

# HOL Light from the foundations (part 2/3)

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# Basic mathematical theories in HOL Light

## Cartesian products and pairs

We define a Cartesian product constructor written as infix '#' (*not* '\*' as in OCaml).

This takes two types  $\alpha$  and  $\beta$  and gives us the Cartesian product  $\alpha \times \beta$ .

## Cartesian products and pairs

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This takes two types  $\alpha$  and  $\beta$  and gives us the Cartesian product  $\alpha \times \beta$ .

As with OCaml, the pairing function is an infix comma, and parentheses are not needed except to establish precedence.

```
# type_of '1,2';;  
val it : hol_type = ':num#num'
```

The projections are `FST` and `SND`.

## Natural numbers

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This gives the type of natural numbers `:num`, a function `SUC` (the image under the bijection of the function postulated by `INFINITY_AX`) and a constant `zero` (some value not in the range of `SUC`).

All the usual arithmetical operations are defined and the usual properties proved, making heavy use of definition by recursion and proof by recursion, e.g. the primitive recursive definition of addition:

```
val it : thm = |- (!n. 0 + n = n) /\ (!m n. SUC m + n = SUC (m + n))
```



## Natural number constants

The 'constants'  $0, 1, 2, 3, 4, \dots$  are not in fact constants, but prettyprinted forms of composite terms. We use two basic constants for the functions  $n \mapsto 2n$  and  $n \mapsto 2n + 1$ :

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$\text{BIT0} = \lambda n. n + n$

$\text{BIT1} = \lambda n. \text{SUC}(n + n)$

These are used to encode numbers in a binary notation, e.g.  $6$  as

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```

```
BIT1 = |- BIT1 n = SUC(n + n)
```

These are used to encode numbers in a binary notation, e.g. 6 as

```
BIT0 (BIT1 (BIT1 _0))
```

An outer identity constant NUMERAL is applied, which among other things avoids confusing cases where one number is a subterm of another one. So for example:

```
# dest_comb '14';;  
val it : term * term = ('NUMERAL', 'BIT0 (BIT1 (BIT1 (BIT1 _0)))')
```

## Natural number arithmetic

Most arithmetic operations in this representation can be evaluated by applying theorems as rewrite rules

ARITH\_ADD =

```
|- (!m n. NUMERAL m + NUMERAL n = NUMERAL (m + n)) /\
  _0 + _0 = _0 /\
  (!n. _0 + BIT0 n = BIT0 n) /\
  (!n. _0 + BIT1 n = BIT1 n) /\
  (!n. BIT0 n + _0 = BIT0 n) /\
  (!n. BIT1 n + _0 = BIT1 n) /\
  (!m n. BIT0 m + BIT0 n = BIT0 (m + n)) /\
  (!m n. BIT0 m + BIT1 n = BIT1 (m + n)) /\
  (!m n. BIT1 m + BIT0 n = BIT1 (m + n)) /\
  (!m n. BIT1 m + BIT1 n = BIT0 (SUC (m + n)))
```

ARITH\_SUC =

```
|- (!n. SUC (NUMERAL n) = NUMERAL (SUC n)) /\
  SUC _0 = BIT1 _0 /\
  (!n. SUC (BIT0 n) = BIT1 n) /\
  (!n. SUC (BIT1 n) = BIT0 (SUC n))
```

Optimized derived rules can do most arithmetic fairly efficiently, way slower than machine arithmetic or bignums, but fast enough for most purposes.

## Real numbers (1)

We say a function  $x : \mathbb{N} \rightarrow \mathbb{N}$  (i.e. a sequence of natural numbers) is *nearly additive* if there is a bound  $B$  with

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$$\forall m, n. |mx_n - nx_m| \leq B(m+n)$$

Intuitively, it may help to think of  $x_n/n$  converging to a real number. We can turn this round and use it as a *definition* of (nonnegative) real numbers.

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Nonnegative reals are defined as equivalence classes of nearly multiplicative sequences. The operations are very easy, for two sequences  $x_n$  and  $y_n$ :



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Taking appropriate equivalence classes of pairs (thinking of  $(x, y)$  as  $x - y$ ) gives the positive and negative reals.

We prove the 'complete ordered field' properties and thereafter never look back inside the actual definition, so the precise definition used doesn't really matter.

