

Taylor Models

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Abstract

We present a formally verified implementation of multivariate Taylor models. Taylor models are a form of rigorous polynomial approximation, consisting of an approximation polynomial based on Taylor expansions, combined with a rigorous bound on the approximation error. Taylor models were introduced as a tool to mitigate the dependency problem of interval arithmetic. Our implementation automatically computes Taylor models for the class of elementary functions, expressed by composition of arithmetic operations and basic functions like exp, sin, or square root.

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1 Topology for Floating Point Numbers

theory *Float-Topology*

imports

HOL-Analysis.Multivariate-Analysis

HOL-Library.Float

begin

This topology is totally disconnected and not complete, in which sense is it useful? Perhaps for convergence of intervals?

unbundle *float.lifting*

instantiation *float :: dist*

begin

lift-definition *dist-float :: float \Rightarrow float \Rightarrow real is dist .*

lemma *dist-float-eq-0-iff: (dist x y = 0) = (x = y) for x y::float*

by *transfer simp*

lemma *dist-float-triangle2: dist x y \leq dist x z + dist y z for x y z::float*

by *transfer (rule dist-triangle2)*

instance ..

end

instantiation *float :: uniformity*

begin

definition *uniformity-float :: (float \times float) filter*

where *uniformity-float = (INF e \in {0<..}. principal {(x, y). dist x y < e})*

instance ..

end

lemma *float-dense-in-real:*

fixes *x :: real*

assumes *x < y*

shows $\exists r \in \text{float}. x < r \wedge r < y$

proof –

from $\langle x < y \rangle$ **have** $0 < y - x$ **by** *simp*

with *reals-Archimedean* **obtain** $q' :: \text{nat}$ **where** $q' : \text{inverse } (\text{real } q') < y - x$

and $0 < q'$

by *blast*

define $q :: \text{nat}$ **where** $q \equiv 2 \wedge \text{nat } | \text{bitlen } q'$

from *bitlen-bounds[of q']* $\langle 0 < q' \rangle$ **have** $q' < q$

by *(auto simp: q-def)*

then have $\text{inverse } q < \text{inverse } q'$

using $\langle 0 < q' \rangle$

```

    by (auto simp: divide-simps)
  with ⟨q' < q⟩ q' have q: inverse (real q) < y - x and 0 < q
    by (auto simp: split: if-splits)
  define p where p = ⌈y * real q⌉ - 1
  define r where r = of-int p / real q
  from q have x < y - inverse (real q)
    by simp
  also from ⟨0 < q⟩ have y - inverse (real q) ≤ r
    by (simp add: r-def p-def le-divide-eq left-diff-distrib)
  finally have x < r .
  moreover from ⟨0 < q⟩ have r < y
    by (simp add: r-def p-def divide-less-eq diff-less-eq less-ceiling-iff [symmetric])
  moreover have r ∈ float
    by (simp add: r-def q-def)
  ultimately show ?thesis by blast
qed

```

lemma *real-of-float-dense*:

```

  fixes x y :: real
  assumes x < y
  shows ∃ q :: float. x < real-of-float q ∧ real-of-float q < y
  using float-dense-in-real [OF ⟨x < y⟩]
  by (auto elim: real-of-float-cases)

```

instantiation *float* :: *linorder-topology*

begin

definition *open-float*::*float set* ⇒ *bool* where

```

  open-float S = (∀ x ∈ S. ∃ e > 0. ∀ y. dist y x < e ⟶ y ∈ S)

```

instance

proof (*standard*, *intro ext iffI*)

```

  fix U :: float set

```

```

  assume generate-topology (range lessThan ∪ range greaterThan) U

```

```

  then show open U

```

```

    unfolding open-float-def uniformity-float-def

```

```

  proof (induction U)

```

```

    case UNIV

```

```

    then show ?case by (auto intro!: zero-less-one)

```

```

  next

```

```

    case (Int a b)

```

```

    show ?case

```

```

    proof safe

```

```

      fix x assume x ∈ a x ∈ b

```

```

      with Int(3,4) obtain e1 e2

```

```

        where dist (y) (x) < e1 ⟹ y ∈ a

```

```

          and dist (y) (x) < e2 ⟹ y ∈ b

```

```

          and 0 < e1 0 < e2

```

```

        for y

```

```

    by (auto dest!: bspec)
  then show  $\exists e > 0. \forall y. \text{dist } y \ x < e \longrightarrow y \in a \cap b$ 
    by (auto intro!: exI[where x=min e1 e2])
qed
next
case (UN K)
show ?case
proof safe
  fix x X assume x: x ∈ X and X: X ∈ K
  from UN[OF X] x obtain e where
    dist (y) (x) < e  $\implies$  y ∈ X e > 0 for y
  by auto
  then show  $\exists e > 0. \forall y. \text{dist (real-of-float y) (real-of-float x) < e} \longrightarrow y \in \bigcup K$ 
    using x X
    by (auto intro!: exI[where x=e])
qed
next
case (Basis s)
then show ?case
proof safe
  fix x u::float
  assume x < u
  then show  $\exists e > 0. \forall y. \text{dist (real-of-float y) (real-of-float x) < e} \longrightarrow y \in \{..<u\}$ 
    by (force simp add: eventually-principal dist-float-def
      dist-real-def abs-real-def
      intro!: exI[where x=(u - x)/2])
next
  fix x l::float
  assume l < x
  then show  $\exists e > 0. \forall y. \text{dist (real-of-float y) (real-of-float x) < e} \longrightarrow y \in \{l<..\}$ 
    by (force simp add: eventually-principal dist-float-def
      dist-real-def abs-real-def
      intro!: exI[where x=(x - l)/2])
qed
qed
next
fix U::float set
assume open U
then obtain e where e:
  x ∈ U  $\implies$  e x > 0
  x ∈ U  $\implies$  dist (y) (x) < e x  $\implies$  y ∈ U for x y
  unfolding open-float-def uniformity-float-def
  by metis
{
  fix x
  assume x: x ∈ U
  obtain e' where e': e' > 0 real-of-float e' < e x
    using real-of-float-dense[of 0 e x]

```

```

    using e(1)[OF x]
    by auto
  then have  $\text{dist } (y) (x) < e' \implies y \in U$  for  $y$ 
    by (intro e[OF x]) auto
  then have  $\exists e' > 0. \forall y. \text{dist } (y) (x) < \text{real-of-float } e' \longrightarrow y \in U$ 
    using e'
    by auto
} then
obtain e' where e':
   $x \in U \implies 0 < e' x$ 
   $x \in U \implies \text{dist } y x < \text{real-of-float } (e' x) \implies y \in U$  for  $x y$ 
  by metis
then have  $U = (\bigcup x \in U. \text{greaterThan } (x - e' x) \cap \text{lessThan } (x + e' x))$ 
  by (auto simp: dist-float-def dist-commute dist-real-def)
also have generate-topology (range lessThan  $\cup$  range greaterThan) ...
  by (intro generate-topology-Union generate-topology.Int generate-topology.Basis)
auto
finally show generate-topology (range lessThan  $\cup$  range greaterThan) U .
qed

end

instance float :: metric-space
proof standard
  fix U::float set
  show open U =  $(\forall x \in U. \forall_F (x', y) \text{ in uniformity. } x' = x \longrightarrow y \in U)$ 
    unfolding open-float-def open-dist uniformity-float-def uniformity-real-def
  proof safe
    fix x
    assume  $\forall x \in U. \exists e > 0. \forall y. \text{dist } (\text{real-of-float } y) (\text{real-of-float } x) < e \longrightarrow y \in U$ 
  x  $\in U$ 
    then obtain e where  $e > 0 \text{ dist } (y) (x) < e \implies y \in U$  for  $y$ 
      by auto
    then show  $\forall_F (x', y) \text{ in INF } e \in \{0 < ..\}. \text{principal } \{(x, y). \text{dist } x y < e\}. x' =$ 
  x  $\longrightarrow y \in U$ 
      by (intro eventually-INF1[where i=e])
        (auto simp: eventually-principal dist-commute dist-float-def)
  next
    fix u
    assume  $\forall x \in U. \forall_F (x', y) \text{ in INF } e \in \{0 < ..\}. \text{principal } \{(x, y). \text{dist } x y < e\}. x' =$ 
  x  $\longrightarrow y \in U$ 
      u  $\in U$ 
    from this obtain E where  $E: E \subseteq \{0 < ..\}$  finite E
       $\forall (x', y) \in \bigcap x \in E. \{(y', y). \text{dist } y' y < x\}. x' = u \longrightarrow y \in U$ 
    by (subst (asm) eventually-INF) (auto simp: INF-principal-finite eventually-principal)
    then show  $\exists e > 0. \forall y. \text{dist } (\text{real-of-float } y) (\text{real-of-float } u) < e \longrightarrow y \in U$ 
      by (intro exI[where x=if E = {} then 1 else Min E])
        (auto simp: dist-commute dist-float-def)

```

```

qed
qed (use dist-float-eq-0-iff dist-float-triangle2 in
      ⟨auto simp add: uniformity-float-def dist-float-def⟩)

instance float::topological-ab-group-add
proof
  fix a b::float
  show (( $\lambda x. \text{fst } x + \text{snd } x$ )  $\longrightarrow a + b$ ) (nhds a  $\times_F$  nhds b)
  proof (rule tendstoI)
    fix e::real
    assume  $e > 0$ 
    have 1: ( $\text{fst} \longrightarrow a$ ) (nhds a  $\times_F$  nhds b)
      and 2: ( $\text{snd} \longrightarrow b$ ) (nhds a  $\times_F$  nhds b)
      by (auto intro!: tendsto-eq-intros filterlim-ident simp: nhds-prod[symmetric])
    have  $\forall_F x$  in nhds a  $\times_F$  nhds b. dist ( $\text{fst } x$ ) (a)  $< e/2$ 
      by (rule tendstoD[OF 1]) (use ⟨ $e > 0$ ⟩ in auto)
    moreover have  $\forall_F x$  in nhds a  $\times_F$  nhds b. dist ( $\text{snd } x$ ) (b)  $< e/2$ 
      by (rule tendstoD[OF 2]) (use ⟨ $e > 0$ ⟩ in auto)
    ultimately show  $\forall_F x$  in nhds a  $\times_F$  nhds b. dist ( $\text{fst } x + \text{snd } x$ ) ( $a + b$ )  $< e$ 
    proof eventually-elim
      case (elim x)
      then show ?case
        by (auto simp: dist-float-def norm)
    qed
  qed
  show (uminus  $\longrightarrow - a$ ) (nhds a)
    using filterlim-ident[of nhds a]
    by (auto intro!: tendstoI dest!: tendstoD simp: dist-float-def dist-minus)
qed

lifting-update float.lifting
lifting-forget float.lifting

end

```

2 Horner Evaluation

```

theory Horner-Eval
  imports HOL-Library.Interval
begin

```

Function and lemmas for evaluating polynomials via the horner scheme. Because interval multiplication is not distributive, interval polynomials expressed as a sum of monomials are not equivalent to their respective horner form. The functions and lemmas in this theory can be used to express interval polynomials in horner form and prove facts about them.

```

fun horner-eval' where
  horner-eval' f x v 0 = v

```

| $\text{horner-eval}' f x v (\text{Suc } i) = \text{horner-eval}' f x (f i + x * v) i$

definition *horner-eval*

where $\text{horner-eval } f x n = \text{horner-eval}' f x 0 n$

lemma *horner-eval-cong*:

assumes $\bigwedge i. i < n \implies f i = g i$

assumes $x = y$

assumes $n = m$

shows $\text{horner-eval } f x n = \text{horner-eval } g y m$

proof–

{
 fix v **have** $\text{horner-eval}' f x v n = \text{horner-eval}' g x v n$
 using *assms(1)* **by** (*induction n arbitrary: v, simp-all*)
}

thus *?thesis*

by (*simp add: assms(2,3) horner-eval-def*)

qed

lemma *horner-eval-eq-setsum*:

fixes $x::'a::\text{linordered-idom}$

shows $\text{horner-eval } f x n = (\sum i < n. f i * x^i)$

proof–

{
 fix v **have** $\text{horner-eval}' f x v n = (\sum i < n. f i * x^i) + v * x^n$
 by (*induction n arbitrary: v, simp-all add: distrib-left mult.commute*)
}

thus *?thesis* **by** (*simp add: horner-eval-def*)

qed

lemma *horner-eval-Suc[*simp*]*:

fixes $x::'a::\text{linordered-idom}$

shows $\text{horner-eval } f x (\text{Suc } n) = \text{horner-eval } f x n + (f n) * x^n$

unfolding *horner-eval-eq-setsum*

by *simp*

lemma *horner-eval-Suc'[*simp*]*:

fixes $x::'a::\{\text{comm-monoid-add, times}\}$

shows $\text{horner-eval } f x (\text{Suc } n) = f 0 + x * (\text{horner-eval } (\lambda i. f (\text{Suc } i)) x n)$

proof–

{
 fix v **have** $\text{horner-eval}' f x v (\text{Suc } n) = f 0 + x * \text{horner-eval}' (\lambda i. f (\text{Suc } i))$
 $x v n$

by (*induction n arbitrary: v, simp-all*)

}

thus *?thesis* **by** (*simp add: horner-eval-def*)

qed

lemma *horner-eval-0[*simp*]*:

shows *horner-eval* $f\ x\ 0 = 0$
by (*simp add: horner-eval-def*)

lemma *horner-eval'-interval*:
fixes $x::'a::\text{linordered-ring}$
assumes $\bigwedge i. i < n \implies f\ i \in \text{set-of } (g\ i)$
assumes $x \in_i I\ v \in_i V$
shows *horner-eval'* $f\ x\ v\ n \in_i \text{horner-eval}'\ g\ I\ V\ n$
using *assms*
by (*induction n arbitrary: v V*) (*auto intro!: plus-in-intervalI times-in-intervalI*)

lemma *horner-eval-interval*:
fixes $x::'a::\text{linordered-idom}$
assumes $\bigwedge i. i < n \implies f\ i \in \text{set-of } (g\ i)$
assumes $x \in \text{set-of } I$
shows *horner-eval* $f\ x\ n \in_i \text{horner-eval}\ g\ I\ n$
unfolding *horner-eval-def*
using *assms*
by (*rule horner-eval'-interval*) (*auto simp: set-of-eq*)

end
theory *Polynomial-Expression-Additional*
imports
Polynomial-Expression
HOL-Decision-Proc.Approximation
begin

lemma *real-of-float-eq-zero-iff*[*simp*]: *real-of-float* $x = 0 \longleftrightarrow x = 0$
by (*simp add: real-of-float-eq*)

Theory *Taylor-Models.Polynomial-Expression* contains a, more or less, 1:1 generalization of theory *Multivariate-Polynomial*. Any additions belong here.

declare [[*coercion-map map-poly*]]
declare [[*coercion interval-of::float \Rightarrow float interval*]]

Apply float interval arguments to a float poly.

value *Ipoly* [*Ivl (Float 4 (-6)) (Float 10 6)*] (*poly.Add (poly.C (Float 3 5)) (poly.Bound 0)*)

map-poly for homomorphisms

lemma *map-poly-homo-polyadd-eq-zero-iff*:
 $\text{map-poly } f\ (p +_p\ q) = 0_p \longleftrightarrow p +_p\ q = 0_p$
if [*symmetric, simp*]: $\bigwedge x\ y. f\ (x + y) = f\ x + f\ y \wedge x. f\ x = 0 \longleftrightarrow x = 0$
by (*induction p q rule: polyadd.induct*) *auto*

lemma *zero-iffD*: $(\bigwedge x. f\ x = 0 \longleftrightarrow x = 0) \implies f\ 0 = 0$
by *auto*

lemma *map-poly-homo-polyadd*:

map-poly f (p1 +_p p2) = map-poly f p1 +_p map-poly f p2

if [*simp*]: $\bigwedge x y. f (x + y) = f x + f y \wedge x. f x = 0 \longleftrightarrow x = 0$

by (*induction p1 p2 rule: polyadd.induct*)

(*auto simp: zero-iffD[OF that(2)] Let-def map-poly-homo-polyadd-eq-zero-iff*)

lemma *map-poly-homo-polyneg*:

map-poly f (~_p p1) = ~_p (map-poly f p1)

if [*simp*]: $\bigwedge x y. f (-x) = -f x$

by (*induction p1*) (*auto simp: Let-def map-poly-homo-polyadd-eq-zero-iff*)

lemma *map-poly-homo-polysub*:

map-poly f (p1 -_p p2) = map-poly f p1 -_p map-poly f p2

if [*simp*]: $\bigwedge x y. f (x + y) = f x + f y \wedge x. f x = 0 \longleftrightarrow x = 0 \wedge x y. f (-x) = -f x$

by (*auto simp: polysub-def map-poly-homo-polyadd map-poly-homo-polyneg*)

lemma *map-poly-homo-polymul*:

*map-poly f (p1 *_p p2) = map-poly f p1 *_p map-poly f p2*

if [*simp*]: $\bigwedge x y. f (x + y) = f x + f y \wedge x. f x = 0 \longleftrightarrow x = 0 \wedge x y. f (x * y) = f x * f y$

by (*induction p1 p2 rule: polymul.induct*)

(*auto simp: zero-iffD[OF that(2)] map-poly-homo-polyadd*)

lemma *map-poly-homo-polypow*:

map-poly f (p1 ^_p n) = map-poly f p1 ^_p n

if [*simp*]: $\bigwedge x y. f (x + y) = f x + f y \wedge x. f x = 0 \longleftrightarrow x = 0 \wedge x y. f (x * y) = f x * f y$

f 1 = 1

proof(*induction n rule: nat-less-induct*)

case (1 n)

then show ?*case*

apply (*cases n*)

apply (*auto simp: map-poly-homo-polyadd map-poly-homo-polymul*)

by (*smt Suc-less-eq div2-less-self even-Suc odd-Suc-div-two map-poly-homo-polymul that*)

qed

lemmas *map-poly-homo-polyarith = map-poly-homo-polyadd map-poly-homo-polyneg map-poly-homo-polysub map-poly-homo-polymul map-poly-homo-polypow*

Count the number of parameters of a polynomial.

fun *num-params* :: 'a poly \Rightarrow nat

where *num-params* (poly.C c) = 0

| *num-params* (poly.Bound n) = Suc n

| *num-params* (poly.Add a b) = max (num-params a) (num-params b)

| *num-params* (poly.Sub a b) = max (num-params a) (num-params b)

| *num-params* (poly.Mul a b) = max (num-params a) (num-params b)

$| \text{num-params } (\text{poly.Neg } a) = \text{num-params } a$
 $| \text{num-params } (\text{poly.Pw } a \ n) = \text{num-params } a$
 $| \text{num-params } (\text{poly.CN } a \ n \ b) = \max (\max (\text{num-params } a) (\text{num-params } b))$
 (Suc n)

lemma *num-params-map-poly[simp]*:
shows $\text{num-params } (\text{map-poly } f \ p) = \text{num-params } p$
by (*induction p, simp-all*)

lemma *num-params-polyadd*:
shows $\text{num-params } (p1 +_p p2) \leq \max (\text{num-params } p1) (\text{num-params } p2)$
proof (*induction p1 p2 rule: polyadd.induct*)
case ($_4 \ c \ n \ p \ c' \ n' \ p'$)
then show ?*case*
by *auto (auto simp: max-def Let-def split: if-splits)*
qed *auto*

lemma *num-params-polyneg*:
shows $\text{num-params } (\sim_p p) = \text{num-params } p$
by (*induction p rule: polyneg.induct*) *simp-all*

lemma *num-params-polymul*:
shows $\text{num-params } (p1 *_p p2) \leq \max (\text{num-params } p1) (\text{num-params } p2)$
proof (*induction p1 p2 rule: polymul.induct*)
case ($_4 \ c \ n \ p \ c' \ n' \ p'$)
then show ?*case*
by *auto (auto simp: max-def Let-def split: if-splits*
intro!: num-params-polyadd[THEN order-trans])
qed *auto*

lemma *num-params-polypow*:
shows $\text{num-params } (p \widehat{_p} n) \leq \text{num-params } p$
apply (*induction n rule: polypow.induct*)
unfolding *polypow.simps*
by (*auto intro!: order-trans[OF num-params-polymul]*
simp: Let-def simp del: polypow.simps)

lemma *num-params-polynate*:
shows $\text{num-params } (\text{polynate } p) \leq \text{num-params } p$
proof(*induction p rule: polynate.induct*)
case ($_2 \ l \ r$)
thus ?*case*
using *num-params-polyadd[of polynate l polynate r]*
by *simp*
next
case ($_3 \ l \ r$)
thus ?*case*
using *num-params-polyadd[of polynate l \sim_p (polynate r)]*
by (*simp add: polysub-def num-params-polyneg*)

```

next
  case (4 l r)
  thus ?case
    using num-params-polymul[of polynate l polynate r]
    by simp
next
  case (5 p)
  thus ?case
    by (simp add: num-params-polyneg)
next
  case (6 p n)
  thus ?case
    using num-params-polypow[of n polynate p]
    by simp
qed simp-all

