

Hyperdual Numbers and Forward Differentiation

Filip Smola, Jacques Fleuriot

March 17, 2025

Abstract

Hyperdual numbers are ones with a real component and a number of infinitesimal components, usually written as $a_0 + a_1 \cdot \epsilon_1 + a_2 \cdot \epsilon_2 + a_3 \cdot \epsilon_1 \epsilon_2$. They have been proposed by Fike and Alonso [1] in an approach to automatic differentiation.

In this entry we formalise hyperdual numbers and their application to forward differentiation. We show them to be an instance of multiple algebraic structures and then, along with facts about twice-differentiability, we define what we call the hyperdual extensions of functions on real-normed fields. This extension formally represents the proposed way that the first and second derivatives of a function can be automatically calculated. We demonstrate it on the standard logistic function $f(x) = \frac{1}{1+e^{-x}}$ and also reproduce the example analytic function $f(x) = \frac{e^x}{\sqrt{\sin(x)^3 + \cos(x)^3}}$ used for demonstration by Fike and Alonso.

Contents

1	Hyperdual Numbers	3
1.1	Addition and Subtraction	3
1.2	Multiplication and Scaling	5
1.2.1	Properties of Zero Divisors	8
1.2.2	Multiplication Cancellation	9
1.3	Multiplicative Inverse and Division	10
1.4	Real Scaling, Real Vector and Real Algebra	15
1.5	Real Inner Product and Real-Normed Vector Space	16
1.6	Euclidean Space	17
1.7	Bounded Linear Projections	20
1.8	Convergence	20
1.9	Derivatives	21
2	Twice Field Differentiable	22
2.1	Differentiability on a Set	22
2.2	Twice Differentiability	22

2.2.1	Constant	23
2.2.2	Identity	23
2.2.3	Constant Multiplication	23
2.2.4	Real Scaling	23
2.2.5	Addition	24
2.2.6	Linear Function	25
2.2.7	Multiplication	25
2.2.8	Sine and Cosine	25
2.2.9	Exponential	26
2.2.10	Square Root	26
2.2.11	Natural Power	27
2.2.12	Inverse	28
2.2.13	Polynomial	28
3	Hyperdual Extension of Functions	29
3.0.1	Convenience Interface	30
3.0.2	Composition	31
3.1	Concrete Instances	31
3.1.1	Constant	31
3.1.2	Identity	32
3.1.3	Component Scalar Multiplication	32
3.1.4	Real Scalar Multiplication	32
3.1.5	Addition	32
3.1.6	Component Linear Function	33
3.1.7	Real Linear Function	33
3.1.8	Multiplication	33
3.1.9	Sine and Cosine	33
3.1.10	Exponential	35
3.1.11	Square Root	36
3.1.12	Natural Power	37
3.1.13	Inverse	38
3.1.14	Division	39
3.1.15	Polynomial	39
3.2	Logistic Function	40
3.3	Analytic Test Function	41

```

theory Hyperdual
imports HOL-Analysis.Analysis
begin

```

1 Hyperdual Numbers

Let τ be some type. Second-order hyperdual numbers over τ take the form $a_1 + a_2\varepsilon_1 + a_3\varepsilon_2 + a_4\varepsilon_1\varepsilon_2$ where all $a_i :: \tau$, and ε_1 and ε_2 are non-zero but nilpotent infinitesimals: $\varepsilon_1^2 = \varepsilon_2^2 = (\varepsilon_1\varepsilon_2)^2 = 0$.

We define second-order hyperdual numbers as a coinductive data type with four components: the base component, two first-order hyperdual components and one second-order hyperdual component.

```
codatatype 'a hyperdual = Hyperdual (Base: 'a) (Eps1: 'a) (Eps2: 'a) (Eps12: 'a)
```

Two hyperduals are equal iff all their components are equal.

```
lemma hyperdual-eq-iff [iff]:
```

```
x = y  $\longleftrightarrow$  ((Base x = Base y)  $\wedge$  (Eps1 x = Eps1 y)  $\wedge$  (Eps2 x = Eps2 y)  $\wedge$  (Eps12 x = Eps12 y))  
(proof)
```

```
lemma hyperdual-eqI:
```

```
assumes Base x = Base y  
and Eps1 x = Eps1 y  
and Eps2 x = Eps2 y  
and Eps12 x = Eps12 y  
shows x = y  
(proof)
```

The embedding from the component type to hyperduals requires the component type to have a zero element.

```
definition of-comp :: ('a :: zero)  $\Rightarrow$  'a hyperdual  
where of-comp a = Hyperdual a 0 0 0
```

```
lemma of-comp-simps [simp]:
```

```
Base (of-comp a) = a  
Eps1 (of-comp a) = 0  
Eps2 (of-comp a) = 0  
Eps12 (of-comp a) = 0  
(proof)
```

1.1 Addition and Subtraction

We define hyperdual addition, subtraction and unary minus pointwise, and zero by embedding.

```
instantiation hyperdual :: (plus) plus  
begin
```

```
primcorec plus-hyperdual
```

```
where
```

```
Base (x + y) = Base x + Base y
```

```

|  $Eps1 (x + y) = Eps1 x + Eps1 y$ 
|  $Eps2 (x + y) = Eps2 x + Eps2 y$ 
|  $Eps12 (x + y) = Eps12 x + Eps12 y$ 

```

```

instance ⟨proof⟩
end

```

```

instantiation hyperdual :: (zero) zero
begin

```

```

definition zero-hyperdual
where 0 = of-comp 0

```

```

instance ⟨proof⟩
end

```

```

lemma zero-hyperdual-simps [simp]:

```

```

Base 0 = 0
Eps1 0 = 0
Eps2 0 = 0
Eps12 0 = 0
Hyperdual 0 0 0 0 = 0
⟨proof⟩

```

```

instantiation hyperdual :: (uminus) uminus
begin

```

```

primcorec uminus-hyperdual
where

```

```

Base (-x) = - Base x
| Eps1 (-x) = - Eps1 x
| Eps2 (-x) = - Eps2 x
| Eps12 (-x) = - Eps12 x

```

```

instance ⟨proof⟩
end

```

```

instantiation hyperdual :: (minus) minus
begin

```

```

primcorec minus-hyperdual
where

```

```

Base (x - y) = Base x - Base y
| Eps1 (x - y) = Eps1 x - Eps1 y
| Eps2 (x - y) = Eps2 x - Eps2 y
| Eps12 (x - y) = Eps12 x - Eps12 y

```

```

instance ⟨proof⟩
end

If the components form a commutative group under addition then so do the
hyperduals.

instance hyperdual :: (semigroup-add) semigroup-add
⟨proof⟩

instance hyperdual :: (monoid-add) monoid-add
⟨proof⟩

instance hyperdual :: (ab-semigroup-add) ab-semigroup-add
⟨proof⟩

instance hyperdual :: (comm-monoid-add) comm-monoid-add
⟨proof⟩

instance hyperdual :: (group-add) group-add
⟨proof⟩

instance hyperdual :: (ab-group-add) ab-group-add
⟨proof⟩

lemma of-comp-add:
  fixes a b :: 'a :: monoid-add
  shows of-comp (a + b) = of-comp a + of-comp b
⟨proof⟩

lemma
  fixes a b :: 'a :: group-add
  shows of-comp-minus: of-comp (- a) = - of-comp a
    and of-comp-diff: of-comp (a - b) = of-comp a - of-comp b
⟨proof⟩

```

1.2 Multiplication and Scaling

Multiplication of hyperduals is defined by distributing the expressions and using the nilpotence of ε_1 and ε_2 , resulting in the definition used here. The hyperdual one is again defined by embedding.

```

instantiation hyperdual :: ({one, zero}) one
begin

definition one-hyperdual
  where 1 = of-comp 1

instance ⟨proof⟩
end

```

```

lemma one-hyperdual-simps [simp]:
  Base 1 = 1
  Eps1 1 = 0
  Eps2 1 = 0
  Eps12 1 = 0
  Hyperdual 1 0 0 0 = 1
  ⟨proof⟩

instantiation hyperdual :: ({times, plus}) times
begin

primcorec times-hyperdual
  where
    Base (x * y) = Base x * Base y
    | Eps1 (x * y) = (Base x * Eps1 y) + (Eps1 x * Base y)
    | Eps2 (x * y) = (Base x * Eps2 y) + (Eps2 x * Base y)
    | Eps12 (x * y) = (Base x * Eps12 y) + (Eps1 x * Eps2 y) + (Eps2 x * Eps1 y)
    + (Eps12 x * Base y)

  instance ⟨proof⟩
end

If the components form a ring then so do the hyperduals.

instance hyperdual :: (semiring) semiring
  ⟨proof⟩

instance hyperdual :: ({monoid-add, mult-zero}) mult-zero
  ⟨proof⟩

instance hyperdual :: (ring) ring
  ⟨proof⟩

instance hyperdual :: (comm-ring) comm-ring
  ⟨proof⟩

instance hyperdual :: (ring-1) ring-1
  ⟨proof⟩

instance hyperdual :: (comm-ring-1) comm-ring-1
  ⟨proof⟩

lemma of-comp-times:
  fixes a b :: 'a :: semiring-0
  shows of-comp (a * b) = of-comp a * of-comp b
  ⟨proof⟩

```

Hyperdual scaling is multiplying each component by a factor from the com-

ponent type.

```

primcorec scaleH :: ('a :: times)  $\Rightarrow$  'a hyperdual  $\Rightarrow$  'a hyperdual (infixr  $\langle *_H \rangle$ 
75)
where
  Base ( $f *_H x$ ) =  $f * \text{Base } x$ 
  | Eps1 ( $f *_H x$ ) =  $f * \text{Eps1 } x$ 
  | Eps2 ( $f *_H x$ ) =  $f * \text{Eps2 } x$ 
  | Eps12 ( $f *_H x$ ) =  $f * \text{Eps12 } x$ 

lemma scaleH-times:
  fixes  $f :: 'a :: \{\text{monoid-add}, \text{mult-zero}\}$ 
  shows  $f *_H x = \text{of-comp } f * x$ 
   $\langle \text{proof} \rangle$ 

lemma scaleH-add:
  fixes  $a :: 'a :: \text{semiring}$ 
  shows  $(a + a') *_H b = a *_H b + a' *_H b$ 
  and  $a *_H (b + b') = a *_H b + a *_H b'$ 
   $\langle \text{proof} \rangle$ 

lemma scaleH-diff:
  fixes  $a :: 'a :: \text{ring}$ 
  shows  $(a - a') *_H b = a *_H b - a' *_H b$ 
  and  $a *_H (b - b') = a *_H b - a *_H b'$ 
   $\langle \text{proof} \rangle$ 

lemma scaleH-mult:
  fixes  $a :: 'a :: \text{semigroup-mult}$ 
  shows  $(a * a') *_H b = a *_H a' *_H b$ 
   $\langle \text{proof} \rangle$ 

lemma scaleH-one [simp]:
  fixes  $b :: ('a :: \text{monoid-mult}) \text{ hyperdual}$ 
  shows  $1 *_H b = b$ 
   $\langle \text{proof} \rangle$ 

lemma scaleH-zero [simp]:
  fixes  $b :: ('a :: \{\text{mult-zero}, \text{times}\}) \text{ hyperdual}$ 
  shows  $0 *_H b = 0$ 
   $\langle \text{proof} \rangle$ 

lemma
  fixes  $b :: ('a :: \text{ring-1}) \text{ hyperdual}$ 
  shows scaleH-minus [simp]:  $- 1 *_H b = - b$ 
  and scaleH-minus-left:  $- (a *_H b) = - a *_H b$ 
  and scaleH-minus-right:  $- (a *_H b) = a *_H - b$ 
   $\langle \text{proof} \rangle$ 

