# THE MATHEMATICS OF THE PENTIUM DIVISION BUG\*

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**Abstract.** Despite all of the publicity surrounding the Pentium bug of 1994, the mathematical details of the bug are poorly understood. We discuss these details and supply a new proof of the Coe–Tang result that the at-risk divisors have six consecutive ones in positions 5 through 10. Also, we prove that the worst-case absolute error for arguments in [1, 2) is on the order of 1e–5.

Key words. Pentium, SRT division, floating point operations

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1. Introduction. Quite properly, the risk to the population of Pentium users emerged as the most provocative issue in the discussion of the Intel Pentium flaw. Unfortunately, evaluating this risk may very well be infeasible. Other well-publicized issues include Intel's public relations policy (eventually chips were replaced automatically on request), the stories of how Nicely found the bug and how Coe [4, 5] succeeded in reverse engineering the algorithm based on "bad" numerators and denominators, and those ubiquitous Pentium jokes [3]. Pratt [12] holds the record for the most extensive computational experiments and classifications of the bug.

We also wish to emphasize that, despite the jokes, the bug is far more subtle than many people realize. Andrew Wiles had a "bug" in the first public draft of his proof of Fermat's Last Theorem—his work was too important for anybody to laugh. The bug in the Pentium was an easy mistake to make, and a difficult one to catch. One way to catch it directly is Kahan's [10] SRT division tester. Kahan's tester chooses arguments more cleverly than random testing, increasing the likelihood of discovering whether an algorithm is somehow broken. His tester concentrates on and near the fenceposts, which is always a good place to look for difficulties. Bryant [1] has a different sort of tester. He uses binary decision diagrams as a check of the validity of a PD table. This is the table in which the bug appears. His algorithm explicitly checks that partial remainders remain within the critical region. It is not immediately clear that this tester could be used directly on the Pentium chip.

Part of what makes the bug so interesting is that people can make unfortunate inferences. The most important wrong conclusion one might reach from this paper is that the SRT division algorithm is so complicated that it cannot be tested and should not be used. The issue is emotional, akin to avoiding airplane travel after an accident. The analysis in this paper is not needed to test chips, but does reveal how interesting the Pentium bug truly is.

This article is a self-contained mathematical discussion of the bug, and only the bug. Sections 2 through 4 contain a complete mathematical specification of the algorithm which would be sufficient for readers to try to see if they can devise buggy numerators and denominators without ever touching a Pentium chip.

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We begin with a quick discussion of radix (or base) 4 SRT division and its carry– save implementation. A very nice tutorial on the subject was recently written by Goldberg [9]. We then give a new proof of the Coe–Tang [6] result that it takes six ones to reach a flaw. The first part of the proof begins with a simple analysis of the inequalities that either prevent you or allow you access to an erroneous table entry. The second part of the proof is an arithmetic puzzle not so very different in spirit from the sort found in recreational mathematics, where one must replace letters with digits to make a correct sum, as in this one from a collection by Fixx [8]:

	S	Е	N	D			9	5	6	7	
+	М	0	R	Е	=	+	1	0	8	5	,
М	0	N	Е	Y		1	0	6	5	2	

uniquely.

We conclude with an explanation of why a defective Pentium was always guaranteed to have an absolute error no bigger than 5e-5. when it divided inputs in the standard interval [1, 2).

**2. SRT division.** We now present the radix 4 version of the SRT division algorithm. This algorithm computes a radix 4 quotient where the digits are not from the set  $\{0, 1, 2, 3\}$  as might be expected from base 4, but rather from  $\{-2, -1, 0, 1, 2\}$ . The extra digit introduces a very useful "slack" into the computation. Binary multiplication by digits  $0, \pm 1$ , and  $\pm 2$  also requires simpler hardware than would, say, the digit 3.

Letting p and d denote the numerator and the denominator, we may as well assume that  $1 \le p, d < 2$ . The SRT division algorithm may be expressed succinctly in conceptual pseudocode:

RADIX 4 SRT DIVISION  $\begin{array}{l} p_0 := p \\ \text{for } k = 0, 1, \dots \\ \text{As a function of } p_k \text{ and } d, \text{ determine a digit } q_k \in \{-2, -1, 0, 1, 2\} \text{ in such a} \\ \text{way that} \\ p_{k+1} := 4(p_k - q_k d) \\ \text{will satisfy } |p_{k+1}| \leq \frac{8}{3}d \\ \text{end} \\ p/d = \sum_{i=0}^{\infty} q_i/4^i. \end{array}$ 

The determination of  $q_k$  is performed by looking up a table described in section 4. How the lookup table works on the Pentium is not important yet. The trouble with a defective Pentium is, by accident, that its table contains entries  $q_k$ , which if accessed would produce  $p_{k+1}$ , which would violate the requirement  $|p_{k+1}| \leq \frac{8}{3}d$ .

If we replace the set  $\{-2, -1, 0, 1, 2\}$  with  $\{0, \ldots, 9\}$ , then the 4 with a 10, and finally the inequality  $|p_{k+1}| \leq \frac{8}{3}d$  with  $p_{k+1} \in [0, 10d)$ , then the pseudocode describes ordinary base 10 long division.

