

Region Quadtrees

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Abstract

These theories formalize *region quadtrees*, which are traditionally used to represent two-dimensional images of (black and white) pixels. Building on these quadtrees, addition and multiplication of recursive block matrices are verified. The generalization of region quadtrees to k dimensions is also formalized.

1 Introduction

These theories formalize so-called *region quadtrees*, as opposed to *point quadtrees* [5, 6, 1]. The following variants are covered:

- Ordinary region quadtrees.
- Block matrices based on region quadtrees. Operations: matrix addition and multiplication. Based on the work of Wise [7, 8, 9, 10, 11].
- A k -dimensional generalization of region quadtrees. This is inspired by the k -dimensional point trees by Bentley [2, 3] which have already been formalized by Rau [4].

For the details of the operations covered see the individual theories.

Contents

1	Introduction	1
2	Quad Tree Basics	3
3	Quad Trees	3
3.1	Compression	3
3.2	Abstraction function	4
3.3	Boolean Quadtrees	5
3.3.1	Abstraction of boolean quadtrees to sets of points . . .	5

3.3.2	Union, Intersection Difference and Complement	6
3.4	Operation <i>put</i>	10
3.5	Extract Square	11
3.6	From Matrix to Quadtree	14
3.6.1	Matrix as function	14
3.6.2	Matrix as list of lists	14
3.7	From Quadtree to Matrix	16
4	Block Matrices via Quad Trees	17
4.1	Square Matrices	17
4.2	Matrix Lemmas	18
4.3	Real Quad Trees and Abstraction to Matrices	18
4.4	Matrix Operations on Trees	19
4.5	Correctness of Quad Tree Implementations	20
4.5.1	<i>add</i>	20
4.5.2	<i>mult</i>	22
5	K-dimensional Region Trees	23
5.1	Subtree	24
5.2	Shifting a coordinate by a boolean vector	24
5.3	Points in a tree	25
5.4	Compression	26
5.5	Extracting a point from a tree	26
5.6	Modifying a point in a tree	27
5.7	Union	29
6	K-dimensional Region Trees - Version 2	30
6.1	Subtree	31
6.2	Shifting a coordinate by a boolean vector	31
6.3	Points in a tree	32
6.4	Compression	33
6.5	Union	33
6.6	Extracting a point from a tree	34
7	K-dimensional Region Trees - Nested Trees	35

2 Quad Tree Basics

```
theory Quad-Base
imports HOL-Library.Tree
begin

datatype 'a qtree = L 'a | Q 'a qtree 'a qtree 'a qtree 'a qtree

instantiation qtree :: (type)height
begin

fun height-qtree :: 'a qtree ⇒ nat where
height (L _) = 0 |
height (Q t0 t1 t2 t3) =
Max {height t0, height t1, height t2, height t3} + 1

instance ..

end

end
```

3 Quad Trees

```
theory Quad-Tree
imports Quad-Base
begin

lemma diff-shunt: ( $\{\} = x - y \longleftrightarrow x \leq y$ )
by blast

lemma mod-minus:  $\llbracket i < 2*m; \neg i < m \rrbracket \implies i \bmod m = i - (m::nat)$ 
by (simp add: div-if modulo-nat-def)

definition select :: bool ⇒ bool ⇒ 'a ⇒ 'a ⇒ 'a ⇒ 'a where
select x y t0 t1 t2 t3 =
(if x then
 if y then t0 else t1
else
 if y then t2 else t3)

abbreviation qf where
qf q f i j d ≡ q (f i j) (f (i+d) j) (f (i+d) (j+d))
```

3.1 Compression

```
fun compressed :: 'a qtree ⇒ bool where
compressed (L _) = True |
```

```

compressed (Q t0 t1 t2 t3) = ((compressed t0 ∧ compressed t1 ∧ compressed t2
∧ compressed t3)
∧ ¬ (Ǝ x. t0 = L x ∧ t1 = t0 ∧ t2 = t0 ∧ t3 = t0))

fun Qc :: 'a qtree ⇒ 'a qtree ⇒ 'a qtree ⇒ 'a qtree ⇒ 'a qtree where
  Qc (L x0) (L x1) (L x2) (L x3) =
    (if x0=x1 ∧ x1=x2 ∧ x2=x3 then L x0 else Q (L x0) (L x1) (L x2) (L x3)) |
  Qc t0 t1 t2 t3 = Q t0 t1 t2 t3

```

Compressing version of Q :

```

lemma compressed-Qc: [[compressed t0; compressed t1; compressed t2; compressed
t3]] ⇒
  compressed (Qc t0 t1 t2 t3)
by(induction t0 t1 t2 t3 rule: Qc.induct) (auto split!: qtree.split)

```

```

lemma compressedQD: compressed (Q t1 t2 t3 t4)
  ⇒ compressed t1 ∧ compressed t2 ∧ compressed t3 ∧ compressed t4
using compressed.simps(2) by blast

```

```

lemma height-Qc-Q: [[height s0 ≤ n; height s1 ≤ n; height s2 ≤ n; height s3 ≤
n]] ⇒
  height (Qc s0 s1 s2 s3) ≤ Suc n
apply(cases (s0,s1,s2,s3) rule: Qc.cases)
using [[simp-depth-limit=1]]apply simp-all
done

```

Modify a quadrant addressed by x and y , and put things back together with Qc :

```

fun modify :: ('a qtree ⇒ 'a qtree) ⇒ bool ⇒ bool ⇒ 'a qtree *'a qtree *'a qtree
* 'a qtree ⇒ 'a qtree where
  modify f x y (t0, t1, t2, t3) =
    (if x then
      if y then Qc (f t0) t1 t2 t3 else Qc t0 (f t1) t2 t3
    else
      if y then Qc t0 t1 (f t2) t3 else Qc t0 t1 t2 (f t3))

```

3.2 Abstraction function

```

fun get :: nat ⇒ 'a qtree ⇒ nat ⇒ nat ⇒ 'a where
  get n (L b) - - = b |
  get (Suc n) (Q t0 t1 t2 t3) i j =
    get n (select (i < 2^n) (j < 2^n) t0 t1 t2 t3) (i mod 2^n) (j mod 2^n)

lemma get-Qc:
  height(Q t0 t1 t2 t3) ≤ n ⇒ get n (Qc t0 t1 t2 t3) i j = get n (Q t0 t1 t2 t3) i
  j
apply(cases n)
apply simp
apply(cases (t0,t1,t2,t3) rule: Qc.cases)

```

```
apply(simp-all add: select-def)
done
```

3.3 Boolean Quadtrees

type-synonym $qtb = \text{bool qtree}$

3.3.1 Abstraction of boolean quadtrees to sets of points

Superceded by the more general *get* abstraction.

type-synonym $points = (\text{nat} \times \text{nat}) \text{ set}$

abbreviation $sq :: \text{nat} \Rightarrow points \text{ where}$
 $sq (n::\text{nat}) \equiv \{0..<2^n\} \times \{0..<2^n\}$

definition $shift :: \text{nat} \Rightarrow \text{nat} \Rightarrow \text{nat} * \text{nat} \Rightarrow \text{nat} * \text{nat} \text{ where}$
 $shift di dj = (\lambda(i,j). (i+di, j+dj))$

lemma $shift\text{-pair}[simp]: shift di dj (a,b) = (a+di, b+dj)$
by(simp add: shift-def)

lemma $in\text{-shift}\text{-image}: (x,y) \in shift di dj ` M \longleftrightarrow di \leq x \wedge dj \leq y \wedge (x-di, y-dj) \in M$
by(force simp: shift-def)

lemma $inj\text{-shift}: inj (shift i j)$
by (auto simp: inj-def)

lemma $shift\text{-disj}\text{-shift}: \llbracket s \subseteq sq n; s' \subseteq sq n; i \geq i' + 2^n \vee i' \geq i + 2^n \vee j \geq j' + 2^n \vee j' \geq j + 2^n \rrbracket \implies shift i j ` s \cap shift i' j' ` s' = \{\}$
by (auto simp add: in-shift-image)

Convention: $A, B :: points$

The layout of the 4 subquadrants $Q t0 t1 t2 t3 / Qsq A0 A1 A2 A3: 1 3 0 2$ That is, the x and y coordinates are shifted as follows (where $1 = 2^n$):
 $(0,1) (1,1) (0,0) (1,0)$

definition $Qsq :: \text{nat} \Rightarrow points \Rightarrow points \Rightarrow points \Rightarrow points \text{ where}$
 $Qsq n A0 A1 A2 A3 = shift 0 0 ` A0 \cup shift 0 (2^n) ` A1 \cup shift (2^n) 0 ` A2 \cup shift (2^n) (2^n) ` A3$

lemma $sq\text{-Suc}\text{-}Qsq: \{0..<2 * 2^n\} \times \{0..<2 * 2^n\} = Qsq n (sq n) (sq n)$
 $(sq n) (sq n)$
by(auto simp: in-shift-image Qsq-def)

fun $points :: \text{nat} \Rightarrow qtb \Rightarrow (\text{nat} * \text{nat}) \text{ set} \text{ where}$
 $points n (L b) = (\text{if } b \text{ then } sq n \text{ else } \{\}) |$
 $points (Suc n) (Q t0 t1 t2 t3) = Qsq n (points n t0) (points n t1) (points n t2) (points n t3)$

```

lemma points-subset: height t ≤ n ==> points n t ⊆ sq n
proof(induction n t rule: points.induct)
  case 1
    then show ?case by simp
  next
    case (2 n t0 t1 t2 t3)
      from 2.prem have h: height t0 ≤ n height t1 ≤ n height t2 ≤ n height t3 ≤ n
        by (auto)
      thus ?case
        using 2.prem 2.IH(1)[OF h(1)] 2.IH(2)[OF h(2)] 2.IH(3)[OF h(3)] 2.IH(4)[OF
        h(4)]
          by (auto simp add: Let-def shift-def Qsq-def)
  next
    case 3 thus ?case
      by simp
  qed

lemma point-Suc-Qc[simp]: points (Suc n) (Qc t0 t1 t2 t3) = points (Suc n) (Q
t0 t1 t2 t3)
by(induction t0 t1 t2 t3 rule: Qc.induct) (auto simp: in-shift-image Qsq-def)

lemma get-points: [ height t ≤ n; (i,j) ∈ sq n ] ==> get n t i j = ((i,j) ∈ points n
t)
proof(induction n t i j rule: get.induct)
  case 1
    then show ?case by simp
  next
    case (2 n t0 t1 t2 t3)
      thus ?case using points-subset[of t0 n] points-subset[of t1 n] points-subset[of t2
n]
        by(auto simp: select-def in-shift-image mod-minus Qsq-def)
  next
    case 3
      then show ?case by simp
  qed

```

3.3.2 Union, Intersection Difference and Complement

```

fun union :: qtb ⇒ qtb ⇒ qtb where
  union (L b) t = (if b then L True else t) |
  union t (L b) = (if b then L True else t) |
  union (Q s1 s2 s3 s4) (Q t1 t2 t3 t4) = Qc (union s1 t1) (union s2 t2) (union
s3 t3) (union s4 t4)

fun inter :: qtb ⇒ qtb ⇒ qtb where
  inter (L b) t = (if b then t else L False) |
  inter t (L b) = (if b then t else L False) |
  inter (Q s1 s2 s3 s4) (Q t1 t2 t3 t4) = Qc (inter s1 t1) (inter s2 t2) (inter s3
t3) (inter s4 t4)

