15–210: Parallel and Sequential Data Structures and Algorithms

Practice Exam II (Solutions)

April 2016

• There are 17 pages in this examination, comprising 6 questions worth a total of 116 points. The last few pages are an appendix with costs of sequence, set and table operations.

• You have 80 minutes to complete this examination.

• Please answer all questions in the space provided with the question. Clearly indicate your answers.

• You may refer to your one double-sided $8\frac{1}{2} \times 11$ in sheet of paper with notes, but to no other person or source, during the examination.

Circle the section YOU ATTEND

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Question 1: Short Answers  (30 points)
Please answer the following questions each with a few sentences, or a short snippet of code
(either pseudocode or SML).

(a) (4 points) Consider an undirected graph $G$ with unique positive weights. Suppose it has a
minimum spanning tree $T$. If we square all the edge weights and compute the MST again,
do we still get the same tree structure? Explain briefly.

**Solution:** Yes we get the same tree. The minimum spanning tree only depends on
the ordering among the edges. This is because the only thing we do with edges is
compare them.

(b) (5 points) Lets say you are given a table that maps every student to the set of classes they
take. Fill in the algorithm below that returns all classes, assuming there is at least one
student in each class. Your algorithm must run in $O(m \log n)$ work and $O((\log m)(\log n))$
span, where $n$ is the number of students and $m$ is the sum of the number of classes taken
across all students. Note, our solution is one line.

**Solution:**
```sml
fun allClasses(T) = Table.reduce Set.union ∅ T
```

(c) (5 points) A new startup *FastRoute* wants to route information along a path in a commu-
nication network, represented as a graph. Each vertex represents a router and each edge
a wire between routers. The wires are weighted by the maximum bandwidth they can support. *FastRoute* comes to you and asks you to develop an algorithm to find the path
with maximum bandwidth from any source $s$ to any destination $t$. As you would expect,
the *bandwidth* of a path is the minimum of the bandwidths of the edges on that path; the
minimum edge is the *bottleneck*.

Explain how to modify Dijkstra’s algorithm to do this. In particular, how would you
change the priority queue and the following relax step?

```sml
fun relax (Q, (u,v,w)) = PQ.insert (d(u) + w, v) Q
```

Justify your answer.

**Solution:** We’ll use a max priority queue instead of a min priority queue used in Dijkstra’s. We will also modify the relax step to insert into the priority queue $\min(d(u), w)$
because the quality of a path is the minimum of the edge weights. These changes don’t
affect the correctness of Dijkstra’s, so we could explore the vertices like in Dijkstra’s.
(d) (5 points) Given a graph with integer edge weights between 1 and 5 (inclusive), you want to find the shortest weighted path between a pair of vertices. How would you reduce this problem to the shortest unweighted path problem, which can be solved using BFS?

**Solution:** Replace each edge with weight $i$ with a simple path of $i$ edges each with weight 1. Then solve with BFS.

(e) (5 points) Recall the implementation of DFS shown in class using the `discover` and `finish` functions. Circle the correct answer for each of the following statements, assuming DFS starts at $A$:

- **discover D could be called before discover E:** True False
- **discover E could be called before discover D:** True False
- **discover D could be called before discover C:** True False
- **finish A could be called before finish B:** True False
- **finish D could be called before discover B:** True False

**Solution:** True, True, True, False, True

(f) (6 points) Circle every type of graph listed below for which star contraction will reduce the number of edges by a constant factor in expectation in every round until fully reduced (and hence imply $O(|E|)$ total work). You can assume redundant edges between vertices are removed.

- (a) a graph in which all vertices have degree at most 2
- (b) a graph in which all vertices have degree at most 3
- (c) a graph in which all vertices have degree $\sqrt{|V|}$
- (d) a graph containing a single cycle (i.e. a forest with one additional edge)
- (e) the complete graph (i.e. an edge between every pair of vertices)
- (f) any graph (still circle others if relevant)

**Solution:** a, d, e
Question 2: (Sets and Tables) Bingled  (16 points)

After forming your company Bingle to index the web allowing word searches based on logical combination of terms (e.g. “big” and “small”), you discover that there are already a couple companies out there that do it....and lo-and-behold, they even have similar names. You therefore decide to extend yours with additional features. In particular you want to support phrase queries: e.g. find all documents where “fun algorithms” appears.