```

Induction rule for natural numbers that takes 0 and 1 as base cases.

```

lemma nat-induct01Suc[case-names 0 1 Suc]:
  assumes P 0
    and P 1
      and  $\bigwedge n. n > 0 \implies P n \implies P (\text{Suc } n)$ 
  shows P n
  (proof)

lemma hyperdual-power:
  fixes x :: ('a :: comm-ring-1) hyperdual
  shows  $x^{\wedge} n = \text{Hyperdual} ((\text{Base } x)^{\wedge} n)$ 
     $(\text{Eps1 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1))$ 
     $(\text{Eps2 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1))$ 
     $(\text{Eps12 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1) + \text{Eps1 } x * \text{Eps2}$ 
 $x * \text{of-nat } n * \text{of-nat } (n - 1) * (\text{Base } x)^{\wedge} (n - 2))$ 
  (proof)

lemma hyperdual-power-simps [simp]:
  shows  $\text{Base} ((x :: 'a :: \text{comm-ring-1 hyperdual})^{\wedge} n) = \text{Base } x^{\wedge} n$ 
    and  $\text{Eps1} ((x :: 'a :: \text{comm-ring-1 hyperdual})^{\wedge} n) = \text{Eps1 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1)$ 
    and  $\text{Eps2} ((x :: 'a :: \text{comm-ring-1 hyperdual})^{\wedge} n) = \text{Eps2 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1)$ 
    and  $\text{Eps12} ((x :: 'a :: \text{comm-ring-1 hyperdual})^{\wedge} n) =$ 
       $(\text{Eps12 } x * \text{of-nat } n * (\text{Base } x)^{\wedge} (n - 1) + \text{Eps1 } x * \text{Eps2 } x * \text{of-nat } n * \text{of-nat } (n - 1) * (\text{Base } x)^{\wedge} (n - 2))$ 
  (proof)

```

Squaring the hyperdual one behaves as expected from the reals.

```

lemma hyperdual-square-eq-1-iff [iff]:
  fixes x :: ('a :: {real-div-algebra, comm-ring}) hyperdual
  shows  $x * x = 1 \longleftrightarrow x = 1 \vee x = -1$ 
  (proof)

```

1.2.1 Properties of Zero Divisors

Unlike the reals, hyperdual numbers may have non-trivial divisors of zero as we show below.

First, if the components have no non-trivial zero divisors then that behaviour is preserved on the base component.

```

lemma divisors-base-zero:
  fixes a b :: ('a :: ring-no-zero-divisors) hyperdual
  assumes  $\text{Base} (a * b) = 0$ 
  shows  $\text{Base } a = 0 \vee \text{Base } b = 0$ 
  (proof)

lemma hyp-base-mult-eq-0-iff [iff]:
  fixes a b :: ('a :: ring-no-zero-divisors) hyperdual
  shows  $\text{Base} (a * b) = 0 \longleftrightarrow \text{Base } a = 0 \vee \text{Base } b = 0$ 
  (proof)

```

However, the conditions are relaxed on the full hyperdual numbers. This is due to some terms vanishing in the multiplication and thus not constraining the result.

```
lemma divisors-hyperdual-zero [iff]:
  fixes a b :: ('a :: ring-no-zero-divisors) hyperdual
  shows a * b = 0  $\longleftrightarrow$  (a = 0  $\vee$  b = 0  $\vee$  (Base a = 0  $\wedge$  Base b = 0  $\wedge$  Eps1 a * Eps2 b = - Eps2 a * Eps1 b))
  ⟨proof⟩
```

1.2.2 Multiplication Cancellation

Similarly to zero divisors, multiplication cancellation rules for hyperduals are not exactly the same as those for reals.

First, cancelling a common factor has a relaxed condition compared to reals. It only requires the common factor to have base component zero, instead of requiring the whole number to be zero.

```
lemma hyp-mult-left-cancel [iff]:
  fixes a b c :: ('a :: ring-no-zero-divisors) hyperdual
  assumes baseC: Base c  $\neq$  0
  shows c * a = c * b  $\longleftrightarrow$  a = b
  ⟨proof⟩
```

```
lemma hyp-mult-right-cancel [iff]:
  fixes a b c :: ('a :: ring-no-zero-divisors) hyperdual
  assumes baseC: Base c  $\neq$  0
  shows a * c = b * c  $\longleftrightarrow$  a = b
  ⟨proof⟩
```

Next, when a factor absorbs another there are again relaxed conditions compared to reals. For reals, either the absorbing factor is zero or the absorbed is the unit. However, with hyperduals there are more possibilities again due to terms vanishing during the multiplication.

```
lemma hyp-mult-cancel-right1 [iff]:
  fixes a b :: ('a :: ring-1-no-zero-divisors) hyperdual
  shows a = b * a  $\longleftrightarrow$  a = 0  $\vee$  b = 1  $\vee$  (Base a = 0  $\wedge$  Base b = 1  $\wedge$  Eps1 b * Eps2 a = - Eps2 b * Eps1 a)
  ⟨proof⟩
```

```
lemma hyp-mult-cancel-right2 [iff]:
  fixes a b :: ('a :: ring-1-no-zero-divisors) hyperdual
  shows b * a = a  $\longleftrightarrow$  a = 0  $\vee$  b = 1  $\vee$  (Base a = 0  $\wedge$  Base b = 1  $\wedge$  Eps1 b * Eps2 a = - Eps2 b * Eps1 a)
  ⟨proof⟩
```

```
lemma hyp-mult-cancel-left1 [iff]:
  fixes a b :: ('a :: ring-1-no-zero-divisors) hyperdual
  shows a = a * b  $\longleftrightarrow$  a = 0  $\vee$  b = 1  $\vee$  (Base a = 0  $\wedge$  Base b = 1  $\wedge$  Eps1 a * Eps2 b = - Eps2 a * Eps1 b)
```

```

⟨proof⟩
lemma hyp-mult-cancel-left2 [iff]:
  fixes a b :: ('a :: ring-1-no-zero-divisors) hyperdual
  shows a * b = a  $\longleftrightarrow$  a = 0  $\vee$  b = 1  $\vee$  (Base a = 0  $\wedge$  Base b = 1  $\wedge$  Eps1 a *
Eps2 b = - Eps2 a * Eps1 b)
  ⟨proof⟩

```

1.3 Multiplicative Inverse and Division

If the components form a ring with a multiplicative inverse then so do the hyperduals. The hyperdual inverse of a is defined as the solution to $a * x = 1$. Hyperdual division is then multiplication by divisor's inverse.

Each component of the inverse has as denominator a power of the base component. Therefore this inverse is only well defined for hyperdual numbers with non-zero base components.

```

instantiation hyperdual :: ({inverse, ring-1}) inverse
begin

```

```

primcorec inverse-hyperdual
  where
    Base (inverse a) = 1 / Base a
    | Eps1 (inverse a) = - Eps1 a / (Base a)2
    | Eps2 (inverse a) = - Eps2 a / (Base a)2
    | Eps12 (inverse a) = 2 * (Eps1 a * Eps2 a / (Base a)3) - Eps12 a / (Base a)2

```

```

primcorec divide-hyperdual
  where
    Base (divide a b) = Base a / Base b
    | Eps1 (divide a b) = (Eps1 a * Base b - Base a * Eps1 b) / ((Base b)2)
    | Eps2 (divide a b) = (Eps2 a * Base b - Base a * Eps2 b) / ((Base b)2)
    | Eps12 (divide a b) = (2 * Base a * Eps1 b * Eps2 b -
      Base a * Base b * Eps12 b -
      Eps1 a * Base b * Eps2 b -
      Eps2 a * Base b * Eps1 b +
      Eps12 a * ((Base b)2)) / ((Base b)3)

```

instance

```

  ⟨proof⟩
end

```

Because hyperduals have non-trivial zero divisors, they do not form a division ring and so we can't use the *division-ring* type class to establish properties of hyperdual division. However, if the components form a division ring as well as a commutative ring, we can prove some similar facts about hyperdual division inspired by *division-ring*.

Inverse is multiplicative inverse from both sides.

lemma

```

fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
assumes Base a ≠ 0
shows hyp-left-inverse [simp]: inverse a * a = 1
    and hyp-right-inverse [simp]: a * inverse a = 1
    ⟨proof⟩

```

Division is multiplication by inverse.

```

lemma hyp-divide-inverse:
fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows a / b = a * inverse b
    ⟨proof⟩

```

Hyperdual inverse is zero when not well defined.

```

lemma zero-base-zero-inverse:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
assumes Base a = 0
shows inverse a = 0
    ⟨proof⟩

```

```

lemma zero-inverse-zero-base:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
assumes inverse a = 0
shows Base a = 0
    ⟨proof⟩

```

```

lemma hyp-inverse-zero:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows (inverse a = 0) = (Base a = 0)
    ⟨proof⟩

```

Inverse preserves invertibility.

```

lemma hyp-invertible-inverse:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows (Base a = 0) = (Base (inverse a) = 0)
    ⟨proof⟩

```

Inverse is the only number that satisfies the defining equation.

```

lemma hyp-inverse-unique:
fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
assumes a * b = 1
shows b = inverse a
    ⟨proof⟩

```

Multiplicative inverse commutes with additive inverse.

```

lemma hyp-minus-inverse-comm:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows inverse (- a) = - inverse a
    ⟨proof⟩

```

Inverse is an involution (only) where well defined. Counter-example for non-invertible is *Hyperdual* 0 0 0 0 with inverse *Hyperdual* 0 0 0 0 which then inverts to *Hyperdual* 0 0 0 0.

```
lemma hyp-inverse-involution:
  fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base a ≠ 0
  shows inverse (inverse a) = a
  ⟨proof⟩
```

```
lemma inverse-inverse-neq-Ex:
  ∃ a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual . inverse (inverse a)
  ≠ a
  ⟨proof⟩
```

Inverses of equal invertible numbers are equal. This includes the other direction by inverse preserving invertibility and being an involution.