```

$t3) \ (inter\ s4\ t4)$

```
fun negate :: qtb ⇒ qtb where
  negate (L b) = L(¬b) |
  negate (Q t1 t2 t3 t4) = Q (negate t1) (negate t2) (negate t3) (negate t4)

fun diff :: qtb ⇒ qtb ⇒ qtb where
  diff (L b) t = (if b then negate t else L False) |
  diff t (L b) = (if b then L False else t) |
  diff (Q s1 s2 s3 s4) (Q t1 t2 t3 t4) = Qc (diff s1 t1) (diff s2 t2) (diff s3 t3) (diff
s4 t4)
```

lemma *Qsq-union*:

```
Qsq n A0 A1 A2 A3 ∪ Qsq n B0 B1 B2 B3 = Qsq n (A0 ∪ B0) (A1 ∪ B1) (A2
∪ B2) (A3 ∪ B3)
by(auto simp: Qsq-def)
```

lemma *points-union*:

```
max (height t1) (height t2) ≤ n ⇒ points n (union t1 t2) = points n t1 ∪ points
n t2
```

proof(induction t1 t2 arbitrary: n rule: union.induct)

case 1 **thus** ?case **using** Un-absorb2[*OF points-subset*] **by** simp
 next

case 2 **thus** ?case **using** Un-absorb1[*OF points-subset*] **by** simp
 next

case 3

from 3.prems **obtain** m **where** n = Suc m **by** (auto dest: Suc-le-D)
 thus ?case **using** 3 **by** (simp add: Qsq-union)

qed

lemma *height-union*: height (union t1 t2) ≤ max (height t1) (height t2)

proof(induction t1 t2 rule: union.induct)

case 3 **then show** ?case

by(auto simp add: height-Qc-Q le-max-iff-disj simp del: max.absorb1 max.absorb2
max.absorb3 max.absorb4)

qed auto

lemma *height-union2*: $\llbracket \text{height } t1 \leq n; \text{height } t2 \leq n \rrbracket \Rightarrow \text{height } (\text{union } t1 t2) \leq n$
by (meson height-union le-trans max.bounded-iff)

lemma *get-union*:

```
max (height t1) (height t2) ≤ n ⇒ get n (union t1 t2) i j = (get n t1 i j ∨ get
n t2 i j)
```

proof(induction t1 t2 arbitrary: i j n rule: union.induct)

case 3

from 3.prems **obtain** m **where** n = Suc m **by** (auto dest: Suc-le-D)
 thus ?case **using** 3 **by** (auto simp add: get-Qc height-union2 select-def)

```

qed auto

lemma compressed-union: compressed t1 ==> compressed t2 ==> compressed(union
t1 t2)
proof(induction t1 t2 arbitrary: rule: union.induct)
  case 1 thus ?case using Un-absorb2[OF points-subset] by simp
next
  case 2 thus ?case using Un-absorb1[OF points-subset] by simp
next
  case 3
  thus ?case
    by (metis compressedQD compressed-Qc union.simps(3))
qed

lemma Qsq-inter:
  [ A0 ⊆ sq n; A1 ⊆ sq n; A2 ⊆ sq n; A3 ⊆ sq n;
    B0 ⊆ sq n; B1 ⊆ sq n; B2 ⊆ sq n; B3 ⊆ sq n ]
  ==> Qsq n A0 A1 A2 A3 ∩ Qsq n B0 B1 B2 B3 = Qsq n (A0 ∩ B0) (A1 ∩ B1)
  (A2 ∩ B2) (A3 ∩ B3)
  by(simp add: Qsq-def Int-Un-distrib Int-Un-distrib2 shift-disj-shift image-Int inj-shift)

lemma points-inter: n ≥ max (height t1) (height t2) ==>
  points n (inter t1 t2) = points n t1 ∩ points n t2
proof(induction t1 t2 arbitrary: n rule: inter.induct)
  case 1 thus ?case by (simp add: inf-absorb2[OF points-subset])
next
  case 2 thus ?case by (simp add: inf-absorb1[OF points-subset])
next
  case 3
  from 3.prems obtain m where n = Suc m by (auto dest: Suc-le-D)
  thus ?case using 3.prems 3.IH[of m]
    by (simp add: Qsq-inter points-subset)
qed

lemma height-inter: height (inter t1 t2) ≤ max (height t1) (height t2)
proof(induction t1 t2 rule: inter.induct)
  case 3 then show ?case
    by(auto simp add: height-Qc-Q le-max-iff-disj simp del: max.absorb1 max.absorb2
      max.absorb3 max.absorb4)
qed auto

lemma height-inter2: [ height t1 ≤ n; height t2 ≤ n ] ==> height (inter t1 t2) ≤
n
by (meson height-inter le-trans max.bounded-iff)

lemma get-inter:
  [ height t1 ≤ n; height t2 ≤ n ] ==> get n (inter t1 t2) i j = (get n t1 i j ∧ get
n t2 i j)
proof(induction t1 t2 arbitrary: i j n rule: union.induct)

```

```

case 3
from 3.prems obtain m where n = Suc m by (auto dest: Suc-le-D)
thus ?case using 3 by (auto simp add: get-Qc height-inter2 select-def)
qed auto

lemma compressed-inter: compressed t1  $\Rightarrow$  compressed t2  $\Rightarrow$  compressed(inter t1 t2)
proof(induction t1 t2 arbitrary: rule: inter.induct)
  case 1 thus ?case using Un-absorb2[OF points-subset] by simp
  next
    case 2 thus ?case using Un-absorb1[OF points-subset] by simp
  next
    case 3
    thus ?case
      by (metis compressedQD compressed-Qc inter.simps(3))
qed

lemma Qsq-diff:  $\llbracket B0 \subseteq sq\ n; B1 \subseteq sq\ n; B2 \subseteq sq\ n; B3 \subseteq sq\ n; A0 \subseteq sq\ n; A1 \subseteq sq\ n; A2 \subseteq sq\ n; A3 \subseteq sq\ n \rrbracket \Rightarrow$ 
   $Qsq\ n\ B0\ B1\ B2\ B3 - Qsq\ n\ A0\ A1\ A2\ A3 = Qsq\ n\ (B0 - A0)\ (B1 - A1)$ 
   $(B2 - A2)\ (B3 - A3)$ 
by (auto simp add: in-shift-image Qsq-def)

lemma points-negate:  $n \geq height\ t \Rightarrow points\ n\ (\negate\ t) = sq\ n - points\ n\ t$ 
proof(induction t arbitrary: n rule: negate.induct)
  case 1 thus ?case by (simp)
  next
    case (2 t0 t1 t2 t3)
    obtain m where [simp]: n = Suc m using Suc-le-D 2.prems by auto
    thus ?case using 2.prems 2.IH[of m]
      by(simp add: sq-Suc-Qsq Qsq-diff points-subset)
qed

lemma negate-eq-L-iff: compressed t  $\Rightarrow$  negate t = L x  $\longleftrightarrow$  t = L( $\neg x$ )
by(cases t) auto

lemma compressed-negate: compressed t  $\Rightarrow$  compressed(negate t)
proof(induction t)
  case L thus ?case by simp
  next
    case Q
    thus ?case using negate-eq-L-iff by force
qed

lemma points-diff:  $n \geq max\ (height\ t1)\ (height\ t2) \Rightarrow$ 
   $points\ n\ (diff\ t1\ t2) = points\ n\ t1 - points\ n\ t2$ 
proof(induction t1 t2 arbitrary: n rule: diff.induct)
  case 1 thus ?case by (simp add: points-negate)

```

```

next
  case 2 thus ?case using points-subset by (simp add: diff-shunt)
next
  case 3
    from 3.prems obtain m where n = Suc m by (auto dest: Suc-le-D)
    thus ?case using 3.prems 3.IH[of m]
      by (simp add: Qsq-diff points-subset)
qed

lemma compressed-diff: compressed t1  $\implies$  compressed t2  $\implies$  compressed(diff t1 t2)
proof(induction t1 t2 arbitrary: rule: diff.induct)
  case 1 thus ?case
    by (simp add: compressed-negate)
next
  case 2 thus ?case by simp
next
  case 3
  thus ?case
    by (metis compressedQD compressed-Qc diff.simps(3))
qed

```

3.4 Operation put

```

fun put :: nat  $\Rightarrow$  nat  $\Rightarrow$  'a  $\Rightarrow$  nat  $\Rightarrow$  'a qtree  $\Rightarrow$  'a qtree where
  put i j a 0 (L -) = L a |
  put i j a (Suc n) t = modify (put (i mod 2^n) (j mod 2^n) a n) (i < 2^n) (j < 2^n)
    (case t of L b  $\Rightarrow$  (L b, L b, L b, L b) | Q t0 t1 t2 t3  $\Rightarrow$  (t0,t1,t2,t3))

lemma points-put:  $\llbracket \text{height } t \leq n; (i,j) \in sq n \rrbracket \implies$ 
  points n (put i j b n t) = (if b then points n t  $\cup$  {(i,j)} else points n t  $-$  {(i,j)})
proof(induction i j b n t rule: put.induct)
  case 1
  then show ?case by (simp)
next
  case 2
  thus ?case unfolding mem-Sigma-iff using points-subset
    apply(simp add: select-def sq-Suc-Qsq Qsq-def mod-minus split: qtree.split)
    by(fastforce simp: mod-minus in-shift-image)
qed auto

lemma height-put: height t  $\leq$  n  $\implies$  height (put i j a n t)  $\leq$  n
proof(induction i j a n t rule: put.induct)
  case 2
  then show ?case by (auto simp: height-Qc-Q split: qtree.split)
qed auto

lemma get-put:  $\llbracket \text{height } t \leq n; (i,j) \in sq n; (i',j') \in sq n \rrbracket \implies$ 

```

```

get n (put i j a n t) i' j' = (if i'=i ∧ j'=j then a else get n t i' j')
proof(induction i j a n t arbitrary: i' j' rule: put.induct)
  case 1
    then show ?case by (auto)
  next
    case 2
      thus ?case
        by(auto simp add: select-def mod-minus get-Qc height-put less-diff-conv2 split!: qtree.split)
  qed auto

lemma compressed-put:
  [height t ≤ n; compressed t] ⇒ compressed (put i j a n t)
proof(induction i j a n t rule: put.induct)
  case 1
    then show ?case by (simp)
  next
    case 2
      thus ?case by (auto simp add: compressed-Qc split: qtree.split)
  qed auto

```

3.5 Extract Square

```

fun get-sq :: nat ⇒ 'a qtree ⇒ nat ⇒ nat ⇒ nat ⇒ 'a qtree where
  get-sq n (L b) m i j = L b |
  get-sq n t 0 i j = L (get n t i j) |
  get-sq (Suc n) (Q t0 t1 t2 t3) (Suc m) i j =
    (if i mod 2^n + 2^(m+1) ≤ 2^n ∧ j mod 2^n + 2^(m+1) ≤ 2^n
     then get-sq n (select (i < 2^n) (j < 2^n) t0 t1 t2 t3) (m+1) (i mod 2^n) (j mod 2^n)
     else qf Qc (get-sq (Suc n) (Q t0 t1 t2 t3) m) i j (2^m))

lemma shift-shift: shift i j ` (shift i' j' ` s) = shift (i+i') (j+j') ` s
using image-iff by(fastforce simp add: shift-def)
lemma shift-shift2: shift i j ` (shift i' j' ` s) = shift (i'+i) (j'+j) ` s
by(simp add: shift-shift Groups.add-ac)

lemma shift-split: shift i j ` s =
  shift (i - i mod 2^n) (j - j mod 2^n) ` (shift (i mod 2^n) (j mod 2^n) ` s)
by (simp add: shift-shift)

lemma plus-pow-aux: (i::nat) + 2^m ≤ 2*2^n ⇒ i < 2 * 2^n
by (metis add-leD1 le-neq-implies-less less-exp nat-add-left-cancel-less not-add-less1)

lemma Qsq-lem: [ A0 ⊆ sq n; A1 ⊆ sq n; A2 ⊆ sq n; A3 ⊆ sq n;
  i + 2^m ≤ 2^Suc n; j + 2^m ≤ 2^Suc n;
  i mod 2^n + 2^m ≤ 2^n; j mod 2^n + 2^m ≤ 2^n ] ⇒
  Qsq n A0 A1 A2 A3 ∩ shift i j ` sq m =
  shift (i - i mod 2^n) (j - j mod 2^n) ` select (i < 2^n) (j < 2^n) A0 A1

```

```

A2 A3 ∩ shift i j ` sq m
by (auto simp: select-def Qsq-def mod-minus plus-pow-aux)

lemma f-select: f (select x y a b c d) = select x y (f a) (f b) (f c) (f d)
by(simp add: select-def)

lemma height-get-sq: m ≤ n ==> height (get-sq n t m i j) ≤ m
proof(induction n t m i j rule: get-sq.induct)
  case (3 n t0 t1 t2 t3 m i j)
  have *: i mod 2 ^ n + 2 ^ m ≤ 2 ^ n ==> Suc m ≤ n
    using power-le-imp-le-exp[of 2::nat Suc m n] by simp
  show ?case
    using 3.IH 3.prems * by (auto simp add: height-Qc-Q Let-def)
qed auto

lemma shift-Qsq: shift i j ` Qsq n A0 A1 A2 A3 =
  Qsq n (shift i j ` A0) (shift i j ` A1) (shift i j ` A2) (shift i j ` A3)
by(simp add: Qsq-def image-Un shift-shift add.commute)

lemma points-get-sq:
  [| height t ≤ n; i + 2 ^ m ≤ 2 ^ n; j + 2 ^ m ≤ 2 ^ n |] ==>
  shift i j ` points m (get-sq n t m i j) = points n t ∩ (shift i j ` sq m)
proof(induction n t m i j rule: get-sq.induct)
  case 2
  then show ?case by (auto simp: get-points)
next
  case (3 n t0 t1 t2 t3 m1 i j)
  define m where m = Suc m1
  let ?t = Q t0 t1 t2 t3
  show ?case
  proof(cases i mod 2 ^ n + 2 ^ m ≤ 2 ^ n ∧ j mod 2 ^ n + 2 ^ m ≤ 2 ^ n)
    case True
    let ?sel = select (i < 2 ^ n) (j < 2 ^ n) t0 t1 t2 t3
    let ?i = i mod 2 ^ n let ?j = j mod 2 ^ n
    have 1: height ?sel ≤ n using 3.prems by(auto simp: select-def)
    have 2: points m (get-sq (Suc n) ?t m i j) = points m (get-sq n ?sel m ?i ?j)
      using True unfolding get-sq.simps m-def by(simp add: Let-def)
    have 3: shift ?i ?j ` points m (get-sq n ?sel m ?i ?j) = points n ?sel ∩ shift ?i
      ?j ` sq m
      using 3.IH(1) 1 True by (simp add: m-def)
    have shift i j ` points (Suc m1) (get-sq (Suc n) ?t (Suc m1) i j) =
      shift i j ` points m (get-sq n ?sel m ?i ?j)
      using True unfolding get-sq.simps m-def by(simp add: Let-def)
    also have ... = shift (i - ?i) (j - ?j) ` shift ?i ?j ` points m (get-sq n ?sel m
      ?i ?j)
      by (meson shift-split)
    also have ... = shift (i - ?i) (j - ?j) ` (points n ?sel ∩ shift ?i ?j ` sq m)
      using 3.IH(1) 1 True by (simp add: m-def)
    also have ... = shift (i - ?i) (j - ?j) ` points n ?sel ∩ shift i j ` sq m
  qed

