

# Kruskal's Algorithm for Minimum Spanning Forest

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## Abstract

This Isabelle/HOL formalization defines a greedy algorithm for finding a minimum weight basis on a weighted matroid and proves its correctness. This algorithm is an abstract version of Kruskal's algorithm.

We interpret the abstract algorithm for the cycle matroid (i.e. forests in a graph) and refine it to imperative executable code using an efficient union-find data structure.

Our formalization can be instantiated for different graph representations. We provide instantiations for undirected graphs and symmetric directed graphs.

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## 1 Minimum Weight Basis

**theory** *MinWeightBasis*

**imports** *Refine-Monadic.Refine-Monadic Matroids.Matroid*

**begin**

For a matroid together with a weight function, assigning each element of the carrier set an weight, we construct a greedy algorithm that determines a minimum weight basis.

**locale** *weighted-matroid* = *matroid carrier indep* **for** *carrier::'a set* **and** *indep +*  
**fixes** *weight :: 'a  $\Rightarrow$  'b::{linorder, ordered-comm-monoid-add}*  
**begin**

**definition** *minBasis* **where**

*minBasis B  $\equiv$  basis B  $\wedge (\forall B'. \text{basis } B' \longrightarrow \text{sum weight } B \leq \text{sum weight } B')$*

## 1.1 Preparations

**fun** *in-sort-edge* **where**

*in-sort-edge*  $x \ [] = [x]$   
 $| \text{in-sort-edge } x \ (y \# \text{ys}) = (\text{if weight } x \leq \text{weight } y \text{ then } x \# y \# \text{ys else } y \# \text{in-sort-edge } x \ \text{ys})$

**lemma** [*simp*]:  $\text{set } (\text{in-sort-edge } x \ L) = \text{insert } x \ (\text{set } L) \ \langle \text{proof} \rangle$

**lemma** *in-sort-edge*:  $\text{sorted-wrt } (\lambda e1 \ e2. \text{weight } e1 \leq \text{weight } e2) \ L \implies \text{sorted-wrt } (\lambda e1 \ e2. \text{weight } e1 \leq \text{weight } e2) \ (\text{in-sort-edge } x \ L) \ \langle \text{proof} \rangle$

**lemma** *in-sort-edge-distinct*:  $x \notin \text{set } L \implies \text{distinct } L \implies \text{distinct } (\text{in-sort-edge } x \ L) \ \langle \text{proof} \rangle$

**lemma** *finite-sorted-edge-distinct*:

**assumes** *finite*  $S$

**obtains**  $L$  **where**  $\text{distinct } L \ \text{sorted-wrt } (\lambda e1 \ e2. \text{weight } e1 \leq \text{weight } e2) \ L \ S = \text{set } L \ \langle \text{proof} \rangle$

**abbreviation** *wsorted* ==  $\text{sorted-wrt } (\lambda e1 \ e2. \text{weight } e1 \leq \text{weight } e2)$

**lemma** *sum-list-map-cons*:

$\text{sum-list } (\text{map weight } (y \# \text{ys})) = \text{weight } y + \text{sum-list } (\text{map weight } \text{ys}) \ \langle \text{proof} \rangle$

**lemma** *exists-greater*:

**assumes**  $\text{len: length } F = \text{length } F'$

**and**  $\text{sum: sum-list } (\text{map weight } F) > \text{sum-list } (\text{map weight } F')$

**shows**  $\exists i < \text{length } F. \text{weight } (F ! i) > \text{weight } (F' ! i)$

$\langle \text{proof} \rangle$

**lemma** *wsorted-nth-mono*: **assumes**  $\text{wsorted } L \ i \leq j < \text{length } L$

**shows**  $\text{weight } (L ! i) \leq \text{weight } (L ! j)$

$\langle \text{proof} \rangle$

### 1.1.1 Weight restricted set

$\text{limi } T \ g$  is the set  $T$  restricted to elements only with weight strictly smaller than  $g$ .

**definition**  $\text{limi } T \ g == \{e. e \in T \wedge \text{weight } e < g\}$

**lemma** *limi-subset*:  $\text{limi } T \ g \subseteq T \ \langle \text{proof} \rangle$

**lemma** *limi-mono*:  $A \subseteq B \implies \text{limi } A \ g \subseteq \text{limi } B \ g \ \langle \text{proof} \rangle$

### 1.1.2 The greedy idea

**definition** *no-smallest-element-skipped*  $E F$

$$= (\forall e \in \text{carrier} - E. \forall g > \text{weight } e. \text{indep } (\text{insert } e (\text{limi } F g)) \longrightarrow (e \in \text{limi } F g))$$

let  $F$  be a set of elements  $\text{limi } F g$  is  $F$  restricted to elements with weight smaller than  $g$  let  $E$  be a set of elements we want to exclude.

*no-smallest-element-skipped*  $E F$  expresses, that going greedily over  $\text{carrier} - E$ , every element that did not render the accumulated set dependent, was added to the set  $F$ .

**lemma** *no-smallest-element-skipped-empty*[simp]: *no-smallest-element-skipped*  $\text{carrier } \{\}$

$\langle \text{proof} \rangle$

**lemma** *no-smallest-element-skippedD*:

**assumes** *no-smallest-element-skipped*  $E F$   $e \in \text{carrier} - E$   
 $\text{weight } e < g$  ( $\text{indep } (\text{insert } e (\text{limi } F g))$ )

**shows**  $e \in \text{limi } F g$

$\langle \text{proof} \rangle$

**lemma** *no-smallest-element-skipped-skip*:

**assumes** *createsCycle*:  $\neg \text{indep } (\text{insert } e F)$

**and**  $I$ : *no-smallest-element-skipped*  $(E \cup \{e\}) F$

**and** *sorted*:  $(\forall x \in F. \forall y \in (E \cup \{e\}). \text{weight } x \leq \text{weight } y)$

**shows** *no-smallest-element-skipped*  $E F$

$\langle \text{proof} \rangle$

**lemma** *no-smallest-element-skipped-add*:

**assumes**  $I$ : *no-smallest-element-skipped*  $(E \cup \{e\}) F$

**shows** *no-smallest-element-skipped*  $E (\text{insert } e F)$

$\langle \text{proof} \rangle$

## 1.2 Minimum Weight Basis algorithm

**definition** *obtain-sorted-carrier*  $\equiv \text{SPEC } (\lambda L. \text{wsorted } L \wedge \text{set } L = \text{carrier})$

**abbreviation** *empty-basis*  $\equiv \{\}$

To compute a minimum weight basis one obtains a list of the carrier set sorted ascendingly by the weight function. Then one iterates over the list and adds an elements greedily to the independent set if it does not render the set dependent.

**definition** *minWeightBasis* **where**

*minWeightBasis*  $\equiv \text{do } \{$   
 $l \leftarrow \text{obtain-sorted-carrier};$   
 $\text{ASSERT } (\text{set } l = \text{carrier});$   
 $T \leftarrow \text{nfoldli } l (\lambda -. \text{True})$   
 $(\lambda e T. \text{do } \{$

```

    ASSERT (indep  $T \wedge e \in \text{carrier} \wedge T \subseteq \text{carrier}$ );
    if indep (insert  $e$   $T$ ) then
      RETURN (insert  $e$   $T$ )
    else
      RETURN  $T$ 
  }) empty-basis;
  RETURN  $T$ 
}

```

### 1.3 The heart of the argument

The algorithmic idea above is correct, as an independent set, which is inclusion maximal and has not skipped any smaller element, is a minimum weight basis.

**lemma** *greedy-approach-leads-to-minBasis*: **assumes** *indep*: *indep*  $F$   
**and** *inclmax*:  $\forall e \in \text{carrier} - F. \neg \text{indep} (\text{insert } e \text{ } F)$   
**and** *no-smallest-element-skipped*  $\{ \} F$   
**shows** *minBasis*  $F$   
*<proof>*

### 1.4 The Invariant

The following predicate is invariant during the execution of the minimum weight basis algorithm, and implies that its result is a minimum weight basis.

**definition** *I-minWeightBasis* **where**  
 $I\text{-minWeightBasis} == \lambda(T, E). \text{indep } T$   
 $\wedge T \subseteq \text{carrier}$   
 $\wedge E \subseteq \text{carrier}$   
 $\wedge (\forall x \in T. \forall y \in E. \text{weight } x \leq \text{weight } y)$   
 $\wedge (\forall e \in \text{carrier} - E - T. \sim \text{indep} (\text{insert } e \text{ } T))$   
 $\wedge \text{no-smallest-element-skipped } E \text{ } T$

**lemma** *I-minWeightBasisD*:  
**assumes**  
 $I\text{-minWeightBasis } (T, E)$   
**shows**  $\text{indep } T \wedge e. e \in \text{carrier} - E - T \implies \sim \text{indep} (\text{insert } e \text{ } T)$   
 $E \subseteq \text{carrier} \wedge x \ y. x \in T \implies y \in E \implies \text{weight } x \leq \text{weight } y \quad T \subseteq \text{carrier}$   
 $\text{no-smallest-element-skipped } E \text{ } T$   
*<proof>*

**lemma** *I-minWeightBasisI*:  
**assumes**  $\text{indep } T \wedge e. e \in \text{carrier} - E - T \implies \sim \text{indep} (\text{insert } e \text{ } T)$   
 $E \subseteq \text{carrier} \wedge x \ y. x \in T \implies y \in E \implies \text{weight } x \leq \text{weight } y \quad T \subseteq \text{carrier}$   
 $\text{no-smallest-element-skipped } E \text{ } T$   
**shows**  $I\text{-minWeightBasis } (T, E)$   
*<proof>*

**lemma** *I-minWeightBasisG*:  $I\text{-minWeightBasis } (T, E) \implies \text{no-smallest-element-skipped } E \ T$

*<proof>*

**lemma** *I-minWeightBasis-sorted*:  $I\text{-minWeightBasis } (T, E) \implies (\forall x \in T. \forall y \in E. \text{weight } x \leq \text{weight } y)$

*<proof>*

## 1.5 Invariant proofs

**lemma** *I-minWeightBasis-empty*:  $I\text{-minWeightBasis } (\{\}, \text{carrier})$

*<proof>*

**lemma** *I-minWeightBasis-final*:  $I\text{-minWeightBasis } (T, \{\}) \implies \text{minBasis } T$

*<proof>*

**lemma** *indep-aux*:

**assumes**  $e \in E \ \forall e \in \text{carrier} - E - F. \neg \text{indep } (\text{insert } e \ F)$

**and**  $x \in \text{carrier} - (E - \{e\}) - \text{insert } e \ F$

**shows**  $\neg \text{indep } (\text{insert } x \ (\text{insert } e \ F))$

*<proof>*

**lemma** *preservation-if*:  $\text{wsorted } x \implies \text{set } x = \text{carrier} \implies$   
 $x = l1 @ xa \ \# \ l2 \implies I\text{-minWeightBasis } (\sigma, \text{set } (xa \ \# \ l2)) \implies \text{indep } \sigma$   
 $\implies xa \in \text{carrier} \implies \text{indep } (\text{insert } xa \ \sigma) \implies I\text{-minWeightBasis } (\text{insert } xa \ \sigma, \text{set } l2)$

*<proof>*

**lemma** *preservation-else*:  $\text{set } x = \text{carrier} \implies$

$x = l1 @ xa \ \# \ l2 \implies I\text{-minWeightBasis } (\sigma, \text{set } (xa \ \# \ l2))$

$\implies \text{indep } \sigma \implies \neg \text{indep } (\text{insert } xa \ \sigma) \implies I\text{-minWeightBasis } (\sigma, \text{set } l2)$

*<proof>*

## 1.6 The refinement lemma

**theorem** *minWeightBasis-refine*:  $(\text{minWeightBasis}, \text{SPEC minBasis}) \in \langle \text{Id} \rangle \text{nres-rel}$

*<proof>*

**end** — locale minWeightBasis

**end**

## 2 Kruskal interface

**theory** *Kruskal*

**imports** *Kruskal-Misc MinWeightBasis*

**begin**

In order to instantiate Kruskal's algorithm for different graph formalizations we provide an interface consisting of the relevant concepts needed

for the algorithm, but hiding the concrete structure of the graph formalization. We thus enable using both undirected graphs and symmetric directed graphs.

