col } A) = b$

*<proof>*

**lemma** *mat-append-col-vec-index*:

**assumes**  $i < \text{dim-row } A$

**and**  $\text{dim-row } A = \text{dim-vec } b$

**shows**  $(\text{row } (\text{mat-append-col } A \ b) \ i) \$ (\text{dim-col } A) = b \$ i$

*<proof>*

**lemma** *mat-append-row-row*:

**assumes**  $\text{dim-col } A = \text{dim-vec } c$

**shows**  $\text{row } (\text{mat-append-row } A \ c) (\text{dim-row } A) = c$

*<proof>*

**lemma** *mat-append-row-in-mat*:

**assumes**  $i < \text{dim-row } A$

**shows**  $\text{row } (\text{mat-append-row } A \ r) \ i = \text{row } A \ i$

*<proof>*

**lemma** *mat-append-row-vec-index*:

**assumes**  $i < \text{dim-col } A$

**and**  $\text{dim-col } A = \text{dim-vec } b$

**shows**  $\text{vec-index } (\text{col } (\text{mat-append-row } A \ b) \ i) (\text{dim-row } A) = \text{vec-index } b \ i$

*<proof>*

**lemma** *mat-append-col-access-in-mat*:

**assumes**  $\text{dim-row } A = \text{dim-vec } b$

**and**  $i < \text{dim-row } A$

**and**  $j < \text{dim-col } A$

**shows**  $(\text{row } (\text{mat-append-col } A \ b) \ i) \$ j = (\text{row } A \ i) \$ j$

*<proof>*

**lemma** *constructing-append-col-row*:

**assumes**  $i < \text{dim-row } A$

**and**  $\text{dim-row } A = \text{dim-vec } b$

**shows**  $\text{row } (\text{mat-append-col } A \ b) \ i = \text{row } A \ i \ @_v \ [\text{vec-index } b \ i]_v$

*<proof>*

**definition** *one-element-vec* **where**  $\text{one-element-vec } n \ e = \text{vec } n \ (\lambda i. \ e)$

**lemma** *one-element-vec-carrier*:  $\text{one-element-vec } n \ e \in \text{carrier-vec } n$

*<proof>*

**lemma** *one-element-vec-dim* [*simp*]:  $\text{dim-vec } (\text{one-element-vec } n \ (r::\text{rat})) = n$

*<proof>*

**lemma** *one-element-vec-access* [*simp*]:  $\bigwedge i. \ i < n \implies \text{vec-index } (\text{one-element-vec } n \ e) \ i = e$

*<proof>*

**fun** *single-nz-val* **where**  $\text{single-nz-val } n \ i \ v = \text{vec } n \ (\lambda j. \ (\text{if } i = j \ \text{then } v \ \text{else } 0))$

**lemma** *single-nz-val-carrier*:  $\text{single-nz-val } n \ i \ v \in \text{carrier-vec } n$

*<proof>*

**lemma** *single-nz-val-access1* [*simp*]:  $i < n \implies \text{single-nz-val } n \ i \ v \ \$ \ i = v$

*<proof>*

**lemma** *single-nz-val-access2* [*simp*]:  $i < n \implies j < n \implies i \neq j \implies \text{single-nz-val } n \ i \ v \ \$ \ j = 0$

*<proof>*

**lemma**  $i < n \implies (v \cdot_v \text{unit-vec } n \ i) \ \$ \ i = (v::'a::\{\text{monoid-mult}, \text{times}, \text{zero-neq-one}\})$

*<proof>*

**lemma** *single-nz-val-unit-vec*:

**fixes**  $v::'a::\{\text{monoid-mult}, \text{times}, \text{zero-neq-one}, \text{mult-zero}\}$

**shows**  $v \cdot_v (\text{unit-vec } n \ i) = \text{single-nz-val } n \ i \ v$

*<proof>*

**lemma** *single-nz-valI* [*intro*]:

**fixes**  $v \ i \ \text{val}$

**assumes**  $\bigwedge j. \ j < \text{dim-vec } v \implies j \neq i \implies v \$ j = 0$

**assumes**  $v \$ i = \text{val}$

**shows**  $v = \text{single-nz-val } (\text{dim-vec } v) \ i \ \text{val}$

*<proof>*

**lemma** *single-nz-val-dotP*:

**assumes**  $i < n$   
**assumes**  $\dim\text{-vec } x = n$   
**shows**  $\text{single-nz-val } n \ i \ v \cdot x = v * x \ \$ \ i$   
 $\langle \text{proof} \rangle$

**lemma** *single-nz-zero-singleton*:  $\text{single-nz-val } 1 \ 0 \ v = [v]_v$   
 $\langle \text{proof} \rangle$

**lemma** *append-one-elem-zero-dotP*:

**assumes**  $\dim\text{-vec } u = m$   
**and**  $\dim\text{-vec } x = n$   
**shows**  $(\text{one-element-vec } n \ e \ @_v \ (0_v \ m)) \cdot (x \ @_v \ u) = (\sum_{i \in \{0 \ .. < \dim\text{-vec } x\}} e * x \ \$ \ i)$   
 $\langle \text{proof} \rangle$

**lemma** *one-element-vec-dotP*:

**assumes**  $\dim\text{-vec } x = n$   
**shows**  $(\text{one-element-vec } n \ e) \cdot x = (\sum_{i \in \{0 \ .. < \dim\text{-vec } x\}} e * x \ \$ \ i)$   
 $\langle \text{proof} \rangle$

**lemma** *singleton-dotP [simp]*:  $\dim\text{-vec } x = 1 \implies [v]_v \cdot x = v * x \ \$ \ 0$   
 $\langle \text{proof} \rangle$

**lemma** *singletons-dotP [simp]*:  $[v]_v \cdot [w]_v = v * w$   
 $\langle \text{proof} \rangle$

**lemma** *singleton-appends-dotP [simp]*:  $\dim\text{-vec } x = \dim\text{-vec } y \implies (x \ @_v \ [v]_v) \cdot (y \ @_v \ [w]_v) = x \cdot y + v * w$   
 $\langle \text{proof} \rangle$

**end**

**theory** *Matrix-LinPoly*

**imports**

*Jordan-Normal-Form.Matrix-Impl*

*Farkas.Simplex-for-Reals*

*Farkas.Matrix-Farkas*

**begin**

Add this to linear polynomials in Simplex

**lemma** *eval-poly-with-sum*:  $(v \ \{\!| \ X \ |\!\}) = (\sum_{x \in \text{vars } v} \text{coeff } v \ x * X \ x)$   
 $\langle \text{proof} \rangle$

**lemma** *eval-poly-with-sum-superset*:

**assumes** *finite*  $S$   
**assumes**  $S \supseteq \text{vars } v$   
**shows**  $(v \ \{\!| \ X \ |\!\}) = (\sum_{x \in S} \text{coeff } v \ x * X \ x)$   
 $\langle \text{proof} \rangle$

Get rid of these synonyms

## 4 Translations of Jordan Normal Forms Matrix Library to Simplex polynomials

### 4.1 Vectors

**definition** *list-to-lpoly* **where**

*list-to-lpoly*  $cs = \text{sum-list } (\text{map2 } (\lambda i c. \text{lp-monom } c i) [0..<\text{length } cs] cs)$