**3. Understanding why SRT works.** It is easy to see that if  $|p_k| \leq \frac{8}{3}d$  then at least one of the five values of  $p_k - q_k d$  has absolute value  $\leq \frac{2}{3}d$ . Figure 3.1 (with unit length d) illustrates this. The indicated  $q_k$  value translates each interval to the

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$$-\frac{8}{3} \quad q_k \leftarrow -2 \quad -\frac{4}{3} \quad -\frac{2}{3} \quad q_k \leftarrow 0 \quad \frac{2}{3} \quad \frac{4}{3} \quad q_k \leftarrow +2 \quad \frac{8}{3} \\ -\frac{5}{3} \quad q_k \leftarrow -1 \quad -\frac{1}{3} \quad \frac{1}{3} \quad q_k \leftarrow +1 \quad \frac{5}{3}$$

FIG. 3.1. This figure shows the interval  $\left[-\frac{8}{3}d, \frac{8}{3}d\right]$ . Each "tic" mark represents the value d/3. Five subintervals are shown: three labeled from above and two from below, with values for  $q_k$ . If p is in one of the five subintervals and  $q_k$  is the digit labeling the subinterval, then the operation sending p to  $p - q_k d$  sends the subinterval to the one corresponding to  $q_k \leftarrow 0$ . The operation sending p to  $4(p - q_k d)$ , then, keeps p from leaving the interval  $\left[-\frac{8}{3}d, \frac{8}{3}d\right]$ .

 $q_k \leftarrow 0$  interval. Overlaps between upper and lower intervals show where either of two choices for  $q_k$  will work. The  $q_k \leftarrow 0$  interval, when scaled up by a factor of 4, remains within the interval  $|p| \leq \frac{8}{3}d$ ; that is why we may run the algorithm ad infinitum.

We can therefore find a  $q_k$  for which

$$(3.1) p_{k+1} = 4(p_k - q_k d)$$

has absolute value  $\leq \frac{8}{3}d$  for every k > 0.

Since Equation (3.1) is equivalent to

$$\frac{p_k}{d}4^{-k} = \frac{q_k}{4^k} + \frac{p_{k+1}}{d}4^{-(k+1)},$$

we may prove by induction that

(3.2) 
$$\frac{p}{d} = \left(q_0 + \frac{q_1}{4} + \dots + \frac{q_{k-1}}{4^{k-1}}\right) + \frac{p_k}{d} 4^{-k}$$

Letting  $k \to \infty$  in Equation (3.2) proves that the SRT algorithm computes the correct quotient.  $\Box$ 

Notice that because of the overlap regions, the representation of the quotient in terms of the  $q_k$  is not uniquely determined, but the value of the quotient is, of course, uniquely determined.

There is a popular misconception that the SRT algorithm is capable of correcting "mistakes" by using the redundant set of digits. Though the overlap in the regions may occasionally allow either of two choices for  $q_k$ , if an invalid  $q_k$  is chosen the algorithm will never recover.

A consequence of Equation (3.2) is that

$$p_k = d \sum_{i=k}^{\infty} q_i / 4^{i-k} = d \left( q_k + \frac{q_{k+1}}{4} + \frac{q_{k+2}}{4^2} + \cdots \right).$$

Summing the geometric progression with the extreme choices of all  $q_i = +2$  or all  $q_i = -2$  shows that the requirement  $|p_k| \leq \frac{8}{3}d$  is not an arbitrary choice, but a necessary ingredient in the algorithm.

On defective Pentiums, for certain values of d and for certain values of  $p_k$  just a little smaller than  $\frac{8}{3}d$ , the chip's table supplies the value 0 for  $q_k$  rather than 2. Then  $p_{k+1}$  turns out to be nearly 10d, which is far outside of the range representable by our geometric progression. Consequently, after the Pentium has supplied  $q_k = 0$  instead of 2, it cannot recover a correct quotient.

A small observation that we will use later is the following lemma.

LEMMA 3.1. If  $q_k = 2$ , then  $p_{k+1} \leq p_k$ .

*Proof.* This is an immediate consequence of the bound  $p_k \leq \frac{8}{3}d$  and Equation (3.1).

4. Quotient digit selection on the Pentium. The Pentium uses a twodimensional lookup table to obtain  $q_k$ . One entry is D, the binary number of the form x.yyyy, i.e., the integer multiple of 1/16, which approximates d from below by four bits. Mathematically,

(4.1) 
$$D \le d < D_+ \equiv D + \frac{1}{16}.$$

The other entry is  $P_k$ , which is obtained from the carry-save representation to be explained momentarily.  $P_k$  is a binary number of the form xxxx.yyy, i.e., an integer multiple of 1/8. It is related to  $p_k$  by the condition that

(4.2) 
$$P_k \le p_k < P_k + \frac{1}{4},$$

but this condition does not define  $P_k$  given  $p_k$ ; rather, it merely narrows it down to two choices. The choice that is made will be defined in Equation (4.4).