```

```

using image-Int[OF inj-shift] shift-split by presburger
also have ... = shift (i - ?i) (j - ?j) ` select (i < 2 ^ n) (j < 2 ^ n) (points
n t0) (points n t1) (points n t2) (points n t3) ∩ shift i j ` sq m
  by(simp add: f-select)
also have ... = points (Suc n) (Q t0 t1 t2 t3) ∩ shift i j ` sq (Suc m1)
  using 3.prems True
  apply(subst Qsq-lem[symmetric])
  by(auto simp: points-subset m-def)
finally show ?thesis .

next
case False
have shift i j ` points (Suc m1) (get-sq (Suc n)) (Q t0 t1 t2 t3) (Suc m1) i j =
  shift i j ` qf (Qsq m1) (λx y. points m1 (get-sq (Suc n)) ?t m1 x y)) i j (2^m1)
  using False unfolding get-sq.simps m-def
  by(simp add: Let-def m-def del: de-Morgan-conj)
also have ... = qf (Qsq m1) (λx y. shift i j ` points m1 (get-sq (Suc n)) ?t m1
x y)) i j (2^m1)
  by(simp add: shift-Qsq)
also have ... = points (Suc n) (Q t0 t1 t2 t3) ∩ shift i j ` sq (Suc m1)
  using 3.IH(2-5) 3.prems False unfolding get-sq.simps m-def
  by(simp add: sq-Suc-Qsq Qsq-def shift-shift2 image-Int[OF inj-shift] image-Un
Int-Un-distrib add.commute)
finally show ?thesis .

qed
qed auto

lemma get-get-sq:
  [| height t ≤ n; i + 2^m ≤ 2^n; j + 2^m ≤ 2^n; i' < 2^m; j' < 2^m |] ==>
  get m (get-sq n t m i j) i' j' = get n t (i+i') (j+j')
proof (induction n t m i j arbitrary: i' j' rule: get-sq.induct)
case (3 n t0 t1 t2 t3 m i j)
let ?t = Q t0 t1 t2 t3
let ?sel = select (i < 2 ^ n) (j < 2 ^ n) t0 t1 t2 t3
show ?case
proof (cases i mod 2^n + 2^(m+1) ≤ 2^n ∧ j mod 2^n + 2^(m+1) ≤ 2^n)
case True
have get (Suc m) (get-sq (Suc n)) ?t (Suc m) i j i' j'
  = get (m+1) (get-sq n ?sel (m+1)) (i mod 2 ^ n) (j mod 2 ^ n) i' j'
  using True by(simp)
also have ... = get n ?sel (i mod 2 ^ n + i') (j mod 2 ^ n + j')
  using True 3.prems by(subst 3.IH(1))(simp-all add: select-def)
also have ... = get (Suc n) ?t (i + i') (j + j')
  using True 3.prems by(auto simp add: select-def mod-minus)
finally show ?thesis .

next
case False
have *: i + 2 * 2 ^ m ≤ 2 * 2 ^ n ==> m ≤ Suc n
  using power-le-imp-le-exp[of 2::nat m n] by linarith
show ?thesis using False 3.prems

```

```

by(auto simp add: 3.IH(2–5) get-Qc mod-minus select-def height-Qc-Q
height-get-sq *)
qed
qed auto

lemma compressed-get-sq:
   $\llbracket \text{height } t \leq n; \text{compressed } t \rrbracket \implies \text{compressed}(\text{get-sq } n \ t \ m \ i \ j)$ 
proof (induction n t m i j rule: get-sq.induct)
  case (?n t0 t1 t2 t3 m i j)
  then show ?case by (simp add: compressed-Qc select-def)
qed auto

```

3.6 From Matrix to Quadtree

3.6.1 Matrix as function

```

definition shift-mx where
  shift-mx mx x y = ( $\lambda i \ j. \ mx(i+x)(j+y)$ )

fun qt-of-fun :: (nat  $\Rightarrow$  nat  $\Rightarrow$  'a)  $\Rightarrow$  nat  $\Rightarrow$  'a qtree where
  qt-of-fun mx (Suc n) = qf Qc ( $\lambda x \ y. \ qt\text{-of}\text{-fun}(shift\text{-mx } mx \ x \ y) \ n$ ) 0 0 ( $2^n$ ) |
  qt-of-fun mx 0 = L(mx 0 0)

lemma points-qt-of-fun: points n (qt-of-fun mx n) = {(i,j)  $\in$  sq n. mx i j}
proof(induction n arbitrary: mx)
  case 0
  then show ?case by (auto)
next
  case (Suc n)
  then show ?case by(auto simp add: shift-mx-def Suc-length-conv sq-Suc-Qsq
Qsq-def Let-def)
qed

lemma compressed-qt-of-fun: compressed (qt-of-fun mx n)
proof(induction n arbitrary: mx)
  case 0
  then show ?case by simp
next
  case (Suc n)
  then show ?case by(simp add:compressed-Qc)
qed

```

3.6.2 Matrix as list of lists

type-synonym 'a mx = 'a list list

definition sq-mx n mx = (length mx = 2^n \wedge ($\forall xs \in set mx. \ length xs = 2^n$))

lemma sq-mx-0: sq-mx 0 mx = ($\exists x. \ mx = [[x]]$)
by(auto simp: sq-mx-def length-Suc-conv)

Decompose matrix into submatrices

```

definition decomp where
decomp n mx = (let mx01 = take (2^n) mx; mx23 = drop (2^n) mx
    in (map (take (2^n)) mx01, map (drop (2^n)) mx01, map (take (2^n)) mx23,
        map (drop (2^n)) mx23))

lemma decomp-sq-mx: sq-mx (Suc n) mx ==> (mx0,mx1,mx2,mx3) = decomp n
mx ==>
sq-mx n mx0 & sq-mx n mx1 & sq-mx n mx2 & sq-mx n mx3
by(auto simp add: sq-mx-def min-def decomp-def Let-def dest: in-set-takeD in-set-dropD)

Quadtree of matrix:
fun qt-of :: nat => 'a mx => 'a qtree where
qt-of (Suc n) mx =
(let (mx0,mx1,mx2,mx3) = decomp n mx
in Qc (qt-of n mx0) (qt-of n mx1) (qt-of n mx2) (qt-of n mx3)) |
qt-of 0 [[x]] = L x

lemma height-qt-of: sq-mx n mx ==> height(qt-of n mx) ≤ n
proof(induction n mx rule: qt-of.induct)
case (1 n mx)
obtain mx0 mx1 mx2 mx3 where *: decomp n mx = (mx0,mx1,mx2,mx3) by
metis prod-cases4
show ?case
using * 1 by (fastforce simp: height-Qc-Q dest!: decomp-sq-mx)
qed (auto simp: sq-mx-def)

lemma compressed-qt-of: sq-mx n mx ==> compressed(qt-of n mx)
proof(induction n mx rule: qt-of.induct)
case (1 n mx)
obtain mx0 mx1 mx2 mx3 where *: decomp n mx = (mx0,mx1,mx2,mx3) by
metis prod-cases4
show ?case
using * 1 decomp-sq-mx[OF 1.prem]
by (simp add: compressed-Qc)
qed (auto simp: sq-mx-def)

lemma points-qt-of: sq-mx n mx ==> points n (qt-of n mx) = {(i,j) ∈ sq n. mx ! i ! j}
proof(induction n arbitrary: mx)
case 0
then show ?case by (auto simp: sq-mx-0 split: if-splits)
next
case (Suc n)
obtain mx0 mx1 mx2 mx3 where *: (mx0,mx1,mx2,mx3) = decomp n mx by
metis prod-cases4
note ** = decomp-sq-mx[OF Suc.prem *]
show ?case using Suc * **
by(auto simp: Qsq-def decomp-def Let-def sq-mx-def add.commute in-shift-image

```

```

mult-2)
qed

lemma get-qt-of:  $\llbracket \text{sq-mx } n \text{ mx}; (i,j) \in \text{sq } n \rrbracket \implies \text{get } n (\text{qt-of } n \text{ mx}) i j = \text{mx} ! i$ 
! j
proof(safe,induction n arbitrary: mx i j)
  case 0
  then show ?case by (auto simp: sq-mx-0 split: if-splits)
next
  case (Suc n)
  obtain mx0 mx1 mx2 mx3 where *:  $(\text{mx0}, \text{mx1}, \text{mx2}, \text{mx3}) = \text{decomp } n \text{ mx}$  by
  (metis prod-cases4)
  note ** = decomp-sq-mx[OF Suc.prems(1) *]
  show ?case using Suc * **
  by(simp add: decomp-def Let-def get-Qc height-qt-of select-def sq-mx-def mod-minus)
qed

```

3.7 From Quadtree to Matrix

```

definition Qmx :: 'a mx  $\Rightarrow$  'a mx  $\Rightarrow$  'a mx  $\Rightarrow$  'a mx  $\Rightarrow$  'a mx where
Qmx mx0 mx1 mx2 mx3 = map2 (@) mx0 mx1 @ map2 (@) mx2 mx3

fun mx-of :: nat  $\Rightarrow$  'a qtree  $\Rightarrow$  'a mx where
mx-of n (L x) = replicate ( $2^{\hat{n}}$ ) (replicate ( $2^{\hat{n}}$ ) x) |
mx-of (Suc n) (Q t0 t1 t2 t3) =
  Qmx (mx-of n t0) (mx-of n t1) (mx-of n t2) (mx-of n t3)

lemma nth-Qmx-select:  $\llbracket \text{sq-mx } n \text{ mx0}; \text{sq-mx } n \text{ mx1}; \text{sq-mx } n \text{ mx2}; \text{sq-mx } n \text{ mx3};$ 
 $i < 2*2^{\hat{n}}; j < 2*2^{\hat{n}} \rrbracket \implies$ 
 $\text{Qmx } mx0 \text{ mx1 } mx2 \text{ mx3 } ! i ! j = \text{select } (i < 2^{\hat{n}}) (j < 2^{\hat{n}}) mx0 \text{ mx1 } mx2 \text{ mx3}$ 
 $! (i \text{ mod } 2^{\hat{n}}) ! (j \text{ mod } 2^{\hat{n}})$ 
by(auto simp: sq-mx-def Qmx-def select-def nth-append mod-minus)

lemma sq-mx-mx-of: height t  $\leq$  n  $\implies$  sq-mx n (mx-of n t)
by(induction n t rule: mx-of.induct)
  (auto simp: sq-mx-def Qmx-def mult-2 elim: in-set-zipE)

lemma mx-of-points: height t  $\leq$  n  $\implies$  points n t = {(i,j)  $\in$  sq n. mx-of n t ! i !
j}
proof(induction n t rule: mx-of.induct)
  case (2 n t0 t1 t2 t3)
  then show ?case
    by (auto simp: Qsq-def nth-Qmx-select[of n] sq-mx-mx-of select-def in-shift-image
    mod-if
      split!: if-splits)
qed auto

lemma mx-of-get:  $\llbracket \text{height } t \leq n; (i,j) \in \text{sq } n \rrbracket \implies \text{mx-of } n \text{ t } ! i ! j = \text{get } n \text{ t } i j$ 
proof(induction n t arbitrary: i j rule: mx-of.induct)

```

```

case (? n)
then show ?case
  by (simp add: nth-Qmx-select[of n] sq-mx-mx-of select-def)
qed auto

end

```

4 Block Matrices via Quad Trees

```

theory Quad-Matrix
imports
  Complex-Main
  Quad-Base
begin

```

There are two possible representations of matrices as quadtrees. In this file we use the standard quadtree with two constructors L and Q . $L\ x$ represents the x -diagonal ma of arbitrary dimension. In particular $L\ 0$ is the "empty" case. Because $L\ x$ can be of arbitrary dimension, it can be added and multiplied with Q .