**lemma** *empty-list-0poly*:

**shows** *list-to-lpoly* [] = 0

*<proof>*

**lemma** *sum-list-map-upto-coeff-limit*:

**assumes**  $i \geq \text{length } L$

**shows** *coeff* (*list-to-lpoly* L)  $i = 0$

*<proof>*

**lemma** *rl-lpoly-coeff-nth-non-empty*:

**assumes**  $i < \text{length } cs$

**assumes**  $cs \neq []$

**shows** *coeff* (*list-to-lpoly* cs)  $i = cs!i$

*<proof>*

**lemma** *list-to-lpoly-coeff-nth*:

**assumes**  $i < \text{length } cs$

**shows** *coeff* (*list-to-lpoly* cs)  $i = cs ! i$

*<proof>*

**lemma** *rat-list-outside-zero*:

**assumes**  $\text{length } cs \leq i$

**shows** *coeff* (*list-to-lpoly* cs)  $i = 0$

*<proof>*

Transform linear polynomials to rational vectors

**fun** *dim-poly* **where**

*dim-poly*  $p = (\text{if } (\text{vars } p) = \{\} \text{ then } 0 \text{ else } \text{Max } (\text{vars } p)+1)$

**definition** *max-dim-poly-list* **where**

*max-dim-poly-list*  $lst = \text{Max } \{\text{Max } (\text{vars } p) \mid p. p \in \text{set } lst\}$

**fun** *lpoly-to-vec* **where**

*lpoly-to-vec*  $p = \text{vec } (\text{dim-poly } p) (\text{coeff } p)$

**lemma** *all-greater-dim-poly-zero*[simp]:

**assumes**  $x \geq \text{dim-poly } p$   
**shows**  $\text{coeff } p \ x = 0$   
 ⟨proof⟩

**lemma** *lpoly-to-vec-0-iff-zero-poly* [iff]:  
**shows**  $(\text{lpoly-to-vec } p) = 0_v \ 0 \longleftrightarrow p = 0$   
 ⟨proof⟩

**lemma** *dim-poly-dim-vec-equiv*:  
 $\text{dim-vec } (\text{lpoly-to-vec } p) = \text{dim-poly } p$   
 ⟨proof⟩

**lemma** *dim-poly-greater-ex-coeff*:  $\text{dim-poly } x > d \implies \exists i \geq d. \text{coeff } x \ i \neq 0$   
 ⟨proof⟩

**lemma** *dimpoly-all-zero-limit*:  
**assumes**  $\bigwedge i. i \geq d \implies \text{coeff } x \ i = 0$   
**shows**  $\text{dim-poly } x \leq d$   
 ⟨proof⟩

**lemma** *construct-poly-from-lower-dim-poly*:  
**assumes**  $\text{dim-poly } x = d+1$   
**obtains**  $p \ c$  **where**  $\text{dim-poly } p \leq d \ x = p + \text{lp-monom } c \ d$   
 ⟨proof⟩

**lemma** *vars-subset-0-dim-poly*:  
 $\text{vars } z \subseteq \{0..<\text{dim-poly } z\}$   
 ⟨proof⟩

**lemma** *in-dim-and-not-var-zero*:  $x \in \{0..<\text{dim-poly } z\} - \text{vars } z \implies \text{coeff } z \ x = 0$   
 ⟨proof⟩

**lemma** *valuate-with-dim-poly*:  $z \ \{ X \} = (\sum i \in \{0..<\text{dim-poly } z\}. \text{coeff } z \ i * X \ i)$   
 ⟨proof⟩

**lemma** *lin-poly-to-vec-coeff-access*:  
**assumes**  $x < \text{dim-poly } y$   
**shows**  $(\text{lpoly-to-vec } y) \ \$ \ x = \text{coeff } y \ x$   
 ⟨proof⟩

**lemma** *addition-over-lin-poly-to-vec*:  
**fixes**  $x \ y$   
**assumes**  $a < \text{dim-poly } x$   
**assumes**  $\text{dim-poly } x = \text{dim-poly } y$   
**shows**  $(\text{lpoly-to-vec } x + \text{lpoly-to-vec } y) \ \$ \ a = \text{coeff } (x + y) \ a$   
 ⟨proof⟩

**lemma** *list-to-lpoly-dim-less*:  $\text{length } cs \geq \text{dim-poly } (\text{list-to-lpoly } cs)$



*<proof>*

Transform rational vectors to linear polynomials

**fun** *vec-to-lpoly* **where**

*vec-to-lpoly* *rv* = *list-to-lpoly* (*list-of-vec* *rv*)

**lemma** *vec-to-lin-poly-coeff-access*:

**assumes**  $x < \dim\text{-vec } y$

**shows**  $y \$ x = \text{coeff } (\text{vec-to-lpoly } y) x$

*<proof>*

**lemma** *addition-over-vec-to-lin-poly*:

**fixes**  $x y$

**assumes**  $a < \dim\text{-vec } x$

**assumes**  $\dim\text{-vec } x = \dim\text{-vec } y$

**shows**  $(x + y) \$ a = \text{coeff } (\text{vec-to-lpoly } x + \text{vec-to-lpoly } y) a$

*<proof>*

**lemma** *outside-list-coeff0*:

**assumes**  $i \geq \dim\text{-vec } xs$

**shows**  $\text{coeff } (\text{vec-to-lpoly } xs) i = 0$

*<proof>*

**lemma** *vec-to-poly-dim-less*:

$\dim\text{-poly } (\text{vec-to-lpoly } x) \leq \dim\text{-vec } x$

*<proof>*

**lemma** *vec-to-lpoly-from-lpoly-coeff-dual1*:

$\text{coeff } (\text{vec-to-lpoly } (\text{lpoly-to-vec } p)) i = \text{coeff } p i$

*<proof>*

**lemma** *vec-to-lpoly-from-lpoly-coeff-dual2*:

**assumes**  $i < \dim\text{-vec } (\text{lpoly-to-vec } (\text{vec-to-lpoly } v))$

**shows**  $(\text{lpoly-to-vec } (\text{vec-to-lpoly } v)) \$ i = v \$ i$

*<proof>*

**lemma** *vars-subset-dim-vec-to-lpoly-dim*:  $\text{vars } (\text{vec-to-lpoly } v) \subseteq \{0..<\dim\text{-vec } v\}$

*<proof>*

**lemma** *sum-dim-vec-equals-sum-dim-poly*:

**shows**  $(\sum a = 0..<\dim\text{-vec } A. \text{coeff } (\text{vec-to-lpoly } A) a * X a) =$

$(\sum a = 0..<\dim\text{-poly } (\text{vec-to-lpoly } A). \text{coeff } (\text{vec-to-lpoly } A) a * X a)$

*<proof>*

**lemma** *vec-to-lpoly-vNil [simp]*:  $\text{vec-to-lpoly } vNil = 0$

*<proof>*

**lemma** *zero-vector-is-zero-poly*:  $\text{coeff } (\text{vec-to-lpoly } (0_v n)) i = 0$

*<proof>*

**lemma** *coeff-nonzero-dim-vec-non-zero*:

**assumes** *coeff (vec-to-lpoly v) i ≠ 0*

**shows**  $v \$ i \neq 0 \ i < \dim\text{-vec } v$

*<proof>*

**lemma** *lpoly-of-v-equals-v-append0*:

$\text{vec-to-lpoly } v = \text{vec-to-lpoly } (v @_v 0_v a)$  (**is** *?lhs = ?rhs*)

*<proof>*

**lemma** *vec-to-lpoly-eval-dot-prod*:

$(\text{vec-to-lpoly } v) \llbracket x \rrbracket = v \cdot (\text{vec } (\dim\text{-vec } v) x)$

*<proof>*

**lemma** *dim-poly-of-append-vec*:

$\dim\text{-poly } (\text{vec-to-lpoly } (a @_v b)) \leq \dim\text{-vec } a + \dim\text{-vec } b$

*<proof>*

**lemma** *vec-coeff-append1*:  $i \in \{0..<\dim\text{-vec } a\} \implies \text{coeff } (\text{vec-to-lpoly } (a @_v b)) i = a \$ i$