The lookup table [6, 13] that computes  $q_k$  as a function of  $P_k$  and D appears in Figure 4.1. The five colors indicate the five digits +2, +1, 0, -1, -2 from top to bottom. The five "stars" at the top of the table indicate table entries that must be 2 but erroneously return 0 on flawed Pentium chips. Note that the five columns are completed using the Coe model, while other columns have ambiguous entries. Indeed, we only know these values because of the bug; otherwise it would be impossible to know. The five entries on the bottom of the table with white borders are not reached; hence any value for  $q_k$  may be placed there. Any proposed verifier of the PD table must be cognizant of the fact that these entries are unreachable or it may mistakenly determine the table invalid. As Pratt writes [12],

One thinks of testing as being as good as verification *if* one could test all possible cases. As a weakened version of this, a comprehensive test should exercise every device and/or line of code in the system.

The Pentium bug reveals a serious limitation of this approach. There is of course no data that can exercise unreachable code or table entries. Thus if one believes that the five "missing" entries are unreachable, then no attempt will be made to produce a test for this case. Hence missing entries are likely to be overlooked by any *fabricated* set of test cases.

The operative word in the quotation above is the word *believes*.

The five bad entries occur for those divisors d for which D has any of the five values 17/16, 20/16, 23/16, 26/16, 29/16. These are the values which allow us a peek at how the Pentium chip is performing division. For the other D values there is no algorithm pathology, so there is no independent way to be sure which digits are selected in the overlap regions. Hence the white boxes in the interior of the lookup table indicate that two possible choices are equally correct. It is worth mentioning that a careless reading of [7] might suggest that the table is sign symmetric. The table is not sign symmetric, and one may speculate that this is one of several errors that contributed to the bug.

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TABLE 4.1.

q	$P_q^{\mathrm{Min}}$	$P_q^{\mathrm{Max}}$
-2	$-\frac{8}{3}D_+$	$-\frac{1}{4} - \frac{4}{3}D_+$
-1	$-\frac{1}{8}-\frac{4}{3}D_+$	$\lfloor -\frac{1}{4} - \frac{1}{3}D_+ \rfloor$
0	$\lfloor -\frac{1}{8} - \frac{1}{3}D_+ \rfloor$	$\left\lceil -\frac{1}{8} + \frac{1}{3}D_+ \right\rceil$
1	$\left\lceil \frac{1}{3}D_{+}\right\rceil$	$-\frac{1}{8}+\frac{4}{3}D_+$
2	$\frac{4}{3}D_{+}$	$-\frac{1}{8} + \frac{8}{3}D_+$

A matlab program to produce table entries follows. Half integers denote that any value is allowed while infinity denotes entries that are not accessed:

```
P=8*(-6:.125:6)';q=0*P;
                                D=floor(16*d); Dp=D+1;
for d=[1:(1/16) : 2-(1/16)];
qq= (P >= floor(-8*Dp/6)-1) + (P >= ceil(-5*D/6)) +
                                                            %q=-2
    (P \ge floor(-4*Dp/6)-1) + (P \ge ceil(-2*D/6))
                                                   +
                                                            %q=-1
    (P >= floor( -Dp/6)-1) + (P >= ceil( Dp/6)) +
                                                            %q= 0
    (P >= floor( 2*D/6)-1) + (P >= ceil( 4*Dp/6)) +
                                                            %q= 1
    (P \ge floor(5*D/6)-1) + (P \ge ceil(8*Dp/6));
                                                            %q= 2
    q = [q qq];
end
```

```
q=(q-5)/2; q(abs(q)==2.5)=Inf*q(abs(q)==2.5); q(:,1)=P/8;q
```

For the remainder of this paper, we are concerned only with the five bad columns in the lookup table. These are the columns with the explosion symbols in Figure 4.1. Mathematically, they are the columns where  $\frac{2}{3}D_+$  is an integer multiple of 1/8. Following Coe and Tang [6], a flawed entry exists in the box corresponding to the value

buggy entry 
$$= P_{\text{Bad}} = \frac{8}{3}D_+ - \frac{1}{8}.$$

The information expressed in colors in Figure 4.1 may be expressed succinctly with thresholds by identifying which of the five intervals  $P_k$  falls in:

$$(4.3) P_q^{\rm Min} \le P_k \le P_q^{\rm Max}$$

The thresholds according to [6] are shown in Table 4.1, where the floor and ceiling symbols round to multiples of 1/8.

It is easy to check that the q chosen in this manner satisfies the constraints of the algorithm specified in section 2. We stress once again that the thresholds given in Table 4.1 are meant to apply only in the five buggy columns.

