# Formalizing Graph Trail Properties in Isabelle/HOL

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Abstract. We describe a dataset expressing and proving properties of graph trails, using Isabelle/HOL. We formalize the reasoning about strictly increasing and decreasing trails, using weights over edges, and prove lower bounds over the length of trails in weighted graphs. We do so by extending the graph theory library of Isabelle/HOL with an algorithm computing the length of a longest strictly decreasing graph trail starting from a vertex for a given weight distribution, and prove that any decreasing trail is also an increasing one.

**Keywords:** weighted graph  $\cdot$  increasing/decreasing trails  $\cdot$  Isabelle/HOL  $\cdot$  verified theory formalization

## 1 Graph Theory in the Archive of Formal Proofs

To increase the reusability of our library we build upon the *Graph-Theory* library by Noschinski [10]. Graphs are represented as records consisting of vertices and edges that can be accessed using the selectors *pverts* and *parcs*. We recall the definition of the type *pair-pre-digraph*:

```
record 'a pair-pre-digraph = pverts :: 'a set parcs :: 'a rel
```

Now restrictions upon the two sets and new features can be introduced using locales. Locales are Isabelle's way to deal with parameterized theories [1]. Consider for example *pair-wf-digraph*. The endpoints of an edge can be accessed using the functions *fst* and *snd*. Therefore, conditions *arc-fst-in-verts* and *arc-snd-in-verts* assert that both endpoints of an edge are vertices. Using so-called sublocales a variety of other graphs are defined.

```
locale pair-wf-digraph = pair-pre-digraph + assumes arc-fst-in-verts: \land e. \ e \in parcs \ G \Longrightarrow fst \ e \in pverts \ G assumes arc-snd-in-verts: \land e. \ e \in parcs \ G \Longrightarrow snd \ e \in pverts \ G
```

An object of type 'b awalk is defined in *Graph-Theory.Arc-Walk* as a list of edges. Additionally, the definition awalk imposes that both endpoints of a walk are vertices of the graph, all elements of the walk are edges and two subsequent edges share a common vertex.

```
type-synonym 'b awalk = 'b list
```

```
definition awalk :: 'a \Rightarrow 'b \text{ awalk} \Rightarrow 'a \Rightarrow bool
awalk u p v \equiv u \in verts \ G \land set \ p \subseteq arcs \ G \land cas \ u \ p \ v
```

We also reuse the type synonym weight-fun introduced in Weighted-Graph.

```
type-synonym 'b weight-fun = 'b \Rightarrow real
```

Finally, there is an useful definition capturing the notion of a complete graph, namely *complete-digraph*.

## 2 Formalization of Trail Properties in Isabelle/HOL

#### 2.1 Increasing and Decreasing Trails in Weighted Graphs

In our work we extend the graph theory framework from Section 1 with new features enabling reasoning about trails. To this end, a trail is defined as a list of edges. We will only consider strictly increasing trails on graphs without parallel edges. For this we require the graph to be of type *pair-pre-digraph*, as introduced in Section 1.

Two different definitions are given in our formalization. Function incTrail can be used without specifying the first and last vertex of the trail whereas incTrail2 uses more of Graph-Theory's predefined features. Moreover, making use of monotonicity incTrail only requires to check if one edge's weight is smaller than its successors' while incTrail2 checks if the weight is smaller than the one of all subsequent edges in the sequence, i.e. if the list is sorted. The equivalence between the two notions is shown in the following.

```
fun incTrail :: 'a pair-pre-digraph \Rightarrow ('a ×'a) weight-fun \Rightarrow ('a ×'a) list \Rightarrow bool where incTrail g \ w \ [] = True \ | incTrail g \ w \ [e_1] = (e_1 \in parcs \ g) \ | incTrail g \ w \ (e_1\#e_2\#es) = (if \ w \ e_1 < w \ e_2 \land e_1 \in parcs \ g \land snd \ e_1 = fst \ e_2 + en \ incTrail g \ w \ (e_2\#es) \ else \ False)

definition(in pair-pre-digraph) incTrail2 where incTrail2 \ w \ es \ u \ v \equiv sorted-wrt \ (\lambda \ e_1 \ e_2. \ w \ e_1 < w \ e_2) \ es \land (es = [] \lor awalk \ u \ es \ v)

fun decTrail \ :: \ 'a \ pair-pre-digraph \Rightarrow ('a \times 'a) \ weight-fun \Rightarrow ('a \times 'a) \ list \Rightarrow bool where decTrail \ g \ w \ [] = True \ | decTrail \ g \ w \ [e_1] = (e_1 \in parcs \ g) \ | decTrail \ g \ w \ (e_1\#e_2\#es) = (if \ w \ e_1 > w \ e_2 \land e_1 \in parcs \ g \land snd \ e_1 = fst \ e_2 + en \ decTrail \ g \ w \ (e_2\#es) \ else \ False)
```