From a different point of view, inverse is injective on invertible numbers. The other direction for is again by inverse preserving invertibility and being an involution.

```
lemma hyp-inverse-injection:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base a ≠ 0
    and Base b ≠ 0
  shows (inverse a = inverse b) = (a = b)
  ⟨proof⟩
```

One is its own inverse.

```
lemma hyp-inverse-1 [simp]:
  inverse (1 :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual) = 1
  ⟨proof⟩
```

Inverse distributes over multiplication (even when not well defined).

```
lemma hyp-inverse-mult-distrib:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  shows inverse (a * b) = inverse b * inverse a
  ⟨proof⟩
```

We derive expressions for addition and subtraction of inverses.

```
lemma hyp-inverse-add:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base a ≠ 0
    and Base b ≠ 0
  shows inverse a + inverse b = inverse a * (a + b) * inverse b
  ⟨proof⟩
```

```
lemma hyp-inverse-diff:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
```

```

assumes a: Base a ≠ 0
and b: Base b ≠ 0
shows inverse a - inverse b = inverse a * (b - a) * inverse b
⟨proof⟩

```

Division is one only when dividing by self.

```

lemma hyp-divide-self:
fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
assumes Base b ≠ 0
shows a / b = 1  $\longleftrightarrow$  a = b
⟨proof⟩

```

Taking inverse is the same as division of one, even when not invertible.

```

lemma hyp-inverse-divide-1 [divide-simps]:
fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows inverse a = 1 / a
⟨proof⟩

```

Division distributes over addition and subtraction.

```

lemma hyp-add-divide-distrib:
fixes a b c :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows (a + b) / c = a/c + b/c
⟨proof⟩

```

```

lemma hyp-diff-divide-distrib:
fixes a b c :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows (a - b) / c = a / c - b / c
⟨proof⟩

```

Multiplication associates with division.

```

lemma hyp-times-divide-assoc [simp]:
fixes a b c :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows a * (b / c) = (a * b) / c
⟨proof⟩

```

Additive inverse commutes with division, because it is multiplication by inverse.

```

lemma hyp-divide-minus-left [simp]:
fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows (-a) / b = - (a / b)
⟨proof⟩

```

```

lemma hyp-divide-minus-right [simp]:
fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
shows a / (-b) = - (a / b)
⟨proof⟩

```

Additive inverses on both sides of division cancel out.

```

lemma hyp-minus-divide-minus:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  shows (-a) / (-b) = a / b
  ⟨proof⟩

```

We can multiply both sides of equations by an invertible denominator.

```

lemma hyp-denominator-eliminate [divide-simps]:
  fixes a b c :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base c ≠ 0
  shows a = b / c ↔ a * c = b
  ⟨proof⟩

```

We can move addition and subtraction to a common denominator in the following ways:

```

lemma hyp-add-divide-eq-iff:
  fixes x y z :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base z ≠ 0
  shows x + y / z = (x * z + y) / z
  ⟨proof⟩

```

Result of division by non-invertible number is not invertible.

```

lemma hyp-divide-base-zero [simp]:
  fixes a b :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  assumes Base b = 0
  shows Base (a / b) = 0
  ⟨proof⟩

```

Division of self is 1 when invertible, 0 otherwise.

```

lemma hyp-divide-self-if [simp]:
  fixes a :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  shows a / a = (if Base a = 0 then 0 else 1)
  ⟨proof⟩

```

Repeated division is division by product of the denominators.

```

lemma hyp-denominators-merge:
  fixes a b c :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  shows (a / b) / c = a / (c * b)
  ⟨proof⟩

```

Finally, we derive general simplifications for division with addition and subtraction.

```

lemma hyp-add-divide-eq-if-simps [divide-simps]:
  fixes a b z :: ('a :: {inverse, comm-ring-1, division-ring}) hyperdual
  shows a + b / z = (if Base z = 0 then a else (a * z + b) / z)
  and a / z + b = (if Base z = 0 then b else (a + b * z) / z)
  and - (a / z) + b = (if Base z = 0 then b else (-a + b * z) / z)
  and a - b / z = (if Base z = 0 then a else (a * z - b) / z)

```

and $a / z - b = (\text{if } \text{Base } z = 0 \text{ then } -b \text{ else } (a - b * z) / z)$
and $-(a / z) - b = (\text{if } \text{Base } z = 0 \text{ then } -b \text{ else } (-a - b * z) / z)$
 $\langle \text{proof} \rangle$

lemma *hyp-divide-eq-eq* [*divide-simps*]:
fixes $a b c :: ('a :: \{\text{inverse}, \text{comm-ring-1}, \text{division-ring}\})$ *hyperdual*
shows $b / c = a \longleftrightarrow (\text{if } \text{Base } c \neq 0 \text{ then } b = a * c \text{ else } a = 0)$
 $\langle \text{proof} \rangle$

lemma *hyp-eq-divide-eq* [*divide-simps*]:
fixes $a b c :: ('a :: \{\text{inverse}, \text{comm-ring-1}, \text{division-ring}\})$ *hyperdual*
shows $a = b / c \longleftrightarrow (\text{if } \text{Base } c \neq 0 \text{ then } a * c = b \text{ else } a = 0)$
 $\langle \text{proof} \rangle$

lemma *hyp-minus-divide-eq-eq* [*divide-simps*]:
fixes $a b c :: ('a :: \{\text{inverse}, \text{comm-ring-1}, \text{division-ring}\})$ *hyperdual*
shows $-(b / c) = a \longleftrightarrow (\text{if } \text{Base } c \neq 0 \text{ then } -b = a * c \text{ else } a = 0)$
 $\langle \text{proof} \rangle$

lemma *hyp-eq-minus-divide-eq* [*divide-simps*]:
fixes $a b c :: ('a :: \{\text{inverse}, \text{comm-ring-1}, \text{division-ring}\})$ *hyperdual*
shows $a = -(b / c) \longleftrightarrow (\text{if } \text{Base } c \neq 0 \text{ then } a * c = -b \text{ else } a = 0)$
 $\langle \text{proof} \rangle$

1.4 Real Scaling, Real Vector and Real Algebra

If the components can be scaled by real numbers then so can the hyperduals. We define the scaling pointwise.

instantiation *hyperdual* :: (*scaleR*) *scaleR*
begin

primcorec *scaleR-hyperdual*
where
 $\text{Base } (f *_R x) = f *_R \text{Base } x$
 $| \text{Eps1 } (f *_R x) = f *_R \text{Eps1 } x$
 $| \text{Eps2 } (f *_R x) = f *_R \text{Eps2 } x$
 $| \text{Eps12 } (f *_R x) = f *_R \text{Eps12 } x$

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

If the components form a real vector space then so do the hyperduals.

instance *hyperdual* :: (*real-vector*) *real-vector*
 $\langle \text{proof} \rangle$

If the components form a real algebra then so do the hyperduals

instance *hyperdual* :: (*real-algebra-1*) *real-algebra-1*

$\langle proof \rangle$

If the components are reals then *of-real* matches our embedding *of-comp*, and $(*_R)$ matches our scalar product $(*_H)$.

lemma *of-real = of-comp*
 $\langle proof \rangle$

lemma *scaleR-eq-scale:*

$(*_R) = (*_H)$
 $\langle proof \rangle$

Hyperdual scalar product $(*_H)$ is compatible with $(*_R)$.

lemma *scaleH-scaleR:*
fixes $a :: 'a :: real-algebra-1$
and $b :: 'a hyperdual$
shows $(f *_R a) *_H b = f *_R a *_H b$
and $a *_H f *_R b = f *_R a *_H b$
 $\langle proof \rangle$

1.5 Real Inner Product and Real-Normed Vector Space

We now take a closer look at hyperduals as a real vector space.

If the components form a real inner product space then we can define one on the hyperduals as the sum of componentwise inner products. The norm is then defined as the square root of that inner product. We define signum, distance, uniformity and openness similarly as they are defined for complex numbers.

```

instantiation hyperdual :: (real-inner) real-inner
begin

definition inner-hyperdual :: 'a hyperdual  $\Rightarrow$  'a hyperdual  $\Rightarrow$  real
where  $x \cdot y = \text{Base } x \cdot \text{Base } y + \text{Eps1 } x \cdot \text{Eps1 } y + \text{Eps2 } x \cdot \text{Eps2 } y + \text{Eps12 }$ 
 $x \cdot \text{Eps12 } y$ 

definition norm-hyperdual :: 'a hyperdual  $\Rightarrow$  real
where norm-hyperdual  $x = \text{sqrt} (x \cdot x)$ 

definition sgn-hyperdual :: 'a hyperdual  $\Rightarrow$  'a hyperdual
where sgn-hyperdual  $x = x /_R \text{norm } x$ 

definition dist-hyperdual :: 'a hyperdual  $\Rightarrow$  'a hyperdual  $\Rightarrow$  real
where dist-hyperdual  $a b = \text{norm}(a - b)$ 

definition uniformity-hyperdual :: ('a hyperdual  $\times$  'a hyperdual) filter
where uniformity-hyperdual =  $(\text{INF } e \in \{0 <..\}. \text{principal } \{(x, y). \text{dist } x y < e\})$ 

definition open-hyperdual :: ('a hyperdual) set  $\Rightarrow$  bool

```

where *open-hyperdual* $U \longleftrightarrow (\forall x \in U. \text{eventually } (\lambda(x', y). x' = x \longrightarrow y \in U) \text{uniformity})$

instance

$\langle \text{proof} \rangle$

end

We then show that with this norm hyperduals with components that form a real normed algebra do not themselves form a normed algebra, by counter-example to the assumption that class adds.

lemma *not-normed-algebra*:

shows $\neg(\forall x y :: ('a :: \{\text{real-normed-algebra-1}, \text{real-inner}\}) \text{hyperdual . norm } (x * y) \leq \text{norm } x * \text{norm } y)$

$\langle \text{proof} \rangle$

1.6 Euclidean Space

Next we define a basis for the space, consisting of four elements one for each component with 1 in the relevant component and 0 elsewhere.

definition $ba :: ('a :: \text{zero-neq-one}) \text{hyperdual}$

where $ba = \text{Hyperdual } 1 \ 0 \ 0 \ 0$

definition $e1 :: ('a :: \text{zero-neq-one}) \text{hyperdual}$

where $e1 = \text{Hyperdual } 0 \ 1 \ 0 \ 0$

definition $e2 :: ('a :: \text{zero-neq-one}) \text{hyperdual}$

where $e2 = \text{Hyperdual } 0 \ 0 \ 1 \ 0$

definition $e12 :: ('a :: \text{zero-neq-one}) \text{hyperdual}$

where $e12 = \text{Hyperdual } 0 \ 0 \ 0 \ 1$

lemmas *hyperdual-bases* = *ba-def e1-def e2-def e12-def*

Using the constructor *Hyperdual* is equivalent to using the linear combination with coefficients the relevant arguments.

lemma *Hyperdual-eq*:

fixes $a b c d :: 'a :: \text{ring-1}$

shows $\text{Hyperdual } a b c d = a *_{\text{H}} ba + b *_{\text{H}} e1 + c *_{\text{H}} e2 + d *_{\text{H}} e12$

$\langle \text{proof} \rangle$

Projecting from the combination returns the relevant coefficient:

lemma *hyperdual-comb-sel* [*simp*]:

fixes $a b c d :: 'a :: \text{ring-1}$

shows $\text{Base}(a *_{\text{H}} ba + b *_{\text{H}} e1 + c *_{\text{H}} e2 + d *_{\text{H}} e12) = a$

and $\text{Eps1}(a *_{\text{H}} ba + b *_{\text{H}} e1 + c *_{\text{H}} e2 + d *_{\text{H}} e12) = b$

and $\text{Eps2}(a *_{\text{H}} ba + b *_{\text{H}} e1 + c *_{\text{H}} e2 + d *_{\text{H}} e12) = c$

and $\text{Eps12}(a *_{\text{H}} ba + b *_{\text{H}} e1 + c *_{\text{H}} e2 + d *_{\text{H}} e12) = d$