4.1. The computation of  $P_k$ : Carry-save addition. Imagine adding 100 numbers on a calculator. On many calculators after typing  $x_1 + x_2$  the sum is displayed, and then folding in  $x_3$  the new sum is obtained, etc. On computers it is convenient to avoid the carry propagation by leaving the result in so-called "carry-save" format (see [2, pp. 668–669]). In this format  $x_1 + x_2$  is represented as  $s_2 + c_2$ . When we add in  $x_3$  the result is represented as  $s_3 + c_3$ , etc. The  $s_i$  and  $c_i$  are known as the sum and carry words, respectively. The basic idea is that when computing the sum of  $s_2 + c_2 + x_3$  in binary, every column can add up to 0, 1, 2, or 3 so the modulo 2 sum of the result (0 or 1) is stored in the sum word, and the carry bit is stored in the carry word. Here is an example:

Generally speaking, sum(a,b,c) is  $a+b+c \mod 2$  in mathematical language, and  $a \oplus b \oplus c$  in a more computer science style language. carry(a,b,c) may be expressed as  $a+b+c \ge 2$  in a matlab sort of language, or as  $(a \land b) \lor (a \land c) \lor (b \land c)$ . The numbers  $c_k$  and  $s_k$  constitute the carry-save representation of  $\sum_{i=1}^k x_k$ . This representation is not unique. However, the least significant bit of  $c_k$  is always 0.

On the Pentium,  $p_k$  is represented in the carry-save form  $c_k + s_k$  so that the expression  $p_{k+1} = p_k - q_k d$  is computed using a carry-save adder. If  $q_k$  is positive  $-q_k d$  is represented as the one's complement of  $q_k d$ .<sup>1</sup> Since forming the two's complement is a two-part process, it is worthwhile simply to complement the bits when forming  $q_k d$  and delay the injection of the addition of 1 by changing the least significant bit of  $c_k$  to a one.

In general,  $p_k - q_k d$  is obtained from d by a combination of shifting and/or ones complementing or zeroing. The fact that these are fast operations on a computer explains why the digit set  $\{-2, -1, 0, 1, 2\}$  is so useful. To perform addition correctly, if a one's complement number is used, a 1 is added to the least significant carry bit before shifting. We will see this in the example.

Given that  $p_k = c_k + s_k$ , it is natural to define

$$(4.4) P_k \equiv C_k + S_k,$$

where  $C_k$  and  $S_k$  represent  $c_k$  and  $s_k$ , respectively, rounded down to the nearest bit. Since

$$C_k \le c_k < C_k + \frac{1}{8}$$
 and  $S_k \le s_k < S_k + \frac{1}{8}$ ,

we can conclude that  $P_k \leq p_k + \frac{1}{4}$ .

RADIX 4 SRT DIVISION WITH CARRY–SAVE ADDITION PENTIUM STYLE  $\begin{array}{l} D := \lfloor d \rfloor_{1/16} \\ S_0 := p_0, \quad C_0 := 0 \\ \text{for } k = 0, 1, \ldots \\ P_k := \lfloor c_k \rfloor_{1/8} + \lfloor s_k \rfloor_{1/8} \\ q_k := \text{table lookup}(P_k, D) \\ \text{compute } (-q_k d) \text{ by zeroing, shifting, and/or ones complementing} \\ c_{k+1} + s_{k+1} := 4(c_k + s_k + (-q_k d)) \text{ carry–save addition and shift} \\ & \text{Correct for one's complement by injection into } c_{k+1} \text{ if } q_k < 0 \\ \text{end} \\ p/d = \sum_{i=0}^{\infty} q_i/4^i. \end{array}$ 

<sup>&</sup>lt;sup>1</sup>One's complement represents negative integers by complementing every bit. Two's complement is obtained by complementing a bit string and then adding one. Mathematically, a two's complement number is correct modulo a power of 2.

TABLE 5.1.

Description	Symbol	Value
Buggy entry	$P_{\rm Bad}$	$-\frac{1}{8} + \frac{8}{3}D_+$
Foothold	$P_{\text{Bad}} - \frac{1}{8}$	$-\frac{1}{4} + \frac{8}{3}D_+$
Top of $q = -2$ region	$P_{-2}^{\text{Max}}$	$-\frac{1}{4} - \frac{4}{3}D_+$
Top of $q = -1$ region	$P_{-1}^{\mathrm{Max}}$	$-\frac{1}{4} - \frac{1}{3}D_+$

The following example illustrates the division of 1.875 by 1.000 using fewer bits than are actually used in the Pentium. (The actual number of bits used in the Pentium is important (see [12, section 2, last paragraph]), but not for our concerns here.) Of course, dividing by 1 is trivial, but the important features of the algorithm are illustrated below.

1.875 =	0001.111 0000000000	$s_0 = 1.875$ in binary
	0000.000 0000000000	$c_0$ is initially set to 0
$-2 \times 1 =$	1101.111 11111111111	2 (from lookup table, where $P_0 = C_0 + S_0$ ) in one's complement
	0000.011 11111111100	$s_1$ is the sum from above with the two place shift
	1111.000 0000000100	$c_1$ is the carry, with shift, and one's complement correction bit
$-(-1) \times 1 =$	0001.000 0000000000	$S_1 = .011 = 3/16, C_1 = 1111.000 = -1, P_1 = -13/16.$
	1001.111 11111100000	
	1000.000 00000100000	no correction bit since no one's complement in previous iteration
$-2 \times 1 =$	1101.111 11111111111	
	0000.000 00011111100	
	1111.111 11100000100	
$-0 \times 1 =$	0000.000 0000000000	
	1111.111 11111100000	
	0000.000 00000100000	
	0000.000 0000000000	
	1111.111 1110000000	
	0000.000 0010000000	

We have thus computed the representation  $1.875 = 2 - \frac{1}{4} + \frac{2}{16} + \frac{0}{32} + \cdots$ .