In the second representation (not covered in this theory) $L\ x$ is the 1x1 ma x . The advantage is that there are fewer cases in function definitions because one cannot add/multiply L and Q : they have different dimensions. However, $L\ 0$ is special: it still represents the 0 ma of arbitrary dimension. This leads to a more complicated invariant wrt dimension. Or one introduces a new constructor, eg *Empty*.

4.1 Square Matrices

type-synonym $ma = nat \Rightarrow nat \Rightarrow real$

Implicitly entries outside the dimensions of the ma are 0. This is maintained by addition; multiplication and diagonal need an explicit argument n to maintain it.

definition $mk-sq :: nat \Rightarrow ma \Rightarrow ma$ **where**
 $mk-sq\ n\ a = (\lambda i\ j. \text{if } i < 2^n \wedge j < 2^n \text{ then } a\ i\ j \text{ else } 0)$

abbreviation $sq-ma\ n\ (a::ma) \equiv (\forall i\ j. 2^n \leq i \vee 2^n \leq j \longrightarrow a\ i\ j = 0)$

Without $mk-sq$ a number of lemmas like *mult-ma-diag-ma-diag-ma* don't hold.

definition $diag-ma :: nat \Rightarrow real \Rightarrow ma$ **where**
 $diag-ma\ n\ x = mk-sq\ n\ (\lambda i\ j. \text{if } i=j \text{ then } x \text{ else } 0)$

definition $add-ma :: ma \Rightarrow ma \Rightarrow ma$ **where**

$$\text{add-ma } a \ b = (\lambda i \ j. \ a \ i \ j + b \ i \ j)$$

```
definition mult-ma :: nat  $\Rightarrow$  ma  $\Rightarrow$  ma  $\Rightarrow$  ma where
  mult-ma n a b = ( $\lambda i \ j. \sum_{k=0..<2^n} a \ i \ k * b \ k \ j$ )
```

4.2 Matrix Lemmas

```
lemma add-ma-diag-ma[simp]: add-ma (diag-ma n x) (diag-ma n y) = diag-ma n (x+y)
```

```
  by(simp add: diag-ma-def add-ma-def mk-sq-def fun-eq-iff)
```

```
lemma add-ma-diag-ma-0[simp]: add-ma (diag-ma n 0) a = a
  by (auto simp add: add-ma-def diag-ma-def mk-sq-def fun-eq-iff)
```

```
lemma add-ma-diag-ma-02[simp]: add-ma a (diag-ma n 0) = a
  by (auto simp add: add-ma-def diag-ma-def mk-sq-def fun-eq-iff)
```

```
lemma mult-ma-diag-ma-0[simp]: mult-ma n (diag-ma n 0) a = diag-ma n 0
  by (auto simp add: mult-ma-def diag-ma-def mk-sq-def fun-eq-iff)
```

```
lemma mult-ma-diag-ma-02[simp]: mult-ma n a (diag-ma n 0) = diag-ma n 0
  by (auto simp add: mult-ma-def diag-ma-def mk-sq-def fun-eq-iff)
```

```
lemma mult-ma-diag-ma-diag-ma[simp]: mult-ma n (diag-ma n x) (diag-ma n y)
= diag-ma n (x*y)
  apply (auto simp add: mult-ma-def diag-ma-def mk-sq-def fun-eq-iff sum.neutral)
  subgoal for i
    apply(simp add: sum.remove[where x=i])
    done
  done
```

4.3 Real Quad Trees and Abstraction to Matrices

```
type-synonym qtr = real qtree
```

```
fun compressed :: qtr  $\Rightarrow$  bool where
  compressed (L x) = True |
  compressed (Q (L x0) (L x1) (L x2) (L x3)) = ( $\neg (x1=0 \wedge x2=0 \wedge x0=x3)$ ) |
  compressed (Q t0 t1 t2 t3) = (compressed t0  $\wedge$  compressed t1  $\wedge$  compressed t2  $\wedge$  compressed t3)
```

```
lemma compressed-Q:
  compressed (Q t1 t2 t3 t4)  $\Longrightarrow$  (compressed t1  $\wedge$  compressed t2  $\wedge$  compressed t3  $\wedge$  compressed t4)
  by(cases Q t1 t2 t3 t4 rule: compressed.cases)(auto)
```

```
definition Qma :: nat  $\Rightarrow$  ma  $\Rightarrow$  ma  $\Rightarrow$  ma  $\Rightarrow$  ma  $\Rightarrow$  ma where
```

```
  Qma n a b c d =
    ( $\lambda i \ j. \text{if } i < 2^n \text{ then if } j < 2^n \text{ then } a \ i \ j \text{ else } b \ i \ (j - 2^n) \text{ else}$ 
      $\text{if } j < 2^n \text{ then } c \ (i - 2^n) \ j \text{ else } d \ (i - 2^n) \ (j - 2^n)$ )
```

```

lemma add-ma-Qma:
  add-ma (Qma n a b c d) (Qma n a' b' c' d') =
  Qma n (add-ma a a') (add-ma b b') (add-ma c c') (add-ma d d')
  by(simp add: Qma-def add-ma-def mk-sq-def fun-eq-iff)

lemma add-ma-diag-ma-Qma: add-ma (diag-ma (Suc n) x) (Qma n a b c d) =
  Qma n (add-ma (diag-ma n x) a) b c (add-ma (diag-ma n x) d)
  by(auto simp add: Qma-def diag-ma-def add-ma-def mk-sq-def fun-eq-iff)

lemma add-ma-Qma-diag-ma: add-ma (Qma n a b c d) (diag-ma (Suc n) x) =
  Qma n (add-ma a (diag-ma n x)) b c (add-ma d (diag-ma n x))
  by(auto simp add: Qma-def diag-ma-def add-ma-def mk-sq-def fun-eq-iff)

lemma diag-ma-Suc: diag-ma (Suc n) x = Qma n (diag-ma n x) (diag-ma n 0)
  (diag-ma n 0) (diag-ma n x)
  by(auto simp add: diag-ma-def Qma-def mk-sq-def fun-eq-iff)

```

Abstraction function:

```

fun ma :: nat  $\Rightarrow$  qtr  $\Rightarrow$  ma where
  ma n (L x) = diag-ma n x |
  ma (Suc n) (Q t0 t1 t2 t3) =
    Qma n (ma n t0) (ma n t1) (ma n t2) (ma n t3)

```

4.4 Matrix Operations on Trees

```

fun Qc :: qtr  $\Rightarrow$  qtr  $\Rightarrow$  qtr  $\Rightarrow$  qtr  $\Rightarrow$  qtr where
  Qc (L x0) (L x1) (L x2) (L x3) =
    (if x1=0  $\wedge$  x2=0  $\wedge$  x0=x3 then L x0 else Q (L x0) (L x1) (L x2) (L x3)) |
  Qc t1 t2 t3 t4 = Q t1 t2 t3 t4

```

```

lemma ma-Suc-Qc: ma (Suc n) (Qc t0 t1 t2 t3) = ma (Suc n) (Q t0 t1 t2 t3)
  by(induction t0 t1 t2 t3 rule: Qc.induct)(auto simp: diag-ma-Suc)

```

```

lemma compressed-Qc:
  compressed (Qc t0 t1 t2 t3) = (compressed t0  $\wedge$  compressed t1  $\wedge$  compressed t2
   $\wedge$  compressed t3)
  by(induction t0 t1 t2 t3 rule: Qc.induct)(auto)

```

```

lemma height-Qc-Q:
  height (Qc t0 t1 t2 t3)  $\leq$  height (Q t0 t1 t2 t3)
  proof(induction t0 t1 t2 t3 rule: Qc.induct)
    case (1 x0 x1 x2 x3)
    then show ?case by simp
  qed (insert Qc.simps,presburger+)

```

```

fun add :: qtr  $\Rightarrow$  qtr  $\Rightarrow$  qtr where
  add (Q s0 s1 s2 s3) (Q t0 t1 t2 t3) = Qc (add s0 t0) (add s1 t1) (add s2 t2)
  (add s3 t3) |
  add (L x) (L y) = L(x+y) |

```

```

add (L x) (Q t0 t1 t2 t3) = Qc (add (L x) t0) t1 t2 (add (L x) t3) |
add (Q t0 t1 t2 t3) (L x) = Qc (add t0 (L x)) t1 t2 (add t3 (L x))

```

```

fun mult :: qtr  $\Rightarrow$  qtr  $\Rightarrow$  qtr where
mult (Q s0 s1 s2 s3) (Q t0 t1 t2 t3) =
  Qc (add (mult s0 t0) (mult s1 t2))
    (add (mult s0 t1) (mult s1 t3))
    (add (mult s2 t0) (mult s3 t2))
    (add (mult s2 t1) (mult s3 t3)) |
mult (L x) (Q t0 t1 t2 t3) =
  Qc (mult (L x) t0)
    (mult (L x) t1)
    (mult (L x) t2)
    (mult (L x) t3) |
mult (Q t0 t1 t2 t3) (L x) =
  Qc (mult t0 (L x))
    (mult t1 (L x))
    (mult t2 (L x))
    (mult t3 (L x)) |
mult (L x) (L y) = L(x*y)

```

Initialization of *qtr* from *ma*

```

fun qtr :: nat  $\Rightarrow$  ma  $\Rightarrow$  qtr where
qtr 0 a = L(a 0 0) |
qtr (Suc n) a =
  (let t0 = qtr n a; t1 = qtr n ( $\lambda i j.$  a i ( $j+2^n$ ));
   t2 = qtr n ( $\lambda i j.$  a ( $i+2^n$ ) j); t3 = qtr n ( $\lambda i j.$  a ( $i+2^n$ ) ( $j+2^n$ ))
  in Q t0 t1 t2 t3)

```

4.5 Correctness of Quad Tree Implementations

4.5.1 add

```

lemma ma-add:  $\llbracket \text{height } s \leq n; \text{height } t \leq n \rrbracket \implies$ 
  ma n (add s t) = add-ma (ma n s) (ma n t)
proof(induction s t arbitrary: n rule: add.induct)
  case 1
  then show ?case by(simp add: less-eq-nat.simps(2) add-ma-Qma ma-Suc-Qc
  split: nat.splits)
  next
  case 2
  then show ?case by(simp)
  next
  case 3
  then show ?case by(simp add: add-ma-diag-ma-Qma ma-Suc-Qc less-eq-nat.simps(2)
  split: nat.splits)
  next
  case 4
  then show ?case by(simp add: add-ma-Qma-diag-ma ma-Suc-Qc less-eq-nat.simps(2)
  split: nat.splits)

```

qed

```
lemma height-add: height (add s t) ≤ max (height s) (height t)
proof(induction s t rule: add.induct)
  case (1 s1 s2 s3 s4 t1 t2 t3 t4)
  thus ?case
    using height-Qc-Q[of add s1 t1 add s2 t2 add s3 t3 add s4 t4]
    by (auto simp: max.coboundedI1 max.coboundedI2
         simp del: max.absorb1 max.absorb2 max.absorb3 max.absorb4 elim!: le-trans)
next
  case (3 x t1 t2 t3 t4)
  thus ?case using height-Qc-Q[of add (L x) t1 t2 t3 add (L x) t4]
    by auto
next
  case (4 t1 t2 t3 t4 x)
  then show ?case using height-Qc-Q[of add t1 (L x) t2 t3 add t4 (L x)]
    by auto
qed simp

lemma compressed-add: [| compressed s; compressed t |] ==> compressed (add s t)
by(induction s t rule: add.induct) (auto simp: compressed-Qc dest: compressed-Q)

lemma Max4: Max{#n0, #n1, #n2, #n3} = max n0 (max n1 (max n2 n3)) by simp

lemma height-mult: height (mult s t) ≤ max (height s) (height t)
proof(induction s t rule: mult.induct)
  case (1 s1 s2 s3 s4 t1 t2 t3 t4)
  let ?m11 = mult s1 t1 let ?m23 = mult s2 t3 let ?m12 = mult s1 t2 let ?m24
  = mult s2 t4
  let ?m31 = mult s3 t1 let ?m43 = mult s4 t3 let ?m32 = mult s3 t2 let ?m44
  = mult s4 t4
  show ?case
    using 1 height-Qc-Q[of add ?m11 ?m23 add ?m12 ?m24 add ?m31 ?m43 add
    ?m32 ?m44]
      height-add[of ?m11 ?m23] height-add[of ?m12 ?m24] height-add[of ?m31
    ?m43] height-add[of ?m32 ?m44]
    unfolding mult.simps height-qtree.simps One-nat-def add-Suc-right add-0-right
    max-Suc-Suc Max4
    by (smt (z3) order.trans le-max-iff-disj not-less-eq-eq)
next
  case (2 x t0 t1 t2 t3)
  thus ?case using height-Qc-Q[of mult (L x) t0 mult (L x) t1 mult (L x) t2 mult
  (L x) t3]
    by (simp)
next
  case (3 t0 t1 t2 t3 x)
  thus ?case using height-Qc-Q[of mult t0 (L x) mult t1 (L x) mult t2 (L x) mult
  t3 (L x)]
    by simp
```

qed (*simp*)