```

```

lemma polynate-map-poly-real[simp]:
  fixes p :: float poly
  shows map-poly real-of-float (polynate p) = polynate (map-poly real-of-float p)
  by (induction p) (simp-all add: map-poly-homo-polyarith)

```

Evaluating a float poly is equivalent to evaluating the corresponding real poly with the float parameters converted to reals.

```

lemma Ipoly-real-float-equiv:
  fixes p::float poly and xs::float list
  assumes num-params p ≤ length xs
  shows Ipoly xs (p::real poly) = Ipoly xs p
  using assms by (induction p, simp-all)

```

Evaluating an 'a poly with 'a interval arguments is monotone.

```

lemma Ipoly-interval-args-mono:
  fixes p::'a::linordered-idom poly
  and x::'a list
  and xs::'a interval list
  assumes x all-ini xs
  assumes num-params p ≤ length xs
  shows Ipoly x p ∈ set-of (Ipoly xs (map-poly interval-of p))
  using assms
  by (induction p)
  (auto simp: all-in-i-def plus-in-intervalI minus-in-intervalI times-in-intervalI
  uminus-in-intervalI set-of-power-mono)

```

```

lemma Ipoly-interval-args-inc-mono:
  fixes p::'a::{real-normed-algebra, linear-continuum-topology, linordered-idom} poly
  and I::'a interval list and J::'a interval list
  assumes num-params p ≤ length I
  assumes I all-subset J
  shows set-of (Ipoly I (map-poly interval-of p)) ⊆ set-of (Ipoly J (map-poly
  interval-of p))

```

```

using assms
by (induction p)
(simp-all add: set-of-add-inc set-of-sub-inc set-of-mul-inc set-of-neg-inc set-of-pow-inc)

```

3 Splitting polynomials to reduce floating point precision

TODO: Move this! Definitions regarding floating point numbers should not be in a theory about polynomials.

```

fun float-prec :: float  $\Rightarrow$  int
  where float-prec f = (let p=exponent f in if p  $\geq$  0 then 0 else -p)

```

```

fun float-round :: nat  $\Rightarrow$  float  $\Rightarrow$  float
  where float-round prec f = (
    let d = float-down prec f; u = float-up prec f
    in if f - d < u - f then d else u)

```

Splits any polynomial p into two polynomials l, r , such that $\forall x::real. p(x) = l(x) + r(x)$ and all floating point coefficients in p are rounded to precision $prec$. Not all cases need to give good results. Polynomials normalized with `polynat` only contain `poly.C` and `poly.CN` constructors.

```

fun split-by-prec :: nat  $\Rightarrow$  float poly  $\Rightarrow$  float poly * float poly
  where split-by-prec prec (poly.C f) = (let r = float-round prec f in (poly.C r,
poly.C (f - r)))
  | split-by-prec prec (poly.Bound n) = (poly.Bound n, poly.C 0)
  | split-by-prec prec (poly.Add l r) = (let (ll, lr) = split-by-prec prec l;
    (rl, rr) = split-by-prec prec r
    in (poly.Add ll rl, poly.Add lr rr))
  | split-by-prec prec (poly.Sub l r) = (let (ll, lr) = split-by-prec prec l;
    (rl, rr) = split-by-prec prec r
    in (poly.Sub ll rl, poly.Sub lr rr))
  | split-by-prec prec (poly.Mul l r) = (let (ll, lr) = split-by-prec prec l;
    (rl, rr) = split-by-prec prec r
    in (poly.Mul ll rl, poly.Add (poly.Add (poly.Mul
lr rl) (poly.Mul ll rr)) (poly.Mul lr rr)))
  | split-by-prec prec (poly.Neg p) = (let (l, r) = split-by-prec prec p in (poly.Neg l,
poly.Neg r))
  | split-by-prec prec (poly.Pw p 0) = (poly.C 1, poly.C 0)
  | split-by-prec prec (poly.Pw p (Suc n)) = (let (l, r) = split-by-prec prec p in
(poly.Pw l n, poly.Sub (poly.Pw p (Suc n)) (poly.Pw l n)))
  | split-by-prec prec (poly.CN c n p) = (let (cl, cr) = split-by-prec prec c;
    (pl, pr) = split-by-prec prec p
    in (poly.CN cl n pl, poly.CN cr n pr))

```

TODO: Prove precision constraint on l .

```

lemma split-by-prec-correct:
  fixes args :: real list

```

```

assumes (l, r) = split-by-prec prec p
shows Ipoly args p = Ipoly args l + Ipoly args r (is ?P1)
  and num-params l ≤ num-params p (is ?P2)
  and num-params r ≤ num-params p (is ?P3)
unfolding atomize-conj
using assms
proof(induction p arbitrary: l r)
  case (Add p1 p2 l r)
  thus ?case
    apply(simp add: Add(1,2)[OF prod.collapse] split-beta)
    using max.coboundedI1 max.coboundedI2 prod.collapse
    by metis
next
  case (Sub p1 p2 l r)
  thus ?case
    apply(simp add: Sub(1,2)[OF prod.collapse] split-beta)
    using max.coboundedI1 max.coboundedI2 prod.collapse
    by metis
next
  case (Mul p1 p2 l r)
  thus ?case
    apply(simp add: Mul(1,2)[OF prod.collapse] split-beta algebra-simps)
    using max.coboundedI1 max.coboundedI2 prod.collapse
    by metis
next
  case (Neg p l r)
  thus ?case by (simp add: Neg(1)[OF prod.collapse] split-beta)
next
  case (Pw p n l r)
  thus ?case by (cases n) (simp-all add: Pw(1)[OF prod.collapse] split-beta)
next
  case (CN c n p2)
  thus ?case
    apply(simp add: CN(1,2)[OF prod.collapse] split-beta algebra-simps)
    by (meson le-max-iff-disj prod.collapse)
qed (simp-all add: Let-def)

```

4 Splitting polynomials by degree

```

fun maxdegree :: ('a::zero) poly ⇒ nat
where maxdegree (poly.C c) = 0
  | maxdegree (poly.Bound n) = 1
  | maxdegree (poly.Add l r) = max (maxdegree l) (maxdegree r)
  | maxdegree (poly.Sub l r) = max (maxdegree l) (maxdegree r)
  | maxdegree (poly.Mul l r) = maxdegree l + maxdegree r
  | maxdegree (poly.Neg p) = maxdegree p
  | maxdegree (poly.Pw p n) = n * maxdegree p
  | maxdegree (poly.CN c n p) = max (maxdegree c) (1 + maxdegree p)

```

```

fun split-by-degree :: nat  $\Rightarrow$  'a::zero poly  $\Rightarrow$  'a poly * 'a poly
  where split-by-degree n (poly.C c) = (poly.C c, poly.C 0)
  | split-by-degree 0 p = (poly.C 0, p)
  | split-by-degree (Suc n) (poly.CN c v p) = (
    let (cl, cr) = split-by-degree (Suc n) c;
        (pl, pr) = split-by-degree n p
    in (poly.CN cl v pl, poly.CN cr v pr))
  — This function is only intended for use on polynomials in normal form. Hence
  most cases never get executed.
  | split-by-degree n p = (poly.C 0, p)

```

```

lemma split-by-degree-correct:
  fixes x :: real list and p :: float poly
  assumes (l, r) = split-by-degree ord p
  shows maxdegree l  $\leq$  ord (is ?P1)
    and Ipoly x p = Ipoly x l + Ipoly x r (is ?P2)
    and num-params l  $\leq$  num-params p (is ?P3)
    and num-params r  $\leq$  num-params p (is ?P4)
  unfolding atomize-conj
  using assms
proof(induction p arbitrary: l r ord)
  case (C c l r ord)
  thus ?case by simp
next
  case (Bound v l r ord)
  thus ?case by (cases ord) simp-all
next
  case (Add p1 p2 l r ord)
  thus ?case by (cases ord) simp-all
next
  case (Sub p1 p2 l r ord)
  thus ?case by (cases ord) simp-all
next
  case (Mul p1 p2 l r ord)
  thus ?case by (cases ord) simp-all
next
  case (Neg p l r ord)
  thus ?case by (cases ord) simp-all
next
  case (Pw p k l r ord)
  thus ?case by (cases ord) simp-all
next
  case (CN c v p l r ord)
  then show ?case
  proof(cases ord)
  case (Suc m)
  obtain cl cr where cl-cr-def: (cl, cr) = split-by-degree (Suc m) c
    by (cases split-by-degree (Suc m) c, simp)
  obtain pl pr where pl-pr-def: (pl, pr) = split-by-degree m p

```

```

    by (cases split-by-degree m p, simp)
  have [simp]:  $Ipoly\ x\ p = Ipoly\ x\ pl + Ipoly\ x\ pr$ 
    using CN(2)[OF pl-pr-def]
    by (cases ord) simp-all
  from CN(3)
  have l-decomp:  $l = CN\ cl\ v\ pl$  and r-decomp:  $r = CN\ cr\ v\ pr$ 
    by (simp-all add: Suc cl-cr-def[symmetric] pl-pr-def[symmetric])
  show ?thesis
    using CN(1)[OF cl-cr-def] CN(2)[OF pl-pr-def]
    unfolding l-decomp
    by (cases p) (auto simp add: l-decomp r-decomp algebra-simps Suc)
qed simp
qed

```

Operations on lists.

lemma *length-map2*[simp]: $length\ (map2\ f\ a\ b) = \min\ (length\ a)\ (length\ b)$

proof(*induction map2 f a b arbitrary: a b*)

case (*Nil a b*)

hence $a = [] \mid b = []$

by(*cases a, simp, cases b, simp-all*)

then show ?case

by *auto*

next

case (*Cons x c a b*)

have $0 < length\ a \wedge 0 < length\ b$

using *Cons*(2)

by (*cases a, simp, cases b, simp-all*)

then obtain *xa ar xb br*

where *a-decomp*[simp]: $a = xa \# ar$

and *b-decomp*[simp]: $b = xb \# br$

by (*cases a, simp-all, cases b, simp-all*)

show ?case

using *Cons*

by *simp*

qed

lemma *map2-nth*[simp]:

assumes $n < length\ a$

assumes $n < length\ b$

shows $(map2\ f\ a\ b)!n = f\ (a!n)\ (b!n)$

using *assms*

proof(*induction n arbitrary: a b*)

case (*0 a b*)

have $0 < length\ a$ and $0 < length\ b$

using *0*

by *simp-all*

thus ?case

using *0*

by *simp*

```

next
  case (Suc n a b)
  from Suc.prem1 have 0 < length a 0 < length b n < length (tl a) n < length
  (tl b)
    using Suc.prem1 by auto
  have map2 f a b = map2 f (hd a # tl a) (hd b # tl b)
    using ⟨0 < length a⟩ ⟨0 < length b⟩
    by simp
  also have ... ! Suc n = map2 f (tl a) (tl b) ! n
    by simp
  also have ... = f (tl a ! n) (tl b ! n)
    using ⟨n < length (tl a)⟩ ⟨n < length (tl b)⟩ by (rule Suc.IH)
  also have tl a ! n = (hd a # tl a) ! Suc n by simp
  also have (hd a # tl a) = a using ⟨0 < length a⟩ by simp
  also have tl b ! n = (hd b # tl b) ! Suc n by simp
  also have (hd b # tl b) = b using ⟨0 < length b⟩ by simp
  finally show ?case .
qed

```

Translating a polynomial by a vector.

```

fun poly-translate :: 'a list ⇒ 'a poly ⇒ 'a poly
  where poly-translate vs (poly.C c) = poly.C c
    | poly-translate vs (poly.Bound n) = poly.Add (poly.Bound n) (poly.C (vs ! n))
    | poly-translate vs (poly.Add l r) = poly.Add (poly-translate vs l) (poly-translate
    vs r)
    | poly-translate vs (poly.Sub l r) = poly.Sub (poly-translate vs l) (poly-translate
    vs r)
    | poly-translate vs (poly.Mul l r) = poly.Mul (poly-translate vs l) (poly-translate
    vs r)
    | poly-translate vs (poly.Neg p) = poly.Neg (poly-translate vs p)
    | poly-translate vs (poly.Pw p n) = poly.Pw (poly-translate vs p) n
    | poly-translate vs (poly.CN c n p) = poly.Add (poly-translate vs c) (poly.Mul
    (poly.Add (poly.Bound n) (poly.C (vs ! n))) (poly-translate vs p))

```

Translating a polynomial is equivalent to translating its argument.

```

lemma poly-translate-correct:
  assumes num-params p ≤ length x
  assumes length x = length v
  shows Ipoly x (poly-translate v p) = Ipoly (map2 (+) x v) p
  using assms
  by (induction p, simp-all)

```

```

lemma real-poly-translate:
  assumes num-params p ≤ length v
  shows Ipoly x (map-poly real-of-float (poly-translate v p)) = Ipoly x (poly-translate
  v (map-poly real-of-float p))
  using assms
  by (induction p, simp-all)

```


lemma *num-params-poly-translate*[*simp*]:
shows *num-params* (*poly-translate v p*) = *num-params p*
by (*induction p, simp-all*)

end

theory *Taylor-Models-Misc*

imports

HOL-Library.Float

HOL-Library.Function-Algebras

HOL-Decision-Procs.Approximation

Affine-Arithmetic.Floatarith-Expression

begin

This theory contains anything that doesn't belong anywhere else.

lemma *of-nat-real-float-equiv*: (*of-nat n :: real*) = (*of-nat n :: float*)
by (*induction n, simp-all add: of-nat-def*)

lemma *fact-real-float-equiv*: (*fact n :: float*) = (*fact n :: real*)
by (*induction n simp-all*)

lemma *Some-those-length*:
those ys = Some xs \implies length xs = length ys
by (*induction ys arbitrary: xs*) (*auto split: option.splits*)

lemma *those-eq-None-iff*: *those ys = None \longleftrightarrow None \in set ys*
by (*induction ys*) (*auto simp: split: option.splits*)

lemma *those-eq-Some-iff*: *those ys = (Some xs) \longleftrightarrow (ys = map Some xs)*
by (*induction ys arbitrary: xs*) (*auto simp: split: option.splits*)

lemma *Some-those-nth*:
assumes *those ys = Some xs*
assumes *i < length xs*
shows *Some (xs!i) = ys!i*
using *Some-those-length[OF assms(1)] assms*
by (*induction xs ys arbitrary: i rule: list-induct2*)
(auto split: option.splits nat.splits simp: nth-Cons)

lemma *fun-pow*: $f^{\hat{n}} = (\lambda x. (f x)^{\hat{n}})$
by (*induction n, simp-all*)

context includes *floatarith-notation* **begin**

Translate floatarith expressions by a vector of floats.

fun *fa-translate* :: *float list* \Rightarrow *floatarith* \Rightarrow *floatarith*
where *fa-translate v* (*Add a b*) = *Add (fa-translate v a) (fa-translate v b)*
| *fa-translate v* (*Minus a*) = *Minus (fa-translate v a)*
| *fa-translate v* (*Mult a b*) = *Mult (fa-translate v a) (fa-translate v b)*
| *fa-translate v* (*Inverse a*) = *Inverse (fa-translate v a)*

```

| fa-translate v (Cos a) = Cos (fa-translate v a)
| fa-translate v (Arctan a) = Arctan (fa-translate v a)
| fa-translate v (Min a b) = Min (fa-translate v a) (fa-translate v b)
| fa-translate v (Max a b) = Max (fa-translate v a) (fa-translate v b)
| fa-translate v (Abs a) = Abs (fa-translate v a)
| fa-translate v (Sqrt a) = Sqrt (fa-translate v a)
| fa-translate v (Exp a) = Exp (fa-translate v a)
| fa-translate v (Ln a) = Ln (fa-translate v a)
| fa-translate v (Var n) = Add (Var n) (Num (v!n))
| fa-translate v (Power a n) = Power (fa-translate v a) n
| fa-translate v (Powr a b) = Powr (fa-translate v a) (fa-translate v b)
| fa-translate v (Floor x) = Floor (fa-translate v x)
| fa-translate v (Num c) = Num c
| fa-translate v Pi = Pi

```

lemma *fa-translate-correct*:

assumes *max-Var-floatarith* $f \leq \text{length } I$

assumes $\text{length } v = \text{length } I$

shows $\text{interpret-floatarith } (fa\text{-translate } v\ f)\ I = \text{interpret-floatarith } f\ (\text{map2 } (+)\ I\ v)$

using *assms*

by (*induction f, simp-all*)

primrec *vars-floatarith* **where**

```

vars-floatarith (Add a b) = (vars-floatarith a)  $\cup$  (vars-floatarith b)
| vars-floatarith (Mult a b) = (vars-floatarith a)  $\cup$  (vars-floatarith b)
| vars-floatarith (Inverse a) = vars-floatarith a
| vars-floatarith (Minus a) = vars-floatarith a
| vars-floatarith (Num a) = {}
| vars-floatarith (Var i) = {i}
| vars-floatarith (Cos a) = vars-floatarith a
| vars-floatarith (Arctan a) = vars-floatarith a
| vars-floatarith (Abs a) = vars-floatarith a
| vars-floatarith (Max a b) = (vars-floatarith a)  $\cup$  (vars-floatarith b)
| vars-floatarith (Min a b) = (vars-floatarith a)  $\cup$  (vars-floatarith b)
| vars-floatarith (Pi) = {}
| vars-floatarith (Sqrt a) = vars-floatarith a
| vars-floatarith (Exp a) = vars-floatarith a
| vars-floatarith (Powr a b) = (vars-floatarith a)  $\cup$  (vars-floatarith b)
| vars-floatarith (Ln a) = vars-floatarith a
| vars-floatarith (Power a n) = vars-floatarith a
| vars-floatarith (Floor a) = vars-floatarith a

```

lemma *finite-vars-floatarith[simp]*: $\text{finite } (\text{vars-floatarith } x)$

by (*induction x auto*)

end

lemma *max-Var-floatarith-eq-Max-vars-floatarith*:

max-Var-floatarith fa = (if vars-floatarith fa = {} then 0 else Suc (Max (vars-floatarith fa)))

by (induction fa) (auto split: if-splits simp: Max-Un Max-eq-iff max-def)

end

theory *Taylor-Models*

imports

Horner-Eval

Polynomial-Expression-Additional

Taylor-Models-Misc

HOL-Decision-Procs.Approximation

HOL-Library.Function-Algebras

HOL-Library.Set-Algebras

Affine-Arithmetic.Straight-Line-Program

Affine-Arithmetic.Affine-Approximation

begin

TODO: get rid of float poly/float interval and use real poly/real interval and data refinement?