Based on the interface, we show that the set of edges together with the predicate of being cycle free (i.e. a forest) forms the cycle matroid. Together with a weight function on the edges we obtain a *weighted-matroid* and thus an instance of the minimum weight basis algorithm, which is an abstract version of Kruskal.

```

locale Kruskal-interface =
  fixes E :: 'edge set
    and V :: 'a set
    and vertices :: 'edge  $\Rightarrow$  'a set
    and joins :: 'a  $\Rightarrow$  'a  $\Rightarrow$  'edge  $\Rightarrow$  bool
    and forest :: 'edge set  $\Rightarrow$  bool
    and connected :: 'edge set  $\Rightarrow$  ('a*'a) set
    and weight :: 'edge  $\Rightarrow$  'b::{'linorder, ordered-comm-monoid-add}
assumes
  finiteE[simp]: finite E
  and forest-subE: forest E'  $\Longrightarrow$  E'  $\subseteq$  E
  and forest-empty: forest {}
  and forest-mono: forest X  $\Longrightarrow$  Y  $\subseteq$  X  $\Longrightarrow$  forest Y
  and connected-same: (u,v)  $\in$  connected {}  $\longleftrightarrow$  u=v  $\wedge$  v  $\in$  V
  and findaugmenting-aux: E1  $\subseteq$  E  $\Longrightarrow$  E2  $\subseteq$  E  $\Longrightarrow$  (u,v)  $\in$  connected E1  $\Longrightarrow$ 
    (u,v)  $\notin$  connected E2
     $\Longrightarrow$   $\exists$  a b e. (a,b)  $\notin$  connected E2  $\wedge$  e  $\notin$  E2  $\wedge$  e  $\in$  E1  $\wedge$  joins a b e
  and augment-forest: forest F  $\Longrightarrow$  e  $\in$  E-F  $\Longrightarrow$  joins u v e
     $\Longrightarrow$  forest (insert e F)  $\longleftrightarrow$  (u,v)  $\notin$  connected F
  and equiv: F  $\subseteq$  E  $\Longrightarrow$  equiv V (connected F)
  and connected-in: F  $\subseteq$  E  $\Longrightarrow$  connected F  $\subseteq$  V  $\times$  V
  and insert-reachable: x  $\in$  V  $\Longrightarrow$  y  $\in$  V  $\Longrightarrow$  F  $\subseteq$  E  $\Longrightarrow$  e  $\in$  E  $\Longrightarrow$  joins x y e
     $\Longrightarrow$  connected (insert e F) = per-union (connected F) x y
  and exhaust:  $\bigwedge$  x. x  $\in$  E  $\Longrightarrow$   $\exists$  a b. joins a b x
  and vertices-constr:  $\bigwedge$  a b e. joins a b e  $\Longrightarrow$  {a,b}  $\subseteq$  vertices e
  and joins-sym:  $\bigwedge$  a b e. joins a b e = joins b a e
  and selfloop-no-forest:  $\bigwedge$  e. e  $\in$  E  $\Longrightarrow$  joins a a e  $\Longrightarrow$   $\sim$ forest (insert e F)
  and finite-vertices:  $\bigwedge$  e. e  $\in$  E  $\Longrightarrow$  finite (vertices e)

  and edgesinvertices:  $\bigcup$  (vertices ' E)  $\subseteq$  V
  and finiteV[simp]: finite V
  and joins-connected: joins a b e  $\Longrightarrow$  T  $\subseteq$  E  $\Longrightarrow$  e  $\in$  T  $\Longrightarrow$  (a,b)  $\in$  connected T

```

**begin**

## 2.1 Derived facts

**lemma** joins-in-V: joins a b e  $\Longrightarrow$  e  $\in$  E  $\Longrightarrow$  a  $\in$  V  $\wedge$  b  $\in$  V  
 <proof>

**lemma** *finiteE-finiteV*:  $\text{finite } E \implies \text{finite } V$   
 $\langle \text{proof} \rangle$

**lemma** *E-inV*:  $\bigwedge e. e \in E \implies \text{vertices } e \subseteq V$   
 $\langle \text{proof} \rangle$

**definition** *CC E' x* =  $(\text{connected } E')^{\text{“}\{x\}}$

**lemma** *sameCC-reachable*:  $E' \subseteq E \implies u \in V \implies v \in V \implies \text{CC } E' u = \text{CC } E' v$   
 $\longleftrightarrow (u, v) \in \text{connected } E'$   
 $\langle \text{proof} \rangle$

**definition** *CCs E'* =  $\text{quotient } V (\text{connected } E')$

**lemma** *quotient V Id* =  $\{\{v\} | v. v \in V\}$   $\langle \text{proof} \rangle$

**lemma** *CCs-empty*:  $\text{CCs } \{\} = \{\{v\} | v. v \in V\}$   
 $\langle \text{proof} \rangle$

**lemma** *CCs-empty-card*:  $\text{card } (\text{CCs } \{\}) = \text{card } V$   
 $\langle \text{proof} \rangle$

**lemma** *CCs-imageCC*:  $\text{CCs } F = (\text{CC } F) \text{ ‘ } V$   
 $\langle \text{proof} \rangle$

**lemma** *union-eclass-decreases-components*:  
**assumes**  $\text{CC } F x \neq \text{CC } F y \text{ } e \notin F \text{ } x \in V \text{ } y \in V \text{ } F \subseteq E \text{ } e \in E \text{ joins } x \text{ } y \text{ } e$   
**shows**  $\text{Suc } (\text{card } (\text{CCs } (\text{insert } e \text{ } F))) = \text{card } (\text{CCs } F)$   
 $\langle \text{proof} \rangle$

**lemma** *forest-CCs*: **assumes** *forest E'* **shows**  $\text{card } (\text{CCs } E') + \text{card } E' = \text{card } V$   
 $\langle \text{proof} \rangle$

**lemma** *pigeonhole-CCs*:  
**assumes** *finiteV*:  $\text{finite } V$  **and** *cardlt*:  $\text{card } (\text{CCs } E1) < \text{card } (\text{CCs } E2)$   
**shows**  $(\exists u \text{ } v. u \in V \wedge v \in V \wedge \text{CC } E1 u = \text{CC } E1 v \wedge \text{CC } E2 u \neq \text{CC } E2 v)$   
 $\langle \text{proof} \rangle$

## 2.2 The edge set and forest form the cycle matroid

**theorem** **assumes** *f1*: *forest E1*  
**and** *f2*: *forest E2*  
**and** *c*:  $\text{card } E1 > \text{card } E2$   
**shows** *augment*:  $\exists e \in E1 - E2. \text{forest } (\text{insert } e \text{ } E2)$   
 $\langle \text{proof} \rangle$

**sublocale** *weighted-matroid E forest weight*  
 $\langle \text{proof} \rangle$



**end** — locale *Kruskal-interface*

**end**

### 3 Refine Kruskal

**theory** *Kruskal-Refine*  
**imports** *Kruskal SeprefUF*  
**begin**

#### 3.1 Refinement I: cycle check by connectedness

As a first refinement step, the check for introduction of a cycle when adding an edge  $e$  can be replaced by checking whether the edge's endpoints are already connected. By this we can shift from an edge-centric perspective to a vertex-centric perspective.

**context** *Kruskal-interface*  
**begin**

**abbreviation** *empty-forest*  $\equiv \{\}$

**abbreviation** *a-endpoints*  $e \equiv SPEC (\lambda(a,b). \text{joins } a \ b \ e)$

**definition** *kruskal0*

**where** *kruskal0*  $\equiv$  **do** {  
   $l \leftarrow \text{obtain-sorted-carrier}$ ;  
   $\text{spanning-forest} \leftarrow \text{nfoldli } l (\lambda-. \text{True})$   
   $(\lambda e \ T. \text{do } \{$   
     $ASSERT (e \in E);$   
     $(a,b) \leftarrow \text{a-endpoints } e;$   
     $ASSERT (\text{joins } a \ b \ e \wedge \text{forest } T \wedge e \in E \wedge T \subseteq E);$   
    **if**  $\neg (a,b) \in \text{connected } T$  **then**  
      **do** {  
         $ASSERT (e \notin T);$   
         $RETURN (\text{insert } e \ T)$   
      }  
    **else**  
       $RETURN T$   
  }  
   $\text{empty-forest};$   
   $RETURN \text{spanning-forest}$   
}

**lemma** *if-subst*: **(if** *indep*  $(\text{insert } e \ T)$  **then**  
   $RETURN (\text{insert } e \ T)$   
**else**  
   $RETURN T$   
**)**

$$= (\text{if } e \notin T \wedge \text{indep } (\text{insert } e \ T) \text{ then}$$

$$\quad \text{RETURN } (\text{insert } e \ T)$$

$$\quad \text{else}$$

$$\quad \text{RETURN } T)$$

$$\langle \text{proof} \rangle$$

**lemma** *kruskal0-refine*:  $(\text{kruskal0}, \text{minWeightBasis}) \in \langle \text{Id} \rangle \text{nres-rel}$   
 $\langle \text{proof} \rangle$

### 3.2 Refinement II: connectedness by PER operation

Connectedness in the subgraph spanned by a set of edges is a partial equivalence relation and can be represented in a disjoint sets. This data structure is maintained while executing Kruskal's algorithm and can be used to efficiently check for connectedness (*per-compare*).