*<proof>*

**lemma** *vec-coeff-append2*:

$i \in \{\dim\text{-vec } a..<\dim\text{-vec } (a @_v b)\} \implies \text{coeff } (\text{vec-to-lpoly } (a @_v b)) i = b \$ (i - \dim\text{-vec } a)$

*<proof>*

Maybe Code Equation

**lemma** *vec-to-lpoly-poly-of-vec-eq*:  $\text{vec-to-lpoly } v = \text{poly-of-vec } v$

*<proof>*

**lemma** *vars-vec-append-subset*:  $\text{vars } (\text{vec-to-lpoly } (0_v n @_v v)) \subseteq \{n..<n + \dim\text{-vec } v\}$

*<proof>*

## 5 Matrices

**fun** *matrix-to-lpolies where*

$\text{matrix-to-lpolies } A = \text{map } \text{vec-to-lpoly } (\text{rows } A)$

**lemma** *matrix-to-lpolies-vec-of-row*:

$i < \dim\text{-row } A \implies \text{matrix-to-lpolies } A ! i = \text{vec-to-lpoly } (\text{row } A i)$

*<proof>*

**lemma** *outside-of-col-range-is-0*:

**assumes**  $i < \dim\text{-row } A$  **and**  $j \geq \dim\text{-col } A$

**shows**  $\text{coeff } ((\text{matrix-to-lpolies } A) ! i) j = 0$

*<proof>*

**lemma** *polys-greater-col-zero*:  
**assumes**  $x \in \text{set } (\text{matrix-to-lpolies } A)$   
**assumes**  $j \geq \text{dim-col } A$   
**shows**  $\text{coeff } x \ j = 0$   
 $\langle \text{proof} \rangle$

**lemma** *matrix-to-lp-vec-to-lpoly-row [simp]*:  
**assumes**  $i < \text{dim-row } A$   
**shows**  $(\text{matrix-to-lpolies } A)!i = \text{vec-to-lpoly } (\text{row } A \ i)$   
 $\langle \text{proof} \rangle$

**lemma** *matrix-to-lpolies-coeff-access*:  
**assumes**  $i < \text{dim-row } A$  **and**  $j < \text{dim-col } A$   
**shows**  $\text{coeff } (\text{matrix-to-lpolies } A \ ! \ i) \ j = A \ \$\$ \ (i,j)$   
 $\langle \text{proof} \rangle$

From linear polynomial list to matrix

**definition** *lin-polies-to-mat where*  
 $\text{lin-polies-to-mat } lst = \text{mat } (\text{length } lst) \ (\text{max-dim-poly-list } lst) \ (\lambda(x,y).\text{coeff } (lst!x) \ y)$

**lemma** *lin-polies-to-rat-mat-coeff-index*:  
**assumes**  $i < \text{length } L$  **and**  $j < (\text{max-dim-poly-list } L)$   
**shows**  $\text{coeff } (L \ ! \ i) \ j = (\text{lin-polies-to-mat } L) \ \$\$ \ (i,j)$   
 $\langle \text{proof} \rangle$

**lemma** *vec-to-lpoly-valuate-equiv-dot-prod*:  
**assumes**  $\text{dim-vec } y = \text{dim-vec } x$   
**shows**  $(\text{vec-to-lpoly } y) \ \{\! \{ (\$)x \} \! \} = y \cdot x$   
 $\langle \text{proof} \rangle$

**lemma** *matrix-to-lpolies-valuate-scalarP*:  
**assumes**  $i < \text{dim-row } A$   
**assumes**  $\text{dim-col } A = \text{dim-vec } x$   
**shows**  $(\text{matrix-to-lpolies } A!i) \ \{\! \{ (\$)x \} \! \} = (\text{row } A \ i) \cdot x$   
 $\langle \text{proof} \rangle$

**lemma** *matrix-to-lpolies-lambda-valuate-scalarP*:  
**assumes**  $i < \text{dim-row } A$   
**assumes**  $\text{dim-col } A = \text{dim-vec } x$   
**shows**  $(\text{matrix-to-lpolies } A!i) \ \{\! \{ (\lambda i. (\text{if } i < \text{dim-vec } x \ \text{then } x\$i \ \text{else } 0)) \} \! \} = (\text{row } A \ i) \cdot x$   
 $\langle \text{proof} \rangle$

**end**  
**theory** *LP-Preliminaries*

```

imports
  More-Jordan-Normal-Forms
  Matrix-LinPoly
  Jordan-Normal-Form.Matrix-Impl
  Farkas.Simplex-for-Reals
  HOL-Library.Mapping
begin

fun vars-from-index-geq-vec where
  vars-from-index-geq-vec index b = [GEQ (lp-monom 1 (i+index)) (b$i). i ←
  [0..lemma constraints-set-vars-geq-vec-def:
  set (vars-from-index-geq-vec start b) =
  {GEQ (lp-monom 1 (i+start)) (b$i) | i. i ∈ {0..lemma vars-from-index-geq-sat:
  assumes ⟨x⟩ ⊨cs set (vars-from-index-geq-vec start b)
  assumes i < dim-vec b
  shows ⟨x⟩ (i+start) ≥ b$i
  ⟨proof⟩

fun mat-x-leq-vec where
  mat-x-leq-vec A b = [LEQ (matrix-to-lpolies A!i) (b$i) . i <- [0..lemma mat-x-leq-vec-sol:
  assumes ⟨x⟩ ⊨cs set (mat-x-leq-vec A b)
  assumes i < dim-vec b
  shows ((matrix-to-lpolies A)!i) ⟦⟨x⟩⟧ ≤ b$i
  ⟨proof⟩

fun x-mat-eq-vec where
  x-mat-eq-vec b A = [EQ (matrix-to-lpolies A!i) (b$i) . i <- [0..lemma x-mat-eq-vec-sol:
  assumes x ⊨cs set (x-mat-eq-vec b A)
  assumes i < dim-vec b
  shows ((matrix-to-lpolies A)!i) ⟦ x ⟧ = b$i
  ⟨proof⟩

```

## 6 Get different matrices into same space, without interference

**fun** *two-block-non-interfering* **where**

*two-block-non-interfering*  $A\ B = (\text{let } z1 = 0_m (\text{dim-row } A) (\text{dim-col } B);$   
 $z2 = 0_m (\text{dim-row } B) (\text{dim-col } A) \text{ in}$   
*four-block-mat*  $A\ z1\ z2\ B)$

**lemma** *split-two-block-non-interfering*:

**assumes** *split-block* (*two-block-non-interfering*  $A\ B$ ) ( $\text{dim-row } A$ ) ( $\text{dim-col } A$ ) =  
 $(Q1, Q2, Q3, Q4)$   
**shows**  $Q1 = A\ Q4 = B$   
 $\langle \text{proof} \rangle$

**lemma** *two-block-non-interfering-dims*:

$\text{dim-row } (\text{two-block-non-interfering } A\ B) = \text{dim-row } A + \text{dim-row } B$   
 $\text{dim-col } (\text{two-block-non-interfering } A\ B) = \text{dim-col } A + \text{dim-col } B$   
 $\langle \text{proof} \rangle$

**lemma** *two-block-non-interfering-zeros-are-0*:

**assumes**  $i < \text{dim-row } A$   
**and**  $j \geq \text{dim-col } A$   
**and**  $j < \text{dim-col } (\text{two-block-non-interfering } A\ B)$   
**shows**  $(\text{two-block-non-interfering } A\ B)\$(i,j) = 0$  (*two-block-non-interfering*  $A\ B)\$(i,j) = 0$   
 $\langle \text{proof} \rangle$