5 Multivariate Taylor Models

5.1 Computing interval bounds on arithmetic expressions

This is a wrapper around the "approx" function. It computes range bounds on floatarith expressions.

fun *compute-bound-fa* :: *nat* \Rightarrow *floatarith* \Rightarrow *float interval list* \Rightarrow *float interval option*

where *compute-bound-fa prec f I = approx prec f (map Some I)*

lemma *compute-bound-fa-correct*:

interpret-floatarith f i \in_r ivl

if *compute-bound-fa prec f I = Some ivl*

i all-in I

for *i::real list*

proof–

have *bounded: bounded-by i (map Some I)*

using *that(2)*

unfolding *bounded-by-def*

by *(auto simp: bounds-of-interval-eq-lower-upper set-of-eq)*

from *that have Some: approx prec f (map Some I) = Some ivl*

by *(auto simp: lower-Interval upper-Interval min-def split: option.splits if-splits)*

from *approx[OF bounded Some]*

show *?thesis by (auto simp: set-of-eq)*

qed

5.2 Definition of Taylor models and notion of rangeity

Taylor models are a pair of a polynomial and an absolute error bound.

datatype *taylor-model* = *TaylorModel* (*tm-poly*: float poly) (*tm-bound*: float interval)

Taylor model for a real valuation of variables

primrec *insertion* :: (nat \Rightarrow 'a) \Rightarrow 'a poly \Rightarrow 'a::{plus,zero,minus,uminus,times,one,power}
where

insertion bs (C c) = c
| *insertion* bs (poly.Bound n) = bs n
| *insertion* bs (Neg a) = - *insertion* bs a
| *insertion* bs (poly.Add a b) = *insertion* bs a + *insertion* bs b
| *insertion* bs (Sub a b) = *insertion* bs a - *insertion* bs b
| *insertion* bs (Mul a b) = *insertion* bs a * *insertion* bs b
| *insertion* bs (Pw t n) = *insertion* bs t $\hat{^}$ n
| *insertion* bs (CN c n p) = *insertion* bs c + (bs n) * *insertion* bs p

definition *range-tm* :: (nat \Rightarrow real) \Rightarrow *taylor-model* \Rightarrow real interval **where**
range-tm e tm = interval-of (*insertion* e (tm-poly tm)) + real-interval (tm-bound tm)

lemma *Ipoly-num-params-cong*: *Ipoly* xs p = *Ipoly* ys p
if $\bigwedge i. i < \text{num-params } p \implies xs ! i = ys ! i$
using that
by (*induction* p; auto)

lemma *insertion-num-params-cong*: *insertion* e p = *insertion* f p
if $\bigwedge i. i < \text{num-params } p \implies e i = f i$
using that
by (*induction* p; auto)

lemma *insertion-eq-IPolyI*: *insertion* xs p = *Ipoly* ys p
if $\bigwedge i. i < \text{num-params } p \implies xs i = ys ! i$
using that
by (*induction* p; auto)

lemma *Ipoly-eq-insertionI*: *Ipoly* ys p = *insertion* xs p
if $\bigwedge i. i < \text{num-params } p \implies xs i = ys ! i$
using that
by (*induction* p; auto)

lemma *range-tmI*:
 $x \in_i \text{range-tm } e \text{ tm}$
if $x: x \in_i \text{interval-of } (\text{insertion } e ((\text{tm-poly } \text{tm}))) + \text{real-interval } (\text{tm-bound } \text{tm})$
for $e::\text{nat}\Rightarrow\text{real}$
by (*auto simp: range-tm-def* x)

lemma *range-tmD*:

```

x ∈i interval-of (insertion e (tm-poly tm)) + real-interval (tm-bound tm)
if x ∈i range-tm e tm
for e::nat⇒real
using that
by (auto simp: range-tm-def)

```

5.3 Interval bounds for Taylor models

Bound a polynomial by simply approximating it with interval arguments.

```

fun compute-bound-poly :: nat ⇒ float interval poly ⇒ (float interval list) ⇒ (float
interval list) ⇒ float interval where
  compute-bound-poly prec (poly.C f) I a = f
| compute-bound-poly prec (poly.Bound n) I a = round-interval prec (I ! n - (a !
n))
| compute-bound-poly prec (poly.Add p q) I a =
  round-interval prec (compute-bound-poly prec p I a + compute-bound-poly prec
q I a)
| compute-bound-poly prec (poly.Sub p q) I a =
  round-interval prec (compute-bound-poly prec p I a - compute-bound-poly prec
q I a)
| compute-bound-poly prec (poly.Mul p q) I a =
  mult-float-interval prec (compute-bound-poly prec p I a) (compute-bound-poly
prec q I a)
| compute-bound-poly prec (poly.Neg p) I a = -compute-bound-poly prec p I a
| compute-bound-poly prec (poly.Pw p n) I a = power-float-interval prec n (compute-bound-poly
prec p I a)
| compute-bound-poly prec (poly.CN p n q) I a =
  round-interval prec (compute-bound-poly prec p I a +
  mult-float-interval prec (round-interval prec (I ! n - (a ! n))) (compute-bound-poly
prec q I a))

```

Bounds on Taylor models are simply a bound on its polynomial, widened by the approximation error.

```

fun compute-bound-tm :: nat ⇒ float interval list ⇒ float interval list ⇒ tay-
lor-model ⇒ float interval
where compute-bound-tm prec I a (TaylorModel p e) = compute-bound-poly prec
p I a + e

```

```

lemma compute-bound-tm-def:
  compute-bound-tm prec I a tm = compute-bound-poly prec (tm-poly tm) I a +
(tm-bound tm)
by (cases tm) auto

```

```

lemma real-of-float-in-real-interval-of[intro, simp]: real-of-float x ∈r X if x ∈i X
using that
by (auto simp: set-of-eq)

```

```

lemma in-set-of-round-interval[intro, simp]:

```

$x \in_r \text{round-interval prec } X$ **if** $x \in_r X$
using *round-ivl-correct*[of X *prec*] **that**
by (*auto simp: set-of-eq*)

lemma *in-set-real-minus-interval*[*intro, simp*]:
 $x - y \in_r X - Y$ **if** $x \in_r X$ $y \in_r Y$
using *that*
by (*auto simp: set-of-eq*)

lemma *real-interval-plus*: $\text{real-interval } (a + b) = \text{real-interval } a + \text{real-interval } b$
by (*simp add: interval-eqI*)

lemma *real-interval-uminus*: $\text{real-interval } (- b) = - \text{real-interval } b$
by (*simp add: interval-eqI*)

lemma *real-interval-of*: $\text{real-interval } (\text{interval-of } b) = \text{interval-of } b$
by (*simp add: interval-eqI*)

lemma *real-interval-minus*: $\text{real-interval } (a - b) = \text{real-interval } a - \text{real-interval } b$
using *real-interval-plus*[of $a - b$] *real-interval-uminus*[of b]
by (*auto simp: interval-eq-iff*)

lemma *in-set-real-plus-interval*[*intro, simp*]:
 $x + y \in_r X + Y$ **if** $x \in_r X$ $y \in_r Y$
using *that*
by (*auto simp: set-of-eq*)

lemma *in-set-neg-plus-interval*[*intro, simp*]:
 $- y \in_r - Y$ **if** $y \in_r Y$
using *that*
by (*auto simp: set-of-eq*)

lemma *in-set-real-times-interval*[*intro, simp*]:
 $x * y \in_r X * Y$ **if** $x \in_r X$ $y \in_r Y$
using *that*
by (*auto simp: real-interval-times intro!: times-in-intervalI*)

lemma *real-interval-one*: $\text{real-interval } 1 = 1$
by (*simp add: interval-eqI*)

lemma *real-interval-zero*: $\text{real-interval } 0 = 0$
by (*simp add: interval-eqI*)

lemma *real-interval-power*: $\text{real-interval } (a \wedge b) = \text{real-interval } a \wedge b$
by (*induction b arbitrary: a*)
(auto simp: real-interval-times real-interval-one)

lemma *in-set-real-power-interval*[*intro, simp*]:

$x \hat{\ } n \in_r X \hat{\ } n$ **if** $x \in_r X$
using *that*
by (*auto simp: real-interval-power intro!: set-of-power-mono*)

lemma *power-float-interval-real-interval*[*intro, simp*]:
 $x \hat{\ } n \in_r$ *power-float-interval prec n X* **if** $x \in_r X$
by (*auto simp: real-interval-power that intro!: power-float-intervalI*)

lemma *in-set-mult-float-interval*[*intro, simp*]:
 $x * y \in_r$ *mult-float-interval prec X Y* **if** $x \in_r X$ $y \in_r Y$
using *mult-float-interval[of X Y] in-set-real-times-interval[OF that] that(1) that(2)*
by *blast*

lemma *in-set-real-minus-swapI*: $e \in_r I ! i - a ! i$
if $x - e \in_r a ! i \in_r I ! i$
using *that*
by (*auto simp: set-of-eq*)

definition *develops-at-within*::(*nat* \Rightarrow *real*) \Rightarrow *float interval list* \Rightarrow *float interval list* \Rightarrow *bool*
where *develops-at-within e a I* \longleftrightarrow (*a all-subset I*) \wedge ($\forall i < \text{length } I. e \in_r I ! i - a ! i$)

lemma *develops-at-withinI*:
assumes *all-in: a all-subset I*
assumes $e: \bigwedge i. i < \text{length } I \Longrightarrow e \in_r I ! i - a ! i$
shows *develops-at-within e a I*
using *assms* **by** (*auto simp: develops-at-within-def*)

lemma *develops-at-withinD*:
assumes *develops-at-within e a I*
shows *a all-subset I*
 $\bigwedge i. i < \text{length } I \Longrightarrow e \in_r I ! i - a ! i$
using *assms* **by** (*auto simp: develops-at-within-def*)

lemma *compute-bound-poly-correct*:
fixes $p::\text{float poly}$
assumes *num-params p* \leq *length I*
assumes *dev: develops-at-within e a I*
shows *insertion e (p::real poly) \in_r compute-bound-poly prec (map-poly interval-of p) I a*
using *assms(1)*
proof (*induction p*)
case (*C x*)
then show *?case* **by** *auto*
next
case (*Bound i*)
then show *?case*
using *dev*

```

    by (auto simp: develops-at-within-def)
next
  case (Add p1 p2)
  then show ?case by force
next
  case (Sub p1 p2)
  then show ?case by force
next
  case (Mul p1 p2)
  then show ?case by force
next
  case (Neg p)
  then show ?case by force
next
  case (Pw p x2a)
  then show ?case by force
next
  case (CN p1 i p2)
  then show ?case
    using dev
    by (auto simp: develops-at-within-def)
qed

```

lemma *compute-bound-tm-correct*:

```

  fixes I :: float interval list and f :: real list  $\Rightarrow$  real
  assumes n: num-params (tm-poly t)  $\leq$  length I
  assumes dev: develops-at-within e a I
  assumes x0:  $x0 \in_i$  range-tm e t
  shows  $x0 \in_r$  compute-bound-tm prec I a t
proof -
  let ?I = insertion e (tm-poly t)
  have  $x0 = ?I + (x0 - ?I)$  by simp
  also have  $\dots \in_r$  compute-bound-tm prec I a t
    unfolding compute-bound-tm-def
    apply (rule in-set-real-plus-interval)
    apply (rule compute-bound-poly-correct)
    apply (rule assms)
    apply (rule dev)
    using range-tmD[OF x0]
    by (auto simp: set-of-eq)
  finally show  $x0 \in_r$  compute-bound-tm prec I a t .
qed

```

lemma *compute-bound-tm-correct-subset*:

```

  fixes I :: float interval list and f :: real list  $\Rightarrow$  real
  assumes n: num-params (tm-poly t)  $\leq$  length I
  assumes dev: develops-at-within e a I
  shows set-of (range-tm e t)  $\subseteq$  set-of (real-interval (compute-bound-tm prec I a t))

```



```

using assms
by (auto intro!: compute-bound-tm-correct)

lemma compute-bound-poly-mono:
  assumes num-params  $p \leq \text{length } I$ 
  assumes mem:  $I \text{ all-subset } J \text{ a all-subset } I$ 
  shows set-of (compute-bound-poly prec  $p \ I \ a$ )  $\subseteq$  set-of (compute-bound-poly prec
   $p \ J \ a$ )
  using assms(1)
proof (induction  $p$  arbitrary:  $a$ )
  case ( $C \ x$ )
  then show ?case by auto
next
  case ( $Bound \ x$ )
  then show ?case using mem
  by (simp add: round-interval-mono set-of-sub-inc)
next
  case ( $Add \ p1 \ p2$ )
  then show ?case using mem
  by (simp add: round-interval-mono set-of-add-inc)
next
  case ( $Sub \ p1 \ p2$ )
  then show ?case using mem
  by (simp add: round-interval-mono set-of-sub-inc)
next
  case ( $Mul \ p1 \ p2$ )
  then show ?case using mem
  by (simp add: round-interval-mono mult-float-interval-mono)
next
  case ( $Neg \ p$ )
  then show ?case using mem
  by (simp add: round-interval-mono set-of-neg-inc)
next
  case ( $Pw \ p \ x2a$ )
  then show ?case using mem
  by (simp add: power-float-interval-mono)
next
  case ( $CN \ p1 \ x2a \ p2$ )
  then show ?case using mem
  by (simp add: round-interval-mono mult-float-interval-mono
  set-of-add-inc set-of-sub-inc)
qed

```

```

lemma compute-bound-tm-mono:
  fixes  $I :: \text{float interval list}$  and  $f :: \text{real list} \Rightarrow \text{real}$ 
  assumes num-params (tm-poly  $t$ )  $\leq \text{length } I$ 
  assumes  $I \text{ all-subset } J$ 
  assumes  $a \text{ all-subset } I$ 
  shows set-of (compute-bound-tm prec  $I \ a \ t$ )  $\subseteq$  set-of (compute-bound-tm prec  $J$ 

```

```

a t)
apply (simp add: compute-bound-tm-def)
apply (rule set-of-add-inc-left)
apply (rule compute-bound-poly-mono)
using assms
by (auto simp: set-of-eq)

```

5.4 Computing taylor models for basic, univariate functions

```

definition tm-const :: float  $\Rightarrow$  taylor-model
  where tm-const c = TaylorModel (poly.C c) 0

```

context includes floatarith-notation **begin**

```

definition tm-pi :: nat  $\Rightarrow$  taylor-model
  where tm-pi prec = (
    let pi-ivl = the (compute-bound-fa prec Pi [])
    in TaylorModel (poly.C (mid pi-ivl)) (centered pi-ivl)
  )

```

```

lemma zero-real-interval[intro,simp]:  $0 \in_r 0$ 
  by (auto simp: set-of-eq)

```

```

lemma range-TM-tm-const[simp]: range-tm e (tm-const c) = interval-of c
  by (auto simp: range-tm-def real-interval-zero tm-const-def)

```

```

lemma num-params-tm-const[simp]: num-params (tm-poly (tm-const c)) = 0
  by (auto simp: tm-const-def)

```

```

lemma num-params-tm-pi[simp]: num-params (tm-poly (tm-pi prec)) = 0
  by (auto simp: tm-pi-def Let-def)

```

```

lemma range-tm-tm-pi:  $pi \in_i$  range-tm e (tm-pi prec)

```

proof–

```

  have  $\bigwedge prec.$  real-of-float (lb-pi prec)  $\leq$  real-of-float (ub-pi prec)
    using iffD1[OF atLeastAtMost-iff, OF pi-boundaries]
    using order-trans by auto
  then obtain ivl-pi where ivl-pi-def: compute-bound-fa prec Pi [] = Some ivl-pi
    by (simp add: approx.simps)
  show ?thesis
    unfolding range-tm-def Let-def
    using compute-bound-fa-correct[OF ivl-pi-def, of []]
    by (auto simp: set-of-eq Let-def centered-def ivl-pi-def tm-pi-def
      simp del: compute-bound-fa.simps)

```

qed

5.4.1 Derivations of floatarith expressions

Compute the n th derivative of a floatarith expression

```

fun deriv :: nat ⇒ floatarith ⇒ nat ⇒ floatarith
  where deriv v f 0 = f
  | deriv v f (Suc n) = DERIV-floatarith v (deriv v f n)

```

```

lemma isDERIV-DERIV-floatarith:
  assumes isDERIV v f vs
  shows isDERIV v (DERIV-floatarith v f) vs
  using assms
proof(induction f)
  case (Power f m)
  then show ?case
    by (cases m) (auto simp: isDERIV-Power)
qed (simp-all add: numeral-eq-Suc add-nonneg-eq-0-iff )

```

```

lemma isDERIV-is-analytic:
  isDERIV i (Taylor-Models.deriv i f n) xs
  if isDERIV i f xs
  using isDERIV-DERIV-floatarith that
  by(induction n) auto

```

```

lemma deriv-correct:
  assumes isDERIV i f (xs[i:=t]) i < length xs
  shows ((λx. interpret-floatarith (deriv i f n) (xs[i:=x])) has-real-derivative interpret-floatarith (deriv i f (Suc n)) (xs[i:=t]))
    (at t within S)
  apply(simp)
  apply (rule has-field-derivative-at-within)
  apply(rule DERIV-floatarith)
  apply fact
  apply (rule isDERIV-is-analytic)
  apply fact
  done

```

Faster derivation for univariate functions, producing smaller terms and thus less over-approximation.

TODO: Extend to Arctan, Log!

```

fun deriv-rec :: floatarith ⇒ nat ⇒ floatarith
  where deriv-rec (Exp (Var 0)) = Exp (Var 0)
  | deriv-rec (Cos (Var 0)) n = (case n mod 4
    of 0 ⇒ Cos (Var 0)
     | Suc 0 ⇒ Minus (Sin (Var 0))
     | Suc (Suc 0) ⇒ Minus (Cos (Var 0))
     | Suc (Suc (Suc 0)) ⇒ Sin (Var 0))
  | deriv-rec (Inverse (Var 0)) n = (if n = 0 then Inverse (Var 0) else Mult (Num (fact n * (if n mod 2 = 0 then 1 else -1))) (Inverse (Power (Var 0) (Suc n))))
  | deriv-rec f n = deriv 0 f n

```

```

lemma deriv-rec-correct:

```

```

assumes isDERIV 0 f (xs[0:=t]) 0 < length xs
shows (( $\lambda x.$  interpret-floatarith (deriv-rec f n) (xs[0:=x]) has-real-derivative
interpret-floatarith (deriv-rec f (Suc n)) (xs[0:=t]) (at t within S)
apply(cases (f, n) rule: deriv-rec.cases)
apply(safe)
using assms deriv-correct[OF assms]
proof-
assume  $f = \text{Cos } (\text{Var } 0)$ 

have n-mod-4-cases: n mod 4 = 0 | n mod 4 = 1 | n mod 4 = 2 | n mod 4 = 3
by auto
have Sin-sin: ( $\lambda xs.$  interpret-floatarith (Sin (Var 0)) xs) = ( $\lambda xs.$  sin (xs!0))
by (simp add:)
show (( $\lambda x.$  interpret-floatarith (deriv-rec (Cos (Var 0)) n) (xs[0:=x]) has-real-derivative
interpret-floatarith (deriv-rec (Cos (Var 0)) (Suc n)) (xs[0:=t])
(at t within S)
using n-mod-4-cases assms
by (auto simp add: mod-Suc Sin-sin field-differentiable-minus
intro!: derivative-eq-intros)
next
assume f-def: f = Inverse (Var 0) and isDERIV 0 f (xs[0:=t])
hence  $t \neq 0$  using assms
by simp
{
fix  $n::\text{nat}$  and  $x::\text{real}$ 
assume  $x \neq 0$ 
moreover have  $(n \bmod 2 = 0 \wedge \text{Suc } n \bmod 2 = 1) \vee (n \bmod 2 = 1 \wedge \text{Suc } n \bmod 2 = 0)$ 
by (cases n rule: parity-cases) auto
ultimately have interpret-floatarith (deriv-rec f n) (xs[0:=x]) = fact n *
 $(-1::\text{real})^n / (x^{\text{Suc } n})$ 
using assms by (auto simp add: f-def field-simps fact-real-float-equiv)
}
note closed-formula = this

have (( $\lambda x.$  inverse (x ^ Suc n)) has-real-derivative  $-\text{real } (\text{Suc } n) * \text{inverse } (t ^ \text{Suc } (\text{Suc } n))$ ) (at t)
using DERIV-inverse-fun[OF DERIV-pow[where n=Suc n], where s=UNIV]
apply(rule iffD1[OF DERIV-cong-ev[OF refl], rotated 2])
using  $t \neq 0$ 
by (simp-all add: divide-simps)
hence (( $\lambda x.$   $\text{fact } n * (-1::\text{real})^n * \text{inverse } (x ^ \text{Suc } n)$ ) has-real-derivative  $\text{fact } (\text{Suc } n) * (-1) ^ \text{Suc } n / t ^ \text{Suc } (\text{Suc } n)$ ) (at t)
apply(rule iffD1[OF DERIV-cong-ev, OF refl - - DERIV-cmult[where c=fact n * (-1::real)^n], rotated 2])
using  $t \neq 0$ 
by (simp-all add: field-simps distrib-left)
then show (( $\lambda x.$  interpret-floatarith (deriv-rec (Inverse (Var 0)) n) (xs[0:=x]))
has-real-derivative

```

```

      interpret-floatarith (deriv-rec (Inverse (Var 0)) (Suc n)) (xs[0:=t]))
      (at t within S)
    apply -
    apply (rule has-field-derivative-at-within)
    apply (rule iffD1[OF DERIV-cong-ev[OF refl - closed-formula[OF (t ≠ 0),
symmetric]], unfolded f-def, rotated 1])
    apply simp
    using assms
    by (simp, safe, simp-all add: fact-real-float-equiv inverse-eq-divide even-iff-mod-2-eq-zero)
qed (use assms in ⟨simp-all add: has-field-derivative-subset[OF DERIV-exp sub-
set-UNIV]⟩)

```

```

lemma deriv-rec-0-idem[simp]:
  shows deriv-rec f 0 = f
  by (cases (f, 0::nat) rule: deriv-rec.cases, simp-all)

```

5.4.2 Computing Taylor models for arbitrary univariate expressions

```

fun tmf-c :: nat ⇒ float interval list ⇒ floatarith ⇒ nat ⇒ float interval option
  where tmf-c prec I f i = compute-bound-fa prec (Mult (deriv-rec f i) (Inverse
(Num (fact i)))) I
  — The interval coefficients of the Taylor polynomial, i.e. the real coefficients
approximated by a float interval.