You decide the right way to represent the index is as a table of sets where the keys of the table are strings (i.e. the words) and the elements of the sets are pairs of values consisting of a document identifier and an integer location in the document where the string appears. So, for example the following collection of three documents with integer document identifiers:

\[
\langle (1, \text{"the big dog"}), (2, \text{"a big dog ate a hat"}), (3, \text{"i read a big book"}) \rangle
\]

the document index would be represented as

\[
\text{idx} = \{ \text{"a"} \mapsto \{ (2, 0), (2, 4), (3, 2) \}, \text{"big"} \mapsto \{ (1, 1), (2, 1), (3, 3) \}, \text{"dog"} \mapsto \{ (1, 2), (2, 2) \}, \ldots \}
\]

In particular you want to support the following interface

signature INDEX = sig
  type word = string
  type docId = int
  type index = docIdIntSet wordTable

  (* represents all documents and all locations where a phrase appears *)
  type docList

  val makeIndex : (docId * string) seq → index
  val find : index → word → docList
  val adj : docList * docList → docList
  val toSeq : docList → docId seq
end

where, given an index I, toSeq (adj (find I "210", find I "rocks"))) would return a sequence of identifiers of documents where “210” appears immediately before “rocks”, and

toSeq (adj (find I "Phil", adj (find I "loves", find I "cats")))

would return a sequence of identifiers of documents where the phrase “Phil love cats” appears.
(a) (8 points) Show SML code to generate the index from the sequence of documents. It should not be more than 8 lines of code and assuming all words have length less than some constant, must run in $O(n \log n)$ work and $O((\log^2 n))$ span, where $n$ is the total number of words across all documents. A function to break a string into words has been given to you.

```sml

```type index = docIdIntSet wordTable

fun makeIndex (docs : (docId * string) seq) : index = 
let
  fun toWords str = Seq.tokens (fn c ⇒ not (Char.isAlphaNum c)) str

Solution:

```sml

fun tagWords (id,doc) = 
  let val words = toWords doc 
  in Seq.tabulate (fn i = (nth i words, (id, i)) (length words) 
  end

val allPairs = Seq.flatten (Seq.map tagWords docs)

val wordTable = Table.collect allPairs

in 
  Table.map Set.fromSeq wordTable 
end

```

(b) (8 points) Define the docList type and implement the function adj as defined above. You might find the function setmap useful. The solution should only be a few lines of code.

```sml

fun setmap f s = Set.fromSeq (Seq.map f (Set.toSeq s))

Solution:

```sml

```type docList = (docIdIntSet)*int

fun adj ((d1,l1), (d2,l2)) = 
  let 
    val d2’ = setmap (fn (d,i) = (d, i-l1)) d2 
  in 
    (Set.intersection (d1,d2’), l1+l2) 
  end

(* FYI: not part of exam *)
fun find idx word = 
  case Table.find idx word ⇒
    NONE ⇒ (Set.empty(), 1) 
  | SOME d ⇒ (d, 1)
Question 3: Dijkstra and A* (15 points)

(a) (6 points) Consider the graph shown below, where the edge weights appear next to the edges and the heuristic distances to vertex G are in parenthesis next to the vertices.

i. Show the order in which vertices are visited by Dijkstra when the source vertex is A.

Solution: A C B E F D G

ii. Show an order in which vertices are visited by A* when the source vertex is A and the destination vertex is G.

Solution: A C F G

(b) (4 points) What is the key reason you would choose to use A* instead of Dijkstra’s algorithm?

Solution: You can use A* if you want the shortest path to only a single goal vertex, and not all shortest paths. A* can be much more efficient, as it tries to move toward the goal more directly, skipping many more vertices.

(c) (5 points) Show a 3-vertex example of a graph on which Dijkstra’s algorithm always fails. Please clearly identify which vertex is the source.

Solution:

```
A
| / \ x=4 / \ y=-2 x+y < z < x guarantees failure
| / \ x+y < z <= x may fail depending on the input order
S --------- B
 z=3
```

Question 4: (Shortest Paths) Wormholes  (10 points)

(a) (10 points) In your new job for a secret Government agency you have been told about the existence of wormholes (also known as Einstein-Rosen bridges) that connect various locations in the country. You have been tasked with designing an algorithm for finding the shortest path using a combination of roads and wormholes between a pair of locations. Traveling through a wormhole is instantaneous, for all practical purposes, but it turns out that on a given trip someone can only go through two wormholes otherwise they risk rearrangement of their atomic structure. The wormhole problem is therefore the weighted shortest path problem (assuming non-negative edge weights) with the additional constraint that

- Some edges are specially marked
- A path can take at most two of those edges

You still have your Dijkstra code from 210. You don’t want to change your code after all you forgot how ML works so you just want to preprocess your graph so that a call to your code $SP(s, t)$ returns the correct solution to the wormhole problem. Explain how to do this. **At most 5 sentences.**

**Solution:** Create three copies of the graph without the wormhole edges: copy 0, copy 1, and copy 2. Connect copy 0 with copy 1 with the wormhole edges, with weight 0. Likewise connect copy 1 with copy 2 with wormhole edges with weight 0. Now find the shortest path from $SP(s, d)$ by starting at $s$ in copy 0 and finding the shortest path to $d$ in any of the three copies.
Question 5: Strongly Connected Components  (20 points)

In this question, you will write 2 functions on directed graphs. We assume that graphs are represented as:

```
type graph = vertexSet vertexTable
```

with key comparisons taking \( O(1) \) work.

(a) (10 points) Given a directed graph \( G = (V, E) \), its transpose \( G^T \) is another directed graph on the same vertices, with every edge flipped. More formally, \( G^T = (V, E') \), where

\[
E' = \{(b, a) \mid (a, b) \in E\}.
\]

Here is a skeleton of an SML definition for `transpose` that computes the transpose of a graph. Fill in the blanks to complete the implementation. Your implementation must have \( O(|E| \log |V|) \) work and \( O(\log^2 |V|) \) span.

```
fun transpose (G : graph) : graph =
  let
    val S = vertexTable.toSeq(G) (* returns (vertex*vertexSet) seq *)
    fun flip(u,nbrs) = Seq.map (fn v => (v,u)) (vertexSet.toSeq nbrs)
    val ET = Seq.flatten(Seq.map flip S)
    val T = vertexTable. collect ET
  in
    vertexTable.map vertexSet.fromSeq T
  end
```

(b) (10 points) A strongly connected component of a directed graph $G = (V, E)$ is a subset $S$ of $V$ such that every vertex $u \in S$ can reach every other vertex $v \in S$ (i.e., there is a directed path from $u$ to $v$), and such that no other vertex in $V$ can be added to $S$ without violating this condition. Every vertex belongs to exactly one strongly connected component in a graph.

Implement the function:

```ocaml
val scc : graph * vertex -> vertexSet
```

such that $scc(G,v)$ returns the strongly connected component containing $v$. You may assume the existence of a function:

```ocaml
val reachable : graph * vertex -> vertexSet
```

such that $reachable(G,v)$ returns all the vertices reachable from $v$ in $G$. Not including the cost of $reachable$, your algorithm must have $O(|E| \log |V|)$ work and $O(\log^2 |V|)$ span. You might find $transpose$ useful and can assume the given time bounds.