# Sets

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But for familiarity of notation we define a membership relation  $\text{IN}$

$\text{|- !P x. x IN P <=> P x}$

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```
|- !P x. x IN P <=> P x
```

as well as a derived syntax (printed in the familiar way by the prettyprinter) for set comprehensions  $\{f(x) \mid P(x)\}$  for 'the set of  $f(x)$  such that  $P(x)$ ', and the usual set operations, e.g.

```
|- s UNION t = {x | x IN s \/\ x IN t}
```

More advanced automation



## More automated derived rules

HOL Light does have quite a few more automated derived rules that can prove non-trivial properties in the right domains completely automatically (and with the usual proof generation).

- ▶ Tautology checker
- ▶ First-order automation (MESON, METIS)
- ▶ Basic set theory
- ▶ Algebra via Gröbner bases
- ▶ Linear arithmetic
- ▶ ...

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To become productive at formal proof, it's worth appreciating what can and cannot be done by these automated methods.

# Tautology checker

You can prove basic propositional tautologies with TAUT

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TAUT 'p /\ q <=> p <=> q <=> p \/ q';;
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- ▶ Convert the problem to standard format and call the SAT solver
- ▶ Use the proof trace returned to generate a HOL Light proof.

The HOL Light proof generation time is not usually much more than the existing search time for the SAT solver.

## First-order automation

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MESON[]

```
'(!x y z. P x y /\ P y z ==> P x z) /\  
  (!x y z. Q x y /\ Q y z ==> Q x z) /\  
  (!x y. P x y ==> P y x) /\  
  (!x y. P x y \\/ Q x y)  
==> (!x y. P x y) \\/ (!x y. Q x y)';;
```



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    (!x y. P x y ==> P y x) /\  
    (!x y. P x y \\/ Q x y)  
  ==> (!x y. P x y) \\/ (!x y. Q x y)';;
```

There is also an analogous METIS due to Joe Hurd, as well as an experimental “Hammer” (Cezary Kaliszyk and Josef Urban) using external provers together with machine learning:

<http://cl-informatik.uibk.ac.at/software/hh/>

## Basic set automation

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```
SET_RULE 't SUBSET s ==> t = s INTER t';;
```

```
SET_RULE '~(s SUBSET {b}) <=> ?a. ~(a = b) /\ a IN s';;
```

```
SET_RULE '(!x y. f x = f y ==> x = y) ==> (!x s. f x IN IMAGE f s <=> x IN s)';;
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```

This is used frequently to generate such handy obvious facts that would otherwise be distracting in the middle of a real proof.

## Algebra via Gröbner bases

HOL Light includes a Gröbner basis procedure which is at the core of several convenient algebraic rules like `INT_RING`, `REAL_FIELD`, `COMPLEX_FIELD`:

```
# REAL_FIELD '!x. &0 < x ==> &1 / x - &1 / (x + &1) = &1 / (x * (x + &1))';;  
val it : thm = |- !x. &0 < x ==> &1 / x - &1 / (x + &1) = &1 / (x * (x + &1))
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val it : thm = |- !x. &0 < x ==> &1 / x - &1 / (x + &1) = &1 / (x * (x + &1))
```

Here is “Vieta’s substitution” for cubic equations, completely automatically:

```
REAL_RING  
'p = (&3 * a1 - a2 pow 2) / &3 /\  
  q = (&9 * a1 * a2 - &27 * a0 - &2 * a2 pow 3) / &27 /\  
  x = z + a2 / &3 /\  
  x * w = w pow 2 - p / &3  
=> (z pow 3 + a2 * z pow 2 + a1 * z + a0 = &0 <=>  
    if p = &0 then x pow 3 = q  
    else (w pow 3) pow 2 - q * (w pow 3) - p pow 3 / &27 = &0) ';;
```

## Linear arithmetic

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```
# REAL_ARITH '!x y:real. x < y ==> x < (x + y) / &2 /\ (x + y) / &2 < y';;  
val it : thm = |- !x y. x < y ==> x < (x + y) / &2 /\ (x + y) / &2 < y
```

```
# REAL_ARITH '!x y:real. (abs(x) - abs(y)) <= abs(x - y)';;  
val it : thm = |- !x y. abs x - abs y <= abs (x - y)
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```

These can also handle non-linear terms and division by constants in easy cases, e.g.

```
REAL_ARITH '(&1 + x) * (&1 - x) * (&1 + x pow 2) < &1 ==> &0 < x pow 4';;
```

```
ARITH_RULE 'x < 2 EXP 30 ==> (429496730 * x) DIV (2 EXP 32) = x DIV 10';;
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ARITH_RULE 'x < 2 EXP 30 ==> (429496730 * x) DIV (2 EXP 32) = x DIV 10';;
```

However in general these are limited to linear problems and only (implicitly or explicitly) universal quantified formulas.