## 5. Analyzing the bug.

5.1. It is not easy to reach the buggy entry. We proceed to prove a lemma which states that the buggy entry  $P_{\text{Bad}}$  can only be reached from the entry below it in the PD table. This entry just below the bad entry plays the role of a foothold. The existence of this foothold is a subtle phenomenon that may not have been readily guessed from general properties of SRT division. I believe that its existence has surprised everybody. Any thought that each table entry is somehow equally likely to be reached is very wrong.

The entries that play an important role in reaching the bug are displayed in Table 5.1.

The result that we proceed to prove in Lemma 5.1 below is that one can only reach the buggy entry from the foothold. We will also show that it is possible to reach the foothold in four ways: from the top of the q = -2 region, the top of the q = -1region, the foothold itself, or the entry below the foothold. However, if the foothold is reached from the latter two of the four routes, the buggy entry cannot be reached on the next step. Therefore, there are only two viable routes to reach the bug. It is worth emphasizing that reaching the foothold is necessary for reaching the buggy entry, but not sufficient. It is quite possible to reach the foothold, but not hit the buggy entry on the next step.

We now proceed with our analysis. Directly from the definition of  $D_+$  given in Equation (4.1), we can write the following identities for  $q_k D_+$  in terms of the binary

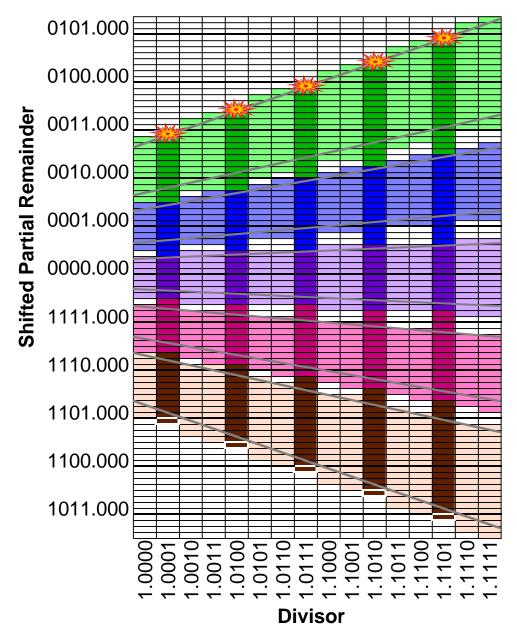


FIG. 4.1. The quotient digit  $q_k \in \{-2, -1, 0, 1, 2\}$  is a function of  $P_k$  and D. During one SRT division D is fixed, so entries are accessed within one column. For example, if  $1 \leq D < 17/16$ , then only entries in the first column are accessed. The five trapezoidal bands (green, blue, etc.) indicate the digits  $q_k$  from +2 to -2 in decreasing order from the top. The five flawed entries that should be +2 but which instead are accidentally 0 are indicated by the explosion symbols at the top of the five columns. In these columns we know from the Tim Coe model the values of the entries. In other columns, there are empty squares in the interior where two possible entries are valid. Toward the top and bottom of the table are entries that a correctly working Pentium never accesses. Note the five entries toward the bottom without borders. They also are never accessed.

expansion of  $d = 1.d_1d_2d_3d_4d_5...$ :

$$(5.1) \qquad \begin{array}{rcl} 2D_{+} &=& 001 \, d_{1}. \, d_{2} \, d_{3} \, d_{4} \, 0 & +1/8 \\ D_{+} &=& 000 \, 1. \, d_{1} \, d_{2} \, d_{3} \, d_{4} & +1/16 \\ 0D_{+} &=& 000 \, 0. & 0 \, 0 \, 0 \, 0 & 0 \\ -D_{+} &=& 111 \, 0. \, \bar{d}_{1} \, \bar{d}_{2} \, \bar{d}_{3} \, \bar{d}_{4} \\ -2D_{+} &=& 110 \, \bar{d}_{1}. \, \bar{d}_{2} \, \bar{d}_{3} \, \bar{d}_{4} \, 0 \end{array}$$

where the negative numbers are expressed in two's complement notation.<sup>2</sup> The chopping is a round down process, but  $D_+$  is akin to a round up, hence the existence of the  $\frac{1}{8}$  and  $\frac{1}{16}$  terms. Therefore, in terms of  $P_k$  and  $D_+$ , we have the version of Equation (3.1) that is

actually computed on the Pentium:

(5.2) 
$$P_{k+1} = 4(P_k - q_k D_+) + R_k,$$

where  $R_k$  is determined by a few higher-order bits. Working out the exact value of  ${\cal R}_k$  requires careful attention to the algorithmic details. The reader may verify that

$$R_{k} = 0.0s_{4}s_{5} + 0.0c_{4}c_{5} + \begin{cases} 0.0 \ d_{5} \ d_{6} \\ 0.0 \ 0 \ d_{5} \\ 0 \\ 0.0 \ \bar{d}_{5} \ \bar{d}_{6} \\ 0 \\ 0.0 \ \bar{d}_{5} \ \bar{d}_{6} \\ \end{cases} + \frac{1}{8} \times \text{carry-over} \left( s_{6}, c_{6}, \begin{cases} d_{7} \\ d_{6} \\ 0 \\ \bar{d}_{6} \\ \bar{d}_{7} \\ \end{cases} \right) + \begin{cases} -1/2 \\ -1/4 \\ 0 \\ 0 \\ 0 \\ 0 \\ \end{cases} \right)$$

$$\text{if} \begin{cases} q = -2 \\ q = -1 \\ q = 0 \\ q = 1 \\ q = 2 \end{cases}$$

where the  $s_i$ ,  $c_i$ , and  $d_i$  are the appropriate bits in the sum, carry, and divisor, respectively.<sup>3</sup> The function carry–over $(b_1, b_2, b_3)$  is 1 if at least two of its arguments are 1. The last correction term of -1/2 and -1/4 is a direct consequence of Equation (5.1).

Taking the maximum value of the parameters, we see that

(5.3) 
$$R_{k} \leq R_{k}^{\text{Max}} \equiv \begin{cases} 3/4 \\ 3/4 \\ 7/8 \\ 1 \\ 5/4 \end{cases} \text{ if } \begin{cases} q = -2 \\ q = -1 \\ q = 0 \\ q = 1 \\ q = 2 \end{cases}$$

We assume that  $D_+$  is a multiple of 3/16; i.e., it corresponds to one of the five flawed table entries. For each value of  $q_k$ , we may tabulate the largest possible  $P_{k+1}$ that may be reached as a function of the extreme  $P_k$  by using Equations (5.2) and

<sup>&</sup>lt;sup>2</sup>Two's complement represents integers by reducing modulo a power of 2. Add  $D_+$  and  $-D_+$  or add  $2D_+$  and  $-2D_+$  (and multiply by 16 to remove the binary point) to see that the sum is a power of 2.

<sup>&</sup>lt;sup>3</sup>We regret the abuse of notation—everywhere else in this paper  $s_i$  refers to all of the bits in the sum word of the *i*th iteration, but here it represents the *i*th bit during an unspecified iteration.

(5.3). Therefore, the table below is a transition table that shows how high one can reach in the table given the previous value of  $q_k$ . This is our first glimpse at just how difficult it is to reach the bad entry  $P_{\text{Bad}}$ .

;)	(5.4) If $P_k$ is at most $\downarrow$ ,		then $P_{k+1}$ is at most $\downarrow$	can reach the
	$q_k$	$P_k$	$P_{k+1}^{\max} = 4(P_k - q_k D_+) + R_k^{\max}$	foothold
	-2	$P_{-2}^{\rm Max} = -\frac{4}{3}D_+ - \frac{1}{4}$	$\frac{8}{3}D_{+} - \frac{1}{4} = P_{\text{Bad}} - \frac{1}{8}$	yes
	-1	$P_{-1}^{\text{Max}} \le -\frac{1}{3}D_{+} - \frac{1}{4}$	$\frac{8}{3}D_+ - \frac{1}{4} = P_{\text{Bad}} - \frac{1}{8}$	yes
	0	$P_0^{\text{Max}} \le \frac{1}{3}D_+$	$\frac{4}{3}D_{+} + \frac{7}{8} < P_{\rm Bad} - \frac{1}{8}$	no
	1	$P_1^{\rm Max} = \frac{4}{3}D_+ - \frac{1}{8}$	$\frac{4}{3}D_{+} + \frac{1}{2} < P_{\rm Bad} - \frac{1}{8}$	no
		If $P_k$ is at most $\downarrow$ ,	then $P_{k+1}$ is at most $\downarrow$	reach buggy entry
	2	$P_{\rm Bad} - \frac{1}{8} = \frac{8}{3}D_+ - \frac{1}{4}$	$\frac{8}{3}D_+ + \frac{1}{4} > P_{\text{Bad}}$	yes
	2	$P_{\rm Bad} - \frac{1}{4} = \frac{8}{3}D_+ - \frac{3}{8}$	$\frac{8}{3}D_+ - \frac{1}{4} = P_{\text{Bad}} - \frac{1}{8}$	no

The two "less than" inequalities in the table above are a simple consequence of  $D_+ > 1$ . In terms of Figure 4.1, the above table states that it is impossible to reach the explosion symbol even if you are at the very top of the brown, pink, purple, or blue regions. The only way to reach the explosion symbol is from the green entry immediately below it. Therefore, we denote this entry the foothold.

LEMMA 5.1. The sequence of P's and corresponding q's that leads to the bad entry is given below:

Here the subscript m in the middle column denotes a repetition of the entry  $m \ge 1$  times, and the first column indicates that either a  $P_{-2}^{Max}$  or  $P_{-1}^{Max}$  may start the path to the bug corresponding to either q = -2 or q = -1, respectively.