```

```

fun tmf-ivl-cs :: nat ⇒ nat ⇒ float interval list ⇒ float list ⇒ floatarith ⇒ float
interval list option
  where tmf-ivl-cs prec ord I a f = those (map (tmf-c prec a f) [0..<ord] @ [tmf-c
prec I f ord])
  — Make a list of bounds on the n+1 coefficients, with the n+1-th coefficient
bounding the remainder term of the Taylor-Lagrange formula.

```

```

fun tmf-polys :: float interval list ⇒ float poly × float interval poly
  where tmf-polys [] = (poly.C 0, poly.C 0)
  | tmf-polys (c # cs) = (
    let (pf, pi) = tmf-polys cs
    in (poly.CN (poly.C (mid c)) 0 pf, poly.CN (poly.C (centered c)) 0 pi)
  )

```

```

fun tm-floatarith :: nat ⇒ nat ⇒ float interval list ⇒ float list ⇒ floatarith ⇒
taylor-model option
  where tm-floatarith prec ord I a f = (
    map-option (λcs.
      let (pf, pi) = tmf-polys cs;
      - = compute-bound-tm prec (List.map2 (–) I a);
      e = round-interval prec (Ipoly (List.map2 (–) I a) pi) — TODO: use
compute-bound-tm here?!
      in TaylorModel pf e
    ) (tmf-ivl-cs prec ord I a f)

```

) — Compute a Taylor model from an arbitrary, univariate floatarith expression, if possible. This is used to compute Taylor models for elemental functions like sin, cos, exp, etc.

term *compute-bound-poly*

lemma *tmf-c-correct*:

fixes *A::float interval list and I::float interval and f::floatarith and a::real list*
assumes *a all-in A*
assumes *tmf-c prec A f i = Some I*
shows *interpret-floatarith (deriv-rec f i) a / fact i ∈_r I*
using *compute-bound-fa-correct[OF assms(2)[unfolded tmf-c.simps], where i=a]*
assms(1)
by (*simp add: divide-real-def fact-real-float-equiv*)

lemma *tmf-ivl-cs-length*:

assumes *tmf-ivl-cs prec n A a f = Some cs*
shows *length cs = n + 1*
by (*simp add: Some-those-length[OF assms[unfolded tmf-ivl-cs.simps]]*)

lemma *tmf-ivl-cs-correct*:

fixes *A::float interval list and f::floatarith*
assumes *a all-in I*
assumes *tmf-ivl-cs prec ord I a f = Some cs*
shows $\bigwedge i. i < \text{ord} \implies \text{tmf-c prec (map interval-of a) f i = Some (cs!i)}$
and *tmf-c prec I f ord = Some (cs!ord)*
and *length cs = Suc ord*

proof—

from *tmf-ivl-cs-length[OF assms(2)]*
show *tmf-c prec I f ord = Some (cs!ord)*
by (*metis Some-those-nth assms(2) diff-zero length-map length-upt less-add-one nth-append-length tmf-ivl-cs.simps*)

next

fix *i assume i < ord*
have *Some (cs!i) = (map (tmf-c prec a f) [0..
apply(*rule Some-those-nth*)
using *assms(2) tmf-ivl-cs-length ⟨i < ord⟩*
by *simp-all*
then show *tmf-c prec a f i = Some (cs!i)*
using *⟨i < ord⟩*
by (*simp add: nth-append*)*

next

show *length cs = Suc ord*
using *assms*
by (*auto simp: split-beta' those-eq-Some-iff list-eq-iff-nth-eq*)

qed

lemma *Ipoly-fst-tmf-polys*:

*Ipoly xs (fst (tmf-polys z)) = (∑ i < length z. xs ! 0 ^ i * (mid (z ! i)))*
for *xs::real list*

proof (*induction z*)
case (*Cons z zs*)
show ?*case*
 unfolding *list.size add-Suc-right sum.lessThan-Suc-shift*
 by (*auto simp: split-beta' Let-def nth-Cons Cons sum-distrib-left ac-simps*)
qed *simp*

lemma *insertion-fst-tmf-polys*:
 $insertion\ e\ (fst\ (tmf\ polys\ z)) = (\sum\ i < length\ z.\ e\ 0 \wedge i * (mid\ (z\ !\ i)))$
for $e :: nat \Rightarrow real$
proof (*induction z*)
case (*Cons z zs*)
show ?*case*
 unfolding *list.size add-Suc-right sum.lessThan-Suc-shift*
 by (*auto simp: split-beta' Let-def nth-Cons Cons sum-distrib-left ac-simps*)
qed *simp*

lemma *Ipoly-snd-tmf-polys*:
 $set\ of\ (horner\ eval\ (real\ interval\ o\ centered\ o\ nth\ z)\ x\ (length\ z)) \subseteq set\ of\ (Ipoly\ [x]\ (map\ poly\ real\ interval\ (snd\ (tmf\ polys\ z))))$
proof (*induction z*)
case (*Cons z zs*)
show ?*case*
 using *Cons[THEN set-of-mul-inc-right]*
 unfolding *list.size add-Suc-right sum.lessThan-Suc-shift*
 by (*auto simp: split-beta' Let-def nth-Cons sum-distrib-left ac-simps*
 elim!: plus-in-intervalE intro!: plus-in-intervalI)
qed (*auto simp: real-interval-zero*)

lemma *zero-interval[intro,simp]*: $0 \in_i 0$
by (*simp add: set-of-eq*)

lemma *sum-in-intervalI*: $sum\ f\ X \in_i\ sum\ g\ X$ **if** $\bigwedge x. x \in X \implies f\ x \in_i\ g\ x$
for $f :: - \Rightarrow 'a :: ordered-comm-monoid-add$
using *that*
proof (*induction X rule: infinite-finite-induct*)
case (*insert x F*)
then show ?*case*
 by (*auto intro!: plus-in-intervalI*)
qed *simp-all*

lemma *set-of-sum-subset*: $set\ of\ (sum\ f\ X) \subseteq set\ of\ (sum\ g\ X)$
if $\bigwedge x. x \in X \implies set\ of\ (f\ x) \subseteq set\ of\ (g\ x)$
for $f :: - \Rightarrow 'a :: linordered-ab-group-add\ interval$
using *that*
by (*induction X rule: infinite-finite-induct*) (*simp-all add: set-of-add-inc*)

lemma *interval-of-plus*: $interval\ of\ (a + b) = interval\ of\ a + interval\ of\ b$
by (*simp add: interval-eqI*)

lemma *interval-of-uminus*: $\text{interval-of } (- a) = - \text{interval-of } a$
by (*simp add: interval-eqI*)

lemma *interval-of-zero*: $\text{interval-of } 0 = 0$
by (*simp add: interval-eqI*)

lemma *interval-of-sum*: $\text{interval-of } (\text{sum } f X) = \text{sum } (\lambda x. \text{interval-of } (f x)) X$
by (*induction X rule: infinite-finite-induct*) (*auto simp: interval-of-plus interval-of-zero*)

lemma *interval-of-prod*: $\text{interval-of } (a * b) = \text{interval-of } a * \text{interval-of } b$
by (*simp add: lower-times upper-times interval-eqI*)

lemma *in-set-of-interval-of[simp]*: $x \in_i (\text{interval-of } y) \longleftrightarrow x = y$ **for** $x y :: 'a :: \text{order}$
by (*auto simp: set-of-eq*)

lemma *real-interval-Ipoly*: $\text{real-interval } (Ipoly \ xs \ p) = Ipoly \ (\text{map } \text{real-interval } \ xs)$
(*map-poly real-interval p*)
if $\text{num-params } p \leq \text{length } xs$
using *that*
by (*induction p*)
(*auto simp: real-interval-plus real-interval-minus real-interval-times real-interval-uminus real-interval-power*)

lemma *num-params-tmf-polys1*: $\text{num-params } (\text{fst } (tmf-polys \ z)) \leq \text{Suc } 0$
by (*induction z*) (*auto simp: split-beta' Let-def*)

lemma *num-params-tmf-polys2*: $\text{num-params } (\text{snd } (tmf-polys \ z)) \leq \text{Suc } 0$
by (*induction z*) (*auto simp: split-beta' Let-def*)

lemma *set-of-real-interval-subset*: $\text{set-of } (\text{real-interval } \ x) \subseteq \text{set-of } (\text{real-interval } \ y)$
if $\text{set-of } \ x \subseteq \text{set-of } \ y$
using *that*
by (*auto simp: set-of-eq*)

theorem *tm-floatarith*:
assumes t : *tm-floatarith prec ord I xs f = Some t*
assumes a : *xs all-in I and x: x ∈_r I ! 0*
assumes $xs-ne$: $xs \neq []$
assumes $deriv$: $\bigwedge x. x \in_r I ! 0 \implies \text{isDERIV } 0 \ f \ (xs[0 := x])$
assumes $\bigwedge i. 0 < i \implies i < \text{length } xs \implies e \ i = \text{real-of-float } (xs ! i)$
assumes $diff-e$: $(x - \text{real-of-float } (xs ! 0)) = e \ 0$
shows *interpret-floatarith f (xs[0:=x]) ∈_i range-tm e t*
proof –
from $xs-ne \ a$ **have** $I-ne[simp]$: $I \neq []$ **by** *auto*
have $xs'-in$: $xs[0 := x]$ *all-in I*
using a
by (*auto simp: nth-list-update x*)


```

from  $t$  obtain  $z$  where  $z$ :  $tmf\text{-}ivl\text{-}cs\ prec\ ord\ I\ xs\ f = Some\ z$ 
  and  $tz$ :  $tm\text{-}poly\ t = fst\ (tmf\text{-}polys\ z)$ 
  and  $tb$ :  $tm\text{-}bound\ t = round\text{-}interval\ prec\ (Ipoly\ (List.map2\ (-)\ I\ xs)\ (snd\ (tmf\text{-}polys\ z)))$ 
  using  $assms(1)$ 
  by ( $cases\ t$ ) ( $auto\ simp$ :  $those\text{-}eq\text{-}Some\text{-}iff\ split\text{-}beta'\ Let\text{-}def\ simp\ del$ :  $tmf\text{-}ivl\text{-}cs.simps$ )
from  $tmf\text{-}ivl\text{-}cs\ correct[OF\ a\ z(1)]$ 
have  $z\text{-}less$ :  $i < ord \implies tmf\text{-}c\ prec\ (map\ interval\text{-}of\ xs)\ f\ i = Some\ (z\ !\ i)$ 
  and  $lz$ :  $length\ z = Suc\ ord\ length\ z - 1 = ord$ 
  and  $z\text{-}ord$ :  $tmf\text{-}c\ prec\ I\ f\ ord = Some\ (z\ !\ ord)$  for  $i$ 
  by  $auto$ 
have  $rewr$ :  $\{..ord\} = insert\ ord\ \{..<ord\}$  by  $auto$ 
let  $?diff = \lambda(i::nat)\ (x::real). interpret\text{-}floatarith\ (deriv\text{-}rec\ f\ i)\ (xs[0:=x])$ 
let  $?c = real\text{-}of\text{-}float\ (xs\ !\ 0)$ 
let  $?n = ord$ 
let  $?a = real\text{-}of\text{-}float\ (lower\ (I!0))$ 
let  $?b = real\text{-}of\text{-}float\ (upper\ (I!0))$ 
let  $?x = x::real$ 
let  $?f = \lambda x::real. interpret\text{-}floatarith\ f\ (xs[0 := x])$ 
have  $2$ :  $?diff\ 0 = ?f$  using  $\langle xs \neq [] \rangle$ 
  by ( $simp\ add$ :  $map\text{-}update$ )
have  $3$ :  $\forall m\ t. m < ?n \wedge ?a \leq t \wedge t \leq ?b \longrightarrow (?diff\ m\ has\text{-}real\text{-}derivative\ ?diff\ (Suc\ m)\ t)\ (at\ t)$ 
  by ( $auto\ intro!$ :  $derivative\text{-}eq\text{-}intros\ deriv\text{-}rec\ correct\ deriv\ simp$ :  $set\text{-}of\text{-}eq\ xs\ ne$ )
have  $4$ :  $?a \leq ?c\ ?c \leq ?b\ ?a \leq ?x\ ?x \leq ?b$ 
  using  $a\ xs\ ne\ x$ 
  by ( $force\ simp$ :  $set\text{-}of\text{-}eq$ ) $+$ 

define  $cr$  where  $cr \equiv \lambda s\ m. if\ m < ord\ then\ ?diff\ m\ ?c / fact\ m - mid\ (z\ !\ m)$ 
   $else\ ?diff\ m\ s / fact\ ord - mid\ (z\ !\ ord)$ 
define  $ci$  where  $ci \equiv \lambda i. real\text{-}interval\ (z\ !\ i) - interval\text{-}of\ (real\text{-}of\text{-}float\ (mid\ (z\ !\ i)))$ 

have  $cr\text{-}ord$ :  $cr\ x\ ord \in_i\ ci\ ord$ 
  using  $tmf\text{-}c\ correct[OF\ xs'\text{-}in\ z\text{-}ord]$ 
  by ( $auto\ simp$ :  $ci\text{-}def\ set\text{-}of\text{-}eq\ cr\text{-}def$ )

have  $enclosure$ :  $(\sum m < ord. cr\ s\ m * (x - (xs\ !\ 0)) ^ m) + cr\ s\ ord * (x - (xs\ !\ 0)) ^ ord$ 
   $\in_r\ round\text{-}interval\ prec\ (Ipoly\ (List.map2\ (-)\ I\ (map\ interval\text{-}of\ xs))\ (snd\ (tmf\text{-}polys\ z)))$ 
  if  $cr\text{-}ord$ :  $cr\ s\ ord \in_i\ ci\ ord$  for  $s$ 
proof  $-$ 
  have  $(\sum m < ord. cr\ s\ m * (x - xs!0) ^ m) + cr\ s\ ord * (x - xs!0) ^ ord =$ 
   $horner\text{-}eval\ (cr\ s)\ (x - xs!0)\ (Suc\ ord)$ 
  by ( $simp\ add$ :  $horner\text{-}eval\text{-}eq\text{-}setsum$ )
  also have  $\dots \in_i\ horner\text{-}eval\ ci\ (real\text{-}interval\ (I\ !\ 0 - xs\ !\ 0))\ (Suc\ ord)$ 
proof ( $rule\ horner\text{-}eval\text{-}interval$ )
  fix  $i$  assume  $i < Suc\ ord$ 

```

```

then consider  $i < \text{ord} \mid i = \text{ord}$  by arith
then show  $cr\ s\ i \in_i\ ci\ i$ 
proof cases
  case 1
  then show ?thesis
    by (auto simp: cr-def ci-def not-less less-Suc-eq-le
      intro!: minus-in-intervalI tmf-c-correct[OF - z-less]
      (metis in-set-of-interval-of list-update-id map-update nth-map real-interval-of)
    qed (simp add: cr-ord)
qed (auto intro!: minus-in-intervalI simp: real-interval-minus x)
also have  $\dots = \text{set-of } (\text{horner-eval } (\text{real-interval } o \text{ centered } o (!) z)$ 
  (real-interval (I ! 0 - xs ! 0)) (length z))
  by (auto simp: ci-def centered-def real-interval-minus real-interval-of lz)
also have  $\dots \subseteq \text{set-of } (\text{Ipoly } [\text{real-interval } (I ! 0 - xs ! 0)])$ 
  (map-poly real-interval (snd (tmf-polys z)))
  (is - \subseteq set-of ?x)
  by (rule Ipoly-snd-tmf-polys)
also have  $\dots = \text{set-of } (\text{real-interval } (\text{Ipoly } [(I ! 0 - xs ! 0)] (\text{snd } (\text{tmf-polys}$ 
z)))))
  by (auto simp: real-interval-Ipoly num-params-tmf-polys2)
also have  $\dots \subseteq \text{set-of } (\text{real-interval } (\text{round-interval prec } (\text{Ipoly } [(I ! 0 - xs !$ 
0)] (\text{snd } (\text{tmf-polys } z)))))
  by (rule set-of-real-interval-subset) (rule round-ivl-correct)
also
  have  $\text{Ipoly } [I ! 0 - \text{interval-of } (xs ! 0)] (\text{snd } (\text{tmf-polys } z)) = \text{Ipoly } (\text{List.map2}$ 
  (-) I (map interval-of xs)) (snd (tmf-polys z))
  using a
  apply (auto intro!: Ipoly-num-params-cong nth-equalityI
    simp: nth-Cons simp del:length-greater-0-conv split: nat.splits dest!:
    less-le-trans[OF - num-params-tmf-polys2[of z]])
  apply (subst map2-nth)
  by simp-all
  finally show ?thesis .
qed
consider  $0 < \text{ord } x \neq xs ! 0 \mid 0 < \text{ord } x = xs ! 0 \mid \text{ord} = 0$  by arith
then show ?thesis
proof cases
  case hyps: 1
  then have 1:  $0 < \text{ord}$  and 5:  $x \neq xs ! 0$  by simp-all
  from Taylor[OF 1 2 3 4 5] obtain s where s: (if ?x < ?c then ?x < s \wedge s <
  ?c else ?c < s \wedge s < ?x)
  and tse:  $?f\ ?x = (\sum_{m < ?n} ?diff\ m\ ?c / \text{fact } m * (?x - ?c) ^ m) + ?diff\ ?n$ 
   $s / \text{fact } ?n * (?x - ?c) ^ ?n$ 
  by blast

  have interpret-floatarith f ((map real-of-float xs)[0 := x]) -
  Ipoly (List.map2 (-) [x] [xs!0]) (fst (tmf-polys z)) =
  ( $\sum_{m < ?n} ?diff\ m\ ?c / \text{fact } m * (?x - ?c) ^ m$ ) +  $?diff\ ?n\ s / \text{fact } ?n * (?x$ 
   $- ?c) ^ ?n -$ 

```

```

  (∑ m ≤ ?n. (x - xs!0) ^ m * mid (z ! m))
  unfolding tse
  by (simp add: Ipoly-fst-tmf-polys rewr lz)
  also have ... = (∑ m < ord. cr s m * (x - xs!0) ^ m) + cr s ord * (x - xs!0)
  ^ ord
  unfolding rewr
  by (simp add: algebra-simps cr-def sum.distrib sum-subtractf)
  also have cr s ord ∈i ci ord
  using a
  apply (auto simp: cr-def ci-def intro!: minus-in-intervalI
    tmf-c-correct[OF - z-ord])
  by (smt 4(1) 4(2) 4(3) 4(4) a all-in-def in-real-intervalI length-greater-0-conv
    nth-list-update s xs-ne)
  note enclosure[OF this]
  also have Ipoly (List.map2 (-) [x] (map real-of-float [xs ! 0])) (map-poly
    real-of-float (fst (tmf-polys z))) =
    insertion e (map-poly real-of-float (fst (tmf-polys z)))
  using diff-e
  by (auto intro!: Ipoly-eq-insertionI simp: nth-Cons split: nat.splits dest:
    less-le-trans[OF - num-params-tmf-polys1[of z]])
  finally
  show ?thesis
  by (simp add: tz tb range-tm-def set-of-eq)
next
case 3
with 3 have length z = Suc 0 by (simp add: lz)
then have fst (tmf-polys z) = fst (tmf-polys [z ! 0])
  by (cases z) auto
also have ... = CN (mid (z ! 0))p 0 0p
  by simp
finally have fst (tmf-polys z) = CN (mid (z ! 0))p 0 0p .
with enclosure[OF cr-ord]
show ?thesis
  by (simp add: cr-def 3 range-tm-def tz tb set-of-eq)
next
case 2
have rewr: {..