## Quantifier elimination for linear arithmetic

Examples/cooper.ml has Cooper's algorithm for integer quantifier elimination as a derived rule, which can handle arbitrary quantifier structure:

```
# COOPER_RULE ' !n. n >= 8 ==> ?a b. n = 3 * a + 5 * b ';;  
val it : thm = |- !n. n >= 8 ==> (?a b. n = 3 * a + 5 * b)
```

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val it : thm = |- !n. n >= 8 ==> (?a b. n = 3 * a + 5 * b)
```

Here's an example where we can prove 'covering congruence' results more or less automatically:

```
let COVERING_CONGRUENCES_1 = prove  
  (' !n. (n == 0) (mod 2) \/  
    (n == 0) (mod 3) \/  
    (n == 1) (mod 4) \/  
    (n == 3) (mod 8) \/  
    (n == 7) (mod 12) \/  
    (n == 23) (mod 24) ',  
  GEN_TAC THEN REWRITE_TAC[num_congruent; int_congruent] THEN  
  SPEC_TAC('&n:int', 'x:int') THEN CONV_TAC COOPER_CONV);;
```

## Quantifier elimination for real arithmetic

Rqe contains a derived quantifier elimination procedure for real arithmetic written by Sean McLaughlin. It is quite powerful in principle:

```
REAL_QELIM_CONV
```

```
'!a b c. (?x. a * x pow 2 + b * x + c = &0) <=>  
  a = &0 /\ (~(b = &0) \/\ c = &0) \/  
  ~(a = &0) /\ b pow 2 >= &4 * a * c';;
```

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'!a b c. (?x. a * x pow 2 + b * x + c = &0) <=>  
  a = &0 /\ (~(b = &0) \\/ c = &0) \/  
  ~(a = &0) /\ b pow 2 >= &4 * a * c';;
```

This seems to be one of the cases where insisting on full LCF-style proof generation really slows things down, so this can be quite time-consuming on large problems.



## Nonlinear arithmetic using sum-of-squares

For purely *universal* nonlinear problems there is a procedure based on sums of squares (building on the work of Pablo Parrilo) which is often much more efficient.

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It relies on an external semidefinite programming engine like CSDP, but generates an algebraic certificate that can be verified very efficiently in HOL Light.

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It relies on an external semidefinite programming engine like CSDP, but generates an algebraic certificate that can be verified very efficiently in HOL Light.

```
# SOS_RULE '1 <= x /\ 1 <= y ==> 1 <= x * y';;  
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It relies on an external semidefinite programming engine like CSDP, but generates an algebraic certificate that can be verified very efficiently in HOL Light.

```
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val it : thm = |- 1 <= x /\ 1 <= y ==> 1 <= x * y
```

Under the surface the algebraic certificate involves rearranging expressions into sums of squares.

## More SOS examples

There is also a conversion that will just explicitly rewrite expressions as sums of squares:

```
# SOS_CONV
  '&2 * x pow 4 + &2 * x pow 3 * y - x pow 2 * y pow 2 + &5 * y pow 4';;
val it : thm =
|- &2 * x pow 4 + &2 * x pow 3 * y - x pow 2 * y pow 2 + &5 * y pow 4 =
  &1 / &2 * (&2 * x pow 2 + x * y + -- &1 * y pow 2) pow 2 +
  &1 / &2 * (x * y + y pow 2) pow 2 +
  &4 * y pow 2 pow 2
```

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  &1 / &2 * (&2 * x pow 2 + x * y + -- &1 * y pow 2) pow 2 +
  &1 / &2 * (x * y + y pow 2) pow 2 +
  &4 * y pow 2 pow 2
```

SOS is quite good at the kinds of inequalities you find in math olympiad problems:

```
REAL_SOS
  '!a b c:real.
    a >= &0 /\ b >= &0 /\ c >= &0
  ==> &3 / &2 * (b + c) * (a + c) * (a + b) <=
    a * (a + c) * (a + b) +
    b * (b + c) * (a + b) +
    c * (b + c) * (a + c)';;
```