```ocaml
fun scc (G : graph, v : vertex) : vertexSet =
    vertexSet.intersection(reachable(G,v),
                           reachable(transpose G,v))
```
Question 6: MST and Tree Contraction  (25 points)

In SegmentLab, you implemented Borůvka’s algorithm that interleaved star contractions and finding minimum weight edges. In this question you will analyze Borůvka’s algorithm more carefully.

We’ll assume throughout this problem that the edges are undirected, and each edge is labeled with a unique identifier (ℓ). The weights of the edges do not need to be unique, and $m = |E|$ and $n = |V|$.

1 % returns the set of edges in the minimum spanning tree of G
2 function MST(G = (V, E)) =
3     if |E| = 0 then {} 
4     else let
5         val F = \{min weight edge incident on v:v ∈ V\}
6         val (V′, P) = contract each tree in the forest (V, F) to a single vertex
7             V′ = remaining vertices
8             P = mapping from each v ∈ V to its representative in V′
9         val E′ = \{(P_u, P_v, ℓ): (u, v, ℓ) ∈ E \mid P_u ≠ P_v\}
10     in
11         MST(G′ = (V′, E′)) ∪ {ℓ: (u, v, ℓ) ∈ F}
12 end

(a) (4 points) Show an example graph with 4 vertices in which F will not include all the edges of the MST.

Solution:

\[
\begin{array}{c}
3 \\
\circ --- \circ \\
1 | \quad | 2 \\
\circ \quad \circ
\end{array}
\]

(b) (4 points) Prove that the set of edges F must be a forest (i.e. F has no cycle).

Solution: Answer 1: The MST does not have a cycle (it is a tree) and F is a subset of F so it can’t have a cycle.
Answer 2: AFSOC that there is a cycle. Consider the maximum weight edge on the cycle. Neither of its endpoints will choose it since they both have lighter edges. Contradiction.
(c) (4 points) Suggest a technique to efficiently contract the forest in parallel. What is a tight asymptotic bound for the work and span of your contract, in terms of \( n \)? Explain briefly. Are these bounds worst case or expected case?

**Solution:** Use star contraction as described in class. Since in contraction a tree will always stay a tree, the number of edges must go down with the number of vertices. Therefore total work will be \( O(n) \) and span will be \( O(\log^2 n) \) in expectation.

(d) (4 points) Argue that each recursive call to \( \text{MST} \) removes, in the worst case, at least half of the vertices; that is, \( |V'| \leq \frac{|V|}{2} \).

**Solution:** Every vertex will join at least one other vertex. Since edges have two directions, at least \( n/2 \) of them must be selected, which will remove at least \( n/2 \) vertices (\( n = |V| \)).

(e) (4 points) What is the maximum number of edges that could remain after one step (i.e. what is \( |E'| \))? Explain briefly.

**Solution:** \( m - n/2 \) since at least \( n/2 \) edges are removed, as described in previous answer.

(f) (5 points) What is the expected work and span of the overall algorithm in terms of \( m \) and \( n \)? Explain briefly. You can assume that calculating \( F \) takes \( O(m) \) work and \( O(\log n) \) span.

**Solution:** Since vertices go down by at least a factor of 1/2 on each round, there will be at most \( \log n \) rounds. The cost of each round is dominated by calculating \( F \), \( O(m) \) work and \( O(\log n) \) span and the contraction of forests \( O(n) \) work and \( O(\log^2 n) \) span. Multiplying the max of each of these by \( \log n \) gives \( O(m \log n) \) work and \( O(\log^3 n) \) span.
Appendix: Library Functions

signature SEQUENCE =
sig
type 'a t
  type 'a seq = 'a t
  type 'a ord = 'a * 'a -> order
datatype 'a listview = NIL | CONS of 'a * 'a seq
datatype 'a treeview = EMPTY | ONE of 'a | PAIR of 'a seq * 'a seq

exception Range
exception Size

val nth : 'a seq -> int -> 'a
val length : 'a seq -> int
val toList : 'a seq -> 'a list
val toString : ('a -> string) -> 'a seq -> string
val equal : ('a * 'a -> bool) -> 'a seq * 'a seq -> bool

val empty : unit -> 'a seq
val singleton : 'a -> 'a seq
val tabulate : (int -> 'a) -> int -> 'a seq
val fromList : 'a list -> 'a seq