4.5.2 *mult*

```

lemma bij-betw-minus-ivlco-nat:  $n \leq a \implies C = \{a - n.. < b - n\} \implies \text{bij-betw } (\lambda k::nat. k - n) \{a.. < b\} C$ 
by(auto simp add: bij-betw-def inj-on-def image-minus-const-atLeastLessThan-nat)

lemma mult-ma-Qma-Qma:
  mult-ma (Suc n) (Qma n a b c d) (Qma n a' b' c' d') =
    (Qma n (add-ma (mult-ma n a a')) (mult-ma n b c')) +
      (add-ma (mult-ma n a b')) (mult-ma n b d')) +
      (add-ma (mult-ma n c a')) (mult-ma n d c')) +
      (add-ma (mult-ma n c b')) (mult-ma n d d'))))
by(auto simp add: mult-ma-def add-ma-def Qma-def mk-sq-def fun-eq-iff sum-Un
ivl-disj-un(17)[of 0 2^n 2*2^n,symmetric]
  intro:sum.reindex-bij-betw[of λk. k - 2^n {2^n.. < 2 * 2^n} {0.. < 2^n}, OF
bij-betw-minus-ivlco-nat])

lemma ma-mult: [ height s ≤ n; height t ≤ n ] ==>
  ma n (mult s t) = mult-ma n (ma n s) (ma n t)
proof(induction s t arbitrary: n rule: mult.induct)
  case (1 s1 s2 s3 s4 t1 t2 t3 t4) thus ?case
    by(simp add: mult-ma-Qma-Qma ma-add ma-Suc-Qc le-trans[OF height-mult]
      less-eq-nat.simps(2) split: nat.splits)
  next
    case 2 thus ?case
      by(simp add: diag-ma-Suc ma-Suc-Qc mult-ma-Qma-Qma
        less-eq-nat.simps(2) split: nat.splits)
  next
    case 3 thus ?case
      by(simp add: diag-ma-Suc ma-Suc-Qc mult-ma-Qma-Qma
        less-eq-nat.simps(2) split: nat.splits)
  qed simp

lemma compressed-mult: [ compressed s; compressed t ] ==> compressed (mult s t)
proof(induction s t rule: mult.induct)
  case 1 thus ?case unfolding mult.simps by (metis compressed-Q compressed-Qc
    compressed-add)
  next
    case 2 thus ?case unfolding mult.simps by (metis compressed-Q compressed-Qc)
  next
    case 3 thus ?case unfolding mult.simps by (metis compressed-Q compressed-Qc)
  next
    case 4 thus ?case by simp
  qed

```

```
end
```

5 K-dimensional Region Trees

```
theory KD-Region-Tree
```

```
imports
```

```
HOL-Library.NList
```

```
HOL-Library.Tree
```

```
begin
```

```
lemma nlists-Suc: nlists (Suc n) A = ( $\bigcup_{a \in A}$ . (#) a ` nlists n A)
```

```
by(auto simp: set-eq-iff image-iff in-nlists-Suc-iff)
```

```
lemma in-nlists-UNIV: xs ∈ nlists k UNIV  $\longleftrightarrow$  length xs = k
```

```
unfolding nlists-def by(auto)
```

```
lemma nlists-singleton: nlists n {a} = {replicate n a}
```

```
unfolding nlists-def by(auto simp: replicate-length-same dest!: subset-singletonD)
```

Generalizes quadtrees. Instead of having 2^n direct children of a node, the children are arranged in a binary tree where each *Split* splits along one dimension.

```
datatype 'a kdt = Box 'a | Split 'a kdt 'a kdt
```

```
datatype-compat kdt
```

```
type-synonym kdtb = bool kdt
```

A *kdt* is most easily explained by showing how quad trees are represented: $Q t_0 t_1 t_2 t_3$ becomes *Split* (*Split* $t_0' t_1'$) (*Split* $t_2' t_3'$) where t_i' is the representation of t_i ; $L a$ becomes *Box* a . In general, each level of an abstract k dimensional tree subdivides space into 2^k subregions. This subdivision is represented by a *kdt* of depth at most k . Further subdivisions of the subregions are seamlessly represented as the subtrees at depth k . *Box* a represents a subregion entirely filled with a 's. In contrast to quad trees, cubes can also occur half way down the subdivision. For example, $Q (L a) (L b) (L c)$ becomes *Split* (*Box* a) (*Split* (*Box* b) (*Box* c)).

```
instantiation kdt :: (type)height
```

```
begin
```

```
fun height-kdt :: 'a kdt ⇒ nat where
```

```
height (Box -) = 0 |
```

```
height (Split l r) = max (height l) (height r) + 1
```

```
instance ..
```

```

end

lemma height-0-iff: height t = 0  $\longleftrightarrow$  ( $\exists x$ . t = Box x)
by(cases t)auto

definition bits :: nat  $\Rightarrow$  bool list set where
bits n = nlists n UNIV

lemma bits-0[code]: bits 0 = {}
by(simp add:bits-def)

lemma bits-Suc[code]:
bits (Suc n) = (let B = bits n in (#) True ‘ B  $\cup$  (#) False ‘ B)
by(simp-all add: bits-def nlists-Suc UN-bool-eq Let-def)

```

5.1 Subtree

```

fun subtree :: 'a kdt  $\Rightarrow$  bool list  $\Rightarrow$  'a kdt where
subtree t [] = t |
subtree (Box x) - = Box x |
subtree (Split l r) (b#bs) = subtree (if b then r else l) bs

lemma subtree-Box[simp]: subtree (Box x) bs = Box x
by(cases bs)auto

lemma height-subtree: height (subtree t bs)  $\leq$  height t – length bs
by(induction t bs rule: subtree.induct) auto

lemma height-subtree2: [height t  $\leq$  k * (Suc n); length bs = k]  $\Longrightarrow$  height (subtree t bs)  $\leq$  k * n
using height-subtree[of t bs] by auto

lemma subtree-Split-Box: length bs  $\neq$  0  $\Longrightarrow$  subtree (Split (Box b) (Box b)) bs =
Box b
by(auto simp: neq-Nil-conv)

```

5.2 Shifting a coordinate by a boolean vector

```

definition mv :: nat  $\Rightarrow$  bool list  $\Rightarrow$  nat list  $\Rightarrow$  nat list where
mv d = map2 (λb x. x + (if b then 0 else d))

lemma map-zip1: [length xs = length ys;  $\forall p \in \text{set}(\text{zip } xs \text{ } ys)$ . f p = fst p]  $\Longrightarrow$ 
map f (zip xs ys) = xs
by (metis (no-types, lifting) map-eq-conv map-fst-zip)

lemma map-mv1: [ps  $\in$  nlists (length bs) {0.. $<$ n}; length ps = length bs]
 $\Longrightarrow$  map (λi. i < n) (mv (n) bs ps) = bs

```

```

by(fastforce simp: mv-def intro!: map-zip1 dest: set-zip-rightD nlistsE-set split:
if-splits)

lemma map-zip2: [ length xs = length ys;  $\forall p \in \text{set}(\text{zip } xs \ ys). f \ p = \text{snd } p \ ] \implies
map \ f \ (\text{zip } xs \ ys) = ys
by (metis (no-types, lifting) map-eq-conv map-snd-zip)

lemma map-mv2: [ ps  $\in$  nlists (length bs) {0..<2^n} ] \implies map (\lambda x. x mod 2^n)
(mv (2^n) bs ps) = ps
by(fastforce simp: mv-def dest: set-zip-rightD nlistsE-set intro!: map-zip2)

lemma mv-map-map: set ps  $\subseteq$  {0..<2 * n} \implies mv (n) (map (\lambda x. x < n) ps)
(map (\lambda x. x mod n) ps) = ps
unfolding nlists-def mv-def
by(auto simp: map-eq-conv[where xs=ps and g=id,simplified] map2-map-map not-less
le-iff-add)

lemma mv-in-nlists:
[ p  $\in$  nlists k {0..<2^n}; bs  $\in$  bits k ] \implies mv (2^n) bs p  $\in$  nlists k {0..<2 *
2^n}
unfolding mv-def nlists-def bits-def
by (fastforce dest: set-zip-rightD)

lemma in-nlists2D: xs  $\in$  nlists k {0..<2 * 2^n} \implies \exists bs  $\in$  bits k. xs  $\in$  mv (2^n)
bs ` nlists k {0..<2^n}
unfolding nlists-def bits-def image-def
apply(rule bexI[where x = map (\lambda x. x < 2^n) xs])
apply(simp)
apply(rule exI[where x = map (\lambda i. i mod 2^n) xs])
apply (auto simp add: mv-map-map)
done

lemma nlists2-simp: nlists k {0..<2 * 2^n} = (\bigcup bs  $\in$  bits k. mv (2^n) bs ` nlists
k {0..<2^n})
by (auto simp: mv-in-nlists in-nlists2D)

lemma in-mv-image: [ ps  $\in$  nlists k {0..<2*2^n}; Ps  $\subseteq$  nlists k {0..<2^n}; bs  $\in$ 
bits k ] \implies
ps  $\in$  mv (2^n) bs ` Ps \longleftrightarrow map (\lambda x. x mod 2^n) ps  $\in$  Ps  $\wedge$  (bs = map (\lambda i. i <
2^n) ps)
by (auto simp: map-mv1 map-mv2 mv-map-map bits-def intro!: image-eqI)$ 
```

5.3 Points in a tree

```

fun cube :: nat  $\Rightarrow$  nat  $\Rightarrow$  nat list set where
cube k n = nlists k {0..<2^n}

fun points :: nat  $\Rightarrow$  nat  $\Rightarrow$  kdtb  $\Rightarrow$  nat list set where
points k n (Box b) = (if b then cube k n else {}) |

```

```

points k (Suc n) t = ( $\bigcup$  bs  $\in$  bits k. mv ( $2^n$ ) bs ‘ points k n (subtree t bs))

lemma points-Suc: points k (Suc n) t = ( $\bigcup$  bs  $\in$  bits k. mv ( $2^n$ ) bs ‘ points k n
(subtree t bs))
by(cases t) (simp-all add: nlists2-simp)

lemma points-subset: height t  $\leq$  k*n  $\implies$  points k n t  $\subseteq$  nlists k {0.. $<2^n$ }
proof(induction k n t rule: points.induct)
  case ( $2 k n l r$ )
  have  $\bigwedge$  bs. bs  $\in$  bits k  $\implies$  height (subtree (Split l r) bs)  $\leq$  k*n
  unfolding bits-def using 2.preds height-subtree2 in-nlists-UNIV by blast
  with 2.IH show ?case
    by(auto intro: mv-in-nlists dest: subsetD)
qed auto

```

5.4 Compression

Compressing Split:

```

fun SplitC :: 'a kdt  $\Rightarrow$  'a kdt  $\Rightarrow$  'a kdt where
  SplitC (Box b1) (Box b2) = (if b1=b2 then Box b1 else Split (Box b1) (Box b2)) |
  SplitC t1 t2 = Split t1 t2

fun compressed :: 'a kdt  $\Rightarrow$  bool where
  compressed (Box -) = True |
  compressed (Split l r) = (compressed l  $\wedge$  compressed r  $\wedge$   $\neg$ ( $\exists$  b. l = Box b  $\wedge$  r = Box b))

lemma compressedI: [| compressed l; compressed r |]  $\implies$  compressed (SplitC l r)
by(induction l r rule: SplitC.induct) auto

lemma subtree-SplitC:
  1  $\leq$  length bs  $\implies$  subtree (SplitC l r) bs = subtree (Split l r) bs
by(induction l r rule: SplitC.induct)
  (simp-all add: subtree-Split-Box Suc-le-eq)

lemma height-SplitC: height(SplitC l r)  $\leq$  Suc (max (height l) (height r))
by(cases (l,r) rule: SplitC.cases)(auto)

lemma height-SplitC2: [| height l  $\leq$  n; height r  $\leq$  n |]  $\implies$  height(SplitC l r)  $\leq$  Suc
n
using height-SplitC[of l r] by simp

```

5.5 Extracting a point from a tree

Also the abstraction function.

```

fun get :: nat  $\Rightarrow$  'a kdt  $\Rightarrow$  nat list  $\Rightarrow$  'a where
  get - (Box b) - = b |
  get (Suc n) t ps = get n (subtree t (map ( $\lambda$ i. i  $<$   $2^n$ ) ps)) (map ( $\lambda$ i. i mod  $2^n$ ) ps)