**definition** *corresponding-union-find* :: 'a per  $\Rightarrow$  'edge set  $\Rightarrow$  bool **where**  
*corresponding-union-find* uf T  $\equiv (\forall a \in V. \forall b \in V. \text{per-compare } uf \ a \ b \longleftrightarrow ((a,b) \in \text{connected } T))$

**definition** *uf-graph-invar* uf-T  
 $\equiv \text{case } uf-T \text{ of } (uf, T) \Rightarrow \text{corresponding-union-find } uf \ T \wedge \text{Domain } uf = V$

**lemma** *uf-graph-invarD*:  $uf\text{-graph-invar } (uf, T) \Longrightarrow \text{corresponding-union-find } uf \ T$   
 $\langle \text{proof} \rangle$

**definition** *uf-graph-rel*  $\equiv \text{br snd } uf\text{-graph-invar}$

**lemma** *uf-graph-relsndD*:  $((a,b),c) \in uf\text{-graph-rel} \Longrightarrow b=c$   
 $\langle \text{proof} \rangle$

**lemma** *uf-graph-relD*:  $((a,b),c) \in uf\text{-graph-rel} \Longrightarrow b=c \wedge uf\text{-graph-invar } (a,b)$   
 $\langle \text{proof} \rangle$

**definition** *kruskal1*

**where** *kruskal1*  $\equiv \text{do } \{$   
 $l \leftarrow \text{obtain-sorted-carrier};$   
 $\text{let } \text{initial-union-find} = \text{per-init } V;$   
 $(\text{per}, \text{spanning-forest}) \leftarrow \text{nfoldli } l \ (\lambda\_. \text{True})$   
 $(\lambda e \ (uf, T). \text{do } \{$   
 $\quad \text{ASSERT } (e \in E);$   
 $\quad (a,b) \leftarrow \text{a-endpoints } e;$   
 $\quad \text{ASSERT } (a \in V \wedge b \in V \wedge a \in \text{Domain } uf \wedge b \in \text{Domain } uf \wedge T \subseteq E);$   
 $\quad \text{if } \neg \text{per-compare } uf \ a \ b \text{ then}$   
 $\quad \text{do } \{$   
 $\quad \quad \text{let } uf = \text{per-union } uf \ a \ b;$   
 $\quad \quad \text{ASSERT } (e \notin T);$   
 $\quad \quad \text{RETURN } (uf, \text{insert } e \ T)$   
 $\quad \}$   
 $\}$

```

      else
        RETURN (uf, T)
      }) (initial-union-find, empty-forest);
    RETURN spanning-forest
  }

```

**lemma** *corresponding-union-find-empty*:  
**shows** *corresponding-union-find* (per-init V) empty-forest  
 ⟨proof⟩

**lemma** *empty-forest-refine*: ((per-init V, empty-forest), empty-forest) ∈ *uf-graph-rel*  
 ⟨proof⟩

**lemma** *uf-graph-invar-preserve*:  
**assumes** *uf-graph-invar* (uf, T)  $a \in V$   $b \in V$   
           *joins* a b e  $e \in E$   $T \subseteq E$   
**shows** *uf-graph-invar* (per-union uf a b, insert e T)  
 ⟨proof⟩

**theorem** *kruskal1-refine*: (kruskal1, kruskal0) ∈ *Id* *nres-rel*  
 ⟨proof⟩

end

end

## 4 Kruskal Implementation

**theory** *Kruskal-Impl*  
**imports** *Kruskal-Refine Refine-Imperative-HOL.IICF*  
**begin**

### 4.1 Refinement III: concrete edges

Given a concrete representation of edges and their endpoints as a pair, we refine Kruskal’s algorithm to work on these concrete edges.

**locale** *Kruskal-concrete* = *Kruskal-interface*  $E$   $V$  *vertices joins forest connected weight*  
**for**  $E$   $V$  *vertices joins forest connected* **and** *weight* ::  $'edge \Rightarrow int +$   
**fixes**  
        $\alpha :: 'cedge \Rightarrow 'edge$   
       **and** *endpoints* ::  $'cedge \Rightarrow ('a * 'a) nres$   
**assumes**  
       *endpoints-refine*:  $\alpha \ xi = x \implies endpoints \ xi \leq \Downarrow Id \ (a-endpoints \ x)$   
**begin**

**definition** *wsorted'* **where** *wsorted'* == *sorted-wrt* ( $\lambda x y. \text{weight } (\alpha x) \leq \text{weight } (\alpha y)$ )

**lemma** *wsorted-map $\alpha$ [simp]*: *wsorted' s*  $\implies$  *wsorted* (*map*  $\alpha$  *s*)  
 <proof>

**definition** *obtain-sorted-carrier'* == *SPEC* ( $\lambda L. \text{wsorted}' L \wedge \alpha \text{ 'set } L = E$ )

**abbreviation** *concrete-edge-rel* :: ('cedge  $\times$  'edge) set **where**  
*concrete-edge-rel*  $\equiv$  *br*  $\alpha$  ( $\lambda \cdot. \text{True}$ )

**lemma** *obtain-sorted-carrier'-refine*:  
 (*obtain-sorted-carrier'*, *obtain-sorted-carrier*)  $\in$   $\langle \langle \text{concrete-edge-rel} \rangle \text{list-rel} \rangle \text{nres-rel}$   
 <proof>

**definition** *kruskal2*  
**where** *kruskal2*  $\equiv$  *do* {  
   *l*  $\leftarrow$  *obtain-sorted-carrier'*;  
   *let* *initial-union-find* = *per-init* *V*;  
   (*per*, *spanning-forest*)  $\leftarrow$  *nfoldli* *l* ( $\lambda \cdot. \text{True}$ )  
   ( $\lambda ce$  (*uf*, *T*). *do* {  
     *ASSERT* ( $\alpha ce \in E$ );  
     (*a*, *b*)  $\leftarrow$  *endpoints* *ce*;  
     *ASSERT* ( $a \in V \wedge b \in V \wedge a \in \text{Domain } uf \wedge b \in \text{Domain } uf$ );  
     *if*  $\neg \text{per-compare } uf \ a \ b$  *then*  
       *do* {  
         *let* *uf* = *per-union* *uf* *a* *b*;  
         *ASSERT* ( $ce \notin \text{set } T$ );  
         *RETURN* (*uf*, *T*@[*ce*])  
       }  
     }  
   *else*  
     *RETURN* (*uf*, *T*)  
 } (*initial-union-find*, []);  
*RETURN* *spanning-forest*  
}

**lemma** *lst-graph-rel-empty[simp]*: ( $\square$ , { $\}$ )  $\in$   $\langle \text{concrete-edge-rel} \rangle \text{list-set-rel}$   
 <proof>

**lemma** *loop-initial-rel*:  
 ((*per-init* *V*, []), *per-init* *V*, { $\}$ )  $\in$  *Id*  $\times_r$   $\langle \text{concrete-edge-rel} \rangle \text{list-set-rel}$   
 <proof>

**lemma** *concrete-edge-rel-list-set-rel*:  
 (*a*, *b*)  $\in$   $\langle \text{concrete-edge-rel} \rangle \text{list-set-rel} \implies \alpha \text{ 'set } a = b$   
 <proof>

**theorem** *kruskal2-refine*: (*kruskal2*, *kruskal1*)  $\in$   $\langle \langle \text{concrete-edge-rel} \rangle \text{list-set-rel} \rangle \text{nres-rel}$   
 <proof>

end

## 4.2 Refinement to Imperative/HOL with Sepref-Tool

Given implementations for the operations of getting a list of concrete edges and getting the endpoints of a concrete edge we synthesize Kruskal in Imperative/HOL.

```

locale Kruskal-Impl = Kruskal-concrete E V vertices joins forest connected weight
 $\alpha$  endpoints
  for E V vertices joins forest connected and weight :: 'edge  $\Rightarrow$  int
    and  $\alpha$  and endpoints :: nat  $\times$  int  $\times$  nat  $\Rightarrow$  (nat  $\times$  nat) nres
    +
  fixes getEdges :: (nat  $\times$  int  $\times$  nat) list nres
    and getEdges-impl :: (nat  $\times$  int  $\times$  nat) list Heap
    and superE :: (nat  $\times$  int  $\times$  nat) set
    and endpoints-impl :: (nat  $\times$  int  $\times$  nat)  $\Rightarrow$  (nat  $\times$  nat) Heap
  assumes
    getEdges-refine: getEdges  $\leq$  SPEC ( $\lambda L. \alpha$  ' set  $L = E$ 
       $\wedge (\forall (a, wv, b) \in \text{set } L. \text{weight } (\alpha (a, wv, b)) = wv) \wedge \text{set } L \subseteq$ 
superE)
    and
    getEdges-impl: (uncurry0 getEdges-impl, uncurry0 getEdges)
       $\in \text{unit-assn}^k \rightarrow_a \text{list-assn } (\text{nat-assn} \times_a \text{int-assn} \times_a \text{nat-assn})$ 
    and
    max-node-is-Max-V:  $E = \alpha$  ' set  $la \implies \text{max-node } la = \text{Max } (\text{insert } 0 V)$ 
    and
    endpoints-impl: ( endpoints-impl, endpoints )
       $\in (\text{nat-assn} \times_a \text{int-assn} \times_a \text{nat-assn})^k \rightarrow_a (\text{nat-assn} \times_a \text{nat-assn})$ 
  begin

  lemma this-loc: Kruskal-Impl E V vertices joins forest connected weight
     $\alpha$  endpoints getEdges getEdges-impl superE endpoints-impl <proof>

```

### 4.2.1 Refinement IV: given an edge set

We now assume to have an implementation of the operation to obtain a list of the edges of a graph. By sorting this list we refine *obtain-sorted-carrier'*.

```

definition obtain-sorted-carrier'' = do {
   $l \leftarrow \text{SPEC } (\lambda L. \alpha$  ' set  $L = E$ 
     $\wedge (\forall (a, wv, b) \in \text{set } L. \text{weight } (\alpha (a, wv, b)) = wv) \wedge \text{set } L$ 
 $\subseteq \text{superE})$ ;
  SPEC ( $\lambda L. \text{sorted-wrt edges-less-eq } L \wedge \text{set } L = \text{set } l$ )
}

```

```

lemma wsorted'-sorted-wrt-edges-less-eq:
  assumes  $\forall (a, wv, b) \in \text{set } s. \text{weight } (\alpha (a, wv, b)) = wv$ 
    sorted-wrt edges-less-eq s

```

**shows** *wsorted'* *s*  
 ⟨*proof*⟩

**lemma** *obtain-sorted-carrier''-refine*:  
 (*obtain-sorted-carrier''*, *obtain-sorted-carrier'*) ∈ ⟨*Id*⟩*nres-rel*  
 ⟨*proof*⟩

**definition** *obtain-sorted-carrier'''* =  
 do {  
   *l* ← *getEdges*;  
   RETURN (*quicksort-by-rel edges-less-eq* [] *l*, *max-node l*)  
 }

**definition** *add-size-rel* = *br fst* ( $\lambda(l,n). n = \text{Max } (\text{insert } 0 \ V)$ )

**lemma** *obtain-sorted-carrier'''-refine*:  
 (*obtain-sorted-carrier'''*, *obtain-sorted-carrier''*) ∈ ⟨*add-size-rel*⟩*nres-rel*  
 ⟨*proof*⟩

**lemmas** *osc-refine* = *obtain-sorted-carrier'''-refine*[*FCOMP obtain-sorted-carrier''-refine*,  
*to-foparam, simplified*]

**definition** *kruskal3* :: (*nat* × *int* × *nat*) *list nres*  
**where** *kruskal3* ≡ do {  
   (*sl*, *mn*) ← *obtain-sorted-carrier'''*;  
   let *initial-union-find* = *per-init'* (*mn* + 1);  
   (*per*, *spanning-forest*) ← *nfoldli sl* ( $\lambda\cdot. \text{True}$ )  
   ( $\lambda ce \ (uf, T). \text{do}$  {  
     ASSERT ( $\alpha \ ce \in E$ );  
     (*a*, *b*) ← *endpoints ce*;  
     ASSERT ( $a \in \text{Domain } uf \wedge b \in \text{Domain } uf$ );  
     if  $\neg \text{per-compare } uf \ a \ b$  then  
       do {  
         let *uf* = *per-union uf a b*;  
         ASSERT ( $ce \notin \text{set } T$ );  
         RETURN (*uf*, *T*@[*ce*])  
       }  
     }  
   else  
     RETURN (*uf*, *T*)  
 }) (*initial-union-find*, []);  
 RETURN *spanning-forest*  
}

