# Hierarchical Approximations of a Function by Polynomials in LEMA 

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2010-02-26

## The Problem

Goal: the exhaustive test of the elementary functions for the TMD in a fixed precision (e.g., in binary64), i.e. "find all the breakpoint numbers $x$ such that $f(x)$ is very close to a breakpoint number".

Breakpoint number: machine number or midpoint number.
$\rightarrow$ Worst cases for $f$ and the inverse function $f^{-1}$.


## Hierarchical Approximations by Polynomials

Current implementation (but one could have more than 3 levels):
function $f$ on an interval I


- Finding approximations must be very fast: from the previous one.
- Degree-1 polynomials: fast algorithm that computes a lower bound on the distance between a segment and $\mathbb{Z}^{2}$ (in fact, this distance, but on a larger domain) [filter] + slower algorithms when needed.


## Computing the Successive Values of a Polynomial

Example: $P(X)=X^{3}$. Difference table:


On the left: coefficients of the polynomial in the basis

$$
\left\{1, x, \frac{X(X-1)}{2}, \frac{X(X-1)(X-2)}{3!}, \ldots\right\}
$$

## Representation in the LEMA Tree

Computations can (and will) be done modulo some constant (much faster).
$\rightarrow$ The corresponding arithmetic must be supported by LEMA.
In practice, some coefficients will be close to 0 (either from above or from below).
$\rightarrow$ In the LEMA tree, notion of magnitude (like with real numbers).
How can this be expressed in LEMA?

- With a list (tuple) containing the coefficients? (But the degree $d$ is not necessarily a constant parameter.)
- With a function taking two arguments $i$ and $n$ returning the coefficient $a_{i}(n)$ of $P(X+n)$ in the basis

$$
\left\{1, X, \frac{X(X-1)}{2}, \frac{X(X-1)(X-2)}{3!}, \ldots\right\} ?
$$

The polynomial object is less visible, but this should be easier.

## An Example of Coefficient Values

An example of coefficient values from the current implementation:

```
a0_0 = A6ABF7160809CF4F 3C762E7160F38B4E
a0_1 = 5458A4173B436123 9CAOE833FEB6CB85 ABFCA8C9
a0_2 = 000002B7E1516295 CCAFB049B66COBEA 354AA25BAAB8404F
a0_3 = 000000000000000A DF85458A6CF1C94C 3BA51465E493E36F D8B90AB5
a0_4 = 0000000000000000 000000002B7E1516 2A0AC34F5D426FDA C4D9DF953DOEDFFB 16FE1543
a0_5 = 0000000000000000 0000000000000000 00ADF85458A986FD E62637A70A321BD8 4F1A4229E540A478
a0_6 = 00000000000000000 0000000000000000 000000000002B7E1 51628AED2A6ABF71 58809CF4F3C762E7
a1_0 = 5BFOA8B145769AA5 225B715628DDCEBF
a1_1 = 00000000056FC2A2 C520B9EFDA13A7F9 8A29425F
a1_2 = 0000000000000000 0015BF0A8B14AE65 D47E77DFB318E888
a1_3 = 0000000000000000 000000000000056FC 2A2C53678FA65285 D9F0CD61
a1_4 = 0000000000000000 0000000000000000 0000015BF0A8B150 561FEAAC8725FFD3 CD14C497
a1_5 = 00000000000000000 0000000000000000 00000000000000005 6FC2A2C515DA54D5 7EE2B10139E9E78F
a2_0 = 0000000000000ADF 85458A2BB500A728
a2_1 = 0000000000000000 0000002B7E151629 05D02CC9
a2_2 = 0000000000000000 0000000000000000 ADF85458A573315C
a2_3 = 0000000000000000 0000000000000000 0000000002B7E151 629B3C88
a2_4 = 0000000000000000 0000000000000000 0000000000000000 000ADF85458A2BB4 A9AAFDC5
```


## From an Interval to the Next One

## The problem (to be considered recursively):

- Input: a polynomial $P$ of degree $d$ on an interval $I$.
- The interval $/$ is split into subintervals $J_{n}$ of the same length.
- The polynomial $P$ will be approximated by polynomials $P_{n}$ of degree $d^{\prime}$ on the intervals $J_{n}$ (sequentially).
- Goal: generate code to compute the (initial) coefficients of $P_{n}$ very quickly (from the work done for $P_{n-1}$ on $J_{n-1}$ ).
- All errors need to be bounded formally: an acceptable error bound will be part of the input, and various parameters (the precision of the coefficients, etc.) will be determined from it.


## From an Interval to the Next One [2]

## Two methods:

(1) Take into account the computations that haven't been done, i.e. those involving the coefficients of degrees $>d^{\prime}$.
$\rightarrow$ Linear combinations of coefficients: additions and multiplications of coefficients by integer constants (constant in the generated code).
(2) Use the fact that the intervals $J_{n}$ have the same length: each (initial) degree- $i$ coefficient of $P_{n}$ can be seen as the value of a polynomial $a_{i}(n)$. $\rightarrow$ The difference table method can be used: only additions.

## Error Bounds

Three kinds of errors:

- Error due to the approximation of function $f$ by a polynomial.
- Approximation errors: coefficients of degree $>d^{\prime}$ are ignored.
$\rightarrow$ Error bound of the form: $\sum_{i=d^{\prime}+1}^{d} U_{i} \cdot\left|a_{i}(0)\right|$
where $U_{i}$ depends on $i$ and the size of the intervals $I$ and $J_{n}$.
- Rounding errors on the coefficients $a_{i}$ (due to their representation with an absolute precision $n_{i}$ ): initial errors and after each computation.
$\rightarrow$ Error bound on $a_{i}(m)$ of the form: $\sum_{j=i}^{d^{\prime}-1} V_{i, j, m} \cdot 2^{-n_{j}}$.
Formally determining $U_{i}$ and $V_{i, j, m}$ can be to difficult to be done automatically. But it should be possible to verify (prove) them with LEMA with conventional error analysis:
- with help of computer algebra software for generic formulas;
- numerically, after instantiation.


## Distribution of the Jobs on Different CPU's

2 possibilities:

- Completely independent jobs (as with the current implementation): the domain is split into intervals $I$, on which $f$ is approximated by a polynomial $P$ and so on. If need be, the code generation can be done on a different machine.
- On some machine (regarded as a server), $f$ is approximated by $P$ on an interval $I$, which is split into $N$ subintervals $J_{n}$; the coefficients of $P_{n}$ are computed directly. The corresponding $N$ jobs are distributed on different machines.

Note: the input parameters can be chosen to control the size thus the estimated average execution time of a job (actually the order of magnitude).

## LEMA Features That Will Be Needed

- Fast automatic generation of correct (in fact, proved) code, possibly with annotations (for provers, but this is currently limited because of the specific arithmetic).
- Possibility to test various parameters.
- Code instrumentation (was forgotten in most discussions), e.g. to count the number of word additions. For instance, transform the LEMA tree to replace a result $x$ by a pair $\left(x, c_{x}\right)$, and $x+y$ by $\left(x+y, c_{x}+c_{y}+1\right)$ ?
- Checking that the LEMA tree is correct, e.g. that formulas written by the human are correct.