```

5.5 Operations on Taylor models

```

fun tm-norm-poly :: taylor-model ⇒ taylor-model
  where tm-norm-poly (TaylorModel p e) = TaylorModel (polynate p) e

```

— Normalizes the Taylor model by transforming its polynomial into horner form.

```
fun tm-lower-order tm-lower-order-of-normed :: nat ⇒ nat ⇒ float interval list ⇒
float interval list ⇒ taylor-model ⇒ taylor-model
  where tm-lower-order prec ord I a t = tm-lower-order-of-normed prec ord I a
(tm-norm-poly t)
  | tm-lower-order-of-normed prec ord I a (TaylorModel p e) = (
    let (l, r) = split-by-degree ord p
    in TaylorModel l (round-interval prec (e + compute-bound-poly prec r I a))
  )
```

— Reduces the degree of a Taylor model's polynomial to n and keeps it range by increasing the error bound.

```
fun tm-round-floats tm-round-floats-of-normed :: nat ⇒ float interval list ⇒ float
interval list ⇒ taylor-model ⇒ taylor-model
  where tm-round-floats prec I a t = tm-round-floats-of-normed prec I a (tm-norm-poly
t)
  | tm-round-floats-of-normed prec I a (TaylorModel p e) = (
    let (l, r) = split-by-prec prec p
    in TaylorModel l (round-interval prec (e + compute-bound-poly prec r I a))
  )
```

— Rounding of Taylor models. Rounds both the coefficients of the polynomial and the floats in the error bound.

```
fun tm-norm tm-norm' :: nat ⇒ float interval list ⇒ float interval list ⇒
taylor-model ⇒ taylor-model
  where tm-norm prec ord I a t = tm-norm' prec ord I a (tm-norm-poly t)
  | tm-norm' prec ord I a t = tm-round-floats-of-normed prec I a (tm-lower-order-of-normed
prec ord I a t)
```

— Normalization of taylor models. Performs order lowering and rounding on taylor models, also converts the polynomial into horner form.

```
fun tm-neg :: taylor-model ⇒ taylor-model
  where tm-neg (TaylorModel p e) = TaylorModel (~p p) (-e)
```

```
fun tm-add :: taylor-model ⇒ taylor-model ⇒ taylor-model
  where tm-add (TaylorModel p1 e1) (TaylorModel p2 e2) = TaylorModel (p1 +p
p2) (e1 + e2)
```

```
fun tm-sub :: taylor-model ⇒ taylor-model ⇒ taylor-model
  where tm-sub t1 t2 = tm-add t1 (tm-neg t2)
```

```
fun tm-mul :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒ taylor-model
⇒ taylor-model ⇒ taylor-model
  where tm-mul prec ord I a (TaylorModel p1 e1) (TaylorModel p2 e2) = (
    let d1 = compute-bound-poly prec p1 I a;
    d2 = compute-bound-poly prec p2 I a;
    p = p1 *p p2;
    e = e1*d2 + d1*e2 + e1*e2
  )
```

```

    in tm-norm' prec ord I a (TaylorModel p e)
  )
lemmas [simp del] = tm-norm'.simps

fun tm-pow :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒ taylor-model
⇒ nat ⇒ taylor-model
  where tm-pow prec ord I a t 0 = tm-const 1
  | tm-pow prec ord I a t (Suc n) = (
    if odd (Suc n)
    then tm-mul prec ord I a t (tm-pow prec ord I a t n)
    else let t' = tm-pow prec ord I a t ((Suc n) div 2)
         in tm-mul prec ord I a t' t'
  )

```

Evaluates a float polynomial, using a Taylor model as the parameter. This is used to compose Taylor models.

```

fun eval-poly-at-tm :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒ float
poly ⇒ taylor-model ⇒ taylor-model
  where eval-poly-at-tm prec ord I a (poly.C c) t = tm-const c
  | eval-poly-at-tm prec ord I a (poly.Bound n) t = t
  | eval-poly-at-tm prec ord I a (poly.Add p1 p2) t
    = tm-add (eval-poly-at-tm prec ord I a p1 t)
              (eval-poly-at-tm prec ord I a p2 t)
  | eval-poly-at-tm prec ord I a (poly.Sub p1 p2) t
    = tm-sub (eval-poly-at-tm prec ord I a p1 t)
              (eval-poly-at-tm prec ord I a p2 t)
  | eval-poly-at-tm prec ord I a (poly.Mul p1 p2) t
    = tm-mul prec ord I a (eval-poly-at-tm prec ord I a p1 t)
                          (eval-poly-at-tm prec ord I a p2 t)
  | eval-poly-at-tm prec ord I a (poly.Neg p) t
    = tm-neg (eval-poly-at-tm prec ord I a p t)
  | eval-poly-at-tm prec ord I a (poly.Pw p n) t
    = tm-pow prec ord I a (eval-poly-at-tm prec ord I a p t) n
  | eval-poly-at-tm prec ord I a (poly.CN c n p) t = (
    let pt = eval-poly-at-tm prec ord I a p t;
        t-mul-pt = tm-mul prec ord I a t pt
    in tm-add (eval-poly-at-tm prec ord I a c t) t-mul-pt
  )

```

```

fun tm-inc-err :: float interval ⇒ taylor-model ⇒ taylor-model
  where tm-inc-err i (TaylorModel p e) = TaylorModel p (e + i)

```

```

fun tm-comp :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒ float ⇒
taylor-model ⇒ taylor-model ⇒ taylor-model
  where tm-comp prec ord I a ta (TaylorModel p e) t = (
    let t-sub-ta = tm-sub t (tm-const ta);
        pt = eval-poly-at-tm prec ord I a p t-sub-ta
    in tm-inc-err e pt
  )

```

$tm-max$, $tm-min$ and $tm-abs$ are implemented extremely naively, because I don't expect them to be very useful. But the implementation is fairly modular, i.e. $tm-\{abs,min,max\}$ all can easily be swapped out, as long as the corresponding correctness lemmas $tm-\{abs,min,max\}-range$ are updated as well.

```
fun  $tm-abs$  ::  $nat \Rightarrow float\ interval\ list \Rightarrow float\ interval\ list \Rightarrow taylor-model \Rightarrow taylor-model$ 
  where  $tm-abs\ prec\ I\ a\ t = ($ 
     $let\ bound = compute-bound-tm\ prec\ I\ a\ t; abs-bound=Ivl\ (0::float)\ (max\ (abs$ 
     $(lower\ bound))\ (abs\ (upper\ bound)))$ 
     $in\ TaylorModel\ (poly.C\ (mid\ abs-bound))\ (centered\ abs-bound))$ 
```

```
fun  $tm-union$  ::  $nat \Rightarrow float\ interval\ list \Rightarrow float\ interval\ list \Rightarrow taylor-model \Rightarrow taylor-model \Rightarrow taylor-model$ 
  where  $tm-union\ prec\ I\ a\ t1\ t2 = ($ 
     $let\ b1 = compute-bound-tm\ prec\ I\ a\ t1; b2 = compute-bound-tm\ prec\ I\ a\ t2;$ 
     $b-combined = sup\ b1\ b2$ 
     $in\ TaylorModel\ (poly.C\ (mid\ b-combined))\ (centered\ b-combined))$ 
```

```
fun  $tm-min$  ::  $nat \Rightarrow float\ interval\ list \Rightarrow float\ interval\ list \Rightarrow taylor-model \Rightarrow taylor-model \Rightarrow taylor-model$ 
  where  $tm-min\ prec\ I\ a\ t1\ t2 = tm-union\ prec\ I\ a\ t1\ t2$ 
```

```
fun  $tm-max$  ::  $nat \Rightarrow float\ interval\ list \Rightarrow float\ interval\ list \Rightarrow taylor-model \Rightarrow taylor-model \Rightarrow taylor-model$ 
  where  $tm-max\ prec\ I\ a\ t1\ t2 = tm-union\ prec\ I\ a\ t1\ t2$ 
```

Rangeity of is preserved by our operations on Taylor models.

```
lemma  $insertion-polyadd[simp]$ :  $insertion\ e\ (a\ +_p\ b) = insertion\ e\ a\ +\ insertion\ e\ b$ 
  for  $a\ b::'a::ring-1\ poly$ 
  apply ( $induction\ a\ b\ rule: polyadd.induct$ )
  apply ( $auto\ simp: algebra-simps\ Let-def$ )
  by ( $metis\ (no-types)\ mult-zero-right\ ring-class.ring-distrib(1)$ )
```

```
lemma  $insertion-polyneg[simp]$ :  $insertion\ e\ (\sim_p\ b) = -\ insertion\ e\ b$ 
  for  $b::'a::ring-1\ poly$ 
  by ( $induction\ b\ rule: polyneg.induct$ ) ( $auto\ simp: algebra-simps\ Let-def$ )
```

```
lemma  $insertion-polysub[simp]$ :  $insertion\ e\ (a\ -_p\ b) = insertion\ e\ a\ -\ insertion\ e\ b$ 
  for  $a\ b::'a::ring-1\ poly$ 
  by ( $simp\ add: polysub-def$ )
```

```
lemma  $insertion-polymul[simp]$ :  $insertion\ e\ (a\ *_p\ b) = insertion\ e\ a\ *\ insertion\ e\ b$ 
  for  $a\ b::'a::comm-ring-1\ poly$ 
```

```

by (induction a b rule: polymul.induct)
  (auto simp: algebra-simps Let-def)

lemma insertion-polypow[simp]: insertion e (a  $\hat{^}$ p b) = insertion e a  $\hat{^}$  b
for a: 'a::comm-ring-1 poly
proof (induction b rule: nat-less-induct)
case (1 n)
then show ?case
proof (cases n)
case (Suc nat)
then show ?thesis
apply (auto simp: )
apply (auto simp: Let-def div2-less-self 1 simp del: polypow.simps)
apply (metis even-Suc even-two-times-div-two odd-Suc-div-two semiring-normalization-rules(27)
semiring-normalization-rules(36))
apply (metis even-two-times-div-two semiring-normalization-rules(36))
done
qed simp
qed

lemma insertion-polynate [simp]:
insertion bs (polynate p) = (insertion bs p :: 'a::comm-ring-1)
by (induct p rule: polynate.induct) (auto simp: )

lemma tm-norm-poly-range:
assumes x  $\in$ i range-tm e t
shows x  $\in$ i range-tm e (tm-norm-poly t)
using assms
by (cases t) (simp add: range-tm-def)

lemma split-by-degree-correct-insertion:
fixes x :: nat  $\Rightarrow$  real and p :: float poly
assumes split-by-degree ord p = (l, r)
shows maxdegree l  $\leq$  ord (is ?P1)
and insertion x p = insertion x l + insertion x r (is ?P2)
and num-params l  $\leq$  num-params p (is ?P3)
and num-params r  $\leq$  num-params p (is ?P4)
proof -
define xs where xs = map x [0..\implies x i = xs ! i for i
by (auto simp: xs-def)
have insertion x p = Ipoly xs p
by (auto intro!: insertion-eq-IpolyI xs)
also
from split-by-degree-correct[OF assms(1)[symmetric]]
have maxdegree l  $\leq$  ord
and p: Ipoly xs (map-poly real-of-float p) =
Ipoly xs (map-poly real-of-float l) + Ipoly xs (map-poly real-of-float r)
and l: num-params l  $\leq$  num-params p

```

```

and  $r$ : num-params  $r \leq$  num-params  $p$ 
  by auto
show ?P1 ?P3 ?P4 by fact+
note  $p$ 
also have  $Ipoly\ xs\ (map\ poly\ real\ of\ float\ l) = insertion\ x\ l$ 
  using  $l$ 
  by (auto intro!:  $xs\ Ipoly\ eq\ insertionI$ )
also have  $Ipoly\ xs\ (map\ poly\ real\ of\ float\ r) = insertion\ x\ r$ 
  using  $r$ 
  by (auto intro!:  $xs\ Ipoly\ eq\ insertionI$ )
finally show ?P2 .
qed

```

```

lemma split-by-prec-correct-insertion:
  fixes  $x :: nat \Rightarrow real$  and  $p :: float\ poly$ 
  assumes split-by-prec ord  $p = (l, r)$ 
  shows  $insertion\ x\ p = insertion\ x\ l + insertion\ x\ r$  (is ?P1)
    and num-params  $l \leq$  num-params  $p$  (is ?P2)
    and num-params  $r \leq$  num-params  $p$  (is ?P3)
proof –
  define  $xs$  where  $xs = map\ x\ [0..<num-params\ p]$ 
  have  $xs: i < num-params\ p \Longrightarrow x\ i = xs\ !\ i$  for  $i$ 
    by (auto simp: xs-def)
  have  $insertion\ x\ p = Ipoly\ xs\ p$ 
    by (auto intro!: insertion-eq-IpolyI xs)
  also
  from split-by-prec-correct[OF assms(1)[symmetric]]
  have  $p: Ipoly\ xs\ (map\ poly\ real\ of\ float\ p) =$ 
     $Ipoly\ xs\ (map\ poly\ real\ of\ float\ l) + Ipoly\ xs\ (map\ poly\ real\ of\ float\ r)$ 
  and  $l: num-params\ l \leq num-params\ p$ 
  and  $r: num-params\ r \leq num-params\ p$ 
    by auto
  show ?P2 ?P3 by fact+
  note  $p$ 
  also have  $Ipoly\ xs\ (map\ poly\ real\ of\ float\ l) = insertion\ x\ l$ 
    using  $l$ 
    by (auto intro!:  $xs\ Ipoly\ eq\ insertionI$ )
  also have  $Ipoly\ xs\ (map\ poly\ real\ of\ float\ r) = insertion\ x\ r$ 
    using  $r$ 
    by (auto intro!:  $xs\ Ipoly\ eq\ insertionI$ )
  finally show ?P1 .
qed

```

```

lemma tm-lower-order-of-normed-range:
  assumes  $x \in_i range\ tm\ e\ t$ 
  assumes dev: develops-at-within e a I
  assumes num-params  $(tm\ poly\ t) \leq length\ I$ 
  shows  $x \in_i range\ tm\ e\ (tm\ lower\ order\ of\ normed\ prec\ ord\ I\ a\ t)$ 
proof–

```


obtain p err **where** t -*decomp*: $t = TaylorModel\ p\ err$
by (*cases* t) *simp*
obtain pl pr **where** p -*split*: *split-by-degree* $ord\ p = (pl, pr)$
by (*cases* *split-by-degree* $ord\ p$, *simp*)

from *split-by-degree-correct-insertion*[*OF* p -*split*]
have $params$: $maxdegree\ pl \leq ord\ num-params\ pl \leq num-params\ p\ num-params\ pr \leq num-params\ p$
and ins : *insertion* e (*map-poly* *real-of-float* p) =
insertion e (*map-poly* *real-of-float* pl) + *insertion* e (*map-poly* *real-of-float* pr)
by *auto*
from *assms* $params$ **have** $params-pr$: $num-params\ pr \leq length\ I$ **by** (*auto* *simp*: t -*decomp*)

have $range-tm\ e\ t =$
interval-of (*insertion* e (*map-poly* *real-of-float* pl)) +
(*interval-of* (*insertion* e (*map-poly* *real-of-float* pr)) + *real-interval* err)
by (*auto* *simp*: t -*decomp* *range-tm-def* ins *ac-simps* *interval-of-plus*) **term**
round-interval
also **have** $set-of\ \dots \subseteq set-of$ (*interval-of* (*insertion* $e\ pl$)) +
set-of (*real-interval* (*round-interval* $prec$ ($err + compute-bound-poly\ prec\ pr\ I$
 a)))
unfolding *set-of-plus* *real-interval-plus* *add.commute*[*of* err]
apply (*rule* *set-plus-mono2*[*OF* *order-refl*])
apply (*rule* *order-trans*) **prefer** 2
apply (*rule* *set-of-real-interval-subset*)
apply (*rule* *round-ivl-correct*)
unfolding *set-of-plus* *real-interval-plus*
apply (*rule* *set-plus-mono2*[*OF* - *order-refl*])
apply (*rule* *subsetI*)
apply *simp*
apply (*rule* *compute-bound-poly-correct*)
apply (*rule* $params-pr$)
by (*rule* $assms$)
also **have** $\dots = set-of$ ($range-tm\ e$ ($tm-lower-order-of-normed\ prec\ ord\ I\ a\ t$))
by (*simp* *add*: t -*decomp* *split-beta'* *Let-def* p -*split* *range-tm-def* *set-of-plus*)
finally **show** *?thesis* **using** $assms$ **by** *auto*
qed

lemma $num-params-tm-norm-poly-le$: $num-params$ ($tm-poly$ ($tm-norm-poly\ t$)) \leq
 X
if $num-params$ ($tm-poly\ t$) $\leq X$
using *that*
by (*cases* t) (*auto* *simp*: *intro!*: $num-params-polynate$ [*THEN* *order-trans*])

lemma $tm-lower-order-range$:
assumes $x \in_i\ range-tm\ e\ t$
assumes dev : *develops-at-within* $e\ a\ I$
assumes $num-params$ ($tm-poly\ t$) $\leq length\ I$

shows $x \in_i \text{range-tm } e \text{ (tm-lower-order prec ord } I \text{ a } t)$
by (*auto simp add: intro!: tm-lower-order-of-normed-range tm-norm-poly-range*
assms
num-params-tm-norm-poly-le)

lemma *tm-round-floats-of-normed-range:*

assumes $x \in_i \text{range-tm } e \text{ t}$
assumes *dev: develops-at-within e a I*
assumes *num-params (tm-poly t) ≤ length I*
shows $x \in_i \text{range-tm } e \text{ (tm-round-floats-of-normed prec } I \text{ a } t)$
 — **TODO:** this is a clone of $\llbracket ?x \in_i \text{range-tm } ?e \text{ ?t; develops-at-within } ?e \text{ ?a } ?I;$
num-params (tm-poly ?t) ≤ length ?I $\implies ?x \in_i \text{range-tm } ?e \text{ (tm-lower-order-of-normed}$
?prec ?ord ?I ?a ?t) -> general sweeping method!