**lemma** *endpoints-spec*: *endpoints ce* ≤ *SPEC* ( $\lambda\cdot. \text{True}$ )  
 ⟨*proof*⟩

**lemma** *kruskal3-subset*:  
**shows** *kruskal3* ≤<sub>*n*</sub> *SPEC* ( $\lambda T. \text{distinct } T \wedge \text{set } T \subseteq \text{superE}$ )  
 ⟨*proof*⟩

**definition** *per-supset-rel* :: ('a per × 'a per) set **where**  
*per-supset-rel*  
 $\equiv \{(p1, p2). p1 \cap \text{Domain } p2 \times \text{Domain } p2 = p2 \wedge p1 - (\text{Domain } p2 \times \text{Domain } p2) \subseteq \text{Id}\}$

**lemma** *per-supset-rel-dom*:  $(p1, p2) \in \text{per-supset-rel} \implies \text{Domain } p1 \supseteq \text{Domain } p2$   
 $\langle \text{proof} \rangle$

**lemma** *per-supset-compare*:  
 $(p1, p2) \in \text{per-supset-rel} \implies x1 \in \text{Domain } p2 \implies x2 \in \text{Domain } p2$   
 $\implies \text{per-compare } p1 \ x1 \ x2 \longleftrightarrow \text{per-compare } p2 \ x1 \ x2$   
 $\langle \text{proof} \rangle$

**lemma** *per-supset-union*:  $(p1, p2) \in \text{per-supset-rel} \implies x1 \in \text{Domain } p2 \implies x2 \in \text{Domain } p2 \implies$   
 $(\text{per-union } p1 \ x1 \ x2, \text{per-union } p2 \ x1 \ x2) \in \text{per-supset-rel}$   
 $\langle \text{proof} \rangle$

**lemma** *per-initN-refine*:  $(\text{per-init}' (\text{Max } (\text{insert } 0 \ V) + 1), \text{per-init } V) \in \text{per-supset-rel}$   
 $\langle \text{proof} \rangle$

**theorem** *kruskal3-refine*:  $(\text{kruskal3}, \text{kruskal2}) \in \langle \text{Id} \rangle \text{nres-rel}$   
 $\langle \text{proof} \rangle$

#### 4.2.2 Synthesis of Kruskal by SepRef

**lemma** [*sepref-import-param*]:  $(\text{sort-edges}, \text{sort-edges}) \in \langle \text{Id} \times_r \text{Id} \times_r \text{Id} \rangle \text{list-rel} \rightarrow \langle \text{Id} \times_r \text{Id} \times_r \text{Id} \rangle \text{list-rel}$   
 $\langle \text{proof} \rangle$

**lemma** [*sepref-import-param*]:  $(\text{max-node}, \text{max-node}) \in \langle \text{Id} \times_r \text{Id} \times_r \text{Id} \rangle \text{list-rel} \rightarrow \text{nat-rel}$   
 $\langle \text{proof} \rangle$

**sepref-register** *getEdges* ::  $(\text{nat} \times \text{int} \times \text{nat}) \text{ list nres}$   
**sepref-register** *endpoints* ::  $(\text{nat} \times \text{int} \times \text{nat}) \Rightarrow (\text{nat} * \text{nat}) \text{ nres}$

**declare** *getEdges-impl* [*sepref-fr-rules*]  
**declare** *endpoints-impl* [*sepref-fr-rules*]

**schematic-goal** *kruskal-impl*:  
 $(\text{uncurry0 } ?c, \text{uncurry0 } \text{kruskal3}) \in (\text{unit-assn})^k \rightarrow_a \text{list-assn } (\text{nat-assn} \times_a \text{int-assn} \times_a \text{nat-assn})$   
 $\langle \text{proof} \rangle$

**concrete-definition** (in  $-$ ) *kruskal* **uses** *Kruskal-Impl.kruskal-impl*  
**prepare-code-thms** (in  $-$ ) *kruskal-def*  
**lemmas** *kruskal-refine* = *kruskal.refine*[*OF this-loc*]

```

abbreviation MSF == minBasis
abbreviation SpanningForest == basis
lemmas SpanningForest-def = basis-def
lemmas MSF-def = minBasis-def

lemmas kruskal3-ref-spec- = kruskal3-refine[FCOMP kruskal2-refine, FCOMP
kruskal1-refine,
  FCOMP kruskal0-refine,
  FCOMP minWeightBasis-refine]

lemma kruskal3-ref-spec':
  (uncurry0 kruskal3, uncurry0 (SPEC ( $\lambda r. MSF (\alpha \text{ ' set } r)$ ))))  $\in$  unit-rel  $\rightarrow_f$ 
   $\langle Id \rangle_{nres-rel}$ 
   $\langle proof \rangle$ 

lemma kruskal3-ref-spec:
  (uncurry0 kruskal3,
    uncurry0 (SPEC ( $\lambda r. distinct\ r \wedge set\ r \subseteq superE \wedge MSF (\alpha \text{ ' set } r)$ ))))
     $\in$  unit-rel  $\rightarrow_f$   $\langle Id \rangle_{nres-rel}$ 
   $\langle proof \rangle$ 

lemma [fcomp-norm-simps]: list-assn (nat-assn  $\times_a$  int-assn  $\times_a$  nat-assn) =
id-assn
   $\langle proof \rangle$ 

lemmas kruskal-ref-spec = kruskal-refine[FCOMP kruskal3-ref-spec]

  The final correctness lemma for Kruskal's algorithm.

lemma kruskal-correct-forest:
  shows  $\langle emp \rangle$  kruskal getEdges-impl endpoints-impl ()
     $\langle \lambda r. \uparrow (distinct\ r \wedge set\ r \subseteq superE \wedge MSF (set\ (map\ \alpha\ r))) \rangle_t$ 
   $\langle proof \rangle$ 

end — locale Kruskal-Impl

end

```

## 5 UGraph - undirected graph with Uprod edges

```

theory UGraph
imports
  Automatic-Refinement.Misc
  Collections.Partial-Equivalence-Relation
  HOL-Library.Uprod
begin

```



## 5.1 Edge path

**fun** *epath* :: 'a uprod set  $\Rightarrow$  'a  $\Rightarrow$  ('a uprod) list  $\Rightarrow$  'a  $\Rightarrow$  bool **where**  
   *epath* *E* *u* [] *v* = (*u* = *v*)  
 | *epath* *E* *u* (*x*#*xs*) *v*  $\longleftrightarrow$  ( $\exists w. u \neq w \wedge \text{Upair } u \ w = x \wedge \text{epath } E \ w \ xs \ v$ )  $\wedge x \in E$

**lemma** [*simp,intro!*]: *epath* *E* *u* [] *u* *<proof>*

**lemma** *epath-subset-E*: *epath* *E* *u* *p* *v*  $\implies$  set *p*  $\subseteq$  *E*  
*<proof>*

**lemma** *path-append-conv*[*simp*]: *epath* *E* *u* (*p*@*q*) *v*  $\longleftrightarrow$  ( $\exists w. \text{epath } E \ u \ p \ w \wedge \text{epath } E \ w \ q \ v$ )  
*<proof>*

**lemma** *epath-rev*[*simp*]: *epath* *E* *y* (*rev* *p*) *x* = *epath* *E* *x* *p* *y*  
*<proof>*

**lemma** *epath* *E* *x* *p* *y*  $\implies \exists p. \text{epath } E \ y \ p \ x$   
*<proof>*

**lemma** *epath-mono*: *E*  $\subseteq$  *E'*  $\implies \text{epath } E \ u \ p \ v \implies \text{epath } E' \ u \ p \ v$   
*<proof>*

**lemma** *epath-restrict*: set *p*  $\subseteq$  *I*  $\implies \text{epath } E \ u \ p \ v \implies \text{epath } (E \cap I) \ u \ p \ v$   
*<proof>*

**lemma** **assumes** *A*  $\subseteq$  *A'*  $\sim \text{epath } A \ u \ p \ v \ \text{epath } A' \ u \ p \ v$   
**shows** *epath-diff-edge*: ( $\exists e. e \in \text{set } p - A$ )  
*<proof>*

**lemma** *epath-restrict'*: *epath* (*insert* *e* *E*) *u* *p* *v*  $\implies e \notin \text{set } p \implies \text{epath } E \ u \ p \ v$   
*<proof>*

**lemma** *epath-not-direct*:  
**assumes** *ep*: *epath* *E* *u* *p* *v* **and** *unv*: *u*  $\neq$  *v*  
**and** *edge-notin*: *Upair* *u* *v*  $\notin$  *E*  
**shows** length *p*  $\geq$  2  
*<proof>*

**lemma** *epath-decompose*:  
**assumes** *e*: *epath* *G* *v* *p* *v'*  
**and** *elem*: *Upair* *a* *b*  $\in$  set *p*  
**shows**  $\exists u \ u' \ p' \ p''. u \in \{a, b\} \wedge u' \in \{a, b\} \wedge \text{epath } G \ v \ p' \ u \wedge \text{epath } G \ u' \ p'' \ v' \wedge$   
   length *p'* < length *p*  $\wedge$  length *p''* < length *p*  
*<proof>*

**lemma** *epath-decompose'*:  
**assumes**  $e: \text{epath } G \ v \ v'$   
**and**  $\text{elem} : \text{Upair } a \ b \in \text{set } p$   
**shows**  $\exists \ u \ u' \ p' \ p'' . \text{Upair } a \ b = \text{Upair } u \ u' \wedge \text{epath } G \ v \ p' \ u \wedge \text{epath } G \ u' \ p'' \ v' \wedge$   
 $\text{length } p' < \text{length } p \wedge \text{length } p'' < \text{length } p$   
 $\langle \text{proof} \rangle$

**lemma** *epath-split-distinct*:  
**assumes**  $\text{epath } G \ v \ p \ v'$   
**assumes**  $\text{Upair } a \ b \in \text{set } p$   
**shows**  $(\exists \ p' \ p'' \ u \ u' .$   
 $\text{epath } G \ v \ p' \ u \wedge \text{epath } G \ u' \ p'' \ v' \wedge$   
 $\text{length } p' < \text{length } p \wedge \text{length } p'' < \text{length } p \wedge$   
 $(u \in \{a, b\} \wedge u' \in \{a, b\}) \wedge$   
 $\text{Upair } a \ b \notin \text{set } p' \wedge \text{Upair } a \ b \notin \text{set } p'')$   
 $\langle \text{proof} \rangle$

## 5.2 Distinct edge path

**definition**  $\text{depath } E \ u \ dp \ v \equiv \text{epath } E \ u \ dp \ v \wedge \text{distinct } dp$

**lemma** *epath-to-depath*:  $\text{set } p \subseteq I \implies \text{epath } E \ u \ p \ v \implies \exists \ dp. \text{depath } E \ u \ dp \ v \wedge \text{set } dp \subseteq I$   
 $\langle \text{proof} \rangle$

**lemma** *epath-to-depath'*:  $\text{epath } E \ u \ p \ v \implies \exists \ dp. \text{depath } E \ u \ dp \ v$   
 $\langle \text{proof} \rangle$

**definition**  $\text{decycle } E \ u \ p == \text{epath } E \ u \ p \ u \wedge \text{length } p > 2 \wedge \text{distinct } p$

## 5.3 Connectivity in undirected Graphs

**definition**  $\text{unconnected } E \equiv \{(u, v). \exists \ p. \text{epath } E \ u \ p \ v\}$

**lemma** *unconnectedempty*:  $\text{unconnected } \{\} = \{(a, a) | a. \text{True}\}$   
 $\langle \text{proof} \rangle$