# Nonlinear inequality reasoning with formal interval arithmetic

As part of the Flyspeck project Alexey Solovyev developed a highly efficient formal implementation of interval arithmetic (Formal\_ineqs),

```
verify_ineq default_params 5
  '-- &10 <= x0 /\ x0 <= &40 /\ &40 <= x1 /\ x1 <= &100 /\
  -- &70 <= x2 /\ x2 <= -- &40 /\ -- &70 <= x3 /\ x3 <= &40 /\
  &10 <= x4 /\ x4 <= &20 /\ -- &10 <= x5 /\ x5 <= &20 /\
  -- &30 <= x6 /\ x6 <= &110 /\ -- &110 <= x7 /\ x7 <= -- &30
==> -- &1 * x0 * x5 pow 3 + &3 * x0 * x5 * x6 pow 2 - x2 * x6 pow 3 +
  &3 * x2 * x6 * x5 pow 2 - x1 * x4 pow 3 + &3 * x1 * x4 * x7 pow 2 -
  x3 * x7 pow 3 + &3 * x3 * x7 * x4 pow 2 - &9563453 / &10000000
  < &232480000';;
```

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  -- &70 <= x2 /\ x2 <= -- &40 /\ -- &70 <= x3 /\ x3 <= &40 /\
  &10 <= x4 /\ x4 <= &20 /\ -- &10 <= x5 /\ x5 <= &20 /\
  -- &30 <= x6 /\ x6 <= &110 /\ -- &110 <= x7 /\ x7 <= -- &30
==> -- &1 * x0 * x5 pow 3 + &3 * x0 * x5 * x6 pow 2 - x2 * x6 pow 3 +
  &3 * x2 * x6 * x5 pow 2 - x1 * x4 pow 3 + &3 * x1 * x4 * x7 pow 2 -
  x3 * x7 pow 3 + &3 * x3 * x7 * x4 pow 2 - &9563453 / &10000000
  < &232480000';;
```

Besides being amazingly efficient, it can also handle several transcendental functions, e.g.

```
verify_ineq default_params 5
  '&0 <= x /\ x <= &1 ==> atn x - x / (&1 + #0.28 * x * x) < #0.005';;
```



## Divisibility properties

HOL Light has a convenient rule for proving a class of basic divisibility properties over natural numbers

NUMBER\_RULE

```
'~(gcd(a,b) = 0) /\ a = a' * gcd(a,b) /\ b = b' * gcd(a,b)
==> coprime(a',b')';;
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```

or integers

```
INTEGER_RULE '!x y. coprime(x * y,x pow 2 + y pow 2) <=> coprime(x,y)';;
```

```
INTEGER_RULE 'coprime(a,b) ==> ?x. (x == u) (mod a) /\ (x == v) (mod b)';;
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NUMBER_RULE
  ‘ $\sim(\text{gcd}(a,b) = 0) \wedge a = a' * \text{gcd}(a,b) \wedge b = b' * \text{gcd}(a,b)$ 
   $\implies \text{coprime}(a',b')$ ’;;
```

or integers

```
INTEGER_RULE ‘! $x y. \text{coprime}(x * y, x^2 + y^2) \iff \text{coprime}(x,y)$ ’;;
```

```
INTEGER_RULE ‘ $\text{coprime}(a,b) \implies \exists x. (x == u) \pmod{a} \wedge (x == v) \pmod{b}$ ’;;
```

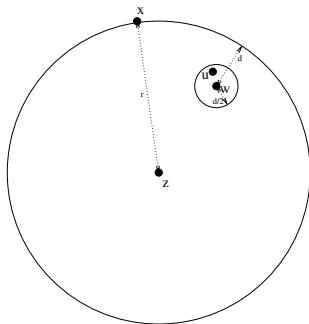
Internally this is using Gröbner bases once again (see Harrison “Automating Elementary Number-Theoretic Proofs using Gröbner bases”).

## Normed space procedure

We also have convenient 'linear decision procedure' for both normed spaces and metric spaces (latter from Marco Maggesi), analogous to the typical ones for integers, reals etc.