proof–

obtain $p \text{ err}$ **where** *t-decomp: t = TaylorModel p err*

by (*cases t simp*)

obtain $pl \text{ pr}$ **where** *p-prec: split-by-prec prec p = (pl, pr)*

by (*cases split-by-prec prec p, simp*)

from *split-by-prec-correct-insertion[OF p-prec]*

have *params: num-params pl ≤ num-params p num-params pr ≤ num-params p*

and *ins: insertion e (map-poly real-of-float p) =*

insertion e (map-poly real-of-float pl) + insertion e (map-poly real-of-float pr)

by *auto*

from *assms params have params-pr: num-params pr ≤ length I*

by (*auto simp: t-decomp*)

have *range-tm e t =*

interval-of (insertion e (map-poly real-of-float pl)) +

(interval-of (insertion e (map-poly real-of-float pr)) + real-interval err)

by (*auto simp: t-decomp range-tm-def ins ac-simps interval-of-plus*)

also have *set-of ... ⊆ set-of (interval-of (insertion e pl)) +*

set-of (real-interval (round-interval prec (err + compute-bound-poly prec pr I

a)))

unfolding *set-of-plus real-interval-plus add.commute[of err]*

apply (*rule set-plus-mono2[OF order-refl]*)

apply (*rule order-trans*) **prefer** 2

apply (*rule set-of-real-interval-subset*)

apply (*rule round-ivl-correct*)

unfolding *set-of-plus real-interval-plus*

apply (*rule set-plus-mono2[OF - order-refl]*)

apply (*rule subsetI*)

apply *simp*

apply (*rule compute-bound-poly-correct*)

apply (*rule params-pr*)

by (*rule assms*)

also have *... = set-of (range-tm e (tm-round-floats-of-normed prec I a t))*

by (*simp add: t-decomp split-beta' Let-def p-prec range-tm-def set-of-plus*)

finally show *?thesis using assms by auto*

qed

lemma *num-params-split-by-degree-le*: $\text{num-params } (\text{fst } (\text{split-by-degree } \text{ord } x)) \leq K$
num-params (*snd* (*split-by-degree* *ord* *x*)) $\leq K$
if *num-params* $x \leq K$ **for** $x::\text{float poly}$
using *split-by-degree-correct-insertion*(3,4)[*of ord x, OF surjective-pairing*] **that**
by *auto*

lemma *num-params-split-by-prec-le*: $\text{num-params } (\text{fst } (\text{split-by-prec } \text{ord } x)) \leq K$
num-params (*snd* (*split-by-prec* *ord* *x*)) $\leq K$
if *num-params* $x \leq K$ **for** $x::\text{float poly}$
using *split-by-prec-correct-insertion*(2,3)[*of ord x, OF surjective-pairing*] **that**
by *auto*

lemma *num-params-tm-norm'-le*:
num-params (*tm-poly* (*tm-round-floats-of-normed* *prec* *I a t*)) $\leq X$
if *num-params* (*tm-poly* *t*) $\leq X$
using *that*
by (*cases* *t*) (*auto simp: tm-norm'.simps split-beta' Let-def intro!: num-params-split-by-prec-le*)

lemma *tm-round-floats-range*:
assumes $x \in_i \text{range-tm } e \text{ } t \text{ develops-at-within } e \text{ } a \text{ } I \text{ num-params } (\text{tm-poly } t) \leq$
length *I*
shows $x \in_i \text{range-tm } e \text{ } (\text{tm-round-floats } \text{prec } I \text{ } a \text{ } t)$
by (*auto intro!: tm-round-floats-of-normed-range assms tm-norm-poly-range num-params-tm-norm-poly-le*)

lemma *num-params-tm-lower-order-of-normed-le*: $\text{num-params } (\text{tm-poly } (\text{tm-lower-order-of-normed}$
prec ord I a t)) $\leq X$
if *num-params* (*tm-poly* *t*) $\leq X$
using *that*
apply (*cases* *t*)
apply (*auto simp: split-beta' Let-def intro!: num-params-polynate[THEN order-trans]*)
apply (*rule order-trans[OF split-by-degree-correct(3)]*)
by (*auto simp: prod-eq-iff*)

lemma *tm-norm'-range*:
assumes $x \in_i \text{range-tm } e \text{ } t \text{ develops-at-within } e \text{ } a \text{ } I \text{ num-params } (\text{tm-poly } t) \leq$
length *I*
shows $x \in_i \text{range-tm } e \text{ } (\text{tm-norm}' \text{ prec } \text{ord } I \text{ } a \text{ } t)$
by (*auto intro!: tm-round-floats-of-normed-range tm-lower-order-of-normed-range*
assms
num-params-tm-norm-poly-le num-params-tm-lower-order-of-normed-le
simp: tm-norm'.simps)

lemma *num-params-tm-norm'*:
num-params (*tm-poly* (*tm-norm'* *prec ord I a t*)) $\leq X$

if $\text{num-params } (tm\text{-poly } t) \leq X$
using *that*
by (*cases t*) (*auto simp: tm-norm'.simps split-beta' Let-def*
intro!: num-params-tm-norm'-le num-params-split-by-prec-le num-params-split-by-degree-le)

lemma *tm-norm-range*:

assumes $x \in_i \text{range-tm } e \text{ } t$ *develops-at-within e a I num-params (tm-poly t) \leq*
length I
shows $x \in_i \text{range-tm } e (tm\text{-norm } prec \text{ ord } I \text{ } a \text{ } t)$
by (*auto intro!: assms tm-norm'-range tm-norm-poly-range num-params-tm-norm-poly-le*)
lemmas [*simp del*] = *tm-norm.simps*

lemma *tm-neg-range*:

assumes $x \in_i \text{range-tm } e \text{ } t$
shows $-x \in_i \text{range-tm } e (tm\text{-neg } t)$
using *assms*
by (*cases t*)
(auto simp: set-of-eq range-tm-def interval-of-plus interval-of-uminus map-poly-homo-polyneg)
lemmas [*simp del*] = *tm-neg.simps*

lemma *tm-bound-tm-add[*simp*]*: $tm\text{-bound } (tm\text{-add } t1 \text{ } t2) = tm\text{-bound } t1 + tm\text{-bound } t2$

by (*cases t1; cases t2*) (*auto simp:*)

lemma *interval-of-add*: $interval\text{-of } (a + b) = interval\text{-of } a + interval\text{-of } b$
by (*auto intro!: interval-eqI*)

lemma *tm-add-range*:

$x + y \in_i \text{range-tm } e (tm\text{-add } t1 \text{ } t2)$
if $x \in_i \text{range-tm } e \text{ } t1$
 $y \in_i \text{range-tm } e \text{ } t2$
proof –
from *range-tmD[OF that(1)] range-tmD[OF that(2)]*
show *?thesis*
apply (*cases t1; cases t2*)
apply (*rule range-tmI*)
by (*auto simp: map-poly-homo-polyadd real-interval-plus ac-simps interval-of-add*
num-params-polyadd insertion-polyadd set-of-eq
dest: less-le-trans[OF - num-params-polyadd])

qed

lemmas [*simp del*] = *tm-add.simps*

lemma *tm-sub-range*:

assumes $x \in_i \text{range-tm } e \text{ } t1$
assumes $y \in_i \text{range-tm } e \text{ } t2$
shows $x - y \in_i \text{range-tm } e (tm\text{-sub } t1 \text{ } t2)$
using *tm-add-range[OF assms(1) tm-neg-range[OF assms(2)]]*
by *simp*

lemmas [simp del] = tm-sub.simps

lemma set-of-intervalI: set-of (interval-of y) \subseteq set-of Y if $y \in_i Y$ for $y::'a::order$
using that by (auto simp: set-of-eq)

lemma set-of-real-intervalI: set-of (interval-of y) \subseteq set-of (real-interval Y) if $y \in_r Y$
using that by (auto simp: set-of-eq)

lemma tm-mul-range:

assumes $x \in_i \text{range-tm } e \ t1$

assumes $y \in_i \text{range-tm } e \ t2$

assumes dev: develops-at-within e a I

assumes params: num-params (tm-poly t1) \leq length I num-params (tm-poly t2)
 \leq length I

shows $x * y \in_i \text{range-tm } e \ (\text{tm-mul } \text{prec } \text{ord } I \ a \ t1 \ t2)$

proof –

define p1 where $p1 = \text{tm-poly } t1$

define p2 where $p2 = \text{tm-poly } t2$

define e1 where $e1 = \text{tm-bound } t1$

define e2 where $e2 = \text{tm-bound } t2$

have t1-def: $t1 = \text{TaylorModel } p1 \ e1$ and t2-def: $t2 = \text{TaylorModel } p2 \ e2$

by (auto simp: p1-def e1-def p2-def e2-def)

from params **have** params: num-params p1 \leq length I num-params p2 \leq length I

by (auto simp: p1-def p2-def)

from range-tmD[OF assms(1)]

obtain xe **where** $x: x = \text{insertion } e \ p1 + xe$

(is - = ?x' + -)

and $xe: xe \in_r e1$

by (auto simp: p1-def e1-def elim!: plus-in-intervalE)

from range-tmD[OF assms(2)]

obtain ye **where** $y: y = \text{insertion } e \ p2 + ye$

(is - = ?y' + -)

and $ye: ye \in_r e2$

by (auto simp: p2-def e2-def elim!: plus-in-intervalE)

have $x * y = \text{insertion } e \ (p1 *_p p2) + (xe * ?y' + ?x' * ye + xe * ye)$

by (simp add: algebra-simps x y map-poly-homo-polymul)

also have ... $\in_i \text{range-tm } e \ (\text{tm-mul } \text{prec } \text{ord } I \ a \ t1 \ t2)$

by (auto intro!: tm-round-floats-of-normed-range assms tm-norm'-range

simp: split-beta' Let-def t1-def t2-def)

(auto simp: range-tm-def real-interval-plus real-interval-times intro!: plus-in-intervalI

times-in-intervalI xe ye params compute-bound-poly-correct dev

num-params-polymul[THEN order-trans])

finally show ?thesis .

qed

lemma num-params-tm-mul-le:

num-params (tm-poly (tm-mul prec ord I a t1 t2)) \leq X

```

if num-params (tm-poly t1) ≤ X
  num-params (tm-poly t2) ≤ X
using that
by (cases t1; cases t2)
  (auto simp: intro!: num-params-tm-norm' num-params-polymul[THEN order-trans])

```

lemmas [*simp del*] = *tm-pow.simps*— TODO: make a systematic decision

lemma

```

shows tm-pow-range: num-params (tm-poly t) ≤ length I ⇒
  develops-at-within e a I ⇒
   $x \in_i \text{range-tm } e \ t \Rightarrow$ 
   $x \wedge^n \in_i \text{range-tm } e \ (\text{tm-pow prec ord } I \ a \ t \ n)$ 
and num-params-tm-pow-le[THEN order-trans]:
  num-params (tm-poly (tm-pow prec ord I a t n)) ≤ num-params (tm-poly t)
unfolding atomize-conj atomize-imp
proof(induction n arbitrary: x t rule: nat-less-induct)
case (1 n)
note IH1 = 1(1)[rule-format, THEN conjunct1, rule-format]
note IH2 = 1(1)[rule-format, THEN conjunct2, THEN order-trans]
show ?case
proof (cases n)
  case 0
  then show ?thesis by (auto simp: tm-const-def range-tm-def set-of-eq tm-pow.simps)
next
  case (Suc nat)
  have eq: odd nat ⇒  $x * x \wedge^{\text{nat}} = x \wedge^{((\text{Suc } \text{nat}) \text{ div } 2)} * x \wedge^{((\text{Suc } \text{nat}) \text{ div } 2)}$ 
2)
  apply (subst power-add[symmetric])
  unfolding div2-plus-div2
  by simp
show ?thesis
  unfolding tm-pow.simps Suc
  using Suc
  apply (auto )
  subgoal
  apply (rule tm-mul-range) apply (assumption)
  apply (rule IH1) apply force
  apply assumption+
  apply (rule IH2) apply force
  apply assumption
  done
  subgoal
  apply (rule num-params-tm-mul-le) apply force
  apply (rule IH2) apply force
  apply force
  done
  subgoal

```

```

    apply (auto simp: Let-def)
    unfolding eq odd-Suc-div-two
    apply (rule tm-mul-range)
    subgoal by (rule IH1) (auto intro!: tm-mul-range num-params-tm-mul-le
IH1 IH2 1
      simp: Let-def div2-less-self)
    subgoal by (rule IH1) (auto intro!: tm-mul-range num-params-tm-mul-le
IH1 IH2 1
      simp: Let-def div2-less-self)
    subgoal by assumption
    subgoal by (rule IH2) (auto simp: div2-less-self 1)
    subgoal by (rule IH2) (auto simp: div2-less-self 1)
    done
  subgoal
    by (auto simp: Let-def div2-less-self 1 intro!: IH2 num-params-tm-mul-le)
  done
qed
qed

```

```

lemma num-params-tm-add-le:
  num-params (tm-poly (tm-add t1 t2)) ≤ X
if num-params (tm-poly t1) ≤ X
  num-params (tm-poly t2) ≤ X
using that
by (cases t1; cases t2)
  (auto simp: tm-add.simps
  intro!: num-params-tm-norm' num-params-polymul[THEN order-trans]
  num-params-polyadd[THEN order-trans])

```

```

lemma num-params-tm-neg-eq[simp]:
  num-params (tm-poly (tm-neg t1)) = num-params (tm-poly t1)
by (cases t1) (auto simp: tm-neg.simps num-params-polyneg)

```

```

lemma num-params-tm-sub-le:
  num-params (tm-poly (tm-sub t1 t2)) ≤ X
if num-params (tm-poly t1) ≤ X
  num-params (tm-poly t2) ≤ X
using that
by (cases t1; cases t2) (auto simp: tm-sub.simps intro!: num-params-tm-add-le)

```

```

lemma num-params-eval-poly-le: num-params (tm-poly (eval-poly-at-tm prec ord I
a p t)) ≤ x
if num-params (tm-poly t) ≤ x num-params p ≤ max 1 x
using that
by (induction prec ord I a p t rule: eval-poly-at-tm.induct)
  (auto intro!: num-params-tm-add-le num-params-tm-sub-le num-params-tm-mul-le
  num-params-tm-pow-le)

```

```

lemma eval-poly-at-tm-range:

```

```

assumes num-params  $p \leq 1$ 
assumes tg-def:  $e' 0 \in_i \text{range-tm } e \text{ } tg$ 
assumes dev: develops-at-within  $e \text{ } a \text{ } I$  and params: num-params ( $\text{tm-poly } tg$ )  $\leq$ 
length  $I$ 
shows insertion  $e' p \in_i \text{range-tm } e \text{ } (\text{eval-poly-at-tm } \text{prec } \text{ord } I \text{ } a \text{ } p \text{ } tg)$ 
using assms(1) params
proof(induction  $p$ )
  case ( $C \text{ } c$ ) thus ?case
    using tg-def
    by (cases  $tg$ ) (auto simp: tm-const-def range-tm-def real-interval-zero)
  next
    case ( $Bound \text{ } n$ ) thus ?case
      using tg-def
      by simp
  next
    case ( $Add \text{ } p1l \text{ } p1r$ ) thus ?case
      using tm-add-range by (simp add: func-plus)
  next
    case ( $Sub \text{ } p1l \text{ } p1r$ ) thus ?case
      using tm-sub-range by (simp add: fun-diff-def)
  next
    case ( $Mul \text{ } p1l \text{ } p1r$ ) thus ?case
      by (auto intro!: tm-mul-range Mul dev num-params-eval-poly-le)
  next
    case ( $Neg \text{ } p1'$ ) thus ?case
      using tm-neg-range by (simp add: fun-Compl-def)
  next
    case ( $Pw \text{ } p1' \text{ } n$ ) thus ?case
      by (auto intro!: tm-pow-range Pw dev num-params-eval-poly-le)
  next
    case ( $CN \text{ } p1l \text{ } n \text{ } p1r$ ) thus ?case
      by (auto intro!: tm-mul-range tm-pow-range CN dev num-params-eval-poly-le
tm-add-range tg-def)
qed

```

lemma *tm-inc-err-range*: $x \in_i \text{range-tm } e \text{ } (\text{tm-inc-err } i \text{ } t)$
if $x \in_i \text{range-tm } e \text{ } t + \text{real-interval } i$
using *that*
by (*cases* t) (*auto simp: range-tm-def real-interval-plus ac-simps*)

lemma *num-params-tm-inc-err*: num-params ($\text{tm-poly } (\text{tm-inc-err } i \text{ } t)$) $\leq X$
if num-params ($\text{tm-poly } t$) $\leq X$
using *that*
by (*cases* t) *auto*

lemma *num-params-tm-comp-le*: num-params ($\text{tm-poly } (\text{tm-comp } \text{prec } \text{ord } I \text{ } a \text{ } ga$
 $tf \text{ } tg)$) $\leq X$
if num-params ($\text{tm-poly } tf$) $\leq \max 1 X$ num-params ($\text{tm-poly } tg$) $\leq X$
using *that*

by (cases tf) (auto intro!: num-params-tm-inc-err num-params-eval-poly-le num-params-tm-sub-le)

lemma *tm-comp-range*:

assumes *tf-def*: $x \in_i \text{range-tm } e' \text{ tf}$

assumes *tg-def*: $e' 0 \in_i \text{range-tm } e \text{ (tm-sub tg (tm-const ga))}$

assumes *params*: $\text{num-params (tm-poly tf)} \leq 1 \text{ num-params (tm-poly tg)} \leq \text{length}$