```

```

lemma get-Suc: get (Suc n) t ps =
  get n (subtree t (map (λi. i < 2 ^ n) ps)) (map (λi. i mod 2 ^ n) ps)
by(cases t)auto

lemma points-get: [ height t ≤ k*n; ps ∈ nlists k {0..<2^n} ] ==>
  get n t ps = (ps ∈ points k n t)
proof(induction n arbitrary: k t ps)
  case 0
  then show ?case by(clar simp simp add: height-0-iff)
next
  case (Suc n)
  show ?case
  proof (cases t)
    case Box
    thus ?thesis using Suc.prems(2) by(simp)
next
  case (Split l r)
  obtain k0 where k = Suc k0 using Suc.prems(1) Split
    by(cases k) auto
  hence ps ≠ []
    using Suc.prems(2) by (auto simp: in-nlists-Suc-iff)
  then show ?thesis using Suc.prems Split Suc.IH[OF height-subtree2[OF Suc.prems(1)]]
  in-nlists2D
    by(simp add: height-subtree2 in-mv-image points-subset bits-def)
  qed
qed

```

5.6 Modifying a point in a tree

```

fun modify :: ('a kdt ⇒ 'a kdt) ⇒ bool list ⇒ 'a kdt ⇒ 'a kdt where
  modify f [] t = f t |
  modify f (b # bs) (Split l r) = (if b then SplitC l (modify f bs r) else SplitC (modify f bs l) r) |
  modify f (b # bs) (Box a) =
    (let t = modify f bs (Box a) in if b then SplitC (Box a) t else SplitC t (Box a))

fun put :: nat list ⇒ 'a ⇒ nat ⇒ 'a kdt ⇒ 'a kdt where
  put ps a 0 (Box -) = Box a |
  put ps a (Suc n) t = modify (put (map (λi. i mod 2^n) ps) a n) (map (λi. i < 2^n) ps) t

```

```

lemma height-modify: [ ∀ t. height t ≤ nk → height (f t) ≤ nk;
  height t ≤ k + nk; length bs = k ]
  ==> height (modify f bs t) ≤ k + nk
apply(induction f bs t arbitrary: k rule: modify.induct)
by (auto simp: height-SplitC2 Let-def)

```

```

lemma height-put:  $\text{height } t \leq n * \text{length } ps \implies \text{height } (\text{put } ps \ a \ n \ t) \leq n * \text{length } ps$ 
proof(induction ps a n t rule: put.induct)
  case 2
    then show ?case by (auto simp: height-modify)
  qed auto

lemma subtree-modify:  $\llbracket \text{length } bs' = \text{length } bs \rrbracket$ 
   $\implies \text{subtree } (\text{modify } f \ bs \ t) \ bs' = (\text{if } bs' = bs \text{ then } f(\text{subtree } t \ bs) \text{ else } \text{subtree } t \ bs')$ 
apply(induction f bs t arbitrary: bs' rule: modify.induct)
apply(auto simp add: length-Suc-conv Let-def subtree-SplitC split: if-splits)
done

lemma mod-eq1:  $\llbracket y < 2 * n; ya < 2 * n; \neg ya < n; \neg y < n; ya \bmod n = y \bmod n \rrbracket$ 
   $\implies ya = (y::nat)$ 
by(simp add: mod-if mult-2 split: if-splits)

lemma nlist-eq-mod:  $\llbracket ps \in \text{nlists } k \{0..<(2::nat) * 2^{\wedge} n\}; ps' \in \text{nlists } k \{0..<2 * 2^{\wedge} n\};$ 
   $\text{map } (\lambda i. i < 2^{\wedge} n) \ ps' = \text{map } (\lambda i. i < 2^{\wedge} n) \ ps; ps' \neq ps \rrbracket \implies$ 
   $\text{map } (\lambda i. i \bmod 2^{\wedge} n) \ ps' \neq \text{map } (\lambda i. i \bmod 2^{\wedge} n) \ ps$ 
apply(induction k arbitrary: ps ps')
  apply simp
  apply (fastforce simp: in-nlists-Suc-iff mod-eq1)
done

lemma get-put:  $\llbracket \text{height } t \leq k*n; ps \in \text{cube } k \ n; ps' \in \text{cube } k \ n \rrbracket \implies$ 
   $\text{get } n \ (\text{put } ps \ a \ n \ t) \ ps' = (\text{if } ps' = ps \text{ then } a \text{ else } \text{get } n \ t \ ps')$ 
proof(induction ps a n t arbitrary: ps' rule: put.induct)
  case 1
    then show ?case by (simp add: nlists-singleton)
  next
    case 2
    thus ?case using in-nlists2D
      by(auto simp add: subtree-modify get-Suc height-subtree2 nlist-eq-mod in-mv-image)
  qed auto

lemma compressed-modify:  $\llbracket \text{compressed } t; \text{compressed } (f \ (\text{subtree } t \ bs)) \rrbracket \implies$ 
   $\text{compressed } (\text{modify } f \ bs \ t)$ 
by(induction f bs t rule: modify.induct) (auto simp: compressedI Let-def)

lemma compressed-subtree:  $\text{compressed } t \implies \text{compressed } (\text{subtree } t \ bs)$ 
by(induction t bs rule: subtree.induct) auto

lemma compressed-put:
   $\llbracket \text{height } t \leq k*n; k = \text{length } ps; \text{compressed } t \rrbracket \implies \text{compressed } (\text{put } ps \ a \ n \ t)$ 
proof(induction ps a n t rule: put.induct)

```

```

case 1
then show ?case by (simp)
next
case 2
thus ?case by (simp add: compressed-modify compressed-subtree height-subtree2)
qed auto

```

5.7 Union

```

fun union :: kdtb ⇒ kdtb ⇒ kdtb where
union (Box b) t = (if b then Box True else t) |
union t (Box b) = (if b then Box True else t) |
union (Split l1 r1) (Split l2 r2) = SplitC (union l1 l2) (union r1 r2)

lemma union-Box2: union t (Box b) = (if b then Box True else t)
by(cases t) auto

lemma subtree-union: subtree (union t1 t2) bs = union (subtree t1 bs) (subtree t2 bs)
proof(induction t1 t2 arbitrary: bs rule: union.induct)
case 2 thus ?case by(auto simp: union-Box2)
next
case 3 thus ?case by(cases bs) (auto simp: subtree-SplitC)
qed auto

lemma points-union:
  [| max (height t1) (height t2) ≤ k*n |] ==>
  points k n (union t1 t2) = points k n t1 ∪ points k n t2
proof(induction n arbitrary: t1 t2)
  case 0 thus ?case by(clarsimp simp add: height-0-iff)
next
  case (Suc n)
  have height t1 ≤ k * Suc n height t2 ≤ k * Suc n
  using Suc.preds by auto
  from height-subtree2[OF this(1)] height-subtree2[OF this(2)] show ?case
    by(auto simp: Suc.IH subtree-union points-Suc bits-def)
qed

lemma get-union:
  [| max (height t1) (height t2) ≤ length ps * n |] ==>
  get n (union t1 t2) ps = (get n t1 ps ∨ get n t2 ps)
proof(induction n arbitrary: t1 t2 ps)
  case 0 thus ?case by(clarsimp simp add: height-0-iff)
next
  case (Suc n)
  have height t1 ≤ length ps * Suc n height t2 ≤ length ps * Suc n
  using Suc.preds(1) by auto
  from height-subtree2[OF this(1)] height-subtree2[OF this(2)] show ?case
    by(simp add: Suc.IH subtree-union get-Suc)

```

```
qed
```

```
lemma height-union: height (union t1 t2) ≤ max (height t1) (height t2)
by(induction t1 t2 rule: union.induct) (auto simp: height-SplitC2)
```

```
lemma compressed-union: compressed t1 ==> compressed t2 ==> compressed(union
t1 t2)
by(induction t1 t2 rule: union.induct) (simp-all add: compressedI)
```

```
end
```

6 K-dimensional Region Trees - Version 2

```
theory KD-Region-Tree2
```

```
imports
```

```
HOL-Library.NList
```

```
HOL-Library.Tree
```

```
begin
```

```
lemma nlists-Suc: nlists (Suc n) A = (⋃ a∈A. (#) a ` nlists n A)
by(auto simp: set-eq-iff image-iff in-nlists-Suc-iff)
```

```
lemma in-nlists-UNIV: xs ∈ nlists k UNIV ↔ length xs = k
unfolding nlists-def by(auto)
```

```
datatype 'a kdt = Box 'a | Split 'a kdt 'a kdt
```

```
datatype-compat kdt
```

```
type-synonym kdtb = bool kdt
```

A *kdt* is most easily explained by showing how quad trees are represented: $Q t0 t1 t2 t3$ becomes $\text{Split} (\text{Split } t0' t1') (\text{Split } t2' t3')$ where t_i' is the representation of t_i ; $L a$ becomes $\text{Box } a$. In general, each level of an abstract k dimensional tree subdivides space into 2^k subregions. This subdivision is represented by a *kdt* of depth at most k . Further subdivisions of the subregions are seamlessly represented as the subtrees at depth k . $\text{Box } a$ represents a subregion entirely filled with a 's. In contrast to quad trees, cubes can also occur half way down the subdivision. For example, $Q (L a) (L a) (L c)$ becomes $\text{Split} (\text{Box } a) (\text{Split} (\text{Box } b) (\text{Box } c))$.

```
instantiation kdt :: (type)height
begin
```

```
fun height-kdt :: 'a kdt ⇒ nat where
```

```

height (Box -) = 0 |
height (Split l r) = max (height l) (height r) + 1

instance ..

end

lemma height-0-iff: height t = 0  $\longleftrightarrow$  ( $\exists x. t = \text{Box } x$ )
by(cases t)auto

definition bits :: nat  $\Rightarrow$  bool list set where
bits n  $\equiv$  nlists n UNIV

lemma bits-Suc[code]:
bits (Suc n) = (let B = bits n in (#) True ` B  $\cup$  (#) False ` B)
by(simp-all add: bits-def nlists-Suc UN-bool-eq Let-def)

```

6.1 Subtree

```

fun subtree :: 'a kdt  $\Rightarrow$  bool list  $\Rightarrow$  'a kdt where
subtree t [] = t |
subtree (Box x) - = Box x |
subtree (Split l r) (b#bs) = subtree (if b then r else l) bs

lemma subtree-Box[simp]: subtree (Box x) bs = Box x
by(cases bs)auto

lemma height-subtree: height (subtree t bs)  $\leq$  height t - length bs
by(induction t bs rule: subtree.induct) auto

lemma height-subtree2:  $\llbracket \text{height } t \leq k * (\text{Suc } n); \text{length } bs = k \rrbracket \implies \text{height } (\text{subtree } t bs) \leq k * n$ 
using height-subtree[of t bs] by auto

lemma subtree-Split-Box: length bs  $\neq$  0  $\implies$  subtree (Split (Box b) (Box b)) bs = Box b
by(auto simp: neq-Nil-conv)

```

6.2 Shifting a coordinate by a boolean vector

The ?

```

definition mv :: bool list  $\Rightarrow$  nat list  $\Rightarrow$  nat list where
mv = map2 ( $\lambda b x. 2*x + (\text{if } b \text{ then } 0 \text{ else } 1)$ )

lemma map-zip1:  $\llbracket \text{length } xs = \text{length } ys; \forall p \in \text{set}(\text{zip } xs \ ys). f p = \text{fst } p \rrbracket \implies$ 
map f (zip xs ys) = xs
by (metis (no-types, lifting) map-eq-conv map-fst-zip)

```

```

lemma map-mv1:  $\llbracket \text{length } ps = \text{length } bs \rrbracket \implies \text{map even } (\text{mv } bs \text{ } ps) = bs$ 
by(auto simp: mv-def intro!: map-zip1 split: if-splits)

lemma map-zip2:  $\llbracket \text{length } xs = \text{length } ys; \forall p \in \text{set(zip } xs \text{ } ys). f \text{ } p = \text{snd } p \rrbracket \implies$ 
 $\text{map } f \text{ (zip } xs \text{ } ys) = ys$ 
by (metis (no-types, lifting) map-eq-conv map-snd-zip)

lemma map-mv2:  $\llbracket \text{length } ps = \text{length } bs \rrbracket \implies \text{map } (\lambda x. x \text{ div } 2) \text{ (mv } bs \text{ } ps) =$ 
 $ps$ 
by(auto simp: mv-def intro!: map-zip2)

lemma mv-map-map:  $\text{mv } (\text{map even } ps) \text{ (map } (\lambda x. x \text{ div } 2) \text{ } ps) = ps$ 
unfolding nlists-def mv-def
by(auto simp add: map-eq-conv[where xs=ps and g=id,simplified] map2-map-map)

lemma mv-in-nlists:
 $\llbracket p \in \text{nlists } k \{0..<2^n\}; bs \in \text{bits } k \rrbracket \implies \text{mv } bs \text{ } p \in \text{nlists } k \{0..<2 * 2^n\}$ 
unfolding mv-def nlists-def bits-def
by (fastforce dest: set-zip-rightD)

lemma in-nlists2D:  $xs \in \text{nlists } k \{0..<2 * 2^n\} \implies \exists bs \in \text{bits } k. xs \in \text{mv } bs`$ 
 $\text{nlists } k \{0..<2^n\}$ 
unfolding nlists-def bits-def
apply(rule bexI[where x = map even xs])
apply(auto simp: image-def)[1]
apply(rule exI[where x = map (\lambda i. i div 2) xs])
apply(auto simp add: mv-map-map)
done

lemma nlists2-simp:  $\text{nlists } k \{0..<2 * 2^n\} = (\bigcup_{bs \in \text{bits } k. \text{mv } bs` \text{nlists } k \{0..<2^n\}}$ 
by (auto simp: mv-in-nlists in-nlists2D)