val rev : 'a seq -> 'a seq
val append : 'a seq * 'a seq -> 'a seq
val flatten : 'a seq seq -> 'a seq
val filter : ('a -> bool) -> 'a seq -> 'a seq
val map : ('a -> 'b) -> 'a seq -> 'b seq
val zip : 'a seq * 'b seq -> ('a * 'b) seq
val zipWith : ('a * 'b -> 'c) -> 'a seq * 'b seq -> 'c seq

val enum : 'a seq -> (int * 'a) seq
val filterIdx : (int * 'a -> bool) -> 'a seq -> 'a seq
val mapIdx : (int * 'a -> 'b) -> 'a seq -> 'b seq
val update : 'a seq * (int * 'a) -> 'a seq
val inject : 'a seq * (int * 'a) seq -> 'a seq

val subseq : 'a seq -> int * int -> 'a seq
val take : 'a seq -> int -> 'a seq
val drop : 'a seq -> int -> 'a seq
val splitHead : 'a seq -> 'a listview
val splitMid : 'a seq -> 'a treeview

val iterate : ('b * 'a -> 'b) -> 'b -> 'a seq -> 'b
val iteratePrefixes : ('b * 'a -> 'b) -> 'b -> 'a seq -> 'b seq * 'b
val iteratePrefixesIncl : ('b * 'a -> 'b) -> 'b -> 'a seq -> 'b seq
val reduce : ('a * 'a -> 'a) -> 'a -> 'a seq -> 'a
val scan : ('a * 'a -> 'a) -> 'a -> 'a seq -> 'a seq
val scanIncl : ('a * 'a -> 'a) -> 'a -> 'a seq -> 'a seq

val sort : 'a ord -> 'a seq -> 'a seq
val merge : 'a ord -> 'a seq * 'a seq -> 'a seq
val collect : 'a ord -> ('a * 'b) seq -> ('a * 'b seq) seq
val collate : 'a ord -> 'a seq ord
val argmax : 'a ord -> 'a seq -> int
val $ : 'a -> 'a seq
val % : 'a list -> 'a seq

<table>
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<th>ArraySequence</th>
<th>Work</th>
<th>Span</th>
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<td>empty ()</td>
<td></td>
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<tr>
<td>singleton a</td>
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<tr>
<td>length s</td>
<td>O(1)</td>
<td>O(1)</td>
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<tr>
<td>nth s i</td>
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<td></td>
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<tr>
<td>subseq s (i, len)</td>
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<td></td>
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<tr>
<td>tabulate f n</td>
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</tr>
<tr>
<td>if f(i) has Wᵢ work and Sᵢ span</td>
<td>O(∑ᵢ₌₀ⁿ⁻¹ Wᵢ)</td>
<td>O(∑ᵢ₌₀ⁿ⁻¹ max Sᵢ)</td>
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<tr>
<td>map f s</td>
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<tr>
<td>if f(s[i]) has Wᵢ work and Sᵢ span, and</td>
<td>O(n)</td>
<td>O(lg n)</td>
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<tr>
<td>zipWith f (s, t)</td>
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<tr>
<td>if f(s[i], t[i]) has Wᵢ work and Sᵢ span, and min(</td>
<td>s</td>
<td>,</td>
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<td>reduce f b s</td>
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<td>if f does constant work and</td>
<td>O(n)</td>
<td>O(lg n)</td>
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<tr>
<td>scan f b s</td>
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<td>if f does constant work and</td>
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<td>filter p s</td>
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<tr>
<td>if p does constant work and</td>
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<tr>
<td>flatten s</td>
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<tr>
<td>O(1 +</td>
<td>s[i]</td>
<td>)</td>
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<tr>
<td>sort cmp s</td>
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<tr>
<td>if cmp does constant work and</td>
<td>O(n lg n)</td>
<td>O(lg² n)</td>
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<tr>
<td>merge cmp (s, t)</td>
<td></td>
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<tr>
<td>if cmp does constant work,</td>
<td>O(m + n)</td>
<td>O(lg(m + n))</td>
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<tr>
<td>append (s, t)</td>
<td></td>
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</tr>
<tr>
<td>if</td>
<td>s</td>
<td>= n, and</td>