definition(in pair-pre-digraph) decTrail2 where

```
decTrail2 \ w \ es \ u \ v \equiv sorted\text{-}wrt \ (\lambda \ e_1 \ e_2. \ w \ e_1 > w \ e_2) \ es \ \land \ (es = [] \lor awalk \ u \ es \ v)
```

Defining trails as lists in Isabelle has many advantages including using predefined list operators, e.g., drop. Thus, we can show one result that will be constantly needed in the following, that is, that any subtrail of an ordered trail is an ordered trail itself.

```
lemma inc Trail-subtrail:
assumes inc Trail g w es
shows inc Trail g w (drop k es)

lemma dec Trail-subtrail:
assumes dec Trail g w es
shows dec Trail g w (drop k es)
```

In Isabelle we then show the equivalence between the two definitions decTrail and decTrail2 of strictly decreasing trails. Similarly, we also show the equivalence between the definition incTrail and incTrail2 of strictly increasing trails.

```
lemma(in pair-wf-digraph) dec Trail-is-dec-walk:

shows dec Trail G w es \longleftrightarrow dec Trail 2 w es (fst (hd es)) (snd (last es))

lemma(in pair-wf-digraph) inc Trail-is-inc-walk:

shows inc Trail G w es \longleftrightarrow inc Trail 2 w es (fst (hd es)) (snd (last es))
```

Any strictly decreasing trail  $(e_1, \ldots, e_n)$  can also be seen as a strictly increasing trail  $(e_n, \ldots, e_1)$  if the graph considered is undirected. To this end, we make use of the locale pair-sym-digraph that captures the idea of symmetric arcs. However, it is also necessary to assume that the weight function assigns the same weight to edge  $(v_i, v_j)$  as to  $(v_j, v_i)$ . This assumption is therefore added to decTrail-eq-rev-incTrail and incTrail-eq-rev-decTrail.

```
\begin{array}{l} \textbf{lemma(in} \ pair\text{-}sym\text{-}digraph) \ dec\ Trail\text{-}eq\text{-}rev\text{-}inc\ Trail\text{:}}\\ \textbf{assumes} \ \forall \ v_1\ v_2.\ w\ (v_1,v_2) = w(v_2,v_1)\\ \textbf{shows} \ dec\ Trail\ G\ w\ es \longleftrightarrow inc\ Trail\ G\ w\ (rev\ (map\ (\lambda(v_1,v_2).\ (v_2,v_1))\ es)) \\ \\ \textbf{lemma(in} \ pair\text{-}sym\text{-}digraph) \ inc\ Trail\text{-}eq\text{-}rev\text{-}dec\ Trail\text{:}}\\ \textbf{assumes} \ \forall \ v_1\ v_2.\ w\ (v_1,v_2) = w(v_2,v_1)\\ \textbf{shows} \ inc\ Trail\ G\ w\ es \longleftrightarrow dec\ Trail\ G\ w\ (rev\ (map\ (\lambda(v_1,v_2).\ (v_2,v_1))\ es)) \end{array}
```

#### 2.2 Weighted Graphs

We add the locale weighted-pair-graph on top of the locale pair-graph introduced in Graph-Theory. A pair-graph is a finite, loop free and symmetric graph. We do not restrict the types of vertices and edges but impose the condition that they have to be a linear order.