**lemma** *unconnected-refl*:  $\text{refl } (\text{unconnected } E)$   
 $\langle \text{proof} \rangle$

**lemma** *unconnected-sym*:  $\text{sym } (\text{unconnected } E)$   
 $\langle \text{proof} \rangle$

**lemma** *unconnected-trans*:  $\text{trans } (\text{unconnected } E)$   
 $\langle \text{proof} \rangle$

**lemma** *unconnected-symI*:  $(u, v) \in \text{unconnected } E \implies (v, u) \in \text{unconnected } E$   
 $\langle \text{proof} \rangle$

**lemma** *equiv UNIV* (*unconnected E*)

*<proof>*

**lemma** *unconnected-refl*: (*unconnected E*)<sup>\*</sup> = (*unconnected E*)<sup>=</sup>

*<proof>*

**lemma** *unconnected-transcl*: (*unconnected E*)<sup>\*</sup> = *unconnected E*

*<proof>*

**lemma** *unconnected-mono*:  $A \subseteq A' \implies \text{unconnected } A \subseteq \text{unconnected } A'$

*<proof>*

**lemma** *findaugmenting-edge*: **assumes** *epath E1 u p v*

**and**  $\neg(\exists p. \text{epath } E2 \ u \ p \ v)$

**shows**  $\exists a \ b. (a,b) \notin \text{unconnected } E2 \wedge \text{Upair } a \ b \notin E2 \wedge \text{Upair } a \ b \in E1$

*<proof>*

## 5.4 Forest

**definition** *forest E*  $\equiv \sim(\exists u \ p. \text{decycle } E \ u \ p)$

**lemma** *forest-mono*:  $Y \subseteq X \implies \text{forest } X \implies \text{forest } Y$

*<proof>*

**lemma** *forrest2-E*: **assumes**  $(u,v) \in \text{unconnected } E$

**and**  $\text{Upair } u \ v \notin E$

**and**  $u \neq v$

**shows**  $\sim \text{forest } (\text{insert } (\text{Upair } u \ v) \ E)$

*<proof>*

**lemma** *insert-stays-forest-means-not-connected*: **assumes**  $\text{forest } (\text{insert } (\text{Upair } u \ v) \ E)$

**and**  $(\text{Upair } u \ v) \notin E$

**and**  $u \neq v$

**shows**  $\sim (u,v) \in \text{unconnected } E$

*<proof>*

**lemma** *epath-singleton*:  $\text{epath } F \ a \ [e] \ b \implies e = \text{Upair } a \ b$

*<proof>*

**lemma** *forest-alt1*:

**assumes**  $\text{Upair } a \ b \in F \ \text{forest } F \ \bigwedge e. e \in F \implies \text{proper-uprod } e$

**shows**  $(a,b) \notin \text{unconnected } (F - \{\text{Upair } a \ b\})$

*<proof>*

**lemma** *forest-alt2*:

assumes  $\bigwedge e. e \in F \implies \text{proper-uprod } e$   
 and  $\bigwedge a\ b. \text{Upair } a\ b \in F \implies (a,b) \notin \text{unconnected } (F - \{\text{Upair } a\ b\})$   
 shows *forest*  $F$   
 $\langle \text{proof} \rangle$

**lemma** *forest-alt*:

assumes  $\bigwedge e. e \in F \implies \text{proper-uprod } e$   
 shows *forest*  $F \iff (\forall a\ b. \text{Upair } a\ b \in F \longrightarrow (a,b) \notin \text{unconnected } (F - \{\text{Upair } a\ b\}))$   
 $\langle \text{proof} \rangle$

**lemma** *augment-forest-overedges*:

assumes  $F \subseteq E$  *forest*  $F$   $(\text{Upair } u\ v) \in E$   $(u,v) \notin \text{unconnected } F$   
 and *notsame*:  $u \neq v$   
 shows *forest*  $(\text{insert } (\text{Upair } u\ v) F)$   
 $\langle \text{proof} \rangle$

## 5.5 uGraph locale

**locale** *uGraph* =

fixes  $E :: 'a \text{ uprod set}$   
 and  $w :: 'a \text{ uprod} \Rightarrow 'c :: \{\text{linorder}, \text{ordered-comm-monoid-add}\}$   
 assumes *ecard2*:  $\bigwedge e. e \in E \implies \text{proper-uprod } e$   
 and *finiteE[simp]*: *finite*  $E$   
**begin**

**abbreviation** *unconnected-on*  $E' V \equiv \text{unconnected } E' \cap (V \times V)$

**abbreviation** *verts*  $\equiv \bigcup (\text{set-uprod } 'E)$

**lemma** *set-uprod-nonempty*  $Y[\text{simp}]$ : *set-uprod*  $x \neq \{\}$   $\langle \text{proof} \rangle$

**abbreviation** *unconnectedV*  $E' \equiv \text{Restr } (\text{unconnected } E') \text{ verts}$

**lemma** *equiv-unconnected-on*: *equiv*  $V$   $(\text{unconnected-on } E' V)$   
 $\langle \text{proof} \rangle$

**lemma** *unconnectedV-refl*:  $E' \subseteq E \implies \text{refl-on } \text{verts } (\text{unconnectedV } E')$   
 $\langle \text{proof} \rangle$

**lemma** *unconnectedV-trans*: *trans*  $(\text{unconnectedV } E')$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-sym*:  $\text{sym } (\text{uconnectedV } E')$   
 $\langle \text{proof} \rangle$

**lemma** *equiv-vert-uconnected*:  $\text{equiv } \text{verts } (\text{uconnectedV } E')$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-tracl*:  $(\text{uconnectedV } F)^* = (\text{uconnectedV } F)^=$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-cl*:  $(\text{uconnectedV } F)^+ = (\text{uconnectedV } F)$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-Restrcl*:  $\text{Restr } ((\text{uconnectedV } F)^*) \text{ } \text{verts} = (\text{uconnectedV } F)$   
 $\langle \text{proof} \rangle$

**lemma** *restr-ucon*:  $F \subseteq E \implies \text{uconnected } F = \text{uconnectedV } F \cup \text{Id}$   
 $\langle \text{proof} \rangle$

**lemma** *relI*:  
**assumes**  $\bigwedge a \ b. (a, b) \in F \implies (a, b) \in G$   
**and**  $\bigwedge a \ b. (a, b) \in G \implies (a, b) \in F$  **shows**  $F = G$   
 $\langle \text{proof} \rangle$

**lemma** *in-per-union*:  $u \in \{x, y\} \implies u' \in \{x, y\} \implies x \in V \implies y \in V \implies$   
 $\text{refl-on } V \ R \implies \text{part-equiv } R \implies (u, u') \in \text{per-union } R \ x \ y$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-mono*:  $(a, b) \in \text{uconnectedV } F \implies F \subseteq F' \implies (a, b) \in \text{uconnectedV } F'$   
 $\langle \text{proof} \rangle$

**lemma** *per-union-sub*:  $x \in S \implies y \in S \implies R \subseteq S \times S \implies \text{per-union } R \ x \ y \subseteq S \times S$   
 $\langle \text{proof} \rangle$

**lemma** *insert-uconnectedV-per*:  
**assumes**  $x \neq y$  **and**  $\text{inV}: x \in \text{verts } y \in \text{verts}$  **and**  $\text{subE}: F \subseteq E$   
**shows**  $\text{uconnectedV } (\text{insert } (\text{Upair } x \ y) \ F) = \text{per-union } (\text{uconnectedV } F) \ x \ y$   
 $(\text{is } \text{uconnectedV } ?F' = \text{per-union } ?uf \ x \ y)$   
 $\langle \text{proof} \rangle$

**lemma** *epath-filter-selfloop*:  $\text{epath } (\text{insert } (\text{Upair } x \ x) \ F) \ a \ p \ b \implies \exists p. \text{epath } F \ a \ p \ b$   
 $\langle \text{proof} \rangle$

**lemma** *uconnectedV-insert-selfloop*:  $x \in \text{verts} \implies \text{uconnectedV } (\text{insert } (\text{Upair } x \ x) \ F) = \text{uconnectedV } F$   
 ⟨proof⟩

**lemma** *equiv-selfloop-per-union-id*:  $\text{equiv } S \ F \implies x \in S \implies \text{per-union } F \ x \ x = F$   
 ⟨proof⟩

**lemma** *insert-uconnectedV-per-eq*:  
 assumes  $\text{in } V: x \in \text{verts}$  and  $\text{sub } E: F \subseteq E$   
 shows  $\text{uconnectedV } (\text{insert } (\text{Upair } x \ x) \ F) = \text{per-union } (\text{uconnectedV } F) \ x \ x$   
 ⟨proof⟩

**lemma** *insert-uconnectedV-per'*:  
 assumes  $\text{in } V: x \in \text{verts}$   $y \in \text{verts}$  and  $\text{sub } E: F \subseteq E$   
 shows  $\text{uconnectedV } (\text{insert } (\text{Upair } x \ y) \ F) = \text{per-union } (\text{uconnectedV } F) \ x \ y$   
 ⟨proof⟩

**definition** *subforest*  $F \equiv \text{forest } F \wedge F \subseteq E$

**definition** *spanningForest* **where**  $\text{spanningForest } X \longleftrightarrow \text{subforest } X \wedge (\forall x \in E. \neg \text{subforest } (\text{insert } x \ X))$

**definition** *minSpanningForest*  $F \equiv \text{spanningForest } F \wedge (\forall F'. \text{spanningForest } F' \longrightarrow \text{sum } w \ F \leq \text{sum } w \ F')$

**end**

**end**

## 6 Kruskal on UGraphs

**theory** *UGraph-Impl*

**imports**

*Kruskal-Impl UGraph*

**begin**

**definition**  $\alpha = (\lambda(u, w, v). \text{Upair } u \ v)$

### 6.1 Interpreting *Kruskal-Impl* with a UGraph

**abbreviation** (in *uGraph*)

*getEdges-SPEC csuper-E*

$\equiv (\text{SPEC } (\lambda L. \text{distinct } (\text{map } \alpha \ L) \wedge \alpha \text{ ' set } L = E$   
 $\wedge (\forall (a, wv, b) \in \text{set } L. w \ (\alpha \ (a, wv, b)) = wv) \wedge \text{set } L \subseteq \text{csuper-}E))$

**locale** *uGraph-impl* = *uGraph*  $E \ w$  **for**  $E :: \text{nat uprod set}$  **and**  $w :: \text{nat uprod} \Rightarrow$

$int +$   
**fixes**  $getEdges-impl :: (nat \times int \times nat) \text{ list Heap and } csuper-E :: (nat \times int \times nat) \text{ set}$   
**assumes**  $getEdges-impl:$   
 $(uncurry0 \text{ getEdges-impl}, uncurry0 (\text{getEdges-SPEC } csuper-E))$   
 $\in \text{unit-assn}^k \rightarrow_a \text{list-assn } (nat-assn \times_a int-assn \times_a nat-assn)$   
**begin**

**abbreviation**  $V \equiv \bigcup (\text{set-uprod } 'E)$

**lemma**  $max-node-is-Max-V$ :  $E = \alpha ' \text{ set } la \implies \text{max-node } la = \text{Max } (\text{insert } 0 V)$   
 $\langle \text{proof} \rangle$