$\langle \text{proof} \rangle$

Any hyperdual number is a linear combination of these four basis elements.

```

lemma hyperdual-linear-comb:
  fixes  $x :: ('a :: ring-1) \text{ hyperdual}$ 
  obtains  $a b c d :: 'a \text{ where } x = a *_H ba + b *_H e1 + c *_H e2 + d *_H e12$ 
   $\langle proof \rangle$ 

```

The linear combination expressing any hyperdual number has as coefficients the projections of that number onto the relevant basis element.

```

lemma hyperdual-eq:
  fixes  $x :: ('a :: ring-1) \text{ hyperdual}$ 
  shows  $x = \text{Base } x *_H ba + \text{Eps1 } x *_H e1 + \text{Eps2 } x *_H e2 + \text{Eps12 } x *_H e12$ 
   $\langle proof \rangle$ 

```

Equality of hyperduals as linear combinations is equality of corresponding components.

```

lemma hyperdual-eq-parts-cancel [simp]:
  fixes  $a b c d :: 'a :: ring-1$ 
  shows  $(a *_H ba + b *_H e1 + c *_H e2 + d *_H e12 = a' *_H ba + b' *_H e1 + c' *_H e2 + d' *_H e12) \equiv$ 
     $(a = a' \wedge b = b' \wedge c = c' \wedge d = d')$ 
   $\langle proof \rangle$ 

```

```

lemma scaleH-cancel [simp]:
  fixes  $a b :: 'a :: ring-1$ 
  shows  $(a *_H ba = b *_H ba) \equiv (a = b)$ 
  and  $(a *_H e1 = b *_H e1) \equiv (a = b)$ 
  and  $(a *_H e2 = b *_H e2) \equiv (a = b)$ 
  and  $(a *_H e12 = b *_H e12) \equiv (a = b)$ 
   $\langle proof \rangle$ 

```

We can now also show that the multiplication we use indeed has the hyperdual units nilpotent.

```

lemma epsilon-squares [simp]:
   $(e1 :: ('a :: ring-1) \text{ hyperdual}) * e1 = 0$ 
   $(e2 :: ('a :: ring-1) \text{ hyperdual}) * e2 = 0$ 
   $(e12 :: ('a :: ring-1) \text{ hyperdual}) * e12 = 0$ 
   $\langle proof \rangle$ 

```

However none of the hyperdual units is zero.

```

lemma hyperdual-bases-nonzero [simp]:
   $ba \neq 0$ 
   $e1 \neq 0$ 
   $e2 \neq 0$ 
   $e12 \neq 0$ 
   $\langle proof \rangle$ 

```

Hyperdual units are orthogonal.

```

lemma hyperdual-bases-ortho [simp]:
   $(ba :: ('a :: \{real-inner,zero-neq-one\}) \text{ hyperdual}) \cdot e1 = 0$ 

```

```

(ba :: ('a :: {real-inner,zero-neq-one}) hyperdual) · e2 = 0
(ba :: ('a :: {real-inner,zero-neq-one}) hyperdual) · e12 = 0
(e1 :: ('a :: {real-inner,zero-neq-one}) hyperdual) · e2 = 0
(e1 :: ('a :: {real-inner,zero-neq-one}) hyperdual) · e12 = 0
(e2 :: ('a :: {real-inner,zero-neq-one}) hyperdual) · e12 = 0
⟨proof⟩

```

Hyperdual units of norm equal to 1.

lemma *hyperdual-bases-norm* [*simp*]:

```

(ba :: ('a :: {real-inner,real-normed-algebra-1}) hyperdual) · ba = 1
(e1 :: ('a :: {real-inner,real-normed-algebra-1}) hyperdual) · e1 = 1
(e2 :: ('a :: {real-inner,real-normed-algebra-1}) hyperdual) · e2 = 1
(e12 :: ('a :: {real-inner,real-normed-algebra-1}) hyperdual) · e12 = 1
⟨proof⟩

```

We can also express earlier operations in terms of the linear combination.

lemma *add-hyperdual-parts*:

```

fixes a b c d :: 'a :: ring-1
shows (a *H ba + b *H e1 + c *H e2 + d *H e12) + (a' *H ba + b' *H e1 +
c' *H e2 + d' *H e12) =
      (a + a') *H ba + (b + b') *H e1 + (c + c') *H e2 + (d + d') *H e12
⟨proof⟩

```

lemma *times-hyperdual-parts*:

```

fixes a b c d :: 'a :: ring-1
shows (a *H ba + b *H e1 + c *H e2 + d *H e12) * (a' *H ba + b' *H e1 +
c' *H e2 + d' *H e12) =
      (a * a') *H ba + (a * b' + b * a') *H e1 + (a * c' + c * a') *H e2 + (a
      * d' + b * c' + c * b' + d * a') *H e12
⟨proof⟩

```

lemma *inverse-hyperdual-parts*:

```

fixes a b c d :: 'a :: {inverse,ring-1}
shows inverse (a *H ba + b *H e1 + c *H e2 + d *H e12) =
      (1 / a) *H ba + (- b / a ^ 2) *H e1 + (- c / a ^ 2) *H e2 + (2 * (b *
      c / a ^ 3) - d / a ^ 2) *H e12
⟨proof⟩

```

Next we show that hyperduals form a euclidean space with the help of the basis we defined earlier and the above inner product if the component is an instance of *euclidean-space* and *real-algebra-1*. The basis of this space is each of the basis elements we defined scaled by each of the basis elements of the component type, representing the expansion of the space for each component of the hyperdual numbers.

instantiation *hyperdual* :: ({*euclidean-space*, *real-algebra-1*}) *euclidean-space*
begin

definition *Basis-hyperdual* :: ('a *hyperdual*) set

```
where Basis = ( $\bigcup_{i \in \{ba, e1, e2, e12\}} (\lambda u. u *_H i) ` Basis$ )
```

```
instance
⟨proof⟩
end
```

1.7 Bounded Linear Projections

Now we can show that each projection to a basis element is a bounded linear map.

```
lemma bounded-linear-Base: bounded-linear Base
⟨proof⟩
lemma bounded-linear-Eps1: bounded-linear Eps1
⟨proof⟩
lemma bounded-linear-Eps2: bounded-linear Eps2
⟨proof⟩
lemma bounded-linear-Eps12: bounded-linear Eps12
⟨proof⟩
```

This bounded linearity gives us a range of useful theorems about limits, convergence and derivatives of these projections.

```
lemmas tendsto-Base = bounded-linear.tendsto[OF bounded-linear-Base]
lemmas tendsto-Eps1 = bounded-linear.tendsto[OF bounded-linear-Eps1]
lemmas tendsto-Eps2 = bounded-linear.tendsto[OF bounded-linear-Eps2]
lemmas tendsto-Eps12 = bounded-linear.tendsto[OF bounded-linear-Eps12]

lemmas has-derivative-Base = bounded-linear.has-derivative[OF bounded-linear-Base]
lemmas has-derivative-Eps1 = bounded-linear.has-derivative[OF bounded-linear-Eps1]
lemmas has-derivative-Eps2 = bounded-linear.has-derivative[OF bounded-linear-Eps2]
lemmas has-derivative-Eps12 = bounded-linear.has-derivative[OF bounded-linear-Eps12]
```

1.8 Convergence

```
lemma inner-mult-le-mult-inner:
fixes a b :: 'a :: {real-inner, real-normed-algebra}
shows ((a * b) · (a * b)) ≤ (a · a) * (b · b)
⟨proof⟩

lemma bounded-bilinear-scaleH:
bounded-bilinear ((*_H) :: ('a :: {real-normed-algebra-1, real-inner}) ⇒ 'a hyperdual ⇒ 'a hyperdual)
⟨proof⟩

lemmas tendsto-scaleH = bounded-bilinear.tendsto[OF bounded-bilinear-scaleH]
```

We describe how limits behave for general hyperdual-valued functions.

First we prove that we can go from convergence of the four component functions to the convergence of the hyperdual-valued function whose components

they define.

```
lemma tendsto-Hyperdual:
  fixes f :: 'a ⇒ ('b :: {real-normed-algebra-1, real-inner})
  assumes (f ⟶ a) F
    and (g ⟶ b) F
    and (h ⟶ c) F
    and (i ⟶ d) F
  shows ((λx. Hyperdual (f x) (g x) (h x) (i x)) ⟶ Hyperdual a b c d) F
  ⟨proof⟩
```

Next we complete the equivalence by proving the other direction, from convergence of a hyperdual-valued function to the convergence of the projected component functions.

```
lemma tendsto-hyperdual-iff:
  fixes f :: 'a ⇒ ('b :: {real-normed-algebra-1, real-inner}) hyperdual
  shows (f ⟶ x) F ↔
    ((λx. Base (f x)) ⟶ Base x) F ∧
    ((λx. Eps1 (f x)) ⟶ Eps1 x) F ∧
    ((λx. Eps2 (f x)) ⟶ Eps2 x) F ∧
    ((λx. Eps12 (f x)) ⟶ Eps12 x) F
  ⟨proof⟩
```

1.9 Derivatives

We describe how derivatives of hyperdual-valued functions behave. Due to hyperdual numbers not forming a normed field, the derivative relation we must use is the general Fréchet derivative (*has-derivative*).

The left to right implication of the following equivalence is easily proved by the known derivative behaviour of the projections. The other direction is more difficult, because we have to construct the two requirements of the (*has-derivative*) relation, the limit and the bounded linearity of the derivative. While the limit is simple to construct from the component functions by previous lemma, the bounded linearity is more involved.

```
lemma has-derivative-hyperdual-iff:
  fixes f :: ('a :: real-normed-vector) ⇒ ('b :: {real-normed-algebra-1, real-inner}) hyperdual
  shows (f has-derivative Df) F ↔
    ((λx. Base (f x)) has-derivative (λx. Base (Df x))) F ∧
    ((λx. Eps1 (f x)) has-derivative (λx. Eps1 (Df x))) F ∧
    ((λx. Eps2 (f x)) has-derivative (λx. Eps2 (Df x))) F ∧
    ((λx. Eps12 (f x)) has-derivative (λx. Eps12 (Df x))) F
  ⟨proof⟩
```

Stop automatically unfolding hyperduals into components outside this theory:

```
lemmas [iff del] = hyperdual-eq-iff
```

```
end
```

2 Twice Field Differentiable

```
theory TwiceFieldDifferentiable
  imports HOL-Analysis.Analysis
begin
```

2.1 Differentiability on a Set

A function is differentiable on a set iff it is differentiable at any point within that set.

```
definition field-differentiable-on :: ('a ⇒ 'a::real-normed-field) ⇒ 'a set ⇒ bool
  (infixr <'field'-differentiable'-on> 50)
  where f field-differentiable-on s ≡ ∀ x∈s. f field-differentiable (at x within s)
```

This is preserved for subsets.

```
lemma field-differentiable-on-subset:
  assumes f field-differentiable-on S
    and T ⊆ S
  shows f field-differentiable-on T
  ⟨proof⟩
```