*Proof.* Our proof goes from right to left. The table in (5.4) shows that we can only reach  $P_{\text{Bad}}$  from  $P_{\text{Bad}} - \frac{1}{8}$ . The table also shows that for q = -2 or q = -1, we can just barely reach  $P_{\text{Bad}} - \frac{1}{8}$ , only when  $P_k = P_k^{\text{Max}}$  and  $R_k = R_k^{\text{Max}}$ .  $P_{\text{Bad}} - \frac{1}{8}$  may also be reached from  $P_{\text{Bad}} - \frac{1}{4}$ , but if  $P_k = P_{\text{Bad}} - \frac{1}{4}$  then  $P_{\text{Bad}} - \frac{1}{4} \leq p_k < P_{\text{Bad}}$ , and Lemma 3.1 guarantees that while the sequence produces twos all future  $p_k$  will also satisfy  $p_k < P_{\text{Bad}}$ , which precludes reaching the flawed entry, i.e., reaching k with  $P_k = P_{\text{Bad}}$ .

# 6. The "send-more-money" puzzle for the Pentium.

THEOREM 6.1 (Coe, Tang). A flawed table entry can only be reached if the divisor  $d = d_1 d_2 d_3 \dots$  has the property that the six consecutive bits from  $d_5$  to  $d_{10}$  are all ones. (Of course  $1.d_1 d_2 d_3 d_4$  must be one of the five bad values.)

*Proof.* First assume that m = 1. (We later show in Lemma 6.6 that this is the only possibility.) The table below illustrates the carry–save division calculation that leads to the buggy entry. We devised a subscript notation to facilitate the reader in following the progression of fill-in. Our five main threads of argument are denoted by  $\alpha, \beta, \gamma, \delta$ , and  $\epsilon$ . If you fill in the digits of our "send-more-money" in the following

sequence, you will fill in the numbers in order:

$$\begin{array}{c} \alpha_{\bigstar}, \alpha_1 \\ \beta_{\bigstar}, \beta_1 \\ \gamma_{\bigstar}, \gamma_1, \gamma_2 \\ \delta_{\bigstar}, \delta_1, \delta_2, \delta_3 \\ \epsilon_{\bigstar}, \epsilon_1, \epsilon_2 \end{array}$$

Only five observations are needed for this argument. They are associated with the  $\blacklozenge$  symbol, as with  $\alpha_{\diamondsuit}$ . Then, in sequence, we let  $\alpha_1, \alpha_2, \ldots$  denote bits we can fill in more or less mechanically based on the carry–save division process. The only ideas used to fill in the mechanical entries are the shifted carry–sum division process and the possible shifting or complementing of the bits in *d*. Asterisks (\*) or blank spaces indicate entries whose values are not of interest. Also of no interest are values to the left of the binary point.

	Case	I: Re	achin	g the	bug	from	-2			Case II: Reaching the bug from $-1$									
	$s_{j-2}$	.*	*	*	$1_{\alpha_{\bigstar}}$	$1_{\alpha_{\bigstar}}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	$s_{j-2}$	.*	*	*	$1_{\alpha}$	$1_{\alpha_{\bigstar}}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	
q = -2	$c_{j-2}$	.*	*	*	$1_{\alpha_{\bigstar}}$	$1_{\alpha_{\bigstar}}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	$c_{j-2}$	.*	*	*	$1_{\alpha_{\bigstar}}$	$1_{\alpha_{\bigstar}}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	q = -1
	2d	$.d_2$	$d_3$	$d_4$	$1_{\alpha_{\bigstar}}$	$1_{\alpha}_{\bigstar}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	d	$.d_1$	$d_2$	$d_3$	$1_{\alpha}_{\bigstar}$	$1_{\alpha}_{\bigstar}$	$1_{\gamma_1}$	$1_{\delta_2}$	$1_{\epsilon_2}$	
	$s_{j-1}$	.*	$1_{\alpha_1}$	$1_{\alpha_1}$	$1_{\gamma_{\bigstar}}$	$1_{\delta_1}$	$1_{\epsilon_1}$			$s_{j-1}$	.*	$1_{\alpha_1}$	$1_{\alpha_1}$	$1_{\gamma_{\bigstar}}$	$1_{\delta_1}$	$1_{\epsilon_1}$			
q = 2	$c_{j-1}$	$.1_{\alpha_1}$	$1_{\alpha_1}$	$1_{\beta_{\bigstar}}$	$1_{\gamma_{\bigstar}}$	$1_{\delta_1}$	$1_{\epsilon_1}$			$c_{j-1}$	$.1_{\alpha_1}$	$1_{\alpha_1}$	$1_{\beta}$	$1_{\gamma_{\bigstar}}$	$1_{\delta_1}$	$1_{\epsilon_1}$			q = 2
	-2d	$.\overline{d}_2$	$\bar{d}_3$	$\bar{d}_4$	$0_{\alpha_1}$	$0_{\alpha_1}$	$0_{\gamma_2}$			-2d	$.\bar{d}_2$	$\bar{d}_3$	$\bar{d}_4$	$0_{\alpha_1}$	$0_{\gamma_2}$	$0_{\delta_3}$			
	$s_j$	.*	$0_{\gamma_1}$	$0_{\delta_2}$						$s_j$	.*	$0_{\gamma_1}$	$0_{\delta_2}$						
bug	$c_j$	.*	$1_{\delta_{\bigstar}}$	$1_{\epsilon}$						$c_j$	.*	$1_{\delta_{\bigstar}}$	$1_{\epsilon_{\bigstar}}$						bug