```

6.3 Points in a tree

```

fun cube :: nat  $\Rightarrow$  nat  $\Rightarrow$  nat list set where
cube k n = nlists k {0..<2^n}

fun points :: nat  $\Rightarrow$  nat  $\Rightarrow$  kdtb  $\Rightarrow$  nat list set where
points k n (Box b) = (if b then cube k n else {})
points k (Suc n) t = ( $\bigcup_{bs \in \text{bits } k. \text{mv } bs` \text{points } k \text{ } n} (\text{subtree } t \text{ } bs)$ )

lemma points-Suc:  $\text{points } k \text{ (Suc } n) \text{ } t = (\bigcup_{bs \in \text{bits } k. \text{mv } bs` \text{points } k \text{ } n} (\text{subtree } t \text{ } bs))$ 
by(cases t) (simp-all add: nlists2-simp)

lemma points-subset:  $\text{height } t \leq k * n \implies \text{points } k \text{ } n \text{ } t \subseteq \text{nlists } k \{0..<2^n\}$ 
proof(induction k n t rule: points.induct)

```

```

case (? k n l r)
have  $\bigwedge bs. bs \in bits\ k \implies height\ (subtree\ (Split\ l\ r)\ bs) \leq k*n$ 
  unfolding bits-def using 2.preds height-subtree2 in-nlists-UNIV by blast
  with 2.IH show ?case
    by(auto intro: mv-in-nlists dest: subsetD)
qed auto

```

6.4 Compression

Compressing Split:

```

fun SplitC :: 'a kdt  $\Rightarrow$  'a kdt where
  SplitC (Box b1) (Box b2) = (if b1=b2 then Box b1 else Split (Box b1) (Box b2)) |
  SplitC t1 t2 = Split t1 t2

fun compressed :: 'a kdt  $\Rightarrow$  bool where
  compressed (Box -) = True |
  compressed (Split l r) = (compressed l  $\wedge$  compressed r  $\wedge$   $\neg(\exists b. l = Box\ b \wedge r = Box\ b)$ )

lemma compressedI:  $\llbracket compressed\ t1; compressed\ t2 \rrbracket \implies compressed\ (SplitC\ t1\ t2)$ 
by(induction t1 t2 rule: SplitC.induct) auto

lemma subtree-SplitC:
   $1 \leq length\ bs \implies subtree\ (SplitC\ l\ r)\ bs = subtree\ (Split\ l\ r)\ bs$ 
by(induction l r rule: SplitC.induct)
  (simp-all add: subtree-Split-Box Suc-le-eq)

```

6.5 Union

```

fun union :: kdtb  $\Rightarrow$  kdtb  $\Rightarrow$  kdtb where
  union (Box b) t = (if b then Box True else t) |
  union t (Box b) = (if b then Box True else t) |
  union (Split l1 r1) (Split l2 r2) = SplitC (union l1 l2) (union r1 r2)

```

```

lemma union-Box2: union t (Box b) = (if b then Box True else t)
by(cases t) auto

```

```

lemma in-mv-image:  $\llbracket ps \in nlists\ k\ \{0..<2^{\hat{n}}\}; Ps \subseteq nlists\ k\ \{0..<2^{\hat{n}}\}; bs \in bits\ k \rrbracket \implies$ 
   $ps \in mv\ bs \wedge Ps \longleftrightarrow map\ (\lambda x. x \ div\ 2)\ ps \in Ps \wedge (bs = map\ even\ ps)$ 
by (auto simp: map-mv1 map-mv2 mv-map-map bits-def intro!: image-eqI)

```

```

lemma subtree-union: subtree (union t1 t2) bs = union (subtree t1 bs) (subtree t2 bs)
proof(induction t1 t2 arbitrary: bs rule: union.induct)
  case 2 thus ?case by(auto simp: union-Box2)
  next
    case 3 thus ?case by(cases bs) (auto simp: subtree-SplitC)

```

```

qed auto

lemma points-union:
   $\llbracket \max(\text{height } t1) (\text{height } t2) \leq k*n \rrbracket \implies$ 
   $\text{points } k\ n (\text{union } t1\ t2) = \text{points } k\ n\ t1 \cup \text{points } k\ n\ t2$ 
proof(induction n arbitrary: t1 t2)
  case 0 thus ?case by(clarsimp simp add: height-0-iff)
next
  case (Suc n)
  have height t1  $\leq k * \text{Suc } n$  height t2  $\leq k * \text{Suc } n$ 
    using Suc.preds by auto
  from height-subtree2[OF this(1)] height-subtree2[OF this(2)] show ?case
    by(auto simp: Suc.IH subtree-union points-Suc bits-def)
qed

lemma compressed-union: compressed t1  $\implies$  compressed t2  $\implies$  compressed(union t1 t2)
  by(induction t1 t2 rule: union.induct) (simp-all add: compressedI)

```

6.6 Extracting a point from a tree

```

lemma size-subtree: bs  $\neq [] \implies (\forall b. t \neq \text{Box } b) \implies \text{size } (\text{subtree } t\ bs) < \text{size } t$ 
  by(induction t bs rule: subtree.induct) force+

```

For termination of *get*:

```

corollary size-subtree-Split[termination-simp]:
  bs  $\neq [] \implies \text{size } (\text{subtree } (\text{Split } l\ r)\ bs) < \text{Suc } (\text{size } l + \text{size } r)$ 
  using size-subtree by fastforce

```

```

fun get :: 'a kdt  $\Rightarrow$  nat list  $\Rightarrow$  'a where
  get (Box b) - = b |
  get t ps = (if ps = [] then undefined else get (subtree t (map even ps)) (map (λi. i div 2) ps))

```

```

lemma points-get:  $\llbracket \text{height } t \leq k*n; ps \in \text{nlists } k \{0..<2^n\} \rrbracket \implies$ 
  get t ps = (ps  $\in$  points k n t)
proof(induction n arbitrary: k t ps)
  case 0
  then show ?case by(clarsimp simp add: height-0-iff)
next
  case (Suc n)
  show ?case
  proof(cases t)
    case Box
    thus ?thesis using Suc.preds(2) by(simp)
  next
    case (Split l r)
    obtain k0 where k = Suc k0 using Suc.preds(1) Split
      by(cases k) auto
    hence ps  $\neq []$ 

```

```

    using Suc.prems(2) by (auto simp: in-nlists-Suc-iff)
  then show ?thesis using Suc.prems Split Suc.IH[OF height-subtree2[OF Suc.prems(1)]]
in-nlists2D
  by(simp add: height-subtree2 in-mv-image points-subset bits-def)
qed
qed

end

```

7 K-dimensional Region Trees - Nested Trees

```

theory KD-Region-Nested
imports HOL-Library.NList
begin

lemma nlists-Suc: nlists (Suc n) A = (UN a:A. (#) a ` nlists n A)
  by(auto simp: set-eq-iff image-iff in-nlists-Suc-iff)
lemma nlists-singleton: nlists n {a} = {replicate n a}
  unfolding nlists-def by(auto simp: replicate-length-same dest!: subset-singletonD)

fun cube :: nat ⇒ nat ⇒ nat list set where
  cube k n = nlists k {0..n2^n}

datatype 'a tree1 = Lf 'a | Br 'a tree1 'a tree1
datatype 'a kdt = Cube 'a | Dims 'a kdt tree1

datatype-compat tree1
datatype-compat kdt

type-synonym kdtb = bool kdt

lemma set-tree1-finite-ne: finite (set-tree1 t) ∧ set-tree1 t ≠ {}
  by(induction t) auto

lemma kdt-tree1-term[termination-simp]: x ∈ set-tree1 t ⇒ size-kdt f x < Suc
  (size-tree1 (size-kdt f) t)
  by(induction t)(auto)

fun h-tree1 :: 'a tree1 ⇒ nat where
  h-tree1 (Lf _) = 0 |
  h-tree1 (Br l r) = max (h-tree1 l) (h-tree1 r) + 1

function (sequential) h-kdt :: 'a kdt ⇒ nat where
  h-kdt (Cube _) = 0 |
  h-kdt (Dims t) = Max (h-kdt ` (set-tree1 t)) + 1
  by pat-completeness auto
termination

```

```

by(relation measure (size-kdt ( $\lambda\_. 1$ )))
  (auto simp add: wf-lex-prod kdt-tree1-term)

function (sequential) inv-kdt :: nat  $\Rightarrow$  'a kdt  $\Rightarrow$  bool where
  inv-kdt k (Cube b) = True |
  inv-kdt k (Dims t) = (h-tree1 t  $\leq$  k  $\wedge$  ( $\forall kt \in$  set-tree1 t. inv-kdt k kt))
  by pat-completeness auto
termination
  by(relation {} <*lex*> measure (size-kdt ( $\lambda\_. 1$ )))
    (auto simp add: wf-lex-prod kdt-tree1-term)

definition bits :: nat  $\Rightarrow$  bool list set where
  bits n = nlists n UNIV

lemma bits-0[code]: bits 0 = {}
  by (auto simp: bits-def)

lemma bits-Suc[code]: bits (Suc n) = (let B = bits n in (#) True ` B  $\cup$  (#) False ` B)
  unfolding bits-def nlists-Suc UN BOOL_EQ by metis

fun leaf :: 'a tree1  $\Rightarrow$  bool list  $\Rightarrow$  'a where
  leaf (Lf x) - = x |
  leaf (Br l r) (b#bs) = leaf (if b then r else l) bs |
  leaf (Br l r) [] = leaf l []

definition mv :: bool list  $\Rightarrow$  nat list  $\Rightarrow$  nat list where
  mv = map2 ( $\lambda b x. 2*x + (if b then 0 else 1)$ )

fun points :: nat  $\Rightarrow$  nat  $\Rightarrow$  kdtb  $\Rightarrow$  nat list set where
  points k n (Cube b) = (if b then cube k n else {})
  points k (Suc n) (Dims t) = ( $\bigcup$  bs  $\in$  bits k. mv bs ` points k n (leaf t bs))

lemma bits-nonempty: bits n  $\neq$  {}
  by(auto simp: bits-def Ex-list-of-length)

lemma finite-bits: finite (bits n)
  by (metis List.finite-set List.set-insert UNIV BOOL bits-def empty-set nlists-set)

lemma mv-in-nlists:
   $\llbracket p \in nlists k \{0..<2^n\}; bs \in bits k \rrbracket \implies mv bs p \in nlists k \{0..<2 * 2^n\}$ 
  unfolding mv-def nlists-def bits-def
  by (fastforce dest: set-zip-rightD)

lemma leaf-append: length bs  $\geq$  h-tree1 t  $\implies$  leaf t (bs@bs') = leaf t bs
  by (induction t bs arbitrary: bs' rule: leaf.induct) auto

lemma leaf-take: length bs  $\geq$  h-tree1 t  $\implies$  leaf t (bs) = leaf t (take (h-tree1 t) bs)
  by (metis append-take-drop-id leaf-append length-take min.absorb2 order-refl)

```

```

lemma Union-bits-le:
  h-tree1 t ≤ n ==> (∪ bs ∈ bits n. {leaf t bs}) = (∪ bs ∈ bits (h-tree1 t). {leaf t bs})
  unfold bits-def nlists-def
  apply rule
  using leaf-take apply (force)
  by auto (metis Ex-list-of-length order.refl le-add-diff-inverse leaf-append length-append)

lemma set-tree1-leafs:
  set-tree1 t = (∪ bs ∈ bits (h-tree1 t). {leaf t bs})
  proof(induction t)
  case (Lf x)
  then show ?case by (simp add: bits-nonempty)
  next
  case (Br t1 t2)
  then show ?case using Union-bits-le[of t1 h-tree1 t2] Union-bits-le[of t2 h-tree1 t1]
  by (auto simp add: Let-def bits-Suc max-def)
  qed

lemma points-subset: inv-kdt k t ==> h-kdt t ≤ n ==> points k n t ⊆ nlists k
{0..<2^n}
  proof(induction k n t rule: points.induct)
  case (2 k n t)
  have mv bs ps ∈ nlists k {0..<2 * 2^n} if *: bs ∈ bits k ps ∈ points k n (leaf t bs) for bs ps
  proof –
    have inv-kdt k (leaf t bs) using *(1) 2.prems(1)
    by(auto simp: set-tree1-leafs)
    (metis bits-def leaf-take length-take min.absorb2 nlistsE-length nlistsI subset-UNIV)
    moreover have h-kdt (leaf t bs) ≤ n using *(1) 2.prems
    by(auto simp add: set-tree1-leafs bits-nonempty finite-bits)
    (metis bits-def leaf-take length-take min.absorb2 nlistsE-length nlistsI subset-UNIV)
    ultimately show ?thesis using * 2.IH[of bs] mv-in-nlists by(auto)
  qed
  thus ?case by(auto)
  qed auto

fun comb1 :: ('a ⇒ 'a ⇒ 'a) ⇒ 'a tree1 ⇒ 'a tree1 ⇒ 'a tree1 where
  comb1 f (Lf x1) (Lf x2) = Lf (f x1 x2) |
  comb1 f (Br l1 r1) (Br l2 r2) = Br (comb1 f l1 l2) (comb1 f r1 r2) |
  comb1 f (Br l1 r1) (Lf x) = Br (comb1 f l1 (Lf x)) (comb1 f r1 (Lf x)) |
  comb1 f (Lf x) (Br l2 r2) = Br (comb1 f (Lf x) l2) (comb1 f (Lf x) r2)