2.2 Twice Differentiability

Informally, a function is twice differentiable at x iff it is differentiable on some neighbourhood of x and its derivative is differentiable at x.

```
definition twice-field-differentiable-at :: ['a ⇒ 'a::real-normed-field, 'a] ⇒ bool
  (infixr <'twice'-field'-differentiable'-at> 50)
  where f twice-field-differentiable-at x ≡
    ∃ S. f field-differentiable-on S ∧ x ∈ interior S ∧ (deriv f) field-differentiable
      (at x)
```

```
lemma once-field-differentiable-at:
  f twice-field-differentiable-at x ⇒ f field-differentiable (at x)
  ⟨proof⟩
```

```
lemma deriv-field-differentiable-at:
  f twice-field-differentiable-at x ⇒ deriv f field-differentiable (at x)
  ⟨proof⟩
```

For a composition of two functions twice differentiable at x, the chain rule eventually holds on some neighbourhood of x.

```
lemma eventually-deriv-compose:
  assumes ∃ S. f field-differentiable-on S ∧ x ∈ interior S
    and g twice-field-differentiable-at (f x)
```

shows $\forall_F x \text{ in nhds } x. \text{deriv} (\lambda x. g(f x)) x = \text{deriv } g(f x) * \text{deriv } f x$
 $\langle \text{proof} \rangle$

lemma *eventually-deriv-compose'*:
assumes f twice-field-differentiable-at x
and g twice-field-differentiable-at $(f x)$
shows $\forall_F x \text{ in nhds } x. \text{deriv} (\lambda x. g(f x)) x = \text{deriv } g(f x) * \text{deriv } f x$
 $\langle \text{proof} \rangle$

Composition of twice differentiable functions is twice differentiable.

lemma *twice-field-differentiable-at-compose*:
assumes f twice-field-differentiable-at x
and g twice-field-differentiable-at $(f x)$
shows $(\lambda x. g(f x))$ twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

2.2.1 Constant

lemma *twice-field-differentiable-at-const* [simp, intro]:
 $(\lambda x. a)$ twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

2.2.2 Identity

lemma *twice-field-differentiable-at-ident* [simp, intro]:
 $(\lambda x. x)$ twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

2.2.3 Constant Multiplication

lemma *twice-field-differentiable-at-cmult* [simp, intro]:
 $(*) k$ twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

lemma *twice-field-differentiable-at-uminus* [simp, intro]:
 uminus twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

lemma *twice-field-differentiable-at-uminus-fun* [intro]:
assumes f twice-field-differentiable-at x
shows $(\lambda x. -f x)$ twice-field-differentiable-at x
 $\langle \text{proof} \rangle$

2.2.4 Real Scaling

lemma *deriv-scaleR-right-id* [simp]:
 $(\text{deriv } ((*_R) k)) = (\lambda z. k *_R 1)$
 $\langle \text{proof} \rangle$

lemma *deriv-deriv-scaleR-right-id* [simp]:

deriv (*deriv* ($(*_R) k$)) = ($\lambda z. 0$)
⟨proof⟩

lemma *deriv-scaleR-right*:

f field-differentiable (at *z*) \implies *deriv* ($\lambda x. k *_R f x$) *z* = $k *_R \text{deriv } f z$
⟨proof⟩

lemma *field-differentiable-scaleR-right* [intro]:

f field-differentiable *F* \implies ($\lambda x. c *_R f x$) field-differentiable *F*
⟨proof⟩

lemma *has-field-derivative-scaleR-deriv-right*:

assumes *f* twice-field-differentiable-at *z*
shows (($\lambda x. k *_R \text{deriv } f x$) has-field-derivative $k *_R \text{deriv} (\text{deriv } f) z$) (at *z*)
⟨proof⟩

lemma *deriv-scaleR-deriv-right*:

assumes *f* twice-field-differentiable-at *z*
shows *deriv* ($\lambda x. k *_R \text{deriv } f x$) *z* = $k *_R \text{deriv} (\text{deriv } f) z$
⟨proof⟩

lemma *twice-field-differentiable-at-scaleR* [simp, intro]:

$(*_R) k$ twice-field-differentiable-at *x*
⟨proof⟩

lemma *twice-field-differentiable-at-scaleR-fun* [simp, intro]:

assumes *f* twice-field-differentiable-at *x*
shows ($\lambda x. k *_R f x$) twice-field-differentiable-at *x*
⟨proof⟩

2.2.5 Addition

lemma *eventually-deriv-add*:

assumes *f* twice-field-differentiable-at *x*
and *g* twice-field-differentiable-at *x*
shows $\forall_F x \text{ in nhds } x. \text{deriv} (\lambda x. f x + g x) x = \text{deriv } f x + \text{deriv } g x$
⟨proof⟩

lemma *twice-field-differentiable-at-add* [intro]:

assumes *f* twice-field-differentiable-at *x*
and *g* twice-field-differentiable-at *x*
shows ($\lambda x. f x + g x$) twice-field-differentiable-at *x*
⟨proof⟩

lemma *deriv-add-id-const* [simp]:

deriv ($\lambda x. x + a$) = ($\lambda z. 1$)
⟨proof⟩

lemma *deriv-deriv-add-id-const* [simp]:

```
deriv (deriv (λx. x + a)) z = 0
⟨proof⟩
```

```
lemma twice-field-differentiable-at-cadd [simp]:
  (λx. x + a) twice-field-differentiable-at x
⟨proof⟩
```

2.2.6 Linear Function

```
lemma twice-field-differentiable-at-linear [simp, intro]:
  (λx. k * x + a) twice-field-differentiable-at x
⟨proof⟩
```

```
lemma twice-field-differentiable-at-linearR [simp, intro]:
  (λx. k *R x + a) twice-field-differentiable-at x
⟨proof⟩
```

2.2.7 Multiplication

```
lemma eventually-deriv-mult:
  assumes f twice-field-differentiable-at x
    and g twice-field-differentiable-at x
  shows ∀F x in nhds x. deriv (λx. f x * g x) x = f x * deriv g x + deriv f x *
g x
⟨proof⟩
```

```
lemma twice-field-differentiable-at-mult [intro]:
  assumes f twice-field-differentiable-at x
    and g twice-field-differentiable-at x
  shows (λx. f x * g x) twice-field-differentiable-at x
⟨proof⟩
```

2.2.8 Sine and Cosine

```
lemma deriv-sin [simp]: deriv sin a = cos a
⟨proof⟩
```

```
lemma deriv-sinf [simp]: deriv sin = (λx. cos x)
⟨proof⟩
```

```
lemma deriv-cos [simp]: deriv cos a = - sin a
⟨proof⟩
```

```
lemma deriv-cosf [simp]: deriv cos = (λx. - sin x)
⟨proof⟩
```

```
lemma deriv-sin-minus [simp]:
  deriv (λx. - sin x) a = - deriv (λx. sin x) a
⟨proof⟩
```

```

lemma twice-field-differentiable-at-sin [simp, intro]:
  sin twice-field-differentiable-at x
  ⟨proof⟩

lemma twice-field-differentiable-at-sin-fun [intro]:
  assumes f twice-field-differentiable-at x
  shows (λx. sin (f x)) twice-field-differentiable-at x
  ⟨proof⟩

lemma twice-field-differentiable-at-cos [simp, intro]:
  cos twice-field-differentiable-at x
  ⟨proof⟩

lemma twice-field-differentiable-at-cos-fun [intro]:
  assumes f twice-field-differentiable-at x
  shows (λx. cos (f x)) twice-field-differentiable-at x
  ⟨proof⟩

```

2.2.9 Exponential

```

lemma deriv-exp [simp]: deriv exp x = exp x
  ⟨proof⟩

lemma deriv-expf [simp]: deriv exp = exp
  ⟨proof⟩

lemma deriv-deriv-exp [simp]: deriv (deriv exp) x = exp x
  ⟨proof⟩

lemma twice-field-differentiable-at-exp [simp, intro]:
  exp twice-field-differentiable-at x
  ⟨proof⟩

lemma twice-field-differentiable-at-exp-fun [simp, intro]:
  assumes f twice-field-differentiable-at x
  shows (λx. exp (f x)) twice-field-differentiable-at x
  ⟨proof⟩

```

2.2.10 Square Root

```

lemma deriv-real-sqrt [simp]: x > 0 ==> deriv sqrt x = inverse (sqrt x) / 2
  ⟨proof⟩

lemma has-real-derivative-inverse-sqrt:
  assumes x > 0
  shows ((λx. inverse (sqrt x) / 2) has-real-derivative - (inverse (sqrt x ^ 3) /
  4)) (at x)
  ⟨proof⟩

lemma deriv-deriv-real-sqrt':

```

```

assumes  $x > 0$ 
shows  $\text{deriv}(\lambda x. \text{inverse}(\sqrt{x}) / 2) x = -\text{inverse}((\sqrt{x})^3) / 4$ 
⟨proof⟩

lemma has-real-derivative-deriv-sqrt:
assumes  $x > 0$ 
shows  $(\text{deriv} \sqrt{\text{has-real-derivative}} - \text{inverse}((\sqrt{x})^3) / 4) (\text{at } x)$ 
⟨proof⟩

lemma deriv-deriv-real-sqrt [simp]:
assumes  $x > 0$ 
shows  $\text{deriv}(\text{deriv} \sqrt{\cdot}) x = -\text{inverse}((\sqrt{x})^3) / 4$ 
⟨proof⟩

lemma twice-field-differentiable-at-sqrt [simp, intro]:
assumes  $x > 0$ 
shows  $\sqrt{\cdot}$  twice-field-differentiable-at  $x$ 
⟨proof⟩

lemma twice-field-differentiable-at-sqrt-fun [intro]:
assumes  $f$  twice-field-differentiable-at  $x$ 
and  $f x > 0$ 
shows  $(\lambda x. \sqrt{f x})$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

2.2.11 Natural Power

```

lemma field-differentiable-power [simp]:
 $(\lambda x. x^n)$  field-differentiable at  $x$ 
⟨proof⟩

lemma deriv-power-fun [simp]:
assumes  $f$  field-differentiable at  $x$ 
shows  $\text{deriv}(\lambda x. f x^n) x = \text{of-nat } n * \text{deriv } f x * f x^{(n-1)}$ 
⟨proof⟩

lemma deriv-power [simp]:
 $\text{deriv}(\lambda x. x^n) x = \text{of-nat } n * x^{(n-1)}$ 
⟨proof⟩

lemma deriv-deriv-power [simp]:
 $\text{deriv}(\text{deriv}(\lambda x. x^n)) x = \text{of-nat } n * \text{of-nat } (n - \text{Suc } 0) * x^{(n-2)}$ 
⟨proof⟩

lemma twice-field-differentiable-at-power [simp, intro]:
 $(\lambda x. x^n)$  twice-field-differentiable-at  $x$ 
⟨proof⟩

lemma twice-field-differentiable-at-power-fun [intro]:

```

```

assumes  $f$  twice-field-differentiable-at  $x$ 
shows  $(\lambda x. f x \wedge n)$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