NORM\_ARITH

```
'abs(norm(w - z) - r) = d /\ norm(u - w) < d / &2 /\ norm(x - z) = r  
==> d / &2 <= norm(x - u)';;
```



See Solovay, Arthan and Harrison *Some new results on decidability for elementary algebra and geometry*

# Tactic proofs

## Goal-directed proofs

Another idea introduced by Milner in LCF was the use of *goal-directed* or *backward* proof.

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Even with the use of powerful forward rules, most people find this goal-directed style more convenient. It is the usual way of proving results in HOL Light.

## Setting up goals

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```

Apply tactics using `e` (“expand”), e.g. `CONJ_TAC` that breaks a conjunctive goal into two conjuncts:

```
# e CONJ_TAC;;  
val it : goalstack = 2 subgoals (2 total)  
  
'f (x + 1) + 3 < f (y + 1) + 3 ==> ~(x = y)'  
  
'x >= x - 3'
```

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0..0..solved at 2  
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We can get at the final theorem now all goals are solved with top\_thm()

```
# top_thm();;  
val it : thm = |- x >= x - 3 /\ (f (x + 1) + 3 < f (y + 1) + 3 ==> ~(x = y))
```



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and applies it in a tactic framework, e.g. `CONV_TAC REAL_ARITH.`

# The duality between rules and tactics

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$$\frac{\Gamma \vdash p \quad \Delta \vdash q}{\Gamma \cup \Delta \vdash p \wedge q}$$

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have natural tactic variants (here CONJ\_TAC) that apply the rule 'backwards'.

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- ▶ `STRIP_TAC` — break down a goal moving hypotheses into assumption list etc.
- ▶ `ASSUME_TAC` and `MP_TAC` — introduce an existing theorem as a hypothesis

There are also 'tacticals' for combining tactics in various ways, e.g. `THEN` to apply them one after the other, `REPEAT` to apply them repeatedly.

## A simple example (1)

Let's prove the formula for the sum of the first  $n$  natural numbers:

```
# g '!n. nsum(1..n) (\i. i) = (n * (n + 1)) DIV 2';;
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We apply induction and rewrite both goals with the recursive definition of sums:

```
# e(INDUCT_TAC THEN REWRITE_TAC[NSUM_CLAUSES_NUMSEG]);;  
val it : goalstack = 2 subgoals (2 total)
```

```
0 ['nsum (1..n) (\i. i) = (n * (n + 1)) DIV 2']
```

```
'(if 1 <= SUC n then nsum (1..n) (\i. i) + SUC n else nsum (1..n) (\i. i)) =  
(SUC n * (SUC n + 1)) DIV 2'
```

```
'(if 1 = 0 then 0 else 0) = (0 * (0 + 1)) DIV 2'
```

## A simple example (2)

The first goal is trivial

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# e ARITH_TAC;;
```

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# e(ASM_REWRITE_TAC[] THEN ARITH_TAC);;

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```

and so

```
# top_thm();;
val it : thm = |- !n. nsum (1..n) (\i. i) = (n * (n + 1)) DIV 2
```

## Packaging tactic proofs

Even if they are developed interactively via 'g' and 'e' steps, it's common to package up the tactics into blocks using a `prove` function.

```
let OUR_LEMMA = prove
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For a video of me proving a slightly larger theorem interactively in a competition, see

<http://www.math.kobe-u.ac.jp/icms2006/icms2006-video/video/v103.html>

# A tour of the library

## Some of the basic library files

HOL Light has quite a few library files developing some branches of mathematics in more detail, e.g.

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- ▶ `Library/rstc.ml` — Reflexive, symmetric and transitive closures of binary relations.

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## Some “great 100 theorems”

<http://www.cs.ru.nl/~freek/100/>

HOL Light currently has 87 of them; those that are not already buried in other library files are in the subdirectory 100, e.g.

- ▶ `100/cayley_hamilton.ml` — The Cayley-Hamilton theorem
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- ▶ 100/polyhedron.ml — Euler’s polyhedron formula  
 $V + F - E = 2$

## The Multivariate library

Partly as a result of Flyspeck, HOL Light is particularly strong in the area of topology, analysis and geometry in Euclidean space  $\mathbb{R}^n$ .

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File	Lines	Contents
misc.ml	2594	Background stuff
metric .ml	35321	Metric spaces and general topology
vectors.ml	10923	Basic vectors, linear algebra
determinants.ml	4956	Determinant and trace
topology.ml	36653	Topology of euclidean space
convex.ml	18279	Convex sets and functions
paths.ml	29932	Paths, simple connectedness etc.
polytope.ml	8940	Faces, polytopes, polyhedra etc.
degree.ml	9706	Degree theory, retracts etc.
derivatives.ml	5797	Derivatives
clifford.ml	979	Geometric (Clifford) algebra
integration.ml	26193	Integration
measure.ml	32007	Lebesgue measure

## Multivariate theories continued

From this foundation complex analysis is developed and used to derive convenient theorems for  $\mathbb{R}$  as well as more topological results.

File	Lines	Contents
complexes.ml	2249	Complex numbers
canal.ml	4031	Complex analysis
transcendentals.ml	7590	Real & complex transcendentals
realanalysis.ml	17718	Some analytical stuff on $\mathbb{R}$
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It would be desirable to generalize more of the material to general topological spaces, metric spaces, measure spaces etc.

## Some examples from topology

The Brouwer fixed point theorem:

```
|- !f:real^N->real^N s.  
    compact s /\ convex s /\ ~(s = {}) /\  
    f continuous_on s /\ IMAGE f s SUBSET s  
    ==> ?x. x IN s /\ f x = x
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The Borsuk homotopy extension theorem:

```
|- !f:real^M->real^N g s t u.  
    closed_in (subtopology euclidean t) s /\  
    (ANR s /\ ANR t \\/ ANR u) /\  
    f continuous_on t /\ IMAGE f t SUBSET u /\  
    homotopic_with (\x. T) (s,u) f g  
    ==> ?g'. homotopic_with (\x. T) (t,u) f g' /\  
            g' continuous_on t /\  
            IMAGE g' t SUBSET u /\  
            !x. x IN s ==> g'(x) = g(x)
```



# Some examples from convexity

## The Krein-Milman (Minkowski) theorem

```
|- !s:real^N->bool.  
    convex s /\ compact s  
    ==> s = convex hull {x | x extreme_point_of s}
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```

## Approximation of convex sets by polytopes w.r.t. Hausdorff distance:

```
|- !s:real^N->bool e.  
    bounded s /\ convex s /\ &0 < e  
    ==> ?p. polytope p /\ s SUBSET p /\ hausdist(p,s) < e
```

## Some Lipschitz/derivative examples

Kirszbraun's theorem on extension of Lipschitz functions:

```
|- !f:real^M->real^N s B.  
    &0 <= B /\  
    (!x y. x IN s /\ y IN s ==> norm(f x - f y) <= B * norm(x - y))  
==> (?g. (!x y. norm(g x - g y) <= B * norm(x - y)) /\  
      (!x. x IN s ==> g x = f x))
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          (!x. x IN s ==> g x = f x))
```

The Lebesgue differentiation theorem

```
|- !f:real^1->real^N s.  
    is_interval s /\ f has_bounded_variation_on s  
    ==> negligible {x | x IN s /\ ~(f differentiable at x)}
```

# Some examples from measure theory

Steinhaus's theorem:

```
|- !s:real^N->bool.  
    lebesgue_measurable s /\ ~negligible s  
    ==> ?d. &0 < d /\ ball(vec 0,d) SUBSET {x - y | x IN s /\ y IN s}
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```

Luzin's theorem:

```
|- !f:real^M->real^N s e.  
    measurable s /\ f measurable_on s /\ &0 < e  
    ==> ?k. compact k /\ k SUBSET s /\ measure(s DIFF k) < e /\  
        f continuous_on k
```

# Some examples from complex analysis

The Little Picard theorem:

```
|- !f:complex->complex a b.  
    f holomorphic_on (:complex) /\  
    ~(a = b) /\ IMAGE f (:complex) INTER {a,b} = {}  
    ==> ?c. f = \x. c
```

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```

The Riemann mapping theorem:

```
|- !s:complex->bool.  
    open s /\ simply_connected s <=>  
    s = {} \/\ s = (:complex) \/  
    ?f g. f holomorphic_on s /\  
          g holomorphic_on ball(Cx(&0),&1) /\  
          (!z. z IN s ==> f z IN ball(Cx(&0),&1) /\ g(f z) = z) /\  
          (!z. z IN ball(Cx(&0),&1) ==> g z IN s /\ f(g z) = z)
```



Thank you!