**sublocale**  $s$ :  $Kruskal-Impl \ E \bigcup (\text{set-uprod } 'E) \text{ set-uprod } \lambda u \ v \ e. \text{Upair } u \ v = e$   
 $\text{subforest } uconnectedV \ w \ \alpha \ PR-CONST \ (\lambda(u,w,v). \text{RETURN } (u,v))$   
 $PR-CONST (\text{getEdges-SPEC } csuper-E)$   
 $\text{getEdges-impl } csuper-E \ (\lambda(u,w,v). \text{return } (u,v))$   
 $\langle \text{proof} \rangle$

**lemma**  $spanningForest-eq-basis$ :  $\text{spanningForest} = s.basis$   
 $\langle \text{proof} \rangle$

**lemma**  $minSpanningForest-eq-minbasis$ :  $\text{minSpanningForest} = s.minBasis$   
 $\langle \text{proof} \rangle$

**lemma**  $kruskal-correct'$ :  
 $\langle emp \rangle \text{ kruskal } getEdges-impl \ (\lambda(u,w,v). \text{return } (u,v)) \ ()$   
 $\langle \lambda r. \uparrow (\text{distinct } r \wedge \text{set } r \subseteq csuper-E \wedge s.MSF (\text{set } (\text{map } \alpha \ r))) \rangle_t$   
 $\langle \text{proof} \rangle$

**lemma**  $kruskal-correct$ :  
 $\langle emp \rangle \text{ kruskal } getEdges-impl \ (\lambda(u,w,v). \text{return } (u,v)) \ ()$   
 $\langle \lambda r. \uparrow (\text{distinct } r \wedge \text{set } r \subseteq csuper-E \wedge \text{minSpanningForest } (\text{set } (\text{map } \alpha \ r))) \rangle_t$   
 $\langle \text{proof} \rangle$

**end**

## 6.2 Kruskal on UGraph from list of concrete edges

**definition**  $uGraph-from-list-\alpha-weight \ L \ e = (THE \ w. \exists a' \ b'. \text{Upair } a' \ b' = e \wedge (a', w, b') \in \text{set } L)$

**abbreviation**  $uGraph-from-list-\alpha-edges \ L \equiv \alpha ' \text{ set } L$

**locale** *fromlist* = **fixes**

$L :: (\text{nat} \times \text{int} \times \text{nat}) \text{ list}$

**assumes** *dist*:  $\text{distinct } (\text{map } \alpha L)$  **and** *no-selfloop*:  $\forall u \ w \ v. (u, w, v) \in \text{set } L \longrightarrow u \neq v$

**begin**

**lemma** *not-distinct-map*:  $a \in \text{set } l \implies b \in \text{set } l \implies a \neq b \implies \alpha a = \alpha b \implies \neg \text{distinct } (\text{map } \alpha l)$

*<proof>*

**lemma** *ii*:  $(a, aa, b) \in \text{set } L \implies \text{uGraph-from-list-}\alpha\text{-weight } L \ (\text{Upair } a \ b) = aa$   
*<proof>*

**sublocale** *uGraph-impl*  $\alpha$  ' *set* *L* *uGraph-from-list-}\alpha\text{-weight } L \text{ return } L \text{ set } L  
*<proof>**

**lemmas** *kruskal-correct* = *kruskal-correct*

**definition** (**in**  $-$ ) *kruskal-algo*  $L = \text{kruskal } (\text{return } L) \ (\lambda(u, w, v). \text{return } (u, v)) \ ()$

**end**

### 6.3 Outside the locale

**definition** *uGraph-from-list-invar*  $:: (\text{nat} \times \text{int} \times \text{nat}) \text{ list} \Rightarrow \text{bool}$  **where**

$\text{uGraph-from-list-invar } L = (\text{distinct } (\text{map } \alpha L) \wedge (\forall p \in \text{set } L. \text{ case } p \text{ of } (u, w, v) \Rightarrow u \neq v))$

**lemma** *uGraph-from-list-invar-conv*:  $\text{uGraph-from-list-invar } L = \text{fromlist } L$   
*<proof>*

**lemma** *uGraph-from-list-invar-subset*:

$\text{uGraph-from-list-invar } L \implies \text{set } L' \subseteq \text{set } L \implies \text{distinct } L' \implies \text{uGraph-from-list-invar } L'$   
*<proof>*

**lemma** *uGraph-from-list-}\alpha\text{-inj-on*:  $\text{uGraph-from-list-invar } E \implies \text{inj-on } \alpha \ (\text{set } E)$   
*<proof>*

**lemma** *sum-easier*:  $\text{uGraph-from-list-invar } L$

$\implies \text{set } E \subseteq \text{set } L$

$\implies \text{sum } (\text{uGraph-from-list-}\alpha\text{-weight } L) \ (\text{uGraph-from-list-}\alpha\text{-edges } E) = \text{sum } (\lambda(u, w, v). w) \ (\text{set } E)$   
*<proof>*



**lemma** *corr*:  $uGraph\text{-}from\text{-}list\text{-}invar\ L \implies$   
 $\langle emp \rangle\ kruskal\text{-}algo\ L$   
 $\langle \lambda F. \uparrow (uGraph\text{-}from\text{-}list\text{-}invar\ F \wedge set\ F \subseteq set\ L \wedge$   
 $uGraph.minSpanningForest\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ L)$   
 $(uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}weight\ L)\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ F)) \rangle_t$   
 $\langle proof \rangle$

**lemma**  $uGraph\text{-}from\text{-}list\text{-}invar\ L \implies$   
 $\langle emp \rangle\ kruskal\text{-}algo\ L$   
 $\langle \lambda F. \uparrow (uGraph\text{-}from\text{-}list\text{-}invar\ F \wedge set\ F \subseteq set\ L \wedge$   
 $uGraph.spanningForest\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ L)\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges$   
 $F)$   
 $\wedge (\forall F'. uGraph.spanningForest\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ L)\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges$   
 $F')) \implies set\ F' \subseteq set\ L \implies sum\ (\lambda(u,w,v). w)\ (set\ F) \leq sum\ (\lambda(u,w,v). w)$   
 $(set\ F')) \rangle_t$   
 $\langle proof \rangle$

## 6.4 Kruskal with input check

**definition**  $kruskal'\ L = kruskal\ (return\ L)\ (\lambda(u,w,v). return\ (u,v))\ ()$

**definition**  $kruskal\text{-}checked\ L = (if\ uGraph\text{-}from\text{-}list\text{-}invar\ L$   
 $then\ do\ \{ F \leftarrow kruskal'\ L; return\ (Some\ F) \}$   
 $else\ return\ None)$

**lemma**  $\langle emp \rangle\ kruskal\text{-}checked\ L \langle \lambda$   
 $Some\ F \implies \uparrow (uGraph\text{-}from\text{-}list\text{-}invar\ L \wedge set\ F \subseteq set\ L$   
 $\wedge uGraph.minSpanningForest\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ L)\ (uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}weight$   
 $L)$   
 $(uGraph\text{-}from\text{-}list\text{-}\alpha\text{-}edges\ F))$   
 $| None \implies \uparrow (\neg uGraph\text{-}from\text{-}list\text{-}invar\ L) \rangle_t$   
 $\langle proof \rangle$

## 6.5 Code export

**export-code**  $uGraph\text{-}from\text{-}list\text{-}invar\ \mathbf{checking}\ SML\text{-}imp$

**export-code**  $kruskal\text{-}checked\ \mathbf{checking}\ SML\text{-}imp$

$\langle ML \rangle$

**end**

## 7 Undirected Graphs as symmetric directed graphs

```

theory Graph-Definition
  imports
    Dijkstra-Shortest-Path.Graph
    Dijkstra-Shortest-Path.Weight
begin

```

### 7.1 Definition

```

fun is-path-undir :: ('v, 'w) graph  $\Rightarrow$  'v  $\Rightarrow$  ('v, 'w) path  $\Rightarrow$  'v  $\Rightarrow$  bool where
  is-path-undir G v [] v'  $\longleftrightarrow$  v=v'  $\wedge$  v' $\in$ nodes G |
  is-path-undir G v ((v1,w,v2)#p) v'
     $\longleftrightarrow$  v=v1  $\wedge$  ((v1,w,v2) $\in$ edges G  $\vee$  (v2,w,v1) $\in$ edges G)  $\wedge$  is-path-undir G
    v2 p v'

```

```

abbreviation nodes-connected G a b  $\equiv$   $\exists p.$  is-path-undir G a p b

```

```

definition degree :: ('v, 'w) graph  $\Rightarrow$  'v  $\Rightarrow$  nat where
  degree G v = card {e $\in$ edges G. fst e = v  $\vee$  snd (snd e) = v}

```

```

locale forest = valid-graph G
  for G :: ('v, 'w) graph +
  assumes cycle-free:
     $\forall (a,w,b)\in E. \neg$  nodes-connected (delete-edge a w b G) a b

```

```

locale connected-graph = valid-graph G
  for G :: ('v, 'w) graph +
  assumes connected:
     $\forall v\in V. \forall v'\in V. \text{nodes-connected } G v v'$ 

```

```

locale tree = forest + connected-graph

```

```

locale finite-graph = valid-graph G
  for G :: ('v, 'w) graph +
  assumes finite-E: finite E and
  finite-V: finite V

```

```

locale finite-weighted-graph = finite-graph G
  for G :: ('v, 'w::weight) graph

```

```

definition subgraph :: ('v, 'w) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool where
  subgraph G H  $\equiv$  nodes G = nodes H  $\wedge$  edges G  $\subseteq$  edges H

```

```

definition edge-weight :: ('v, 'w) graph  $\Rightarrow$  'w::weight where
  edge-weight G  $\equiv$  sum (fst o snd) (edges G)

```

```

definition edges-less-eq :: ('a  $\times$  'w::weight  $\times$  'a)  $\Rightarrow$  ('a  $\times$  'w  $\times$  'a)  $\Rightarrow$  bool
  where edges-less-eq a b  $\equiv$  fst(snd a)  $\leq$  fst(snd b)

```

**definition** *maximally-connected* :: ('v, 'w) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*maximally-connected* H G  $\equiv \forall v \in \text{nodes } G. \forall v' \in \text{nodes } G.$   
*(nodes-connected* G v v')  $\longrightarrow$  (*nodes-connected* H v v')

**definition** *spanning-forest* :: ('v, 'w) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*spanning-forest* F G  $\equiv \text{forest } F \wedge \text{maximally-connected } F \text{ } G \wedge \text{subgraph } F \text{ } G$

**definition** *optimal-forest* :: ('v, 'w::weight) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*optimal-forest* F G  $\equiv (\forall F'::('v, 'w) \text{ graph.}$   
*spanning-forest* F' G  $\longrightarrow \text{edge-weight } F \leq \text{edge-weight } F')$

**definition** *minimum-spanning-forest* :: ('v, 'w::weight) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*minimum-spanning-forest* F G  $\equiv \text{spanning-forest } F \text{ } G \wedge \text{optimal-forest } F \text{ } G$

**definition** *spanning-tree* :: ('v, 'w) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*spanning-tree* F G  $\equiv \text{tree } F \wedge \text{subgraph } F \text{ } G$

**definition** *optimal-tree* :: ('v, 'w::weight) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*optimal-tree* F G  $\equiv (\forall F'::('v, 'w) \text{ graph.}$   
*spanning-tree* F' G  $\longrightarrow \text{edge-weight } F \leq \text{edge-weight } F')$