I

assumes *dev*: *develops-at-within* e a I

shows $x \in_i \text{range-tm } e \text{ (tm-comp prec ord } I \text{ a ga tf tg)}$

proof–

obtain $pf \text{ ef}$ **where** *tf-decomp*: $tf = \text{TaylorModel } pf \text{ ef}$ **using** *taylor-model.exhaust*
by *auto*

obtain $pg \text{ eg}$ **where** *tg-decomp*: $tg = \text{TaylorModel } pg \text{ eg}$ **using** *taylor-model.exhaust*
by *auto*

from *params* **have** *params*: $\text{num-params } pf \leq \text{Suc } 0 \text{ num-params } pg \leq \text{length } I$

by (*auto simp: tf-decomp tg-decomp*)

from *tf-def* **obtain** xe **where** *x-def*: $x = \text{insertion } e' \text{ pf} + xe \text{ } xe \in_r \text{ ef}$

by (*auto simp: tf-decomp range-tm-def elim!: plus-in-intervalE*)

show *?thesis*

using *tg-def*

by (*auto simp: tf-decomp tg-decomp x-def params dev*)

intro!: *tm-inc-err-range eval-poly-at-tm-range plus-in-intervalI num-params-tm-sub-le*)

qed

lemma *mid-centered-collapse*:

interval-of (real-of-float (mid abs-bound)) + real-interval (centered abs-bound) =
real-interval abs-bound

by (*auto simp: centered-def interval-eq-iff*)

lemmas [*simp del*] = *tm-abs.simps*

lemma *tm-abs-range*:

assumes *x*: $x \in_i \text{range-tm } e \text{ t}$

assumes *n*: $\text{num-params (tm-poly t)} \leq \text{length } I$ **and** *d*: *develops-at-within* e a I

shows $abs \ x \in_i \text{range-tm } e \text{ (tm-abs prec } I \text{ a t)}$

proof–

obtain $p \text{ e}$ **where** *t-def[*simp*]*: $t = \text{TaylorModel } p \text{ e}$ **using** *taylor-model.exhaust*
by *auto*

define *bound* **where** *bound* = *compute-bound-tm prec I a t*

have *bound*: $x \in_r \text{bound}$

unfolding *bound-def*

using *n d x*

by (*rule compute-bound-tm-correct*)

define *abs-bound* **where** *abs-bound* $\equiv \text{Ivl } 0 \text{ (max |lower bound| |upper bound|)}$

have *abs-bound*: $|x| \in_r \text{abs-bound}$ **using** *bound*

by (*auto simp: abs-bound-def set-of-eq abs-real-def max-def min-def*)

have *tm-abs-decomp*: $\text{tm-abs prec } I \text{ a t} = \text{TaylorModel (poly.C (mid abs-bound))}$
(*centered abs-bound*)

by (*simp add: bound-def abs-bound-def Let-def tm-abs.simps*)

show *?thesis*
unfolding *tm-abs-decomp*
by (*rule range-tmI*) (*auto simp: mid-centered-collapse abs-bound*)
qed

lemma *num-params-tm-abs-le*: $\text{num-params } (tm\text{-poly } (tm\text{-abs } prec\ I\ a\ t)) \leq X$ **if**
 $\text{num-params } (tm\text{-poly } t) \leq X$
using *that*
by (*auto simp: tm-abs.simps Let-def*)

lemma *real-interval-sup*: $\text{real-interval } (sup\ a\ b) = sup\ (\text{real-interval } a)\ (\text{real-interval } b)$
by (*auto simp: interval-eq-iff inf-real-def inf-float-def sup-float-def sup-real-def min-def max-def*)

lemma *in-interval-supI1*: $x \in_i a \implies x \in_i sup\ a\ b$
and *in-interval-supI2*: $x \in_i b \implies x \in_i sup\ a\ b$
for $x::'a::lattice$
by (*auto simp: set-of-eq le-infI1 le-infI2 le-supI1 le-supI2*)

lemma *tm-union-range-left*:
assumes $x \in_i range\ tm\ e\ t1$
 $\text{num-params } (tm\text{-poly } t1) \leq length\ I\ \text{develops-at-within } e\ a\ I$
shows $x \in_i range\ tm\ e\ (tm\text{-union } prec\ I\ a\ t1\ t2)$
proof–
define *b1* **where** $b1 \equiv compute\ bound\ tm\ prec\ I\ a\ t1$
define *b2* **where** $b2 \equiv compute\ bound\ tm\ prec\ I\ a\ t2$
define *b-combined* **where** $b\text{-combined} \equiv sup\ b1\ b2$

obtain $p\ e$ **where** *tm-union-decomp*: $tm\text{-union } prec\ I\ a\ t1\ t2 = TaylorModel\ p\ e$
using *taylor-model.exhaust* **by** *auto*
then have *p-def*: $p = (mid\ b\text{-combined})_p$
and *e-def*: $e = centered\ b\text{-combined}$
by (*auto simp: Let-def b1-def b2-def b-combined-def interval-eq-iff*)
have $x \in_r b1$
by (*auto simp: b1-def intro!: compute-bound-tm-correct assms*)
then have $x \in_r b\text{-combined}$
by (*auto simp: b-combined-def real-interval-sup in-interval-supI1*)
then show *?thesis*
unfolding *tm-union-decomp*
by (*auto simp: range-tm-def p-def e-def mid-centered-collapse*)
qed

lemma *tm-union-range-right*:
assumes $x \in_i range\ tm\ e\ t2$
 $\text{num-params } (tm\text{-poly } t2) \leq length\ I\ \text{develops-at-within } e\ a\ I$
shows $x \in_i range\ tm\ e\ (tm\text{-union } prec\ I\ a\ t1\ t2)$
using *tm-union-range-left[OF assms]*
by (*simp add: interval-union-commute*)

lemma *num-params-tm-union-le*:
num-params (tm-poly (tm-union prec I a t1 t2)) ≤ X
if *num-params (tm-poly t1) ≤ X num-params (tm-poly t2) ≤ X*
using *that*
by (*auto simp: Let-def*)

lemmas [*simp del*] = *tm-union.simps tm-min.simps tm-max.simps*

lemma *tm-min-range*:
assumes *x ∈_i range-tm e t1*
assumes *y ∈_i range-tm e t2*
num-params (tm-poly t1) ≤ length I
num-params (tm-poly t2) ≤ length I
develops-at-within e a I
shows *min x y ∈_i range-tm e (tm-min prec I a t1 t2)*
using *assms*
by (*auto simp: Let-def tm-min.simps min-def intro: tm-union-range-left tm-union-range-right*)

lemma *tm-max-range*:
assumes *x ∈_i range-tm e t1*
assumes *y ∈_i range-tm e t2*
num-params (tm-poly t1) ≤ length I
num-params (tm-poly t2) ≤ length I
develops-at-within e a I
shows *max x y ∈_i range-tm e (tm-max prec I a t1 t2)*
using *assms*
by (*auto simp: Let-def tm-max.simps max-def intro: tm-union-range-left tm-union-range-right*)

5.6 Computing Taylor models for multivariate expressions

Compute Taylor models for expressions of the form "f (g x)", where f is an elementary function like exp or cos, by composing Taylor models for f and g. For our correctness proof, we need to make it explicit that the range of g on I is inside the domain of f, by introducing the *f-exists-on* predicate.

```
fun compute-tm-by-comp :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒
floatarith ⇒ taylor-model option ⇒ (float interval ⇒ bool) ⇒ taylor-model option
  where compute-tm-by-comp prec ord I a f g f-exists-on = (
    case g
    of Some tg ⇒ (
      let gI = compute-bound-tm prec I a tg;
      ga = mid (compute-bound-tm prec a a tg)
      in if f-exists-on gI
      then map-option (λtf. tm-comp prec ord I a ga tf tg) (tm-floatarith prec
ord [gI] [ga] f)
      else None)
    | - ⇒ None
  )
```

Compute Taylor models with numerical precision $prec$ of degree ord , with Taylor models in the environment env whose variables are jointly interpreted with domain I and expanded around point a . from floatarith expressions on a rectangular domain.

```

fun approx-tm :: nat ⇒ nat ⇒ float interval list ⇒ float interval list ⇒ floatarith
⇒ taylor-model list ⇒
  taylor-model option
  where approx-tm - - I - (Num c) env = Some (tm-const c)
  | approx-tm - - I a (Var n) env = (if n < length env then Some (env ! n) else
None)
  | approx-tm prec ord I a (Add l r) env = (
    case (approx-tm prec ord I a l env, approx-tm prec ord I a r env)
    of (Some t1, Some t2) ⇒ Some (tm-add t1 t2)
    | - ⇒ None)
  | approx-tm prec ord I a (Minus f) env
    = map-option tm-neg (approx-tm prec ord I a f env)
  | approx-tm prec ord I a (Mult l r) env = (
    case (approx-tm prec ord I a l env, approx-tm prec ord I a r env)
    of (Some t1, Some t2) ⇒ Some (tm-mul prec ord I a t1 t2)
    | - ⇒ None)
  | approx-tm prec ord I a (Power f k) env
    = map-option (λt. tm-pow prec ord I a t k)
      (approx-tm prec ord I a f env)
  | approx-tm prec ord I a (Inverse f) env
    = compute-tm-by-comp prec ord I a (Inverse (Var 0)) (approx-tm prec ord
I a f env) (λx. 0 < lower x ∨ upper x < 0)
  | approx-tm prec ord I a (Cos f) env
    = compute-tm-by-comp prec ord I a (Cos (Var 0)) (approx-tm prec ord I a
f env) (λx. True)
  | approx-tm prec ord I a (Arctan f) env
    = compute-tm-by-comp prec ord I a (Arctan (Var 0)) (approx-tm prec ord I
a f env) (λx. True)
  | approx-tm prec ord I a (Exp f) env
    = compute-tm-by-comp prec ord I a (Exp (Var 0)) (approx-tm prec ord I a
f env) (λx. True)
  | approx-tm prec ord I a (Ln f) env
    = compute-tm-by-comp prec ord I a (Ln (Var 0)) (approx-tm prec ord I a f
env) (λx. 0 < lower x)
  | approx-tm prec ord I a (Sqrt f) env
    = compute-tm-by-comp prec ord I a (Sqrt (Var 0)) (approx-tm prec ord I a
f env) (λx. 0 < lower x)
  | approx-tm prec ord I a Pi env = Some (tm-pi prec)
  | approx-tm prec ord I a (Abs f) env
    = map-option (tm-abs prec I a) (approx-tm prec ord I a f env)
  | approx-tm prec ord I a (Min l r) env = (
    case (approx-tm prec ord I a l env, approx-tm prec ord I a r env)
    of (Some t1, Some t2) ⇒ Some (tm-min prec I a t1 t2)
    | - ⇒ None)
  | approx-tm prec ord I a (Max l r) env = (

```

```

      case (approx-tm prec ord I a l env, approx-tm prec ord I a r env)
      of (Some t1, Some t2) => Some (tm-max prec I a t1 t2)
      | - => None
| approx-tm prec ord I a (Powr l r) env = None — TODO
| approx-tm prec ord I a (Floor l) env = None — TODO

```

lemma *mid-in-real-interval*: $\text{mid } i \in_r i$
using *lower-le-upper*[of *i*]
by (*auto simp: mid-def set-of-eq powr-minus*)

lemma *set-of-real-interval-mono*: $\text{set-of } (\text{real-interval } x) \subseteq \text{set-of } (\text{real-interval } y)$
if $\text{set-of } x \subseteq \text{set-of } y$
using *that* **by** (*auto simp: set-of-eq*)

lemmas [*simp del*] = *compute-bound-poly.simps tm-floatarith.simps*

lemmas [*simp del*] = *tmf-ivl-cs.simps compute-bound-tm.simps tmf-polys.simps*

lemma *tm-floatarith-eq-Some-num-params*:
 $\text{tm-floatarith prec ord a b f} = \text{Some } tf \implies \text{num-params } (\text{tm-poly } tf) \leq 1$
by (*auto simp: tm-floatarith.simps split-beta' Let-def those-eq-Some-iff num-params-tmf-polys1*)

lemma *compute-tm-by-comp-range*:
assumes *max-Var-floatarith* $f \leq 1$
assumes *a*: *a* *all-subset* *I*
assumes *tx-range*: $x \in_i \text{range-tm } e \text{ } tg$
assumes *t-def*: $\text{compute-tm-by-comp prec ord I a f } (\text{Some } tg) \text{ } c = \text{Some } t$
assumes *f-deriv*:
 $\bigwedge x. x \in_r \text{compute-bound-tm prec I a tg} \implies c (\text{compute-bound-tm prec I a tg})$
 $\implies \text{isDERIV } 0 \text{ } f [x]$
assumes *params*: $\text{num-params } (\text{tm-poly } tg) \leq \text{length } I$
and *dev*: *develops-at-within* *e* *a* *I*
shows *interpret-floatarith* $f [x] \in_i \text{range-tm } e \text{ } t$
proof–
from *t-def*[*simplified, simplified Let-def*]
obtain *tf*
where *t1-def*: $\text{tm-floatarith prec ord } [\text{compute-bound-tm prec I } (a) \text{ } tg]$
 $[\text{mid } (\text{compute-bound-tm prec a a } tg)] \text{ } f =$
 $\text{Some } tf$
and *t-decomp*: $t = \text{tm-comp prec ord I a } (\text{mid } (\text{compute-bound-tm prec a a } tg)) \text{ } tf \text{ } tg$
and *c-true*: $c (\text{compute-bound-tm prec I a } tg)$
by (*auto simp: split-beta' Let-def split: if-splits*)
have *a1*: $\text{mid } (\text{compute-bound-tm prec a a } tg) \in_r (\text{compute-bound-tm prec I a } tg)$
apply (*rule rev-subsetD[OF mid-in-real-interval]*)
apply (*rule set-of-real-interval-mono*)
apply (*rule compute-bound-tm-mono*)

```

using params a
by (auto simp add: set-of-eq elim!: range-tmD)
from  $\langle \text{max-Var-floatarith } f \leq 1 \rangle$ 
have [simp]:  $\bigwedge x. 0 \leq \text{length } x \implies (\lambda x. \text{interpret-floatarith } f [x ! 0]) x =$ 
interpret-floatarith f x
by (induction f, simp-all)

```

```

let ?mid = real-of-float (mid (compute-bound-tm prec a a tg))
have 1: interpret-floatarith f [x] ∈i range-tm (λ-. x - ?mid) tf
apply (rule tm-floatarith[OF t1-def, simplified])
subgoal
apply (rule rev-subsetD)
apply (rule mid-in-real-interval)
apply (rule set-of-real-interval-mono)
apply (rule compute-bound-tm-mono)
using assms
by (auto)
subgoal
by (rule compute-bound-tm-correct assms)+
subgoal by (auto intro!: assms c-true)
subgoal by (auto simp: )
done

```

```

show ?thesis
unfolding t-decomp
apply (rule tm-comp-range)
apply (rule 1)
using tm-floatarith-eq-Some-num-params[OF t1-def]
by (auto simp: intro!: tm-sub-range assms )

```

qed

lemmas [*simp del*] = *compute-tm-by-comp.simps*

```

lemma compute-tm-by-comp-num-params-le:
assumes compute-tm-by-comp prec ord I a f (Some t0) i = Some t
assumes  $1 \leq X \text{ num-params } (tm\text{-poly } t0) \leq X$ 
shows  $\text{num-params } (tm\text{-poly } t) \leq X$ 
using assms
by (auto simp: compute-tm-by-comp.simps Let-def intro!: num-params-tm-comp-le
dest!: tm-floatarith-eq-Some-num-params
split: option.splits if-splits)

```

```

lemma compute-tm-by-comp-eq-Some-iff: compute-tm-by-comp prec ord I a f t0 i
= Some t  $\longleftrightarrow$ 
 $(\exists z x2. t0 = \text{Some } x2 \wedge$ 
tm-floatarith prec ord [compute-bound-tm prec I a x2]
[mid (compute-bound-tm prec a a x2)] f =
Some z
 $\wedge \text{tm-comp prec ord I a}$ 
 $(\text{mid } (compute-bound-tm \text{ prec } a a x2)) z x2 = t$ 

```

```

     $\wedge i$  (compute-bound-tm prec I a x2))
  by (auto simp: compute-tm-by-comp.simps Let-def split: option.splits)

lemma num-params-approx-tm:
  assumes approx-tm prec ord I a f env = Some t
  assumes  $\bigwedge tm. tm \in \text{set env} \implies \text{num-params (tm-poly tm)} \leq \text{length I}$ 
  shows  $\text{num-params (tm-poly t)} \leq \text{length I}$ 
  using assms
proof (induction f arbitrary: t)
  case (Add f1 f2)
  then show ?case by (auto split: option.splits intro!: num-params-tm-add-le)
next
  case (Minus f)
  then show ?case by (auto split: option.splits)
next
  case (Mult f1 f2)
  then show ?case by (auto split: option.splits intro!: num-params-tm-mul-le)
next
  case (Inverse f)
  then show ?case
    by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
        intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
  case (Cos f)
  then show ?case
    by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
        intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
  case (Arctan f)
  then show ?case
    by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
        intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
  case (Abs f)
  then show ?case
    by (auto simp: tm-abs.simps Let-def intro!: num-params-tm-union-le)
next
  case (Max f1 f2)
  then show ?case
    by (auto simp: tm-max.simps Let-def intro!: num-params-tm-union-le split:
        option.splits)
next
  case (Min f1 f2)
  then show ?case
    by (auto simp: tm-min.simps Let-def intro!: num-params-tm-union-le split:
        option.splits)
next
  case Pi
  then show ?case

```

```

    by (auto)
next
case (Sqrt f)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Exp f)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Powr f1 f2)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Ln f)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Power f x2a)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-pow-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Floor f)
then show ?case
  by (auto split: option.splits simp: Let-def compute-tm-by-comp-eq-Some-iff
      intro!: num-params-tm-comp-le dest!: tm-floatarith-eq-Some-num-params)
next
case (Var x)
then show ?case by (auto split: if-splits)
next
case (Num x)
then show ?case by auto
qed

```

lemma *in-interval-realI*: $a \in_i I$ if $a \in_r I$ using that by (auto simp: set-of-eq)

lemma *all-subset-all-inI*: *map interval-of a all-subset I* if *a all-in I*
 using that by (auto simp: in-interval-realI)

lemma *compute-tm-by-comp-None*: *compute-tm-by-comp p ord I a x None k = None*
 by (rule ccontr) (auto simp: compute-tm-by-comp-eq-Some-iff)

lemma *approx-tm-num-Vars-None*:

assumes $\text{max-Var-floatarith } f > \text{length } \text{env}$
shows $\text{approx-tm } p \text{ ord } I \text{ a } f \text{ env} = \text{None}$
using assms
by ($\text{induction } f$) ($\text{auto split: option.splits if-splits simp: max-def compute-tm-by-comp-None}$)

lemma $\text{approx-tm-num-Vars}$:
assumes $\text{approx-tm } \text{prec } \text{ord } I \text{ a } f \text{ env} = \text{Some } t$
shows $\text{max-Var-floatarith } f \leq \text{length } \text{env}$
apply ($\text{rule } \text{ccontr}$)
using $\text{approx-tm-num-Vars-None}[of \text{env } f \text{ prec } \text{ord } I \text{ a}] \text{ assms}$
by auto

definition $\text{range-tms } e \text{ xs} = \text{map } (\text{range-tm } e) \text{ xs}$

lemma approx-tm-range :
assumes $a: a \text{ all-subset } I$
assumes $t\text{-def}: \text{approx-tm } \text{prec } \text{ord } I \text{ a } f \text{ env} = \text{Some } t$
assumes $\text{allin}: \text{xs all-in}_i \text{ range-tms } e \text{ env}$
assumes $\text{devs}: \text{develops-at-within } e \text{ a } I$
assumes $\text{env}: \bigwedge \text{tm. } \text{tm} \in \text{set } \text{env} \implies \text{num-params } (\text{tm-poly } \text{tm}) \leq \text{length } I$
shows $\text{interpret-floatarith } f \text{ xs} \in_i \text{range-tm } e \text{ t}$
using $t\text{-def}$

proof($\text{induct } f \text{ arbitrary: } t$)
case ($\text{Var } n$)
thus $?case$
using $\text{assms}(2) \text{ allin } \text{approx-tm-num-Vars}[of \text{prec } \text{ord } I \text{ a } \text{Var } n \text{ env } t]$
by ($\text{auto simp: all-in-i-def range-tms-def}$)

next
case ($\text{Num } c$)
thus $?case$
using $\text{assms}(2) \text{ by } (\text{auto simp add: assms}(3))$

next
case ($\text{Add } l \text{ r } t$)
obtain $t1$ **where** $t1\text{-def}: \text{approx-tm } \text{prec } \text{ord } I \text{ a } l \text{ env} = \text{Some } t1$
by ($\text{metis } (\text{no-types, lifting}) \text{Add}(3) \text{approx-tm.simps}(3) \text{option.case-eq-if option.collapse prod.case}$)
obtain $t2$ **where** $t2\text{-def}: \text{approx-tm } \text{prec } \text{ord } I \text{ a } r \text{ env} = \text{Some } t2$
by ($\text{smt } \text{Add}(3) \text{approx-tm.simps}(3) \text{option.case-eq-if option.collapse prod.case}$)
have $t\text{-def}: t = \text{tm-add } t1 \text{ t2}$
using $\text{Add}(3) \text{ t1-def } t2\text{-def}$
by ($\text{metis } \text{approx-tm.simps}(3) \text{option.case}(2) \text{option.inject prod.case}$)

have [simp]: $\text{interpret-floatarith } (\text{floatarith.Add } l \text{ r}) = \text{interpret-floatarith } l + \text{interpret-floatarith } r$
by auto
show $?case$
using Add
by ($\text{auto simp: } t\text{-def intro!: tm-add-range Add } t1\text{-def } t2\text{-def}$)
next

```

case (Minus f t)
have [simp]: interpret-floatarith (Minus f) = -interpret-floatarith f
  by auto

obtain t1 where t1-def: approx-tm prec ord I a f env = Some t1
  by (metis Minus.premis(1) approx-tm.simps(4) map-option-eq-Some)
have t-def: t = tm-neg t1
  by (metis Minus.premis(1) approx-tm.simps(4) option.inject option.simps(9)
t1-def)

show ?case
  by (auto simp: t-def intro!: tm-neg-range t1-def Minus)
next
case (Mult l r t)
obtain t1 where t1-def: approx-tm prec ord I a l env = Some t1
  by (metis (no-types, lifting) Mult(3) approx-tm.simps(5) option.case-eq-if option.collapse prod.case)
obtain t2 where t2-def: approx-tm prec ord I a r env = Some t2
  by (smt Mult(3) approx-tm.simps(5) option.case-eq-if option.collapse prod.case)
have t-def: t = tm-mul prec ord I a t1 t2
  using Mult(3) t1-def t2-def
  by (metis approx-tm.simps(5) option.case(2) option.inject prod.case)

have [simp]: interpret-floatarith (floatarith.Mult l r) = interpret-floatarith l * interpret-floatarith r
  by auto
show ?case
  using env Mult
  by (auto simp add: t-def intro!: tm-mul-range Mult t1-def t2-def devs
num-params-approx-tm[OF t1-def] num-params-approx-tm[OF t2-def])
next
case (Power f k t)
from Power(2)
obtain tm-f where tm-f-def: approx-tm prec ord I a f env = Some tm-f
  apply(simp) by metis
have t-decomp: t = tm-pow prec ord I a tm-f k
  using Power(2) by (simp add: tm-f-def)
show ?case
  using env Power
  by (auto simp add: t-def tm-f-def intro!: tm-pow-range Power devs
num-params-approx-tm[OF tm-f-def])
next
case (Inverse f t)
from Inverse obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have safe:  $\bigwedge x. x \in_r$  (compute-bound-tm prec I a tf)  $\implies$ 
0 < lower (compute-bound-tm prec I a tf)  $\vee$  upper (compute-bound-tm prec
I a tf) < 0  $\implies$ 
  isDERIV 0 (Inverse (Var 0)) [x]