```

The last two equations cover cases that do not arise but are needed to prove that *comb1* only applies *f* to elements of the two trees, which implies this congruence lemma:

```

lemma comb1-cong[fundef-cong]:
   $\llbracket s1 = t1; s2 = t2; \bigwedge x y. x \in \text{set-tree1 } t1 \implies y \in \text{set-tree1 } t2 \implies f x y = g x y \rrbracket \implies \text{comb1 } f s1 s2 = \text{comb1 } g t1 t2$ 
  apply(induction f t1 t2 arbitrary: s1 s2 rule: comb1.induct)
  apply auto
  done

```

This congruence lemma in turn implies that *union* terminates because the recursive calls of *union* via *comb1* only involve elements from the two trees, which are smaller.

```

function (sequential) union :: kdtb  $\Rightarrow$  kdtb  $\Rightarrow$  kdtb where
  union (Cube b) t = (if b then Cube True else t) |
  union t (Cube b) = (if b then Cube True else t) |
  union (Dims t1) (Dims t2) = Dims (comb1 union t1 t2)
  by pat-completeness auto
  termination
  by(relation measure (size-kdt ( $\lambda$ -. 1))  $\langle\!\rangle$ lex* $\rangle$  {})
    (auto simp add: wf-lex-prod kdt-tree1-term)

```

```

lemma leaf-comb1:
   $\llbracket \text{length } bs \geq \max (\text{h-tree1 } t1) (\text{h-tree1 } t2) \rrbracket \implies$ 
  leaf (comb1 f t1 t2) bs = f (leaf t1 bs) (leaf t2 bs)
  apply(induction f t1 t2 arbitrary: bs rule: comb1.induct)
  apply (auto simp: Suc-le-length-iff split: if-splits)
  done

```

```

lemma leaf-in-set-tree1:  $\llbracket \text{length } bs \geq \text{h-tree1 } t \rrbracket \implies \text{leaf } t \text{ } bs \in \text{set-tree1 } t$ 
  apply(auto simp add: set-tree1-leafs bits-def intro: nlistsI)
  by (metis leaf-take length-take min.absorb2 nlistsI subset-UNIV)

```

```

lemma leaf-in-set-tree2:  $\llbracket x \in \text{nlists } k \text{ } \text{UNIV}; \text{h-tree1 } t1 \leq k \rrbracket \implies \text{leaf } t1 \text{ } x \in \text{set-tree1 } t1$ 
  by (metis leaf-in-set-tree1 leaf-take length-take min.absorb2 nlistsE-length)

```

```

lemma points-union:
   $\llbracket \text{inv-kdt } k \text{ } t1; \text{inv-kdt } k \text{ } t2; n \geq \max (\text{h-kdt } t1) (\text{h-kdt } t2) \rrbracket \implies$ 
  points k n (union t1 t2) = points k n t1  $\cup$  points k n t2
  proof(induction t1 t2 arbitrary: n rule: union.induct)
    case 1 thus ?case using Un-absorb2[OF points-subset] by simp
  next
    case 2 thus ?case using Un-absorb1[OF points-subset] by simp
  next
    case (3 t1 t2)
    from 3.prems obtain m where n = Suc m by (auto dest: Suc-le-D)
    with 3 show ?case
      by (simp add: leaf-comb1 bits-def leaf-in-set-tree2 set-tree1-finite-ne image-Un UN-Un-distrib)
  qed

```

```

lemma size-leaf[termination-simp]: size (leaf t (map f ps)) < Suc (size-tree1 size t)
apply(induction t map f ps arbitrary: ps rule: leaf.induct)
  apply simp
  apply fastforce
  apply fastforce
done

fun get :: 'a kdt ⇒ nat list ⇒ 'a where
get (Cube b) - = b |
get (Dims t) ps = get (leaf t (map even ps)) (map (λx. x div 2) ps)

lemma map-zip1: [ length xs = length ys; ∀ p ∈ set(zip xs ys). f p = fst p ] ⇒
map f (zip xs ys) = xs
by (metis (no-types, lifting) map-eq-conv map-fst-zip)

lemma map-mv1: [ length ps = length bs ] ⇒ map even (mv bs ps) = bs
unfolding nlists-def mv-def by(auto intro!: map-zip1 split: if-splits)

lemma map-zip2: [ length xs = length ys; ∀ p ∈ set(zip xs ys). f p = snd p ] ⇒
map f (zip xs ys) = ys
by (metis (no-types, lifting) map-eq-conv map-snd-zip)

lemma map-mv2: [ length ps = length bs ] ⇒ map (λx. x div 2) (mv bs ps) = ps
unfolding nlists-def mv-def by(auto intro!: map-zip2)

lemma mv-map-map: mv (map even ps) (map (λx. x div 2) ps) = ps
unfolding nlists-def mv-def
by(auto simp add: map-eq-conv[where xs=ps and g=id,simplified] map2-map-map)

lemma in-mv-image: [ ps ∈ nlists k {0..<2*2^n}; Ps ⊆ nlists k {0..<2^n}; bs ∈ bits k ] ⇒
ps ∈ mv bs ‘ Ps ←→ map (λx. x div 2) ps ∈ Ps ∧ (bs = map even ps)
by (auto simp: map-mv1 map-mv2 mv-map-map bits-def intro!: image-eqI)

lemma get-points: [ inv-kdt k t; h-kdt t ≤ n; ps ∈ nlists k {0..<2^n} ] ⇒
get t ps = (ps ∈ points k n t)
proof(induction t ps arbitrary: n rule: get.induct)
  case (2 t ps)
  obtain m where [simp]: n = Suc m using ⟨h-kdt (Dims t) ≤ n⟩ by (auto dest: Suc-le-D)
  have ∀ bs. length bs = k → inv-kdt k (leaf t bs) ∧ h-kdt (leaf t bs) ≤ m
  using 2.prem by (auto simp add: leaf-in-set-tree1 set-tree1-finite-ne)
  moreover have map (λx. x div 2) ps ∈ nlists k {0..<2^m}
  using 2.prem(3) by(fastforce intro!: nlistsI dest: nlistsE-set)
  ultimately show ?case using 2.prem 2.IH[of m] points-subset[of k - m]
  by(auto simp add: in-mv-image bits-def intro: nlistsI)
qed auto

```

```

fun modify :: ('a ⇒ 'a) ⇒ bool list ⇒ 'a tree1 ⇒ 'a tree1 where
  modify f [] (Lf x) = Lf (f x) |
  modify f (b#bs) (Lf x) = (if b then Br (Lf x) (modify f bs (Lf x)) else Br (modify
    f bs (Lf x)) (Lf x)) |
  modify f (b#bs) (Br l r) = (if b then Br l (modify f bs r) else Br (modify
    f bs l) r)

fun put :: 'a ⇒ nat ⇒ nat list ⇒ 'a kdt ⇒ 'a kdt where
  put b' 0 ps (Cube -) = Cube b' |
  put b' (Suc n) ps t =
    Dims (modify (put b' n (map (λi. i div 2) ps)) (map even ps)
      (case t of Cube b ⇒ Lf (Cube b) | Dims t ⇒ t))

lemma leaf-modify: [ h-tree1 t ≤ length bs; length bs' = length bs ] ⇒
  leaf (modify f bs t) bs' = (if bs' = bs then f(leaf t bs) else leaf t bs')
apply(induction f bs t arbitrary: bs' rule: modify.induct)
apply(auto simp: length-Suc-conv split: if-splits)
done

lemma in-nlists2D: xs ∈ nlists k {0..<2 * 2 ^ n} ⇒ ∃ bs ∈ nlists k UNIV. xs ∈
  mv bs ` nlists k {0..<2 ^ n}
unfolding nlists-def
apply(rule bexI[where x = map even xs])
apply(auto simp: image-def)[1]
apply(rule exI[where x = map (λi. i div 2) xs])
apply(auto simp add: mv-map-map)
done

lemma nlists2-simp: nlists k {0..<2 * 2 ^ n} = (⋃ bs ∈ nlists k UNIV. mv bs ` nlists k {0..<2 ^ n})
by (auto simp: mv-in-nlists bits-def in-nlists2D)

lemma mv-diff:
  [ length qs = length bs; ∀ as ∈ A. length as = length bs ] ⇒ mv bs ` (A - {qs})
  = mv bs ` A - {mv bs qs}
by (auto) (metis map-mv2)

lemma put-points: [ inv-kdt k t; h-kdt t ≤ n; ps ∈ nlists k {0..<2 ^ n} ] ⇒
  points k n (put b n ps t) = (if b then points k n t ∪ {ps} else points k n t - {ps})
proof(induction b n ps t rule: put.induct)
  case 1 thus ?case by (simp add: nlists-singleton)
next
  case (2 b' n ps t)
  have *: ∀ x bs. t = Dims x → length bs = length ps → inv-kdt k (leaf x bs)
  using 2.prems(1,3) leaf-in-set-tree1 by fastforce
  have **: t = Dims x ⇒ length bs = length ps ⇒ h-kdt (leaf x bs) ≤ n for x bs
  using leaf-in-set-tree1[of x] 2.prems set-tree1-finite-ne[of x] by auto

```

```

have ***:  $\llbracket t = \text{Dims } x; \text{length } bs = \text{length } ps \rrbracket \implies$ 
 $(\forall qs \in \text{points}(\text{length } ps) n (\text{leaf } x \text{ } bs). \text{length } qs = \text{length } ps) = \text{True}$  for  $x$   $bs$ 
using 2.prems(3) by (metis * ** nlistsE-length points-subset subset-iff)

have Union-diff-aux:  $a \in A \implies (\bigcup x \in A. F x) = F a \cup (\bigcup x \in A - \{a\}. F x)$ 
for  $a$   $A$   $F$ 
by blast
have notin-aux:  $\forall x \in \text{nlists}(\text{length } ps) \text{ UNIV} - \{\text{map even } ps\}. \forall qs \in A x. \text{length } qs = \text{length } ps \implies$ 
 $ps \notin (\bigcup x \in \text{nlists}(\text{length } ps) \text{ UNIV} - \{\text{map even } ps\}. \text{mv } x \text{ } ' A x)$  for  $A$ 
by (smt (verit) DiffE UN-E image-iff insert-iff map-mv1 nlistsE-length)
have set1:  $\bigwedge x y. \{x. x \neq y\} = \text{UNIV} - \{y\}$  by blast
have nlists-map:  $\bigwedge n xs f A. n = \text{size } xs \implies (\text{map } f xs \in \text{nlists } n A) = (f \text{ } ' \text{set } xs \subseteq A)$  by simp

have  $(\lambda i. i \text{ div } 2) \text{ } ' \text{set } ps \subseteq \{0..<2 \wedge n\}$  using nlistsE-set[OF 2.prems(3)] by
auto
moreover have  $\forall x. t = \text{Dims } x \longrightarrow \text{inv-kdt } k (\text{Dims } x)$ 
using 2.prems(1) by blast
moreover have  $t = \text{Dims } x \implies \text{length } bs = \text{length } ps \implies \text{points}(\text{length } ps) n (\text{leaf } x \text{ } bs) \subseteq \text{nlists}(\text{length } ps) \{0..<2 \wedge n\}$  for  $x$   $bs$ 
using 2.prems(3) by (metis * ** nlistsE-length points-subset)
moreover have  $\text{length } ps = k$  using 2.prems(3) by simp
moreover from 2 * ** calculation show ?case
by (clarsimp simp: leaf-modify[of - map even ps] mv-map-map nlists-map bits-def
nlistsE-length[of -::bool list k UNIV] nlists2-simp Union-diff-aux[of map even ps]
mv-diff *** Diff-insert0[OF notin-aux]
insert-absorb Diff-insert-absorb Int-absorb1 set1 Diff-Int-distrib Un-Diff
split: kdt.split)
qed simp

end

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