2.2.12 Inverse

```

lemma eventually-deriv-inverse:
assumes  $x \neq 0$ 
shows  $\forall_F x \text{ in nhds } x. \text{deriv inverse } x = -1 / (x \wedge 2)$ 
⟨proof⟩

```

```

lemma deriv-deriv-inverse [simp]:
assumes  $x \neq 0$ 
shows  $\text{deriv}(\text{deriv inverse}) x = 2 * \text{inverse}(x \wedge 3)$ 
⟨proof⟩

```

```

lemma twice-field-differentiable-at-inverse [simp, intro]:
assumes  $x \neq 0$ 
shows  $\text{inverse}$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

```

lemma twice-field-differentiable-at-inverse-fun [simp, intro]:
assumes  $f$  twice-field-differentiable-at  $x$ 
and  $f x \neq 0$ 
shows  $(\lambda x. \text{inverse}(f x))$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

```

lemma twice-field-differentiable-at-divide [intro]:
assumes  $f$  twice-field-differentiable-at  $x$ 
and  $g$  twice-field-differentiable-at  $x$ 
and  $g x \neq 0$ 
shows  $(\lambda x. f x / g x)$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

2.2.13 Polynomial

```

lemma twice-field-differentiable-at-polyn [simp, intro]:
fixes  $\text{coef} :: \text{nat} \Rightarrow 'a :: \{\text{real-normed-field}\}$ 
and  $n :: \text{nat}$ 
shows  $(\lambda x. \sum_{i < n} \text{coef } i * x \wedge i)$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

```

lemma twice-field-differentiable-at-polyn-fun [simp]:
fixes  $\text{coef} :: \text{nat} \Rightarrow 'a :: \{\text{real-normed-field}\}$ 
and  $n :: \text{nat}$ 
assumes  $f$  twice-field-differentiable-at  $x$ 
shows  $(\lambda x. \sum_{i < n} \text{coef } i * f x \wedge i)$  twice-field-differentiable-at  $x$ 
⟨proof⟩

```

end

3 Hyperdual Extension of Functions

```
theory HyperdualFunctionExtension
  imports Hyperdual TwiceFieldDifferentiable
begin
```

The following is an important fact in the derivation of the hyperdual extension.

```
lemma
  fixes x :: ('a :: comm-ring-1) hyperdual and n :: nat
  assumes Base x = 0
  shows x ^ (n + 3) = 0
⟨proof⟩
```

We define the extension of a function to the hyperdual numbers.

```
primcorec hypext :: (('a :: real-normed-field) ⇒ 'a) ⇒ 'a hyperdual ⇒ 'a hyperdual
(*h* → [80] 80)
where
  Base ((*h* f) x) = f (Base x)
  | Eps1 ((*h* f) x) = Eps1 x * deriv f (Base x)
  | Eps2 ((*h* f) x) = Eps2 x * deriv f (Base x)
  | Eps12 ((*h* f) x) = Eps12 x * deriv f (Base x) + Eps1 x * Eps2 x * deriv
    (deriv f) (Base x)
```

This has the expected behaviour when expressed in terms of the units.

```
lemma hypext-Hyperdual-eq:
  (*h* f) (Hyperdual a b c d) =
    Hyperdual (f a) (b * deriv f a) (c * deriv f a) (d * deriv f a + b * c * deriv
    (deriv f) a)
  ⟨proof⟩

lemma hypext-Hyperdual-eq-parts:
  (*h* f) (Hyperdual a b c d) =
    f a *H ba + (b * deriv f a) *H e1 + (c * deriv f a) *H e2 +
    (d * deriv f a + b * c * deriv (deriv f) a) *H e12
  ⟨proof⟩
```

The extension can be used to extract the function value, and first and second derivatives at x when applied to $x *_H re + e1 + e2 + 0 *_H e12$, which we denote by βx .

```
definition hyperdualx :: ('a :: real-normed-field) ⇒ 'a hyperdual (⟨β⟩)
where β x = (Hyperdual x 1 1 0)
```

```
lemma hyperdualx-sel [simp]:
  shows Base (β x) = x
  and Eps1 (β x) = 1
  and Eps2 (β x) = 1
  and Eps12 (β x) = 0
```

$\langle proof \rangle$

lemma *hypext-extract-eq*:

$(\ast h^* f) (\beta x) = f x *_H ba + deriv f x *_H e1 + deriv f x *_H e2 + deriv (deriv f) x *_H e12$
 $\langle proof \rangle$

lemma *Base-hypext*:

$Base ((\ast h^* f) (\beta x)) = f x$
 $\langle proof \rangle$

lemma *Eps1-hypext*:

$Eps1 ((\ast h^* f) (\beta x)) = deriv f x$
 $\langle proof \rangle$

lemma *Eps2-hypext*:

$Eps2 ((\ast h^* f) (\beta x)) = deriv (deriv f) x$
 $\langle proof \rangle$

lemma *Eps12-hypext*:

$Eps12 ((\ast h^* f) (\beta x)) = deriv (deriv f) x$
 $\langle proof \rangle$

3.0.1 Convenience Interface

Define a datatype to hold the function value, and the first and second derivative values.

datatype ('a :: real-normed-field) derivs = Derivs (Value: 'a) (First: 'a) (Second: 'a)

Then we convert a hyperdual number to derivative values by extracting the base component, one of the first-order components, and the second-order component.

fun *hyperdual-to-derivs* :: ('a :: real-normed-field) hyperdual \Rightarrow 'a derivs
where *hyperdual-to-derivs* $x =$ Derivs (Base x) (Eps1 x) (Eps12 x)

Finally we define way of converting any compatible function into one that yields the value and the derivatives.

fun *autodiff* :: ('a :: real-normed-field \Rightarrow 'a) \Rightarrow 'a \Rightarrow 'a derivs
where *autodiff* $f = (\lambda x. \text{hyperdual-to-derivs} ((\ast h^* f) (\beta x)))$

lemma *autodiff-sel*:

$Value (\text{autodiff } f x) = Base ((\ast h^* f) (\beta x))$
 $First (\text{autodiff } f x) = Eps1 ((\ast h^* f) (\beta x))$
 $Second (\text{autodiff } f x) = Eps12 ((\ast h^* f) (\beta x))$
 $\langle proof \rangle$

The result contains the expected values.

```

lemma autodiff-extract-value:
  Value (autodiff f x) = f x
  ⟨proof⟩

lemma autodiff-extract-first:
  First (autodiff f x) = deriv f x
  ⟨proof⟩

lemma autodiff-extract-second:
  Second (autodiff f x) = deriv (deriv f) x
  ⟨proof⟩

```

The derivative components of the result are actual derivatives if the function is sufficiently differentiable on that argument.

```

lemma autodiff-first-derivative:
  assumes f field-differentiable (at x)
  shows (f has-field-derivative First (autodiff f x)) (at x)
  ⟨proof⟩

lemma autodiff-second-derivative:
  assumes f twice-field-differentiable-at x
  shows ((deriv f) has-field-derivative Second (autodiff f x)) (at x)
  ⟨proof⟩

```

3.0.2 Composition

Composition of hyperdual extensions is the hyperdual extension of composition:

```

lemma hypext-compose:
  assumes f twice-field-differentiable-at (Base x)
    and g twice-field-differentiable-at (f (Base x))
  shows (*h* (λx. g (f x))) x = (*h* g) ((*h* f) x)
  ⟨proof⟩

```

3.1 Concrete Instances

3.1.1 Constant

Component embedding is an extension of the constant function.

```

lemma hypext-const [simp]:
  (*h* (λx. a)) x = of-comp a
  ⟨proof⟩

lemma autodiff (λx. a) = (λx. Derivs a 0 0)
  ⟨proof⟩

```

3.1.2 Identity

Identity is an extension of the component identity.

lemma *hypext-ident*:

$(\ast h \ast (\lambda x. x)) x = x$
 $\langle proof \rangle$

3.1.3 Component Scalar Multiplication

Component scaling is an extension of component constant multiplication:

lemma *hypext-scaleH*:

$(\ast h \ast (\lambda x. k * x)) x = k *_H x$
 $\langle proof \rangle$

lemma *hypext-fun-scaleH*:

assumes f twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. k * f x)) x = k *_H (\ast h \ast f) x$
 $\langle proof \rangle$

Unary minus is just an instance of constant multiplication:

lemma *hypext-uminus*:

$(\ast h \ast uminus) x = - x$
 $\langle proof \rangle$

3.1.4 Real Scalar Multiplication

Real scaling is an extension of component real scaling:

lemma *hypext-scaleR*:

$(\ast h \ast (\lambda x. k *_R x)) x = k *_R x$
 $\langle proof \rangle$

lemma *hypext-fun-scaleR*:

assumes f twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. k *_R f x)) x = k *_R (\ast h \ast f) x$
 $\langle proof \rangle$

3.1.5 Addition

Addition of hyperdual extensions is a hyperdual extension of addition of functions.

lemma *hypext-fun-add*:

assumes f twice-field-differentiable-at (Base x)
and g twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. f x + g x)) x = (\ast h \ast f) x + (\ast h \ast g) x$
 $\langle proof \rangle$

lemma *hypext-cadd* [*simp*]:

$(\ast h \ast (\lambda x. x + a)) x = x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

lemma *hypext-fun-cadd*:
assumes f twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. f x + a)) x = (\ast h \ast f) x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

3.1.6 Component Linear Function

Hyperdual linear function is an extension of the component linear function:

lemma *hypext-linear*:
 $(\ast h \ast (\lambda x. k * x + a)) x = k *_H x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

lemma *hypext-fun-linear*:
assumes f twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. k * f x + a)) x = k *_H (\ast h \ast f) x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

3.1.7 Real Linear Function

We have the same for real scaling instead of component multiplication:

lemma *hypext-linearR*:
 $(\ast h \ast (\lambda x. k *_R x + a)) x = k *_R x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

lemma *hypext-fun-linearR*:
assumes f twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda x. k *_R f x + a)) x = k *_R (\ast h \ast f) x + \text{of-comp } a$
 $\langle \text{proof} \rangle$

3.1.8 Multiplication

Extension of multiplication is multiplication of the functions' extensions.

lemma *hypext-fun-mult*:
assumes f twice-field-differentiable-at (Base x)
and g twice-field-differentiable-at (Base x)
shows $(\ast h \ast (\lambda z. f z * g z)) x = (\ast h \ast f) x * (\ast h \ast g) x$
 $\langle \text{proof} \rangle$

3.1.9 Sine and Cosine

The extended sin and cos at an arbitrary hyperdual.

lemma *hypext-sin-Hyperdual*:
 $(\ast h \ast \sin) (\text{Hyperdual } a b c d) = \sin a *_H ba + (b * \cos a) *_H e1 + (c * \cos a)$
 $*_H e2 + (d * \cos a - b * c * \sin a) *_H e12$

$\langle proof \rangle$

lemma *hypext-cos-Hyperdual*:

$$(*h* \cos) (\text{Hyperdual } a \ b \ c \ d) = \cos a *_H ba - (b * \sin a) *_H e1 - (c * \sin a) *_H e2 - (d * \sin a + b * c * \cos a) *_H e12$$