**lemma** *two-block-non-interfering-row-comp1*:

**assumes**  $i < \text{dim-row } A$   
**shows**  $\text{row } (\text{two-block-non-interfering } A\ B)\ i = \text{row } A\ i @_v (0_v (\text{dim-col } B))$   
 $\langle \text{proof} \rangle$

**lemma** *two-block-non-interfering-row-comp2*:

**assumes**  $i < \text{dim-row } (\text{two-block-non-interfering } A\ B)$   
**and**  $i \geq \text{dim-row } A$   
**shows**  $\text{row } (\text{two-block-non-interfering } A\ B)\ i = (0_v (\text{dim-col } A)) @_v \text{row } B\ (i - \text{dim-row } A)$   
 $\langle \text{proof} \rangle$

**lemma** *first-vec-two-block-non-inter-is-first-vec*:

**assumes**  $\text{dim-col } A + \text{dim-col } B = \text{dim-vec } v$   
**assumes**  $\text{dim-row } A = n$   
**shows**  $\text{vec-first } (\text{two-block-non-interfering } A\ B *_v v)\ n = A *_v (\text{vec-first } v (\text{dim-col } A))$   
 $\langle \text{proof} \rangle$

**lemma** *last-vec-two-block-non-inter-is-last-vec*:

**assumes**  $\text{dim-col } A + \text{dim-col } B = \text{dim-vec } v$   
**assumes**  $\text{dim-row } B = n$

**shows**  $\text{vec-last } ((\text{two-block-non-interfering } A \ B) *_{\text{v}} v) \ n = B *_{\text{v}} (\text{vec-last } v \ (\text{dim-col } B))$   
 ⟨proof⟩

**lemma** *two-block-non-interfering-mult-decomposition:*

**assumes**  $\text{dim-col } A + \text{dim-col } B = \text{dim-vec } v$

**shows**  $\text{two-block-non-interfering } A \ B *_{\text{v}} v =$

$A *_{\text{v}} \text{vec-first } v \ (\text{dim-col } A) \ @_{\text{v}} B *_{\text{v}} \text{vec-last } v \ (\text{dim-col } B)$

⟨proof⟩

**fun** *mat-leqb-egc* **where**

$\text{mat-leqb-egc } A \ b \ c = (\text{let } \text{lst} = \text{matrix-to-lpolies } (\text{two-block-non-interfering } A \ A^T) \ \text{in}$

$\text{[LEQ } (\text{lst}!i) \ (b\$i) \ . \ i < - [0..<\text{dim-vec } b]] \ @$   
 $\text{[EQ } (\text{lst}!i) \ ((b@_{\text{v}}c)\$i) \ . \ i < - [\text{dim-vec } b \ ..< \ \text{dim-vec } (b@_{\text{v}}c)]])$

**lemma** *mat-leqb-egc-for-LEQ:*

**assumes**  $i < \text{dim-vec } b$

**assumes**  $i < \text{dim-row } A$

**shows**  $(\text{mat-leqb-egc } A \ b \ c)!i = \text{LEQ } ((\text{matrix-to-lpolies } A)!i) \ (b\$i)$

⟨proof⟩

**lemma** *mat-leqb-egc-for-EQ:*

**assumes**  $\text{dim-vec } b \leq i$  **and**  $i < \text{dim-vec } (b@_{\text{v}}c)$

**assumes**  $\text{dim-row } A = \text{dim-vec } b$  **and**  $\text{dim-col } A \geq \text{dim-vec } c$

**shows**  $(\text{mat-leqb-egc } A \ b \ c)!i =$

$\text{EQ } (\text{vec-to-lpoly } (0_{\text{v}} \ (\text{dim-col } A) \ @_{\text{v}} \ \text{row } A^T \ (i - \text{dim-vec } b))) \ (c\$ (i - \text{dim-vec } b))$

⟨proof⟩

**lemma** *mat-leqb-egc-satisfies1:*

**assumes**  $x \models_{\text{cs}} \text{set } (\text{mat-leqb-egc } A \ b \ c)$

**assumes**  $i < \text{dim-vec } b$

**and**  $i < \text{dim-row } A$

**shows**  $(\text{matrix-to-lpolies } A)!i \ \{\!|x|\!\} \leq b\$i$

⟨proof⟩

**lemma** *mat-leqb-egc-satisfies2:*

**assumes**  $x \models_{\text{cs}} \text{set } (\text{mat-leqb-egc } A \ b \ c)$

**assumes**  $\text{dim-vec } b \leq i$  **and**  $i < \text{dim-vec } (b@_{\text{v}}c)$

**and**  $\text{dim-row } A = \text{dim-vec } b$  **and**  $\text{dim-vec } c \leq \text{dim-col } A$

**shows**  $(\text{matrix-to-lpolies } (\text{two-block-non-interfering } A \ A^T) ! i) \ \{\!|x|\!\} = (b @_{\text{v}} c) \$$

$i$

⟨proof⟩

**lemma** *mat-leqb-egc-simplex-satisfies2:*

**assumes**  $\text{simplex } (\text{mat-leqb-egc } A \ b \ c) = \text{Sat } x$

**assumes**  $\dim\text{-vec } b \leq i$  **and**  $i < \dim\text{-vec } (b @_v c)$   
**and**  $\dim\text{-row } A = \dim\text{-vec } b$  **and**  $\dim\text{-vec } c \leq \dim\text{-col } A$   
**shows**  $(\text{matrix-to-lpolies } (\text{two-block-non-interfering } A A^T) ! i) \{ \langle x \rangle \} = (b @_v c)$   
 $\$ i$   
 $\langle \text{proof} \rangle$

**fun**  $\text{index-geq-n}$  **where**  
 $\text{index-geq-n } i n = \text{GEQ } (\text{lp-monom } 1 i) n$

**lemma**  $\text{index-geq-n-simplex}$ :  
**assumes**  $\langle x \rangle \models_c (\text{index-geq-n } i n)$   
**shows**  $\langle x \rangle i \geq n$   
 $\langle \text{proof} \rangle$

**fun**  $\text{from-index-geq0-vector}$  **where**  
 $\text{from-index-geq0-vector } i v = [\text{GEQ } (\text{lp-monom } 1 (i+j)) (v\$j) . j < -[0..<\dim\text{-vec } v]]$

**lemma**  $\text{from-index-geq-vector-simplex}$ :  
**assumes**  $x \models_{cs} \text{set } (\text{from-index-geq0-vector } i v)$   
 $j < \dim\text{-vec } v$   
**shows**  $x (i + j) \geq v\$j$   
 $\langle \text{proof} \rangle$

**lemma**  $\text{from-index-geq0-vector-simplex2}$ :  
**assumes**  $\langle x \rangle \models_{cs} \text{set } (\text{from-index-geq0-vector } i v)$   
**assumes**  $i \leq j$  **and**  $j < (\dim\text{-vec } v) + i$   
**shows**  $\langle x \rangle j \geq v\$(j - i)$   
 $\langle \text{proof} \rangle$

**fun**  $\text{x-times-c-geq-y-times-b}$  **where**  
 $\text{x-times-c-geq-y-times-b } c b = \text{GEQPP } (\text{vec-to-lpoly } (c @_v 0_v (\dim\text{-vec } b)))$   
 $(\text{vec-to-lpoly } (0_v (\dim\text{-vec } c) @_v b))$