```

```

    by (simp add: set-of-eq , safe, simp-all)
  have np: num-params (tm-poly tf) ≤ length I
    using tf-def
    apply (rule num-params-approx-tm)
    using assms by auto
  from compute-tm-by-comp-range[OF - a
    Inverse(1)[OF tf-def]
    Inverse(2)[unfolded approx-tm.simps tf-def]
    safe np devs]
  show ?case by simp
next
case hyps: (Cos f t)
from hyps obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have np: num-params (tm-poly tf) ≤ length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from compute-tm-by-comp-range[OF - a
  hyps(1)[OF tf-def]
  hyps(2)[unfolded approx-tm.simps tf-def]
  - np devs]
show ?case by simp
next
case hyps: (Arctan f t)
from hyps obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have np: num-params (tm-poly tf) ≤ length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from compute-tm-by-comp-range[OF - a
  hyps(1)[OF tf-def]
  hyps(2)[unfolded approx-tm.simps tf-def]
  - np devs]
show ?case by simp
next
case hyps: (Exp f t)
from hyps obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have np: num-params (tm-poly tf) ≤ length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from compute-tm-by-comp-range[OF - a
  hyps(1)[OF tf-def]
  hyps(2)[unfolded approx-tm.simps tf-def]
  - np devs]
show ?case by simp

```

```

next
case hyps: (Ln f t)
from hyps obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have safe:  $\bigwedge x. x \in_r \text{compute-bound-tm prec I a tf} \implies$ 
   $0 < \text{lower} (\text{compute-bound-tm prec I a tf}) \implies \text{isDERIV } 0 (\text{Ln} (\text{Var } 0)) [x]$ 
  by (auto simp: set-of-eq)
have np: num-params (tm-poly tf)  $\leq$  length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from compute-tm-by-comp-range[OF - a
  hyps(1)[OF tf-def]
  hyps(2)[unfolded approx-tm.simps tf-def]
  safe np devs]
show ?case by simp
next
case hyps: (Sqrt f t)
from hyps obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  by (auto simp: compute-tm-by-comp-eq-Some-iff)
have safe:  $\bigwedge x. x \in_r \text{compute-bound-tm prec I a tf} \implies$ 
   $0 < \text{lower} (\text{compute-bound-tm prec I a tf}) \implies \text{isDERIV } 0 (\text{Sqrt} (\text{Var } 0)) [x]$ 
  by (auto simp: set-of-eq)
have np: num-params (tm-poly tf)  $\leq$  length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from compute-tm-by-comp-range[OF - a
  hyps(1)[OF tf-def]
  hyps(2)[unfolded approx-tm.simps tf-def]
  safe np devs]
show ?case by simp
next
case (Pi t)
hence t = tm-pi prec by simp
then show ?case
  by (auto intro!: range-tm-tm-pi)
next
case (Abs f t)
from Abs(2) obtain tf where tf-def: approx-tm prec ord I a f env = Some tf
  and t-def: t = tm-abs prec I a tf
  by (metis (no-types, lifting) approx-tm.simps(14) map-option-eq-Some)
have np: num-params (tm-poly tf)  $\leq$  length I
  using tf-def
  apply (rule num-params-approx-tm)
  using assms by auto
from tm-abs-range[OF Abs(1)[OF tf-def] np devs]
show ?case
  unfolding t-def interpret-floatarith.simps(9) comp-def

```

```

    by assumption
next
case hyps: (Min l r t)
from hyps(3)
obtain t1 t2 where t-decomp: t = tm-min prec I a t1 t2
  and t1-def: Some t1 = approx-tm prec ord I a l env
  and t2-def: approx-tm prec ord I a r env = Some t2
  by (smt approx-tm.simps(15) option.case-eq-if option.collapse option.distinct(2)
option.inject split-conv)
from this(2,3) hyps(1-3)
have t1-range: (interpret-floatarith l xs) ∈i range-tm e t1
  and t2-range: (interpret-floatarith r xs) ∈i range-tm e t2
by auto

have [simp]: interpret-floatarith (floatarith.Min l r) = (λvs. min (interpret-floatarith
l vs) (interpret-floatarith r vs))
  by auto
have np1: num-params (tm-poly t1) ≤ length I
  using t1-def[symmetric]
  apply (rule num-params-approx-tm)
  using assms by auto
have np2: num-params (tm-poly t2) ≤ length I
  using t2-def
  apply (rule num-params-approx-tm)
  using assms by auto
show ?case
  unfolding t-decomp(1)
  apply(simp del: tm-min.simps)
  using t1-range t2-range np1 np2
  by (auto intro!: tm-min-range devs)
next
case hyps: (Max l r t)
from hyps(3)
obtain t1 t2 where t-decomp: t = tm-max prec I a t1 t2
  and t1-def: Some t1 = approx-tm prec ord I a l env
  and t2-def: approx-tm prec ord I a r env = Some t2
  by (smt approx-tm.simps(16) option.case-eq-if option.collapse option.distinct(2)
option.inject split-conv)
from this(2,3) hyps(1-3)
have t1-range: (interpret-floatarith l xs) ∈i range-tm e t1
  and t2-range: (interpret-floatarith r xs) ∈i range-tm e t2
by auto

have [simp]: interpret-floatarith (floatarith.Min l r) = (λvs. min (interpret-floatarith
l vs) (interpret-floatarith r vs))
  by auto
have np1: num-params (tm-poly t1) ≤ length I
  using t1-def[symmetric]
  apply (rule num-params-approx-tm)

```

```

using assms by auto
have np2: num-params (tm-poly t2) ≤ length I
using t2-def
apply (rule num-params-approx-tm)
using assms by auto
show ?case
unfolding t-decomp(1)
apply(simp del: tm-min.simps)
using t1-range t2-range np1 np2
by (auto intro!: tm-max-range devs)
qed simp-all

```

Evaluate expression with Taylor models in environment.

5.7 Computing bounds for floatarith expressions

TODO: compare parametrization of input vs. uncertainty for input...

definition *tm-of-ivl-par* *n ivl* = *TaylorModel* (*CN* (*C* ((*upper ivl* + *lower ivl*)**Float* 1 (-1))) *n*
(*C* ((*upper ivl* - *lower ivl*)**Float* 1 (-1)))) 0
— track uncertainty in parameter *n*, which is to be interpreted over standardized domain $[-1, 1]$.

value *tm-of-ivl-par* 3 (*Ivl* (-1) 1)

definition *tms-of-ivls* *ivls* = *map* ($\lambda(i, ivl). tm-of-ivl-par\ i\ ivl$) (*zip* [0..*length* *ivls*] *ivls*)

value *tms-of-ivls* [*Ivl* 1 2, *Ivl* 4 5]

primrec *approx-slp'*::*nat* ⇒ *nat* ⇒ *float interval list* ⇒ *float interval list* ⇒ *slp* ⇒ *taylor-model list* ⇒ *taylor-model list option*

where

```

approx-slp' p ord I a [] xs = Some xs
| approx-slp' p ord I a (ea # eas) xs =
  do {
    r ← approx-tm p ord I a ea xs;
    approx-slp' p ord I a eas (r#xs)
  }

```

lemma *mem-range-tms-Cons-iff*[*simp*]: $x\#xs\ all-in_i\ range-tms\ e\ (X\#XS) \longleftrightarrow x \in_i\ range-tm\ e\ X \wedge xs\ all-in_i\ range-tms\ e\ XS$

by (*auto simp: range-tms-def all-in-i-def nth-Cons split: nat.splits*)

lemma *approx-slp'-range*:

assumes *i*: *i* *all-subset* *I*

assumes *dev*: *develops-at-within* *e i I*

assumes *vs*: *vs* *all-in_i* *range-tms* *e VS* ($\bigwedge tm. tm \in set\ VS \implies num-params\ (tm-poly\ tm) \leq length\ I$)

assumes *appr*: *approx-slp' p ord I i ra VS = Some X*
shows *interpret-slp ra vs all-in_i range-tms e X*
using *appr vs*
proof (*induction ra arbitrary: X vs VS*)
case (*Cons ra ras*)
from *Cons.prem*s
obtain *a where a: approx-tm p ord I i ra VS = Some a*
and *r: approx-slp' p ord I i ras (a # VS) = Some X*
by (*auto simp: bind-eq-Some-conv*)
from *approx-tm-range[OF i a Cons.prem*s(2) *dev Cons.prem*s(3)]
have *interpret-floatarith ra vs ∈_i range-tm e a*
by *auto*
then have 1: *interpret-floatarith ra vs#vs all-in_i range-tms e (a#VS)*
using *Cons.prem*s(2)
by *auto*
show ?*case*
apply *auto*
apply (*rule Cons.IH*)
apply (*rule r*)
apply (*rule 1*)
apply *auto*
apply (*rule num-params-approx-tm*)
apply (*rule a*)
by (*auto intro!: Cons.prem*s)
qed *auto*

definition *approx-slp::nat ⇒ nat ⇒ nat ⇒ slp ⇒ taylor-model list ⇒ taylor-model list option*

where
approx-slp p ord d slp tms =
map-option (take d)
(approx-slp' p ord (replicate (length tms) (Ivl (-1) 1)) (replicate (length tms)
0) slp tms)

lemma *length-range-tms[simp]: length (range-tms e VS) = length VS*
by (*auto simp: range-tms-def*)

lemma *set-of-Ivl: set-of (Ivl a b) = {a .. b} if a ≤ b*
by (*auto simp: set-of-eq that min-def*)

lemma *set-of-zero[simp]: set-of 0 = {0::'a::ordered-comm-monoid-add}*
by (*auto simp: set-of-eq*)

theorem *approx-slp-range-tms:*
assumes *approx-slp p ord d slp VS = Some X*
assumes *slp-def: slp = slp-of-fas fas*
assumes *d-def: d = length fas*
assumes *e: e ∈ UNIV → {-1 .. 1}*
assumes *vs: vs all-in_i range-tms e VS*

```

assumes lens:  $\bigwedge tm. tm \in set\ VS \implies num\ params\ (tm\ poly\ tm) \leq length\ vs$ 
shows interpret-floatariths fas vs all-ini range-tms e X
proof –
  have interpret-floatariths fas vs = take d (interpret-slp slp vs)
    by (simp add: slp-of-fas slp-def d-def)
  also
  have lvs: length vs = length VS
    using assms by (auto simp: all-in-i-def)
  define i where i = replicate (length vs) (0::float interval)
  define I where I = replicate (length vs) (Ivl (-1) 1::float interval)
  from assms obtain XS where
    XS: approx-slp' p ord I i slp VS = Some XS
    and X: take d XS = X
    by (auto simp: approx-slp-def lvs i-def I-def)
  have iI: i all-subset I
    by (auto simp: i-def I-def set-of-Ivl)
  have dev: develops-at-within e i I
    using e
    by (auto simp: develops-at-within-def i-def I-def set-of-Ivl real-interval-Ivl
      real-interval-minus real-interval-zero set-of-eq Pi-iff min-def)
  from approx-slp'-range[OF iI dev vs - XS] lens
  have interpret-slp slp vs all-ini range-tms e XS by (auto simp: I-def)
  then have take d (interpret-slp slp vs) all-ini range-tms e (take d XS)
    by (auto simp: all-in-i-def range-tms-def)
  also note (take d XS = X)
  finally show ?thesis .
qed

end

end
theory Experiments
  imports Taylor-Models
    Affine-Arithmetic.Affine-Arithmetic
begin

instantiation interval::({show, preorder}) show begin

context includes interval.lifting begin
lift-definition shows-prec-interval::
  nat  $\Rightarrow$  'a interval  $\Rightarrow$  char list  $\Rightarrow$  char list
  is  $\lambda p\ ivl\ s. (shows\ string\ "Interval" o shows\ ivl)\ s$  .

lift-definition shows-list-interval::
  'a interval list  $\Rightarrow$  char list  $\Rightarrow$  char list
  is  $\lambda ivls\ s. shows\ list\ ivls\ s$  .

instance

```



```

apply standard
subgoal by transfer (auto simp: show-law-simps)
subgoal by transfer (auto simp: show-law-simps)
done
end

```

end

definition *split-largest-interval* :: *float interval list* \Rightarrow *float interval list* \times *float interval list* **where**

```

split-largest-interval xs = (case sort-key (uminus o snd) (zip [0..<length xs] (map
  (\x. upper x - lower x) xs)) of Nil  $\Rightarrow$  ([], []))
  | (i, -)#-  $\Rightarrow$  let x = xs! i in (xs[i:=Ivl (lower x) ((upper x + lower x)*Float 1
  (-1))],
    xs[i:=Ivl ((upper x + lower x)*Float 1 (-1)) (upper x)]))

```

definition *Inf-tm* *p* *params* *tm* =

```

lower (compute-bound-tm p (replicate params (Ivl (-1) (1))) (replicate params
(Ivl 0 0)) tm)

```

primrec *prove-pos*::*bool* \Rightarrow *nat* \Rightarrow *nat* \Rightarrow *nat* \Rightarrow

```

(nat  $\Rightarrow$  nat  $\Rightarrow$  taylor-model list  $\Rightarrow$  taylor-model option)  $\Rightarrow$  float interval list list
 $\Rightarrow$  bool where

```

```

prove-pos prnt 0 p ord F X = (let - = if prnt then print (STR "# depth limit
exceeded"  $\square$ ) else () in False)

```

```

| prove-pos prnt (Suc i) p ord F XXS =

```

```

(case XXS of []  $\Rightarrow$  True | (X#XS)  $\Rightarrow$ 

```

```

let

```

```

  params = length X;

```

```

  R = F p ord (tms-of-ivls X);

```

```

  - = if prnt then print (String.implode ((shows "# " o shows (map (\i vl.
(lower ivl, upper ivl) X)) "  $\square$ ")) else ()

```

```

  in

```

```

  if R  $\neq$  None  $\wedge$  0 < Inf-tm p params (the R)

```

```

  then let - = if prnt then print (STR "# Success"  $\square$ ) else () in prove-pos prnt
i p ord F XS

```

```

  else let - = if prnt then print (String.implode ((shows "# Split (" o shows
((map-option (Inf-tm p params)) R) o shows "'") "  $\square$ ")) else () in case split-largest-interval
X of (a, b)  $\Rightarrow$ 

```

```

    prove-pos prnt i p ord F (a#b#XS)

```

hide-const (open) *prove-pos-slp*

definition *prove-pos-slp* *prnt* *prec* ord *fa* *i* *xs* = (let *slp* = *slp-of-fas* [*fa*] in *prove-pos*
prnt *i* *prec* ord (λ *p* ord *xs*).

```

  case approx-slp prec ord 1 slp xs of None  $\Rightarrow$  None | Some [x]  $\Rightarrow$  Some x | Some
-  $\Rightarrow$  None) xs)

```

experiment begin

unbundle *floatarith-notation*

abbreviation *schwefel* \equiv

$$(5.8806 / 10 \wedge 10) + (\text{Var } 0 - (\text{Var } 1) \wedge_e 2) \wedge_e 2 + (\text{Var } 1 - 1) \wedge_e 2 + (\text{Var } 0 - (\text{Var } 2) \wedge_e 2) \wedge_e 2 + (\text{Var } 2 - 1) \wedge_e 2$$

lemma *prove-pos-slp True 30 0 schwefel 100000 [replicate 3 (Ivl (-10) 10)]*
by *eval*

abbreviation *delta6* \equiv (*Var* 0 * *Var* 3 * (-*Var* 0 + *Var* 1 + *Var* 2 - *Var* 3 + *Var* 4 + *Var* 5) +

$$\begin{aligned} & \text{Var } 1 * \text{Var } 4 * (\text{Var } 0 - \text{Var } 1 + \text{Var } 2 + \text{Var } 3 - \text{Var } 4 + \text{Var } 5) + \\ & \text{Var } 2 * \text{Var } 5 * (\text{Var } 0 + \text{Var } 1 - \text{Var } 2 + \text{Var } 3 + \text{Var } 4 - \text{Var } 5) + \\ & - \text{Var } 1 * \text{Var } 2 * \text{Var } 3 \\ & - \text{Var } 0 * \text{Var } 2 * \text{Var } 4 \\ & - \text{Var } 0 * \text{Var } 1 * \text{Var } 5 \\ & - \text{Var } 3 * \text{Var } 4 * \text{Var } 5) \end{aligned}$$

lemma *prove-pos-slp True 30 3 delta6 10000 [replicate 6 (Ivl 4 (Float 104045 (-14)))]*
by *eval*

abbreviation *caprasse* \equiv (3.1801 + - *Var* 0 * (*Var* 2) \wedge_e 3 + 4 * *Var* 1 * (*Var* 2) \wedge_e 2 * *Var* 3 +
4 * *Var* 0 * *Var* 2 * (*Var* 3) \wedge_e 2 + 2 * *Var* 1 * (*Var* 3) \wedge_e 3 + 4 * *Var* 0 * *Var* 2 + 4 * (*Var* 2) \wedge_e 2 - 10 * *Var* 1 * *Var* 3 +
-10 * (*Var* 3) \wedge_e 2 + 2)

lemma *prove-pos-slp True 30 2 caprasse 10000 [replicate 4 (Ivl (-Float 1 (-1)) (Float 1 (-1)))]*
by *eval*

abbreviation *magnetism* \equiv

$$\begin{aligned} & 0.25001 + (\text{Var } 0) \wedge_e 2 + 2 * (\text{Var } 1) \wedge_e 2 + 2 * (\text{Var } 2) \wedge_e 2 + 2 * (\text{Var } 3) \wedge_e 2 + \\ & 2 * (\text{Var } 4) \wedge_e 2 + 2 * (\text{Var } 5) \wedge_e 2 + \\ & 2 * (\text{Var } 6) \wedge_e 2 - \text{Var } 0 \end{aligned}$$

end

end