**definition** *minimum-spanning-tree* :: ('v, 'w::weight) graph  $\Rightarrow$  ('v, 'w) graph  $\Rightarrow$  bool **where**  
*minimum-spanning-tree* F G  $\equiv \text{spanning-tree } F \text{ } G \wedge \text{optimal-tree } F \text{ } G$

## 7.2 Helping lemmas

**lemma** *nodes-delete-edge[simp]*:  
*nodes* (delete-edge v e v' G) = *nodes* G  
 <proof>

**lemma** *edges-delete-edge[simp]*:  
*edges* (delete-edge v e v' G) = *edges* G - {(v,e,v')}  
 <proof>

**lemma** *subgraph-node*:  
**assumes** subgraph H G  
**shows** v  $\in$  nodes G  $\longleftrightarrow$  v  $\in$  nodes H  
 <proof>

**lemma** *delete-add-edge*:  
**assumes** a  $\in$  nodes H  
**assumes** c  $\in$  nodes H  
**assumes** (a, w, c)  $\notin$  edges H  
**shows** delete-edge a w c (add-edge a w c H) = H  
 <proof>

**lemma** *swap-delete-add-edge*:

**assumes**  $(a, b, c) \neq (x, y, z)$   
**shows**  $\text{delete-edge } a \ b \ c \ (\text{add-edge } x \ y \ z \ H) = \text{add-edge } x \ y \ z \ (\text{delete-edge } a \ b \ c \ H)$   
 $\langle \text{proof} \rangle$

**lemma** *swap-delete-edges*:  $\text{delete-edge } a \ b \ c \ (\text{delete-edge } x \ y \ z \ H)$   
 $= \text{delete-edge } x \ y \ z \ (\text{delete-edge } a \ b \ c \ H)$   
 $\langle \text{proof} \rangle$

**context** *valid-graph*  
**begin**

**lemma** *valid-subgraph*:  
**assumes** *subgraph*  $H \ G$   
**shows** *valid-graph*  $H$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-simps*[*simp*, *intro!*]:  
 $\text{is-path-undir } G \ v \ [] \ v \longleftrightarrow v \in V$   
 $\text{is-path-undir } G \ v \ [(v, w, v')] \ v' \longleftrightarrow (v, w, v') \in E \vee (v', w, v) \in E$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-memb*[*simp*]:  
 $\text{is-path-undir } G \ v \ p \ v' \implies v \in V \wedge v' \in V$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-memb-edges*:  
**assumes** *is-path-undir*  $G \ v \ p \ v'$   
**shows**  $\forall (a, w, b) \in \text{set } p. (a, w, b) \in E \vee (b, w, a) \in E$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-split*:  
 $\text{is-path-undir } G \ v \ (p1 @ p2) \ v' \longleftrightarrow (\exists u. \text{is-path-undir } G \ v \ p1 \ u \wedge \text{is-path-undir } G \ u \ p2 \ v')$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-split'*[*simp*]:  
 $\text{is-path-undir } G \ v \ (p1 @ (u, w, u') \# p2) \ v'$   
 $\longleftrightarrow \text{is-path-undir } G \ v \ p1 \ u \wedge ((u, w, u') \in E \vee (u', w, u) \in E) \wedge \text{is-path-undir } G \ u' \ p2 \ v'$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-sym*:  
**assumes** *is-path-undir*  $G \ v \ p \ v'$   
**shows** *is-path-undir*  $G \ v' \ (\text{rev } (\text{map } (\lambda(u, w, u'). (u', w, u)) \ p)) \ v$   
 $\langle \text{proof} \rangle$

**lemma** *is-path-undir-subgraph*:  
**assumes** *is-path-undir*  $H \ x \ p \ y$   
**assumes** *subgraph*  $H \ G$

**shows** *is-path-undir*  $G$   $x$   $p$   $y$   
 $\langle proof \rangle$

**lemma** *no-path-in-empty-graph:*

**assumes**  $E = \{\}$   
**assumes**  $p \neq []$   
**shows**  $\neg is-path-undir\ G\ v\ p\ v$   
 $\langle proof \rangle$

**lemma** *is-path-undir-split-distinct:*

**assumes** *is-path-undir*  $G$   $v$   $p$   $v'$   
**assumes**  $(a, w, b) \in set\ p \vee (b, w, a) \in set\ p$   
**shows**  $(\exists p' p'' u\ u'.\ is-path-undir\ G\ v\ p'\ u \wedge is-path-undir\ G\ u'\ p''\ v' \wedge$   
 $length\ p' < length\ p \wedge length\ p'' < length\ p \wedge$   
 $(u \in \{a, b\} \wedge u' \in \{a, b\}) \wedge$   
 $(a, w, b) \notin set\ p' \wedge (b, w, a) \notin set\ p' \wedge$   
 $(a, w, b) \notin set\ p'' \wedge (b, w, a) \notin set\ p'')$   
 $\langle proof \rangle$

**lemma** *add-edge-is-path:*

**assumes** *is-path-undir*  $G$   $x$   $p$   $y$   
**shows** *is-path-undir*  $(add-edge\ a\ b\ c\ G)\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *add-edge-was-path:*

**assumes** *is-path-undir*  $(add-edge\ a\ b\ c\ G)\ x\ p\ y$   
**assumes**  $(a, b, c) \notin set\ p$   
**assumes**  $(c, b, a) \notin set\ p$   
**assumes**  $a \in V$   
**assumes**  $c \in V$   
**shows** *is-path-undir*  $G\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *delete-edge-is-path:*

**assumes** *is-path-undir*  $G\ x\ p\ y$   
**assumes**  $(a, b, c) \notin set\ p$   
**assumes**  $(c, b, a) \notin set\ p$   
**shows** *is-path-undir*  $(delete-edge\ a\ b\ c\ G)\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *delete-node-is-path:*

**assumes** *is-path-undir*  $G\ x\ p\ y$   
**assumes**  $x \neq v$   
**assumes**  $v \notin fst'set\ p \cup snd'snd'set\ p$   
**shows** *is-path-undir*  $(delete-node\ v\ G)\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *delete-edge-was-path:*

**assumes** *is-path-undir* (*delete-edge*  $a\ b\ c\ G$ )  $x\ p\ y$   
**shows** *is-path-undir*  $G\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *subset-was-path*:  
**assumes** *is-path-undir*  $H\ x\ p\ y$   
**assumes** *edges*  $H \subseteq E$   
**assumes** *nodes*  $H \subseteq V$   
**shows** *is-path-undir*  $G\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *delete-node-was-path*:  
**assumes** *is-path-undir* (*delete-node*  $v\ G$ )  $x\ p\ y$   
**shows** *is-path-undir*  $G\ x\ p\ y$   
 $\langle proof \rangle$

**lemma** *add-edge-preserve-subgraph*:  
**assumes** *subgraph*  $H\ G$   
**assumes**  $(a, w, b) \in E$   
**shows** *subgraph* (*add-edge*  $a\ w\ b\ H$ )  $G$   
 $\langle proof \rangle$

**lemma** *delete-edge-preserve-subgraph*:  
**assumes** *subgraph*  $H\ G$   
**shows** *subgraph* (*delete-edge*  $a\ w\ b\ H$ )  $G$   
 $\langle proof \rangle$

**lemma** *add-delete-edge*:  
**assumes**  $(a, w, c) \in E$   
**shows** *add-edge*  $a\ w\ c$  (*delete-edge*  $a\ w\ c\ G$ ) =  $G$   
 $\langle proof \rangle$

**lemma** *swap-add-edge-in-path*:  
**assumes** *is-path-undir* (*add-edge*  $a\ w\ b\ G$ )  $v\ p\ v'$   
**assumes**  $(a, w', a') \in E \vee (a', w', a) \in E$   
**shows**  $\exists p. \text{is-path-undir } (\text{add-edge } a'\ w''\ b\ G)\ v\ p\ v'$   
 $\langle proof \rangle$

**lemma** *induce-maximally-connected*:  
**assumes** *subgraph*  $H\ G$   
**assumes**  $\forall (a, w, b) \in E. \text{nodes-connected } H\ a\ b$   
**shows** *maximally-connected*  $H\ G$   
 $\langle proof \rangle$

**lemma** *add-edge-maximally-connected*:  
**assumes** *maximally-connected*  $H\ G$   
**assumes** *subgraph*  $H\ G$   
**assumes**  $(a, w, b) \in E$   
**shows** *maximally-connected* (*add-edge*  $a\ w\ b\ H$ )  $G$

*<proof>*

**lemma** *delete-edge-maximally-connected:*

**assumes** *maximally-connected*  $H\ G$

**assumes** *subgraph*  $H\ G$

**assumes** *pab: is-path-undir*  $(\text{delete-edge } a\ w\ b\ H)\ a\ pab\ b$

**shows** *maximally-connected*  $(\text{delete-edge } a\ w\ b\ H)\ G$

*<proof>*

**lemma** *connected-impl-maximally-connected:*

**assumes** *connected-graph*  $H$

**assumes** *subgraph:* *subgraph*  $H\ G$

**shows** *maximally-connected*  $H\ G$

*<proof>*

**lemma** *add-edge-is-connected:*

*nodes-connected*  $(\text{add-edge } a\ b\ c\ G)\ a\ c$

*nodes-connected*  $(\text{add-edge } a\ b\ c\ G)\ c\ a$

*<proof>*

**lemma** *swap-edges:*

**assumes** *nodes-connected*  $(\text{add-edge } a\ w\ b\ G)\ v\ v'$

**assumes**  $a \in V$

**assumes**  $b \in V$

**assumes**  $\neg \text{nodes-connected } G\ v\ v'$

**shows** *nodes-connected*  $(\text{add-edge } v\ w'\ v'\ G)\ a\ b$

*<proof>*

**lemma** *subgraph-impl-connected:*

**assumes** *connected-graph*  $H$

**assumes** *subgraph:* *subgraph*  $H\ G$

**shows** *connected-graph*  $G$

*<proof>*

**lemma** *add-node-connected:*

**assumes**  $\forall a \in V - \{v\}. \forall b \in V - \{v\}. \text{nodes-connected } G\ a\ b$

**assumes**  $(v, w, v') \in E \vee (v', w, v) \in E$

**assumes**  $v \neq v'$

**shows**  $\forall a \in V. \forall b \in V. \text{nodes-connected } G\ a\ b$

*<proof>*

**end**

**context** *connected-graph*

**begin**

**lemma** *maximally-connected-impl-connected:*

**assumes** *maximally-connected*  $H\ G$

**assumes** *subgraph:* *subgraph*  $H\ G$

**shows** *connected-graph*  $H$

*<proof>*

**end**

**context** *forest*

**begin**

**lemmas** *delete-edge-valid'* = *delete-edge-valid*[*OF valid-graph-axioms*]

**lemma** *delete-edge-from-path*:

**assumes** *nodes-connected* *G a b*

**assumes** *subgraph* *H G*

**assumes**  $\neg$  *nodes-connected* *H a b*

**shows**  $\exists (x, w, y) \in E - \text{edges } H. (\neg \text{nodes-connected } (\text{delete-edge } x \ w \ y \ G))$   
*a b*)  $\wedge$

$(\text{nodes-connected } (\text{add-edge } a \ w' \ b \ (\text{delete-edge } x \ w \ y \ G)) \ x \ y)$