**lemma**  $\text{x-times-c-geq-y-times-b-correct}$ :  
**assumes**  $\text{simplex } [\text{x-times-c-geq-y-times-b } c b] = \text{Sat } x$   
**shows**  $((\text{vec-to-lpoly } (c @_v 0_v (\dim\text{-vec } b))) \{ \langle x \rangle \}) \geq$   
 $((\text{vec-to-lpoly } (0_v (\dim\text{-vec } c) @_v b)) \{ \langle x \rangle \})$   
 $\langle \text{proof} \rangle$

**definition**  $\text{split-i-j-x}$  **where**

$split-i-j-x\ i\ j\ x = (vec\ i\ \langle x \rangle, vec\ (j - i)\ (\lambda y. \langle x \rangle\ (y+i)))$

**abbreviation**  $split-n-m-x$  **where**

$split-n-m-x\ n\ m\ x \equiv split-i-j-x\ n\ (n+m)\ x$

**lemma**  $split-vec-dims$ :

**assumes**  $split-i-j-x\ i\ j\ x = (a, b)$

**shows**  $dim-vec\ a = i\ dim-vec\ b = (j - i)$

$\langle proof \rangle$

**lemma**  $split-n-m-x-abbrev-dims$ :

**assumes**  $split-n-m-x\ n\ m\ x = (a, b)$

**shows**  $dim-vec\ a = n\ dim-vec\ b = m$

$\langle proof \rangle$

**lemma**  $split-access-fst-1$ :

**assumes**  $k < i$

**assumes**  $split-i-j-x\ i\ j\ x = (a, b)$

**shows**  $a\ \$\ k = \langle x \rangle\ k$

$\langle proof \rangle$

**lemma**  $split-access-snd-1$ :

**assumes**  $i \leq k$  **and**  $k < j$

**assumes**  $split-i-j-x\ i\ j\ x = (a, b)$

**shows**  $b\ \$\ (k - i) = \langle x \rangle\ k$

$\langle proof \rangle$

**lemma**  $split-access-fst-2$ :

**assumes**  $(x, y) = split-i-j-x\ i\ j\ Z$

**assumes**  $k < dim-vec\ x$

**shows**  $x\ \$\ k = \langle Z \rangle\ k$

$\langle proof \rangle$

**lemma**  $split-access-snd-2$ :

**assumes**  $(x, y) = split-i-j-x\ i\ j\ Z$

**assumes**  $k < dim-vec\ y$

**shows**  $y\ \$\ k = \langle Z \rangle\ (k + dim-vec\ x)$

$\langle proof \rangle$

**lemma**  $from-index-geq0-vector-split-snd$ :

**assumes**  $\langle X \rangle \models_{cs}\ set\ (from-index-geq0-vector\ d\ v)$

**assumes**  $(x, y) = split-n-m-x\ d\ m\ X$

**shows**  $\bigwedge i. i < dim-vec\ v \implies i < m \implies y\ \$\ i \geq v\ \$\ i$

$\langle proof \rangle$

**lemma**  $split-coeff-vec-index-sum$ :

**assumes**  $(x, y) = split-i-j-x\ (dim-vec\ (lpoly-to-vec\ v))\ l\ X$

**shows**  $(\sum i = 0..<dim-vec\ x. Abstract-Linear-Poly.coeff\ v\ i * \langle X \rangle\ i) =$



$(\sum i = 0..<dim-vec\ x.\ lpoly-to-vec\ v\ \$\ i\ *\ x\ \$\ i)$   
 ⟨proof⟩

**lemma** *scalar-prod-valuation-after-split-equiv1*:

**assumes**  $(x,y) = split-i-j-x\ (dim-vec\ (lpoly-to-vec\ v))\ l\ X$

**shows**  $(lpoly-to-vec\ v) \cdot x = (v\ \{\langle X \rangle\})$

⟨proof⟩

**definition** *mat-times-vec-leq* ( $[-*_v]- \leq - [1000,1000,100]$ )

**where**

$$[A *_v x] \leq b \iff (\forall i < dim-vec\ b.\ (A *_v x)\ \$i \leq b\ \$i) \wedge$$

$$(dim-row\ A = dim-vec\ b) \wedge$$

$$(dim-col\ A = dim-vec\ x)$$

**definition** *vec-times-mat-eq* ( $[-*_v]= - [1000,1000,100]$ )

**where**

$$[y\ *_v\ A] = c \iff (\forall i < dim-vec\ c.\ (A^T *_v y)\ \$i = c\ \$i) \wedge$$

$$(dim-col\ A^T = dim-vec\ y) \wedge$$

$$(dim-row\ A^T = dim-vec\ c)$$

**definition** *vec-times-mat-leq* ( $[-*_v]- \leq - [1000,1000,100]$ )

**where**

$$[y\ *_v\ A] \leq c \iff (\forall i < dim-vec\ c.\ (A^T *_v y)\ \$i \leq c\ \$i) \wedge$$

$$(dim-col\ A^T = dim-vec\ y) \wedge$$

$$(dim-row\ A^T = dim-vec\ c)$$

**lemma** *mat-times-vec-leqI*[intro]:

**assumes**  $dim-row\ A = dim-vec\ b$

**assumes**  $dim-col\ A = dim-vec\ x$

**assumes**  $\bigwedge i.\ i < dim-vec\ b \implies (A *_v x)\ \$i \leq b\ \$i$

**shows**  $[A *_v x] \leq b$

⟨proof⟩

**lemma** *mat-times-vec-leqD*[dest]:

**assumes**  $[A *_v x] \leq b$

**shows**  $dim-row\ A = dim-vec\ b \wedge dim-col\ A = dim-vec\ x \wedge \bigwedge i.\ i < dim-vec\ b \implies (A *_v x)\ \$i \leq b\ \$i$

⟨proof⟩

**lemma** *vec-times-mat-eqD*[dest]:

**assumes**  $[y\ *_v\ A] = c$

**shows**  $(\forall i < dim-vec\ c.\ (A^T *_v y)\ \$i = c\ \$i) \wedge (dim-col\ A^T = dim-vec\ y) \wedge (dim-row\ A^T = dim-vec\ c)$

⟨proof⟩

**lemma** *vec-times-mat-leqD*[dest]:

**assumes**  $[y\ *_v\ A] \leq c$

**shows**  $(\forall i < dim-vec\ c.\ (A^T *_v y)\ \$i \leq c\ \$i) \wedge (dim-col\ A^T = dim-vec\ y) \wedge (dim-row\ A^T = dim-vec\ c)$

$A^T = \text{dim-vec } c$   
 $\langle \text{proof} \rangle$

**lemma** *mat-times-vec-eqI*[intro]:  
assumes  $\text{dim-col } A^T = \text{dim-vec } x$   
assumes  $\text{dim-row } A^T = \text{dim-vec } c$   
assumes  $\bigwedge i. i < \text{dim-vec } c \implies (A^T *_v x)\$i = c\$i$   
shows  $[x *_v A] = c$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-split-correct1*:  
assumes  $\text{dim-vec } b = \text{dim-row } A$   
assumes  $\langle X \rangle \models_{cs} \text{set } (\text{mat-leqb-eqc } A \ b \ c)$   
assumes  $(x, y) = \text{split-i-j-x } (\text{dim-col } A) \ l \ X$   
shows  $[A *_v x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-split-simplex-correct1*:  
assumes  $\text{dim-vec } b = \text{dim-row } A$   
assumes  $\text{simplex } (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$   
assumes  $(x, y) = \text{split-i-j-x } (\text{dim-col } A) \ l \ X$   
shows  $[A *_v x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *sat-mono*:  
assumes  $\text{set } A \subseteq \text{set } B$   
shows  $\langle X \rangle \models_{cs} \text{set } B \implies \langle X \rangle \models_{cs} \text{set } A$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-split-subset-correct1*:  
assumes  $\text{dim-vec } b = \text{dim-row } A$   
assumes  $\text{set } (\text{mat-leqb-eqc } A \ b \ c) \subseteq \text{set } S$   
assumes  $\text{simplex } S = \text{Sat } X$   
assumes  $(x, y) = \text{split-i-j-x } (\text{dim-col } A) \ l \ X$   
shows  $[A *_v x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-split-correct2*:  
assumes  $\text{dim-vec } c = \text{dim-row } A^T$   
assumes  $\text{dim-vec } b = \text{dim-col } A^T$   
assumes  $\langle X \rangle \models_{cs} \text{set } (\text{mat-leqb-eqc } A \ b \ c)$   
assumes  $(x, y) = \text{split-n-m-x } (\text{dim-row } A^T) \ (\text{dim-col } A^T) \ X$   
shows  $[y *_v A] = c$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-split-simplex-correct2*:  
assumes  $\text{dim-vec } c = \text{dim-row } A^T$   
assumes  $\text{dim-vec } b = \text{dim-col } A^T$   
assumes  $\text{simplex } (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$