$\langle proof \rangle$

lemma *Eps1-hypext-sin [simp]*:

$$\text{Eps1 } ((*h* \sin) x) = \text{Eps1 } x * \cos (\text{Base } x)$$

$\langle proof \rangle$

lemma *Eps2-hypext-sin [simp]*:

$$\text{Eps2 } ((*h* \sin) x) = \text{Eps2 } x * \cos (\text{Base } x)$$

$\langle proof \rangle$

lemma *Eps12-hypext-sin [simp]*:

$$\text{Eps12 } ((*h* \sin) x) = \text{Eps12 } x * \cos (\text{Base } x) - \text{Eps1 } x * \text{Eps2 } x * \sin (\text{Base } x)$$

$\langle proof \rangle$

lemma *hypext-sin-e1 [simp]*:

$$(*h* \sin) (x * e1) = e1 * x$$

$\langle proof \rangle$

lemma *hypext-sin-e2 [simp]*:

$$(*h* \sin) (x * e2) = e2 * x$$

$\langle proof \rangle$

lemma *hypext-sin-e12 [simp]*:

$$(*h* \sin) (x * e12) = e12 * x$$

$\langle proof \rangle$

lemma *hypext-cos-e1 [simp]*:

$$(*h* \cos) (x * e1) = 1$$

$\langle proof \rangle$

lemma *hypext-cos-e2 [simp]*:

$$(*h* \cos) (x * e2) = 1$$

$\langle proof \rangle$

lemma *hypext-cos-e12 [simp]*:

$$(*h* \cos) (x * e12) = 1$$

$\langle proof \rangle$

The extended sin and cos at β x .

lemma *hypext-sin-extract*:

$$(*h* \sin) (\beta x) = \sin x *_H ba + \cos x *_H e1 + \cos x *_H e2 - \sin x *_H e12$$

$\langle proof \rangle$

lemma *hypext-cos-extract*:

$(\ast h \ast \cos) (\beta x) = \cos x *_H ba - \sin x *_H e1 - \sin x *_H e2 - \cos x *_H e12$
 $\langle proof \rangle$

Extracting the extended sin components at βx .

lemma *Base-hypext-sin-extract [simp]*:

$Base ((\ast h \ast \sin) (\beta x)) = \sin x$
 $\langle proof \rangle$

lemma *Eps2-hypext-sin-extract [simp]*:

$Eps2 ((\ast h \ast \sin) (\beta x)) = \cos x$
 $\langle proof \rangle$

lemma *Eps12-hypext-sin-extract [simp]*:

$Eps12 ((\ast h \ast \sin) (\beta x)) = - \sin x$
 $\langle proof \rangle$

Extracting the extended cos components at βx .

lemma *Base-hypext-cos-extract [simp]*:

$Base ((\ast h \ast \cos) (\beta x)) = \cos x$
 $\langle proof \rangle$

lemma *Eps2-hypext-cos-extract [simp]*:

$Eps2 ((\ast h \ast \cos) (\beta x)) = - \sin x$
 $\langle proof \rangle$

lemma *Eps12-hypext-cos-extract [simp]*:

$Eps12 ((\ast h \ast \cos) (\beta x)) = - \cos x$
 $\langle proof \rangle$

We get one of the key trigonometric properties for the extensions of sin and cos.

lemma $((\ast h \ast \sin) x)^2 + ((\ast h \ast \cos) x)^2 = 1$
 $\langle proof \rangle$

lemma $(\ast h \ast \sin) x + (\ast h \ast \cos) x = (\ast h \ast (\lambda x. \sin x + \cos x)) x$
 $\langle proof \rangle$

3.1.10 Exponential

The exponential function extension behaves as expected.

lemma *hypext-exp-Hyperdual*:

$(\ast h \ast \exp) (Hyperdual a b c d) =$
 $\exp a *_H ba + (b * \exp a) *_H e1 + (c * \exp a) *_H e2 + (d * \exp a + b * c$
 $* \exp a) *_H e12$
 $\langle proof \rangle$

lemma *hypext-exp-extract*:

$(\ast h \ast \exp) (\beta x) = \exp x *_H ba + \exp x *_H e1 + \exp x *_H e2 + \exp x *_H e12$
 $\langle proof \rangle$

lemma *hypext-exp-e1* [simp]:
 $(\ast h \ast \exp) (x * e1) = 1 + e1 * x$
 $\langle proof \rangle$

lemma *hypext-exp-e2* [simp]:
 $(\ast h \ast \exp) (x * e2) = 1 + e2 * x$
 $\langle proof \rangle$

lemma *hypext-exp-e12* [simp]:
 $(\ast h \ast \exp) (x * e12) = 1 + e12 * x$
 $\langle proof \rangle$

Extracting the parts for the exponential function extension.

lemma *Eps1-hypext-exp-extract* [simp]:
 $Eps1 ((\ast h \ast \exp) (\beta x)) = \exp x$
 $\langle proof \rangle$

lemma *Eps2-hypext-exp-extract* [simp]:
 $Eps2 ((\ast h \ast \exp) (\beta x)) = \exp x$
 $\langle proof \rangle$

lemma *Eps12-hypext-exp-extract* [simp]:
 $Eps12 ((\ast h \ast \exp) (\beta x)) = \exp x$
 $\langle proof \rangle$

3.1.11 Square Root

Square root function extension.

lemma *hypext-sqrt-Hyperdual-Hyperdual*:
assumes $a > 0$
shows $(\ast h \ast \sqrt) (Hyperdual a b c d) =$
 $Hyperdual (\sqrt a) (b * inverse (\sqrt a) / 2) (c * inverse (\sqrt a) / 2)$
 $(d * inverse (\sqrt a) / 2 - b * c * inverse (\sqrt a \wedge 3) / 4)$
 $\langle proof \rangle$

lemma *hypext-sqrt-Hyperdual*:
 $a > 0 \implies (\ast h \ast \sqrt) (Hyperdual a b c d) =$
 $\sqrt a *_H ba + (b * inverse (\sqrt a) / 2) *_H e1 + (c * inverse (\sqrt a) / 2)$
 $*_H e2 +$
 $(d * inverse (\sqrt a) / 2 - b * c * inverse (\sqrt a \wedge 3) / 4) *_H e12$
 $\langle proof \rangle$

lemma *hypext-sqrt-extract*:
 $x > 0 \implies (\ast h \ast \sqrt) (\beta x) = \sqrt x *_H ba + (inverse (\sqrt x) / 2) *_H e1 +$
 $(inverse (\sqrt x) / 2) *_H e2 - (inverse (\sqrt x \wedge 3) / 4) *_H e12$
 $\langle proof \rangle$

Extracting the parts for the square root extension.

lemma *Eps1-hypext-sqrt-extract [simp]*:

$$x > 0 \implies \text{Eps1 } ((\text{*h* sqrt}) (\beta x)) = \text{inverse} (\sqrt{x}) / 2$$

{proof}

lemma *Eps2-hypext-sqrt-extract [simp]*:

$$x > 0 \implies \text{Eps2 } ((\text{*h* sqrt}) (\beta x)) = \text{inverse} (\sqrt{x}) / 2$$

{proof}

lemma *Eps12-hypext-sqrt-extract [simp]*:

$$x > 0 \implies \text{Eps12 } ((\text{*h* sqrt}) (\beta x)) = -(\text{inverse} (\sqrt{x}^3) / 4)$$

{proof}

lemma *Base* $x > 0 \implies (\text{*h* sin}) x + (\text{*h* sqrt}) x = (\text{*h*} (\lambda x. \sin x + \sqrt{x})) x$

{proof}

3.1.12 Natural Power

lemma *hypext-power*:

$$(\text{*h*} (\lambda x. x^n)) x = x^n$$

{proof}

lemma *hypext-fun-power*:

assumes f twice-field-differentiable-at (*Base* x)
shows $(\text{*h*} (\lambda x. (f x)^n)) x = ((\text{*h*} f) x)^n$

{proof}

lemma *hypext-power-Hyperdual*:

$$\begin{aligned} (\text{*h*} (\lambda x. x^n)) (\text{Hyperdual } a b c d) = \\ a^n *_H ba + (\text{of-nat } n * b * a^{(n-1)}) *_H e1 + (\text{of-nat } n * c * a^{(n-1)}) *_H e2 + \\ (d * (\text{of-nat } n * a^{(n-1)}) + b * c * (\text{of-nat } n * \text{of-nat } (n-1) * a^{(n-2)})) *_H e12 \end{aligned}$$

{proof}

lemma *hypext-power-Hyperdual-parts*:

$$\begin{aligned} (\text{*h*} (\lambda x. x^n)) (a *_H ba + b *_H e1 + c *_H e2 + d *_H e12) = \\ a^n *_H ba + (\text{of-nat } n * b * a^{(n-1)}) *_H e1 + (\text{of-nat } n * c * a^{(n-1)}) *_H e2 + \\ (d * (\text{of-nat } n * a^{(n-1)}) + b * c * (\text{of-nat } n * \text{of-nat } (n-1) * a^{(n-2)})) *_H e12 \end{aligned}$$

{proof}

lemma *hypext-power-extract*:

$$\begin{aligned} (\text{*h*} (\lambda x. x^n)) (\beta x) = \\ x^n *_H ba + (\text{of-nat } n * x^{(n-1)}) *_H e1 + (\text{of-nat } n * x^{(n-1)}) *_H e2 + \\ (\text{of-nat } n * \text{of-nat } (n-1) * x^{(n-2)}) *_H e12 \end{aligned}$$

$\langle proof \rangle$

lemma *Eps1-hypext-power* [*simp*]:

$$Eps1 ((\ast h * (\lambda x. x \wedge n)) x) = of\text{-}nat n * Eps1 x * (Base x) \wedge (n - 1)$$

$\langle proof \rangle$

lemma *Eps2-hypext-power* [*simp*]:

$$Eps2 ((\ast h * (\lambda x. x \wedge n)) x) = of\text{-}nat n * Eps2 x * (Base x) \wedge (n - 1)$$

$\langle proof \rangle$

lemma *Eps12-hypext-power* [*simp*]:

$$\begin{aligned} Eps12 ((\ast h * (\lambda x. x \wedge n)) x) &= \\ Eps12 x * (of\text{-}nat n * Base x \wedge (n - 1)) + Eps1 x * Eps2 x * (of\text{-}nat n * of\text{-}nat &(n - 1) * Base x \wedge (n - 2)) \end{aligned}$$

$\langle proof \rangle$

3.1.13 Inverse

lemma *hypext-inverse*:

$$\begin{aligned} \text{assumes } Base x &\neq 0 \\ \text{shows } (\ast h * \text{inverse}) x &= \text{inverse } x \end{aligned}$$

$\langle proof \rangle$

lemma *hypext-fun-inverse*:

$$\begin{aligned} \text{assumes } f \text{ twice-field-differentiable-at } (Base x) \\ \text{and } f'(Base x) &\neq 0 \\ \text{shows } (\ast h * (\lambda x. \text{inverse}(f x))) x &= \text{inverse}((\ast h * f) x) \end{aligned}$$

$\langle proof \rangle$

lemma *hypext-inverse-Hyperdual*:

$$\begin{aligned} a \neq 0 \implies \\ (\ast h * \text{inverse})(\text{Hyperdual } a b c d) &= \\ \text{Hyperdual } (\text{inverse } a) (- (b / a^2)) (- (c / a^2)) (2 * b * c / (a \wedge 3) - d / a^2) \end{aligned}$$