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</tbody>
</table>
signature TABLE =
sig
  structure Key : EQKEY
  structure Seq : SEQUENCE

  type 'a t
  type 'a table = 'a t

  structure Set : SET where Key = Key and Seq = Seq

  val size : 'a table -> int
  val domain : 'a table -> Set.t
  val range : 'a table -> 'a Seq.t
  val toString : ('a -> string) -> 'a table -> string
  val toSeq : 'a table -> (Key.t * 'a) Seq.t

  val find : 'a table -> Key.t -> 'a option
  val insert : 'a table * (Key.t * 'a) -> 'a table
  val insertWith : ('a * 'a -> 'a) -> 'a table * (Key.t * 'a) -> 'a table
  val delete : 'a table * Key.t -> 'a table

  val empty : unit -> 'a table
  val singleton : Key.t * 'a -> 'a table
  val tabulate : (Key.t -> 'a) -> Set.t -> 'a table
  val collect : (Key.t * 'a) Seq.t -> 'a Seq.t table
  val fromSeq : (Key.t * 'a) Seq.t -> 'a table

  val map : ('a -> 'b) -> 'a table -> 'b table
  val mapKey : (Key.t * 'a -> 'b) -> 'a table -> 'b table
  val filter : ('a -> bool) -> 'a table -> 'a table
  val filterKey : (Key.t * 'a -> bool) -> 'a table -> 'a table

  val reduce : ('a * 'a -> 'a) -> 'a -> 'a table -> 'a
  val iterate : ('b * 'a -> 'b) -> 'b -> 'a table -> 'b
  val iteratePrefixes : ('b * 'a -> 'b) -> 'b -> 'a table -> ('b table * 'b)

  val union : ('a * 'a -> 'a) -> ('a table * 'a table) -> 'a table
  val intersection : ('a * 'b -> 'c) -> ('a table * 'b table) -> 'c table
  val difference : 'a table * 'b table -> 'a table

  val restrict : 'a table * Set.t -> 'a table
  val subtract : 'a table * Set.t -> 'a table

  val $ : (Key.t * 'a) -> 'a table
end
signature SET =
  sig
    structure Key : EQKEY
    structure Seq : SEQUENCE

    type t
    type set = t

    val size : set -> int
    val toString : set -> string
    val toSeq : set -> Key.t Seq.t

    val empty : unit -> set
    val singleton : Key.t -> set
    val fromSeq : Key.t Seq.t -> set

    val find : set -> Key.t -> bool
    val insert : set * Key.t -> set
    val delete : set * Key.t -> set

    val filter : (Key.t -> bool) -> set -> set

    val reduceKey : (Key.t * Key.t -> Key.t) -> Key.t -> set -> Key.t
    val iterateKey : ('a * Key.t -> 'a) -> 'a -> set -> 'a

    val union : set * set -> set
    val intersection : set * set -> set
    val difference : set * set -> set

    val $ : Key.t -> set
  end
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<tr>
<th>MktTreapTable</th>
<th>Work</th>
<th>Span</th>
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<tbody>
<tr>
<td>size $T$</td>
<td>$O(1)$</td>
<td>$O(1)$</td>
</tr>
<tr>
<td>filter $f$ $T$</td>
<td>$\sum_{(k \mapsto v) \in T} W(f(v)) \log</td>
<td>T</td>
</tr>
<tr>
<td>map $f$ $T$</td>
<td>$\sum_{k \in X} W(f(k)) \max_{k \in X} S(f(k))$</td>
<td></td>
</tr>
<tr>
<td>tabulate $f$ $X$</td>
<td>$O(</td>
<td>T</td>
</tr>
<tr>
<td>reduce $f$ $b$ $T$</td>
<td>$O(</td>
<td>T</td>
</tr>
<tr>
<td>insertWith $f$ $(T, (k, v))$</td>
<td>$O(</td>
<td>\log</td>
</tr>
<tr>
<td>find $T$ $k$</td>
<td>$O(</td>
<td>\log</td>
</tr>
<tr>
<td>delete $(T, k)$</td>
<td>$O(</td>
<td>\log</td>
</tr>
<tr>
<td>domain $T$</td>
<td>$O(</td>
<td>T</td>
</tr>
<tr>
<td>range $T$</td>
<td>$O(</td>
<td>T</td>
</tr>
<tr>
<td>toSeq $T$</td>
<td>$O(</td>
<td>S</td>
</tr>
<tr>
<td>collect $S$</td>
<td>$O(</td>
<td>S</td>
</tr>
<tr>
<td>fromSeq $S$</td>
<td>$O(</td>
<td>S</td>
</tr>
</tbody>
</table>

For each argument pair $(A, B)$ below, let $n = \max(|A|, |B|)$ and $m = \min(|A|, |B|)$.

<table>
<thead>
<tr>
<th>MktTreapTable</th>
<th>Work</th>
<th>Span</th>
</tr>
</thead>
<tbody>
<tr>
<td>union $f$ $(X, Y)$</td>
<td>$O(m \log (O(\log (n + m))/m))$</td>
<td></td>
</tr>
<tr>
<td>intersection $f$ $(X, Y)$</td>
<td>$O(m \log (O(\log (n + m))/m))$</td>
<td></td>
</tr>
<tr>
<td>difference $(X, Y)$</td>
<td>$O(m \log (O(\log (n + m))/m))$</td>
<td></td>
</tr>
<tr>
<td>restrict $(T, X)$</td>
<td>$O(m \log (O(\log (n + m))/m))$</td>
<td></td>
</tr>
<tr>
<td>subtract $(T, X)$</td>
<td>$O(m \log (O(\log (n + m))/m))$</td>
<td></td>
</tr>
</tbody>
</table>