**assumes**  $(x, y) = \text{split-n-m-x } (\text{dim-row } A^T) (\text{dim-col } A^T) X$   
**shows**  $[y \text{ } _v * A] = c$   
 $\langle \text{proof} \rangle$

**lemma** *mat-leqb-eqc-correct*:

**assumes**  $\text{dim-vec } c = \text{dim-row } A^T$   
**and**  $\text{dim-vec } b = \text{dim-col } A^T$   
**assumes**  $\text{simplex } (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$   
**assumes**  $(x, y) = \text{split-n-m-x } (\text{dim-row } A^T) (\text{dim-col } A^T) X$   
**shows**  $[y \text{ } _v * A] = c \ [A \ *_v \ x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *eval-lpoly-eq-dot-prod-split1*:

**assumes**  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$   
**shows**  $(\text{vec-to-lpoly } c) \ \{\!\{X\}\!\} = c \cdot x$   
 $\langle \text{proof} \rangle$

**lemma** *eval-lpoly-eq-dot-prod-split2*:

**assumes**  $(x, y) = \text{split-n-m-x } (\text{dim-vec } b) (\text{dim-vec } c) X$   
**shows**  $(\text{vec-to-lpoly } (0_v (\text{dim-vec } b) \ @_v \ c)) \ \{\!\{X\}\!\} = c \cdot y$   
 $\langle \text{proof} \rangle$

**lemma** *x-times-c-geq-y-times-b-split-dotP*:

**assumes**  $\langle X \rangle \models_c \text{x-times-c-geq-y-times-b } c \ b$   
**assumes**  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$   
**shows**  $c \cdot x \geq b \cdot y$   
 $\langle \text{proof} \rangle$

**lemma** *mult-right-leq*:

**fixes**  $A :: ('a :: \{\text{comm-semiring-1}, \text{ordered-semiring}\}) \ \text{mat}$   
**assumes**  $\text{dim-vec } y = \text{dim-vec } b$   
**and**  $\forall i < \text{dim-vec } y. \ y \ \$i \geq 0$   
**and**  $[A \ *_v \ x] \leq b$   
**shows**  $(A \ *_v \ x) \cdot y \leq b \cdot y$   
 $\langle \text{proof} \rangle$

**lemma** *mult-right-eq*:

**assumes**  $\text{dim-vec } x = \text{dim-vec } c$   
**and**  $[y \text{ } _v * A] = c$   
**shows**  $(A^T \ *_v \ y) \cdot x = c \cdot x$   
 $\langle \text{proof} \rangle$

**lemma** *soundness-mat-x-leq*:

**assumes**  $\text{dim-row } A = \text{dim-vec } b$   
**assumes**  $\text{simplex } (\text{mat-x-leq-vec } A \ b) = \text{Sat } X$   
**shows**  $\exists x. [A \ *_v \ x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *completeness-mat-x-leq*:

**assumes**  $\exists x. [A *_v x] \leq b$   
**shows**  $\exists X. \text{simplex} (\text{mat-x-leq-vec } A \ b) = \text{Sat } X$   
 $\langle \text{proof} \rangle$

**lemma** *soundness-mat-x-eq-vec*:  
**assumes**  $\text{dim-row } A^T = \text{dim-vec } c$   
**assumes**  $\text{simplex} (x\text{-mat-eq-vec } c \ A^T) = \text{Sat } X$   
**shows**  $\exists x. [x \ *_v \ A] = c$   
 $\langle \text{proof} \rangle$

**lemma** *completeness-mat-x-eq-vec*:  
**assumes**  $\exists x. [x \ *_v \ A] = c$   
**shows**  $\exists X. \text{simplex} (x\text{-mat-eq-vec } c \ A^T) = \text{Sat } X$   
 $\langle \text{proof} \rangle$

**lemma** *soundness-mat-leqb-eqc1*:  
**assumes**  $\text{dim-row } A = \text{dim-vec } b$   
**assumes**  $\text{simplex} (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$   
**shows**  $\exists x. [A *_v x] \leq b$   
 $\langle \text{proof} \rangle$

**lemma** *soundness-mat-leqb-eqc2*:  
**assumes**  $\text{dim-row } A^T = \text{dim-vec } c$   
**assumes**  $\text{dim-col } A^T = \text{dim-vec } b$   
**assumes**  $\text{simplex} (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$   
**shows**  $\exists y. [y \ *_v \ A] = c$   
 $\langle \text{proof} \rangle$

**lemma** *completeness-mat-leqb-eqc*:  
**assumes**  $\exists x. [A *_v x] \leq b$   
**and**  $\exists y. [y \ *_v \ A] = c$   
**shows**  $\exists X. \text{simplex} (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X$   
 $\langle \text{proof} \rangle$

**lemma** *sound-and-complte-mat-leqb-eqc [iff]*:  
**assumes**  $\text{dim-row } A^T = \text{dim-vec } c$   
**assumes**  $\text{dim-col } A^T = \text{dim-vec } b$   
**shows**  $(\exists x. [A *_v x] \leq b) \wedge (\exists y. [y \ *_v \ A] = c) \longleftrightarrow (\exists X. \text{simplex} (\text{mat-leqb-eqc } A \ b \ c) = \text{Sat } X)$   
 $\langle \text{proof} \rangle$

## 7 Translate Inequalities to Matrix Form

**fun** *nonstrict-constr* **where**  
*nonstrict-constr* (*LEQ* *p r*) = *True* |  
*nonstrict-constr* (*GEQ* *p r*) = *True* |  
*nonstrict-constr* (*EQ* *p r*) = *True* |  
*nonstrict-constr* (*LEQPP* *p q*) = *True* |  
*nonstrict-constr* (*GEQPP* *p q*) = *True* |

*nonstrict-constr* (*EQPP* *p q*) = *True* |  
*nonstrict-constr* - = *False*

**abbreviation** *nonstrict-constrs cs*  $\equiv (\forall a \in \text{set } cs. \text{nonstrict-constr } a)$

**fun** *transf-constraint* **where**

*transf-constraint* (*LEQ* *p r*) = [*LEQ* *p r*] |  
*transf-constraint* (*GEQ* *p r*) = [*LEQ* (*-p*) (*-r*)] |  
*transf-constraint* (*EQ* *p r*) = [*LEQ* *p r*, *LEQ* (*-p*) (*-r*)] |  
*transf-constraint* (*LEQPP* *p q*) = [*LEQ* (*p - q*) 0] |  
*transf-constraint* (*GEQPP* *p q*) = [*LEQ* (*-(p - q)*) 0] |  
*transf-constraint* (*EQPP* *p q*) = [*LEQ* (*p - q*) 0, *LEQ* (*-(p - q)*) 0] |  
*transf-constraint* - = []