$\langle proof \rangle$

lemma *hypext-inverse-Hyperdual-parts*:

$$\begin{aligned} a \neq 0 \implies \\ (\ast h * \text{inverse})(a *_H ba + b *_H e1 + c *_H e2 + d *_H e12) &= \\ \text{inverse } a *_H ba + - (b / a^2) *_H e1 + - (c / a^2) *_H e2 + (2 * b * c / a \wedge 3 &- d / a^2) *_H e12 \end{aligned}$$

$\langle proof \rangle$

lemma *inverse-Hyperdual-parts*:

$$\begin{aligned} (a :: 'a :: \text{real-normed-field}) \neq 0 \implies \\ \text{inverse } (a *_H ba + b *_H e1 + c *_H e2 + d *_H e12) &= \\ \text{inverse } a *_H ba + - (b / a^2) *_H e1 + - (c / a^2) *_H e2 + (2 * b * c / a \wedge 3 &- d / a^2) *_H e12 \end{aligned}$$

$\langle proof \rangle$

lemma *hypext-inverse-extract*:

$$x \neq 0 \implies (*h* \text{inverse}) (\beta x) = \text{inverse } x *_H ba - (1 / x^2) *_H e1 - (1 / x^2) *_H e2 + (2 / x^3) *_H e12$$

(proof)

lemma *inverse-extract*:

$$x \neq 0 \implies \text{inverse} (\beta x) = \text{inverse } x *_H ba - (1 / x^2) *_H e1 - (1 / x^2) *_H e2 + (2 / x^3) *_H e12$$

(proof)

lemma *Eps1-hypext-inverse* [simp]:

$$\text{Base } x \neq 0 \implies \text{Eps1 } ((*h* \text{inverse}) x) = - \text{Eps1 } x * (1 / (\text{Base } x)^2)$$

(proof)

lemma *Eps1-inverse* [simp]:

$$\text{Base } (x::'a::\text{real-normed-field hyperdual}) \neq 0 \implies \text{Eps1 } (\text{inverse } x) = - \text{Eps1 } x * (1 / (\text{Base } x)^2)$$

(proof)

lemma *Eps2-hypext-inverse* [simp]:

$$\text{Base } (x::'a::\text{real-normed-field hyperdual}) \neq 0 \implies \text{Eps2 } (\text{inverse } x) = - \text{Eps2 } x * (1 / (\text{Base } x)^2)$$

(proof)

lemma *Eps12-hypext-inverse* [simp]:

$$\text{Base } (x::'a::\text{real-normed-field hyperdual}) \neq 0 \implies \text{Eps12 } (\text{inverse } x) = \text{Eps1 } x * \text{Eps2 } x * (2 / (\text{Base } x^3)) - \text{Eps12 } x / (\text{Base } x)^2$$

(proof)

3.1.14 Division

lemma *hypext-fun-divide*:

assumes *f twice-field-differentiable-at* (*Base x*)
and *g twice-field-differentiable-at* (*Base x*)
and *g (Base x) ≠ 0*
shows $(*h* (\lambda x. f x / g x)) x = (*h* f) x / (*h* g) x$

(proof)

3.1.15 Polynomial

lemma *hypext-polyn*:

fixes *coef :: nat ⇒ 'a :: {real-normed-field}*
and *n :: nat*
shows $(*h* (\lambda x. \sum i < n. \text{coef } i * x^i)) x = (\sum i < n. (\text{coef } i) *_H (x^i))$

(proof)

lemma *hypext-fun-polyn*:

fixes *coef :: nat ⇒ 'a :: {real-normed-field}*
and *n :: nat*
assumes *f twice-field-differentiable-at* (*Base x*)

```

shows (*h* ( $\lambda x. \sum i < n. \text{coef } i * (f x)^{\wedge} i$ ))  $x = (\sum i < n. (\text{coef } i) *_H (((*h* f) x)^{\wedge} i))$ 
<proof>
end

```

```

theory LogisticFunction
imports HyperdualFunctionExtension
begin

```

3.2 Logistic Function

Define the standard logistic function and its hyperdual variant:

```

definition logistic :: real  $\Rightarrow$  real
  where logistic  $x = \text{inverse}(1 + \exp(-x))$ 
definition hyp-logistic :: real hyperdual  $\Rightarrow$  real hyperdual
  where hyp-logistic  $x = \text{inverse}(1 + (*h* \exp)(-x))$ 

```

Hyperdual extension of the logistic function is its hyperdual variant:

```

lemma hypext-logistic:
  (*h* logistic)  $x = \text{hyp-logistic } x$ 
<proof>

```

From properties of autodiff we know it gives us the derivative:

```

lemma Eps1 (hyp-logistic ( $\beta x$ )) = deriv logistic  $x$ 
<proof>

```

which is equal to the known derivative of the standard logistic function:

```

lemma First (autodiff logistic  $x$ ) =  $\exp(-x) / (1 + \exp(-x))^{\wedge} 2$ 
<proof>

```

Similarly we can get the second derivative:

```

lemma Second (autodiff logistic  $x$ ) = deriv (deriv logistic)  $x$ 
<proof>

```

and derive its value:

```

lemma Second (autodiff logistic  $x$ ) =  $((\exp(-x) - 1) * \exp(-x)) / ((1 + \exp(-x))^{\wedge} 3)$ 
<proof>
end

```

```

theory AnalyticTestFunction
imports HyperdualFunctionExtension HOL-Decision-Proc.Approximation
begin

```

3.3 Analytic Test Function

We investigate the analytic test function used by Fike and Alonso in their 2011 paper [1] as a relatively non-trivial example. The function is defined as: $\lambda x. \exp x / \sqrt{(\sin x)^3 + (\cos x)^3}$.

```
definition fa-test :: real  $\Rightarrow$  real
where fa-test x = exp x / (sqrt (sin x  $\wedge$  3 + cos x  $\wedge$  3))
```

We define the same composition of functions but using the relevant hyperdual versions. Note that we implicitly use the facts that hyperdual extensions of plus, times and inverse are the same operations on hyperduals.

```
definition hyp-fa-test :: real hyperdual  $\Rightarrow$  real hyperdual
where hyp-fa-test x = ((*h* exp) x) / ((*h* sqrt) (((*h* sin) x)  $\wedge$  3 + ((*h* cos) x)  $\wedge$  3))
```

We prove lemmas useful to show when this function is well defined.

```
lemma sin-cube-plus-cos-cube:
 $\sin x \wedge 3 + \cos x \wedge 3 = 1/2 * (\sin x + \cos x) * (2 - \sin(2 * x))$ 
for x :: 'a:{real-normed-field,banach}
⟨proof⟩
```

```
lemma sin-cube-plus-cos-cube-gt-zero-iff:
 $(\sin x \wedge 3 + \cos x \wedge 3 > 0) = (\sin x + \cos x > 0)$ 
for x :: real
⟨proof⟩
```

```
lemma sin-plus-cos-eq-45:
 $\sin x + \cos x = \sqrt{2} * \sin(x + \pi/4)$ 
⟨proof⟩
```

```
lemma sin-cube-plus-cos-cube-gt-zero-iff':
 $(\sin x \wedge 3 + \cos x \wedge 3 > 0) = (\sin(x + \pi/4) > 0)$ 
⟨proof⟩
```

```
lemma sin-less-zero-pi:
 $\llbracket -\pi < x; x < 0 \rrbracket \implies \sin x < 0$ 
⟨proof⟩
```

```
lemma sin-45-positive-intervals:
 $(\sin(x + \pi/4) > 0) = (x \in (\bigcup n::int. \{-\pi/4 + 2*\pi*n <..< 3*\pi/4 + 2*\pi*n\}))$ 
⟨proof⟩
```

When the function is well defined our hyperdual definition is equal to the hyperdual extension.

```
lemma hypext-fa-test:
assumes Base x  $\in$  ( $\bigcup n::int. \{-\pi/4 + 2*\pi*n <..< 3*\pi/4 + 2*\pi*n\}$ )
shows (*h* fa-test) x = hyp-fa-test x
```

$\langle proof \rangle$

We can show that our hyperdual extension gives (approximately) the same values as those found by Fike and Alonso when evaluated at $(15::'a) / (10::'a)$.

lemma

```
assumes x = hyp-fa-test (β 1.5)
shows |Base x - 4.4978| ≤ 0.00005
  and |Eps1 x - 4.0534| ≤ 0.00005
  and |Eps12 x - 9.4631| ≤ 0.00005
⟨proof⟩
```

A number of additional lemmas that will be required to prove the derivatives:

lemma hypext-sqrt-hyperdual-parts:

```
a > 0 ==> (*h* sqrt) (a *H ba + b *H e1 + c *H e2 + d *H e12) =
  sqrt a *H ba + (b * inverse (sqrt a) / 2) *H e1 + (c * inverse (sqrt a) / 2)
  *H e2 +
  (d * inverse (sqrt a) / 2 - b * c * inverse (sqrt a ^ 3) / 4) *H e12
⟨proof⟩
```

lemma cos-multiple: $\cos(n * x) = 2 * \cos x * \cos((n - 1) * x) - \cos((n - 2) * x)$

for $x :: 'a :: \{banach,real-normed-field\}$

$\langle proof \rangle$

lemma sin-multiple: $\sin(n * x) = 2 * \cos x * \sin((n - 1) * x) - \sin((n - 2) * x)$

for $x :: 'a :: \{banach,real-normed-field\}$

$\langle proof \rangle$

lemma power5:

```
fixes z :: 'a :: monoid-mult
shows z ^ 5 = z * z * z * z * z
⟨proof⟩
```

lemma power6:

```
fixes z :: 'a :: monoid-mult
shows z ^ 6 = z * z * z * z * z * z
⟨proof⟩
```

We find the derivatives of *fa-test* by applying a Wengert list approach, as done by Fike and Alonso, to make the same composition but in hyperduals. We know that this is equal to the hyperdual extension which in turn gives us the derivatives.

lemma Wengert-autodiff-fa-test:

```
assumes x ∈ (Union n::int. {-pi/4 + 2*pi*n <..< 3*pi/4 + 2*pi*n})
shows First (autodiff fa-test x) =
  (exp x * (3 * cos x + 5 * cos (3 * x) + 9 * sin x + sin (3 * x))) /
```

```


$$(8 * (\sqrt{(\sin x)^3 + (\cos x)^3}))^3)$$

and Second (autodiff fa-test x) =

$$(\exp x * (130 - 12 * \cos(2 * x)) +$$


$$30 * \cos(4 * x) + 12 * \cos(6 * x) -$$


$$111 * \sin(2 * x) +$$


$$48 * \sin(4 * x) + 5 * \sin(6 * x))) /$$


$$(64 * (\sqrt{(\sin x)^3 + (\cos x)^3}))^5)$$

(proof)

```

end

References

- [1] J. A. Fike and J. J. Alonso. The development of hyper-dual numbers for exact second-derivative calculations. In *AIAA paper 2011-886, 49th AIAA Aerospace Sciences Meeting*, 2011.