Furthermore, all weights have to be integers between 0 and  $\lfloor \frac{q}{2} \rfloor$  where 0 is used as a special value to indicate that there is no edge at that position. Since the range of the weight function is in the reals, the set of natural numbers  $\{1,...,card\ (parcs\ G)\ div\ 2\}$  has to be casted into a set of reals. This is realized by taking the image of the function real that casts a natural number to a real.

```
locale weighted-pair-graph = pair-graph (G:: ('a::linorder) pair-pre-digraph) for G + fixes w :: ('a×'a) weight-fun assumes dom: e \in parcs \ G \longrightarrow w \ e \in real '\{1..card \ (parcs \ G) \ div \ 2\} and vert-ge: card \ (pverts \ G) \ge 1
```

We introduce some useful abbreviations, according to the ones in Section ??

```
abbreviation(in weighted-pair-graph) q \equiv card \ (parcs \ G) abbreviation(in weighted-pair-graph) n \equiv card \ (pverts \ G) abbreviation(in weighted-pair-graph) W \equiv \{1...q \ div \ 2\}
```

Note an important difference between Section ?? and our formalization. Although a weighted-pair-graph is symmetric, the edge set contains both "directions" of an edge, i.e.,  $(v_1, v_2)$  and  $(v_2, v_1)$  are both in parcs G. Thus, the maximum number of edges (in the case that the graph is complete) is  $n \cdot (n-1)$  and not  $\frac{n \cdot (n-1)}{2}$ . Another consequence is that the number q of edges is always even.

```
lemma (in weighted-pair-graph) max-arcs:

shows card (parcs G) \leq n*(n-1)

lemma (in weighted-pair-graph) even-arcs:

shows even q
```

The below sublocale distinct-weighted-pair-graph refines weighted-pair-graph. The condition zero fixes the meaning of 0. The weight function is defined on the set of all vertices but since self loops are not allowed; we use 0 as a special value to indicate the unavailability of the edge. The second condition distinct enforces that no two edges can have the same weight. There are some exceptions however captured in the statement  $(v_1 = u_2 \wedge v_2 = u_1) \vee (v_1 = u_1 \wedge v_2 = u_2)$ . Firstly,  $(v_1, v_2)$  should have the same weight as  $(v_2, v_1)$ . Secondly,  $w(v_1, v_2)$  has the same value as  $w(v_1, v_2)$ . Note that both edges being self loops resulting in them both having weight 0 is prohibited by condition zero. Our decision to separate these two conditions from the ones in weighted-pair-graph instead of making one locale of its own is two-fold: On the one hand, there are scenarios where distinctiveness is not wished for. On the other hand, 0 might not be available as a special value.

```
locale distinct-weighted-pair-graph = weighted-pair-graph + assumes zero: \forall v_1 \ v_2. \ (v_1,v_2) \notin parcs \ G \longleftrightarrow w \ (v_1,v_2) = 0 and distinct: \forall \ (v_1,v_2) \in parcs \ G. \ \forall \ (u1,u2) \in parcs \ G. ((v_1 = u2 \land v_2 = u1) \lor (v_1 = u1 \land v_2 = u2)) \longleftrightarrow w \ (v_1,v_2) = w \ (u1,u2)
```

One important step in our formalization is to show that the weight function is surjective. However, having two elements of the domain (edges) being mapped to the same element of the codomain (weight) makes the proof complicated. We therefore first prove that the weight function is surjective on a restricted set of edges. Here we use the fact that there is a linear order on vertices by only considering edges were the first endpoint is bigger than the second.