**fun** *transf-constraints* **where**

*transf-constraints* [] = [] |  
*transf-constraints* (*x#xs*) = *transf-constraint* *x* @ (*transf-constraints* *xs*)

**lemma** *trans-constraint-creates-LEQ-only*:

**assumes** *transf-constraint* *x*  $\neq$  []  
**shows**  $(\forall x \in \text{set } (\text{transf-constraint } x). \exists a b. x = \text{LEQ } a b)$   
*<proof>*

**lemma** *trans-constraints-creates-LEQ-only*:

**assumes** *transf-constraints* *xs*  $\neq$  []  
**assumes** *x*  $\in$  *set* (*transf-constraints* *xs*)  
**shows**  $\exists p r. \text{LEQ } p r = x$   
*<proof>*

**lemma** *non-strict-constr-no-LT*:

**assumes** *nonstrict-constrs cs*  
**shows**  $\forall x \in \text{set } cs. \neg(\exists a b. \text{LT } a b = x)$   
*<proof>*

**lemma** *non-strict-constr-no-GT*:

**assumes** *nonstrict-constrs cs*  
**shows**  $\forall x \in \text{set } cs. \neg(\exists a b. \text{GT } a b = x)$   
*<proof>*

**lemma** *non-strict-constr-no-LTPP*:

**assumes** *nonstrict-constrs cs*  
**shows**  $\forall x \in \text{set } cs. \neg(\exists a b. \text{LTPP } a b = x)$   
*<proof>*

**lemma** *non-strict-constr-no-GTPP*:

**assumes** *nonstrict-constrs cs*  
**shows**  $\forall x \in \text{set } cs. \neg(\exists a b. \text{GTPP } a b = x)$

*<proof>*

**lemma** *non-strict-consts-cond:*

**assumes**  $\bigwedge x. x \in \text{set } cs \implies \neg(\exists a b. LT\ a\ b = x)$   
**assumes**  $\bigwedge x. x \in \text{set } cs \implies \neg(\exists a b. GT\ a\ b = x)$   
**assumes**  $\bigwedge x. x \in \text{set } cs \implies \neg(\exists a b. LTPP\ a\ b = x)$   
**assumes**  $\bigwedge x. x \in \text{set } cs \implies \neg(\exists a b. GTPP\ a\ b = x)$   
**shows** *nonstrict-consts cs*  
*<proof>*

**lemma** *sat-constr-sat-transf-constrs:*

**assumes**  $v \models_c cs$   
**shows**  $v \models_{cs} \text{set } (\text{transf-constraint } cs)$   
*<proof>*

**lemma** *sat-constrs-sat-transf-constrs:*

**assumes**  $v \models_{cs} \text{set } cs$   
**shows**  $v \models_{cs} \text{set } (\text{transf-constraints } cs)$   
*<proof>*

**lemma** *sat-transf-constrs-sat-constr:*

**assumes** *nonstrict-constr cs*  
**assumes**  $v \models_{cs} \text{set } (\text{transf-constraint } cs)$   
**shows**  $v \models_c cs$   
*<proof>*

**lemma** *sat-transf-constrs-sat-constrs:*

**assumes** *nonstrict-consts cs*  
**assumes**  $v \models_{cs} \text{set } (\text{transf-constraints } cs)$   
**shows**  $v \models_{cs} \text{set } cs$   
*<proof>*

**end**

**theory** *Linear-Programming*

**imports**

*HOL-Library.Code-Target-Int*

*LP-Preliminaries*

*Farkas.Simplex-for-Reals*

**begin**

## 8 Abstract LPs

Primal Problem

**definition** *sat-primal*  $A\ b = \{ x. [A\ *_v\ x] \leq b \}$

Dual Problem

**definition** *sat-dual*  $A\ c = \{ y. [y\ *_v\ A] = c \wedge (\forall i < \text{dim-vec } y. y\ \$\ i \geq 0) \}$

**definition** *optimal-set*  $f S = \{x \in S. (\forall y \in S. f x y)\}$

**abbreviation** *max-lp where*

$max-lp A b c \equiv optimal-set (\lambda x y. (y \cdot c) \leq (x \cdot c)) (sat-primal A b)$

**abbreviation** *min-lp where*

$min-lp A b c \equiv optimal-set (\lambda x y. (y \cdot c) \geq (x \cdot c)) (sat-dual A c)$

**lemma** *optimal-setI* [intro]:

assumes  $x \in S$

assumes  $\bigwedge y. y \in S \implies (\lambda x y. (y \cdot c) \geq (x \cdot c)) x y$

shows  $x \in optimal-set (\lambda x y. (y \cdot c) \geq (x \cdot c)) S$

*<proof>*

**lemma** *max-lpI* [intro]:

assumes  $[A *_v x] \leq b$

assumes  $(\bigwedge y. [A *_v y] \leq b \implies (\lambda x y. (y \cdot c) \geq (x \cdot c)) y x)$

shows  $x \in max-lp A b c$

*<proof>*

**lemma** *min-lpI* [intro]:

assumes  $[y *_v A] = c$

and  $(\bigwedge i. i < dim-vec y \implies y \$ i \geq 0)$

assumes  $(\bigwedge x. x \in sat-dual A c \implies (\lambda x y. (y \cdot c) \geq (x \cdot c)) y x)$

shows  $y \in min-lp A b c$

*<proof>*

**lemma** *sat-primalD* [dest]:

assumes  $x \in sat-primal A b$

shows  $[A *_v x] \leq b$

*<proof>*

**lemma** *sat-primalI* [intro]:

assumes  $[A *_v x] \leq b$

shows  $x \in sat-primal A b$

*<proof>*

**lemma** *sat-dualD* [dest]:

assumes  $y \in sat-dual A c$

shows  $[y *_v A] = c (\forall i < dim-vec y. y \$ i \geq 0)$

*<proof>*

**lemma** *sat-dualI* [intro]:

assumes  $[y *_v A] = c (\forall i < dim-vec y. y \$ i \geq 0)$

shows  $y \in sat-dual A c$

*<proof>*

**lemma** *sol-dim-in-sat-primal*:  $x \in sat-primal A b \implies dim-vec x = dim-col A$

*<proof>*

**lemma** *sol-dim-in-max-lp*:  $x \in \text{max-lp } A \ b \ c \implies \text{dim-vec } x = \text{dim-col } A$   
*<proof>*

**lemma** *sol-dim-in-sat-dual*:  $x \in \text{sat-dual } A \ c \implies \text{dim-vec } x = \text{dim-row } A$   
*<proof>*

**lemma** *sol-dim-in-min-lp*:  $x \in \text{min-lp } A \ b \ c \implies \text{dim-vec } x = \text{dim-row } A$   
*<proof>*