$\langle \text{proof} \rangle$

**lemma** *forest-add-edge*:

**assumes**  $a \in V$

**assumes**  $b \in V$

**assumes**  $\neg$  *nodes-connected* *G a b*

**shows** *forest* (*add-edge* *a w b G*)

$\langle \text{proof} \rangle$

**lemma** *forest-subsets*:

**assumes** *valid-graph* *H*

**assumes** *edges*  $H \subseteq E$

**assumes** *nodes*  $H \subseteq V$

**shows** *forest* *H*

$\langle \text{proof} \rangle$

**lemma** *subgraph-forest*:

**assumes** *subgraph* *H G*

**shows** *forest* *H*

$\langle \text{proof} \rangle$

**lemma** *forest-delete-edge*: *forest* (*delete-edge* *a w c G*)

$\langle \text{proof} \rangle$

**lemma** *forest-delete-node*: *forest* (*delete-node* *n G*)

$\langle \text{proof} \rangle$

**end**

**context** *finite-graph*

**begin**

**lemma** *finite-subgraphs*: *finite*  $\{T. \text{subgraph } T \ G\}$

$\langle \text{proof} \rangle$



**end**

**lemma** *minimum-spanning-forest-impl-tree*:  
**assumes** *minimum-spanning-forest*  $F\ G$   
**assumes** *valid-G*: *valid-graph*  $G$   
**assumes** *connected-graph*  $F$   
**shows** *minimum-spanning-tree*  $F\ G$   
 $\langle proof \rangle$

**lemma** *minimum-spanning-forest-impl-tree2*:  
**assumes** *minimum-spanning-forest*  $F\ G$   
**assumes** *connected-G*: *connected-graph*  $G$   
**shows** *minimum-spanning-tree*  $F\ G$   
 $\langle proof \rangle$

**end**

### 7.3 Auxiliary lemmas for graphs

**theory** *Graph-Definition-Aux*  
**imports** *Graph-Definition SeprefUF*  
**begin**

**context** *valid-graph*  
**begin**

**lemma** *nodes-connected-sym*: *nodes-connected*  $G\ a\ b = \text{nodes-connected } G\ b\ a$   
 $\langle proof \rangle$

**lemma** *Domain-nodes-connected*: *Domain*  $\{(x, y) \mid x\ y.\ \text{nodes-connected } G\ x\ y\}$   
 $= V$   
 $\langle proof \rangle$

**lemma** *Range-nodes-connected*: *Range*  $\{(x, y) \mid x\ y.\ \text{nodes-connected } G\ x\ y\} = V$   
 $\langle proof \rangle$

**lemma** *nodes-connected-insert-per-union*:  
 $(\text{nodes-connected } (\text{add-edge } a\ w\ b\ H)\ x\ y) \longleftrightarrow (x, y) \in \text{per-union } \{(x, y) \mid x\ y.\ \text{nodes-connected } H\ x\ y\}\ a\ b$   
**if** *subgraph*  $H\ G$  **and** *PER*: *part-equiv*  $\{(x, y) \mid x\ y.\ \text{nodes-connected } H\ x\ y\}$   
**and**  $V: a \in V\ b \in V$  **for**  $x\ y$   
 $\langle proof \rangle$

**lemma** *is-path-undir-append*: *is-path-undir*  $G\ v\ p1\ u \implies \text{is-path-undir } G\ u\ p2\ w$   
 $\implies \text{is-path-undir } G\ v\ (p1 @ p2)\ w$   
 $\langle proof \rangle$

**lemma**  
*augment-edge*:

**assumes** *sg*: *subgraph G1 G subgraph G2 G* **and**  
*p*:  $(u, v) \in \{(a, b) \mid a \text{ b. nodes-connected } G1 \ a \ b\}$   
**and** *notinE2*:  $(u, v) \notin \{(a, b) \mid a \text{ b. nodes-connected } G2 \ a \ b\}$

**shows**  $\exists a \ b \ e. (a, b) \notin \{(a, b) \mid a \text{ b. nodes-connected } G2 \ a \ b\} \wedge e \notin \text{edges } G2 \wedge$   
 $e \in \text{edges } G1 \wedge (\text{case } e \text{ of } (aa, w, ba) \Rightarrow a=aa \wedge b=ba \vee a=ba \wedge b=aa)$   
 <proof>

**lemma** *nodes-connected-refl*:  $a \in V \implies \text{nodes-connected } G \ a \ a$   
 <proof>

**lemma** *assumes sg: subgraph H G*  
**shows** *connected-VV*:  $\{(x, y) \mid x \ y. \text{nodes-connected } H \ x \ y\} \subseteq V \times V$   
**and** *connected-refl*: *refl-on*  $V \ \{(x, y) \mid x \ y. \text{nodes-connected } H \ x \ y\}$   
**and** *connected-trans*: *trans*  $\{(x, y) \mid x \ y. \text{nodes-connected } H \ x \ y\}$   
**and** *connected-sym*: *sym*  $\{(x, y) \mid x \ y. \text{nodes-connected } H \ x \ y\}$   
**and** *connected-equiv*: *equiv*  $V \ \{(x, y) \mid x \ y. \text{nodes-connected } H \ x \ y\}$   
 <proof>

**lemma** *forest-maximally-connected-incl-max1*:  
**assumes**  
*forest H*  
*subgraph H G*  
**shows**  $(\forall (a, w, b) \in \text{edges } G - \text{edges } H. \neg (\text{forest } (\text{add-edge } a \ w \ b \ H))) \implies$   
*maximally-connected H G*  
 <proof>

**lemma** *forest-maximally-connected-incl-max2*:  
**assumes**  
*forest H*  
*subgraph H G*  
**shows** *maximally-connected H G*  $\implies (\forall (a, w, b) \in E - \text{edges } H. \neg (\text{forest } (\text{add-edge } a \ w \ b \ H)))$   
 <proof>

**lemma** *forest-maximally-connected-incl-max-conv*:  
**assumes**  
*forest H*  
*subgraph H G*  
**shows** *maximally-connected H G*  $= (\forall (a, w, b) \in E - \text{edges } H. \neg (\text{forest } (\text{add-edge } a \ w \ b \ H)))$   
 <proof>

**end**

**end**

## 8 Kruskal on Symmetric Directed Graph

```

theory Graph-Definition-Impl
imports
  Kruskal-Impl Graph-Definition-Aux
begin

```

### 8.1 Interpreting *Kruskal-Impl*

```

locale fromlist = fixes
  L :: (nat × int × nat) list
begin

```

```

abbreviation E ≡ set L
abbreviation V ≡ fst ‘ E ∪ (snd ∘ snd) ‘ E
abbreviation ind (E' :: (nat × int × nat) set) ≡ (| nodes = V, edges = E' |)
abbreviation subforest E' ≡ forest (ind E') ∧ subgraph (ind E') (ind E)

```

```

lemma max-node-is-Max-V: E = set la ⇒ max-node la = Max (insert 0 V)
  <proof>

```

```

lemma ind-valid-graph: ∧ E'. E' ⊆ E ⇒ valid-graph (ind E')
  <proof>

```

```

lemma vE: valid-graph (ind E) <proof>

```

```

lemma ind-valid-graph': ∧ E'. subgraph (ind E') (ind E) ⇒ valid-graph (ind E')
  <proof>

```

```

lemma add-edge-ind: (a,w,b) ∈ E ⇒ add-edge a w b (ind F) = ind (insert
(a,w,b) F)
  <proof>

```

```

lemma nodes-connected-ind-sym: F ⊆ E ⇒ sym {(x, y) | x y. nodes-connected
(ind F) x y}
  <proof>

```

```

lemma nodes-connected-ind-trans: F ⊆ E ⇒ trans {(x, y) | x y. nodes-connected
(ind F) x y}
  <proof>

```

```

lemma part-equiv-nodes-connected-ind:
  F ⊆ E ⇒ part-equiv {(x, y) | x y. nodes-connected (ind F) x y}
  <proof>

```

```

sublocale s: Kruskal-Impl E V

```

$\lambda e. \{fst\ e, snd\ (snd\ e)\} \lambda u\ v\ (a, w, b). u=a \wedge v=b \vee u=b \wedge v=a$   
*subforest*  
 $\lambda E'. \{ (a, b) \mid a\ b. \text{ nodes-connected } (ind\ E')\ a\ b \}$   
 $\lambda(u, w, v). w\ id\ PR-CONST\ (\lambda(u, w, v). RETURN\ (u, v))$   
 $PR-CONST\ (RETURN\ L)\ return\ L\ set\ L\ (\lambda(u, w, v). return\ (u, v))$   
 $\langle proof \rangle$

## 8.2 Showing the equivalence of minimum spanning forest definitions

As the definition of the minimum spanning forest from the minWeightBasis algorithm differs from the one of our graph formalization, we new show their equivalence.

**lemma** *spanning-forest-eq*:  $s.SpanningForest\ E' = spanning-forest\ (ind\ E')\ (ind\ E)$   
 $\langle proof \rangle$

**lemma** *edge-weight-alt*:  $edge-weight\ G = sum\ (\lambda(u, w, v). w)\ (edges\ G)$   
 $\langle proof \rangle$

**lemma** *MSF-eq*:  $s.MSF\ E' = minimum-spanning-forest\ (ind\ E')\ (ind\ E)$   
 $\langle proof \rangle$

**lemma** *kruskal-correct*:  
 $\langle emp \rangle\ kruskal\ (return\ L)\ (\lambda(u, w, v). return\ (u, v))\ ()$   
 $\langle \lambda F. \uparrow (distinct\ F \wedge set\ F \subseteq E \wedge minimum-spanning-forest\ (ind\ (set\ F))\ (ind\ E)) \rangle_t$   
 $\langle proof \rangle$

**definition** (**in**  $-$ ) *kruskal-algo*  $L = kruskal\ (return\ L)\ (\lambda(u, w, v). return\ (u, v))\ ()$

**end**

## 8.3 Outside the locale

**definition** *GD-from-list- $\alpha$ -weight*  $L\ e = (case\ e\ of\ (u, w, v) \Rightarrow w)$

**abbreviation** *GD-from-list- $\alpha$ -graph*  $G\ L \equiv (\downarrow nodes = fst\ ' (set\ G) \cup (snd \circ snd)\ ' (set\ G), edges = set\ L)$

**lemma** *corr*:  
 $\langle emp \rangle\ kruskal-algo\ L$   
 $\langle \lambda F. \uparrow (set\ F \subseteq set\ L \wedge$   
 $minimum-spanning-forest\ (GD-from-list-\alpha-graph\ L\ F)\ (GD-from-list-\alpha-graph\ L\ L)) \rangle_t$   
 $\langle proof \rangle$

**lemma** *kruskal-correct*:  $\langle emp \rangle\ kruskal-algo\ L$

$\langle \lambda F. \uparrow (\text{set } F \subseteq \text{set } L \wedge$   
 $\text{spanning-forest } (GD\text{-from-list-}\alpha\text{-graph } L \ F) \ (GD\text{-from-list-}\alpha\text{-graph } L \ L)$   
 $\wedge (\forall F'. \text{spanning-forest } (GD\text{-from-list-}\alpha\text{-graph } L \ F') \ (GD\text{-from-list-}\alpha\text{-graph}$   
 $L \ L)) \longrightarrow \text{sum } (\lambda(u,w,v). w) \ (\text{set } F) \leq \text{sum } (\lambda(u,w,v). w) \ (\text{set } F')) \rangle_t$   
 $\langle \text{proof} \rangle$

## 8.4 Code export

**export-code** *kruskal-algo* **checking** *SML-imp*

$\langle ML \rangle$

**end**