Then, the surjectivity of w is relatively simple to show. Note that we could also have assumed surjectivity in distinct-weighted-pair-graph and shown that

distinctiveness follows from it. However, distinctiveness is the more natural assumption that is more likely to appear in any application of ordered trails.

```
lemma(in distinct-weighted-pair-graph) restricted-weight-fun-surjective: shows (\forall k \in W. \exists (v_1, v_2) \in (parcs \ G). \ w \ (v_1, v_2) = k)
```

```
lemma(in distinct-weighted-pair-graph) weight-fun-surjective:
shows (\forall k \in W. \exists (v_1,v_2) \in (parcs \ G). \ w \ (v_1,v_2) = k)
```

#### 2.3 Computing a Longest Ordered Trail

We next formally verify Algorithm ?? and compute longest ordered trails. To this end, we introduce the function *findEdge* to find an edge in a list of edges by its weight.

```
fun findEdge :: ('a \times 'a) weight-fun \Rightarrow ('a \times 'a) list \Rightarrow real \Rightarrow ('a \times 'a) where findEdge f [] k = undefined | findEdge f (e \# es) k = (if f e = k then e else findEdge f es k)
```

Function findEdge will correctly return the edge whose weight is k. We do not care in which order the endpoints are found, i.e. whether  $(v_1, v_2)$  or  $(v_2, v_1)$  is returned.

```
lemma(in distinct-weighted-pair-graph) findEdge-success:

assumes k \in W and w(v_1,v_2) = k and (parcs \ G) \neq \{\}

shows (findEdge w (set-to-list (parcs G)) k) = (v_1,v_2)

\vee (findEdge w (set-to-list (parcs G)) k) = (v_2,v_1)
```

We translate the notion of a labelling function  $L^i(v)$  (see Definition ??) into Isabelle. Function getL G w, in short for get label, returns the length of the longest strictly decreasing path starting at vertex v. In contrast to Definition ?? subgraphs are treated here implicitly. Intuitively, this can be seen as adding edges to an empty graph in order of their weight.

```
fun getL :: ('a::linorder) \ pair-pre-digraph \Rightarrow ('a \times 'a) \ weight-fun \Rightarrow nat \Rightarrow 'a \Rightarrow nat where getL \ g \ w \ 0 \ v = 0 \ | getL \ g \ w \ (Suc \ i) \ v = (let \ (v_1,v_2) = (findEdge \ w \ (set-to-list \ (arcs \ g)) \ (Suc \ i)) \ in (if \ v = v_1 \ then \ max \ ((getL \ g \ w \ i \ v_2)+1) \ (getL \ g \ w \ i \ v) \ else (if \ v = v_2 \ then \ max \ ((getL \ g \ w \ i \ v_1)+1) \ (getL \ g \ w \ i \ v) \ else getL \ g \ w \ i \ v)))
```

To add all edges to the graph, set i = |E|. Recall that  $card\ (parcs\ g) = 2*|E|$ , as every edge appears twice. Then, iterate over all vertices and give back the maximum length which is found by using  $getL\ G\ w$ . Since  $getL\ G\ w$  can also be used to get a longest strictly increasing trail ending at vertex v the algorithm is not restricted to strictly decreasing trails.

```
definition getLongestTrail :: ('a::linorder) pair-pre-digraph \Rightarrow ('a \times 'a) weight-fun \Rightarrow nat where getLongestTrail gw = Max (set [(getL\ g\ w\ (card\ (parcs\ g)\ div\ 2)\ v)\ .\ v <- \ sorted-list-of-set\ (pverts\ g)])
```

Exporting the algorithm into Haskell code results in a fully verified program to find a longest strictly decreasing or strictly increasing trail.

```
export-code getLongestTrail in Haskell module-name LongestTrail
```

Using an induction proof and extensive case distinction, the correctness of Algorithm ?? is then shown in our formalization, by proving the following theorem:

```
theorem(in distinct-weighted-pair-graph) correctness: assumes \exists v \in (pverts \ G). getL G \ w \ (q \ div \ 2) \ v = k shows \exists xs. \ decTrail \ G \ w \ xs \land length \ xs = k
```

#### 2.4 Minimum Length of Ordered Trails

The algorithm introduced in Section 2.3 is already useful on its own. Additionally, it can be used to verify the lower bound on the minimum length of a strictly decreasing trail  $P_d(w, G) \geq 2 \cdot \left| \frac{q}{n} \right|$ .

To this end, Lemma 1 from Section ?? is translated into Isabelle as the lemma *minimal-increase-one-step*. The proof is similar to its counterpart, also using a case distinction. Lemma 2 is subsequently proved, here named *minimal-increase-total*.