**lemma** *min-lp-in-sat-dual*:  $x \in \text{min-lp } A \ b \ c \implies x \in \text{sat-dual } A \ c$   
*<proof>*

**lemma** *max-lp-in-sat-primal*:  $x \in \text{max-lp } A \ b \ c \implies x \in \text{sat-primal } A \ b$   
*<proof>*

**locale** *abstract-LP* =

**fixes**  $A :: ('a :: \{\text{comm-semiring-1}, \text{ordered-semiring}, \text{linorder}\}) \text{ mat}$

**fixes**  $b :: 'a \text{ vec}$

**fixes**  $c :: 'a \text{ vec}$

**fixes**  $m$

**fixes**  $n$

**assumes**  $b \in \text{carrier-vec } m$

**assumes**  $c \in \text{carrier-vec } n$

**assumes**  $A \in \text{carrier-mat } m \ n$

**begin**

**lemma** *dim-b-row-A*:  $\text{dim-vec } b = \text{dim-row } A$   
*<proof>*

**lemma** *dim-b-col-A*:  $\text{dim-vec } c = \text{dim-col } A$   
*<proof>*

**lemma** *weak-duality-aux*:

**fixes**  $i \ j$

**assumes**  $i \in \{c \cdot x \mid x. x \in \text{sat-primal } A \ b\}$

**and**  $j \in \{b \cdot y \mid y. y \in \text{sat-dual } A \ c\}$

**shows**  $i \leq j$

*<proof>*

**theorem** *weak-duality-theorem*:

**assumes**  $x \in \text{max-lp } A \ b \ c$

**assumes**  $y \in \text{min-lp } A \ b \ c$

**shows**  $x \cdot c \leq y \cdot b$

*<proof>*

**end**



```

fun create-optimal-solutions where
  create-optimal-solutions A b c =
    (case simplex (x-times-c-geq-y-times-b c b #
      mat-leqb-ecq A b c @
      from-index-geq0-vector (dim-vec c) (0_v (dim-vec b)))
    of
      Unsat X  $\Rightarrow$  Unsat X
      | Sat X  $\Rightarrow$  Sat X)

fun optimize-no-cond where optimize-no-cond A b c = (case create-optimal-solutions
  A b c of
    Unsat X  $\Rightarrow$  Unsat X
    | Sat X  $\Rightarrow$  Sat (fst (split-n-m-x (dim-vec c) (dim-vec b) X)))

lemma create-opt-sol-satisfies:
  assumes create-optimal-solutions A b c = Sat X
  shows  $\langle X \rangle \models_{cs} \text{set } ((x\text{-times-}c\text{-geq-}y\text{-times-}b\ c\ b\ \# \text{ mat-leqb-ecq } A\ b\ c\ @$ 
    from-index-geq0-vector (dim-vec c) (0_v (dim-vec b))))
   $\langle \text{proof} \rangle$ 

lemma create-opt-sol-sat-leq-mat:
  assumes dim-vec b = dim-row A
  assumes create-optimal-solutions A b c = Sat X
  and (x, y) = split-i-j-x (dim-col A) (dim-vec b) X
  shows  $[A *_{v} x] \leq b$ 
   $\langle \text{proof} \rangle$ 

lemma create-opt-sol-sat-eq-mat:
  assumes dim-vec c = dim-row AT
  and dim-vec b = dim-col AT
  assumes create-optimal-solutions A b c = Sat X
  and (x, y) = split-i-j-x (dim-vec c) (dim-vec c + dim-vec b) X
  shows  $[y\ v * A] = c$ 
   $\langle \text{proof} \rangle$ 

lemma create-opt-sol-satisfies-leq:
  assumes create-optimal-solutions A b c = Sat X
  assumes (x, y) = split-n-m-x (dim-vec c) (dim-vec b) X
  shows  $x \cdot c \geq y \cdot b$ 
   $\langle \text{proof} \rangle$ 

lemma create-opt-sol-satisfies-geq0:
  assumes create-optimal-solutions A b c = Sat X
  assumes (x, y) = split-n-m-x (dim-vec c) (dim-vec b) X
  shows  $\bigwedge i. i < \text{dim-vec } y \implies y\ \$i \geq 0$ 
   $\langle \text{proof} \rangle$ 

locale rat-LP = abstract-LP A b c m n

```

```

for  $A :: \text{rat mat}$ 
  and  $b :: \text{rat vec}$ 
  and  $c :: \text{rat vec}$ 
  and  $m :: \text{nat}$ 
  and  $n :: \text{nat}$ 
begin

lemma create-opt-sol-in-LP:
  assumes create-optimal-solutions  $A\ b\ c = \text{Sat } X$ 
  assumes  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$ 
  shows  $[A *_{\text{v}} x] \leq b \ [y *_{\text{v}} A] = c \ x \cdot c \geq y \cdot b \wedge i. i < \text{dim-vec } y \implies y\ \$i \geq 0$ 
  <proof>

lemma create-optim-in-sols:
  assumes create-optimal-solutions  $A\ b\ c = \text{Sat } X$ 
  assumes  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$ 
  shows  $c \cdot x \in \{c \cdot x \mid x. [A *_{\text{v}} x] \leq b\}$ 
   $b \cdot y \in \{b \cdot y \mid y. [y *_{\text{v}} A] = c \wedge (\forall i < \text{dim-vec } y. y\ \$i \geq 0)\}$ 
  <proof>

lemma cx-leq-bx-in-creating-opt:
  assumes create-optimal-solutions  $A\ b\ c = \text{Sat } X$ 
  assumes  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$ 
  shows  $c \cdot x \leq b \cdot y$ 
  <proof>

lemma min-max-for-sol:
  assumes create-optimal-solutions  $A\ b\ c = \text{Sat } X$ 
  assumes  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$ 
  shows  $c \cdot x = b \cdot y$ 
  <proof>

lemma create-opt-solutions-correct:
  assumes create-optimal-solutions  $A\ b\ c = \text{Sat } X$ 
  assumes  $(x, y) = \text{split-n-m-x } (\text{dim-vec } c) (\text{dim-vec } b) X$ 
  shows  $x \in \text{max-lp } A\ b\ c$ 
  <proof>

lemma optimize-no-cond-correct:
  assumes optimize-no-cond  $A\ b\ c = \text{Sat } x$ 
  shows  $x \in \text{max-lp } A\ b\ c$ 
  <proof>

lemma optimize-no-cond-sol-sat:
  assumes optimize-no-cond  $A\ b\ c = \text{Sat } x$ 
  shows  $x \in \text{sat-primal } A\ b$ 
  <proof>

```

**end**

**fun** *maximize* **where**

*maximize*  $A\ b\ c = (\text{if } \text{dim-vec } b = \text{dim-row } A \wedge \text{dim-vec } c = \text{dim-col } A \text{ then}$   
     $\text{Some } (\text{optimize-no-cond } A\ b\ c)$   
     $\text{else None})$

**lemma** *optimize-sound*:

**assumes**  $\text{maximize } A\ b\ c = \text{Some } (\text{Sat } x)$   
**shows**  $x \in \text{max-lp } A\ b\ c$

*<proof>*

**lemma** *maximize-option-elim*:

**assumes**  $\text{maximize } A\ b\ c = \text{Some } x$   
**shows**  $\text{dim-vec } b = \text{dim-row } A\ \text{dim-vec } c = \text{dim-col } A$

*<proof>*

**lemma** *optimize-sol-dimension*:

**assumes**  $\text{maximize } A\ b\ c = \text{Some } (\text{Sat } x)$   
**shows**  $x \in \text{carrier-vec } (\text{dim-col } A)$

*<proof>*

**lemma** *optimize-sat*:

**assumes**  $\text{maximize } A\ b\ c = \text{Some } (\text{Sat } x)$   
**shows**  $[A\ *_v\ x] \leq b$

*<proof>*

**derive** (*eq*) *ceq rat*

**derive** (*linorder*) *compare rat*

**derive** (*compare*) *ccompare rat*

**derive** (*rbt*) *set-impl rat*

**derive** (*eq*) *ceq atom QDelta*

**derive** (*linorder*) *compare-order QDelta*

**derive** *compare-order atom*

**derive** *ccompare atom QDelta*

**derive** (*rbt*) *set-impl atom QDelta*

**lemma** *of-rat-val*:  $\text{simplex } cs = (\text{Sat } v) \implies \text{of-rat-val } \langle v \rangle \models_{rcs} \text{set } cs$   
*<proof>*

**end**

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