From minimal-increase-total we have that that the sum of all labels after q div 2 steps is greater than q. Now assume that all labels are smaller than q div n. Because we have n vertices, this leads to a contradiction, which proves algo-result-min.

```
lemma(in distinct-weighted-pair-graph) algo-result-min:

shows (\exists v \in pverts \ G. \ getL \ Gw \ (q \ div \ 2) \ v \geq q \ div \ n)
```

**shows**  $(\sum v \in pverts \ G. \ getL \ G \ w \ (q \ div \ 2) \ v) \ge q$ 

Finally, using lemma algo-result-min together with the correctness theorem of section 2.3, we prove the lower bound of  $2 \cdot \lfloor \frac{q}{n} \rfloor$  over the length of a longest strictly decreasing trail. This general approach could also be used to extend our formalization and prove existence of other trails. For example, assume that some restrictions on the graph give raise to the existence of a trail of length  $m \geq 2 \cdot \lfloor \frac{q}{n} \rfloor$ . Then, it is only necessary to show that our algorithm can find this trail.

```
theorem(in distinct-weighted-pair-graph) dec-trail-exists:

shows \exists es. decTrail G w es \land length es = q div n

theorem(in distinct-weighted-pair-graph) inc-trail-exists:

shows \exists es. incTrail G w es \land length es = q div n
```

Corollary 1 is translated into dec-trail-exists-complete. The proof first argues that the number of edges is  $n \cdot (n-1)$  by restricting its domain as done already in Section 2.2.

```
lemma(in distinct-weighted-pair-graph) dec-trail-exists-complete: assumes complete-digraph n G shows (\exists es. decTrail G w es \land length es = n-1)
```

### 2.5 Example Graph $K_4$

We return to the example graph from Figure ?? and show that our results from Sections 2.1-2.4 can be used to prove existence of trails of length k, in particular k=3 in  $K_4$ . Defining the graph and the weight function separately, we use natural numbers as vertices.

```
abbreviation Example Graph:: nat pair-pre-digraph where Example Graph \equiv (| pverts = \{1,2,3,(4::nat)\}, parcs = \{(v_1,v_2). \ v_1 \in \{1,2,3,(4::nat)\} \land v_2 \in \{1,2,3,(4::nat)\} \land v_1 \neq v_2\} |)

abbreviation Example Graph Weight Function :: (nat \times nat) weight-fun where Example Graph Weight Function \equiv (\lambda(v_1,v_2).

if (v_1 = 1 \land v_2 = 2) \lor (v_1 = 2 \land v_2 = 1) then 1 else (if \ (v_1 = 1 \land v_2 = 3) \lor (v_1 = 3 \land v_2 = 1) then 3 else (if \ (v_1 = 1 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 2) then 6 else (if \ (v_1 = 2 \land v_2 = 3) \lor (v_1 = 4 \land v_2 = 2) then 5 else (if \ (v_1 = 2 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 3) then 2 else (if \ (v_1 = 3 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 3) then 2 else (if \ (v_1 = 3 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 3) then 2 else (if \ (v_1 = 3 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 3) then 2 else (if \ (v_1 = 3 \land v_2 = 4) \lor (v_1 = 4 \land v_2 = 3) then 2 else
```

We show that the graph  $K_4$  of Figure ?? satisfies the conditions that were imposed in distinct-weighted-pair-graph and its parent locale, including for example no self loops and distinctiveness. Of course there is still some effort required for this. However, it is necessary to manually construct trails or list all possible weight distributions. Additionally, instead of q! statements there are at most  $\frac{3q}{2}$  statements needed.

#### interpretation example:

 $distinct\text{-}weighted\text{-}pair\text{-}graph\ ExampleGraph\ ExampleGraphWeightFunction}$ 

Now it is an easy task to prove that there is a trail of length 3. We only add the fact that *ExampleGraph* is a *distinct-weighted-pair-graph* and lemma *dec-trail-exists*.

```
\mathbf{lemma}\ \textit{ExampleGraph-decTrail}:
```

```
\exists xs. decTrail\ ExampleGraph\ ExampleGraphWeightFunction\ xs \land length\ xs = 3
```

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