Explanation:

- $\alpha_{\bigstar}$  Since R (Lemma 5.1) must equal  $R^{max}$  we must have  $c_4, c_5, s_4, s_5$ , and the two d bits equal to 1.
- $\beta_{\bigstar} = 8(P_{\text{Bad}} \frac{1}{8})$  is even. (It can be 22, 26, 30, 34, or 38.) To obtain an even number, we must add a 1 to the  $1_{\alpha_1}$  immediately above.
- $\gamma_{\bigstar}$   $R = R^{\text{Max}} \frac{3}{8}$  (Lemma 5.1). The  $0_{\alpha_1}$  immediately below reduces R by 2/8, and a 0 in the  $\gamma_{\bigstar}$  position would reduce R by another 2/8, giving 4/8.
- $\delta_{\bigstar} = 8P_{\text{Bad}} \in \{23, 27, 31, 35, 39\} \text{ is } 3 \pmod{4}.$
- $\epsilon_{\bigstar} = 8P_{\text{Bad}} \in \{23, 27, 31, 35, 39\} \text{ is } 3 \pmod{4}.$

The conclusion that we have so far is that if we begin with q = -2, we must then have that  $d_5, d_6, d_7, d_8, d_9$  are all 1. If we begin with q = -1, then we conclude that  $d_5, d_6, d_7, d_8$  are all 1.

We are almost, but not quite, finished. Having all those ones at the q = -2 or q = -1 step allows us to go back yet another step. A quick analysis shows that the line above  $s_{j-2}$  can only be d or 2d and that it too has many ones. We can then guarantee that  $d_9$  and  $d_{10}$  are also 1.

LEMMA 6.6. The value for m in Lemma 5.1 must be 1.

*Proof.* We proceed with the same sort of send-more-money puzzle. The assumption of more than one q = 2 in sequence yields a contradiction. We encourage readers to try to find the contradiction themselves rather than read the proof to follow. In the diagram below we do not use subscripts for values that we have already obtained from  $\alpha, \beta$ , and  $\gamma$  in the proof of Theorem 6.1. We then continue the numbering convention with  $\zeta$ .

### THE MATHEMATICS OF THE PENTIUM DIVISION BUG

	ot reaching th leading to cor	0	, ,	Case II: Not reaching the bug from $-1$ , 2, 2 Sequence leading to branch					
	$s_{j-2}$ .* *	* 1	$1  1  1_{\zeta_5}$	$s_{j-2}$ .* * * 1 1 1					
q = -2	$c_{j-2}$ .* *	* 1		$c_{j-2}$ .* * * 1 1 1 $q = -1$					
	$2d$ $.d_2$ $d_3$	$d_4$ 1	$1 \ 1 \ 1_{\zeta_5}$	$d  .d_1 \ d_2 \ d_3 \ 1 \ 1 \ 1$					
	$s_{j-1}$ .* 1	1 1	$1_{\zeta_4} * 1_{\zeta_7}$	$s_{j-1}$ .* 1 1 1					
q = 2	$c_{j-1}$ .1 1	1 1	$1_{\zeta_4} \ \ast \ 1_{\zeta_7}$	$c_{j-1}$ .1 1 1 1 $q=2$					
	$-2d$ . $\bar{d}_2$ $\bar{d}_3$	$\bar{d}_4$ 0	$0 0 0_{\zeta_6}$	$-2d~.ar{d}_2~ar{d}_3~ar{d}_4~0~0$					
	$s_j$ .* 0	$0_{\zeta_2}  1_{\zeta_{\bigstar}}$	$0_{\zeta_{7}}$	$s_j$ .* 0 $\bigstar$ 1					
q = 2	$c_j$ .* $1_{\zeta_3}$	$0_{\zeta_1} \ 1_{\zeta_{\bigstar}}$	$1_{\eta}$	$c_j$ .* $\blacklozenge$ $\blacklozenge$ 1 $q=2$					
	$-2d$ . $\bar{d}_2$ $\bar{d}_3$	$\bar{d}_4 = 0$	0 0	$-2d \ .d_2 \ d_3 \ d_4 \ 0 \ 0$					
	$s_{j+1}$	$1_{\eta_1} 0_{\theta_{\bigstar}}$							
	$c_{j+1}$	$1_{\eta_2}$							

Explanation (Case I):

 $\zeta_{\bullet}$  If the next entry is the bug,  $R = R^{max} - \frac{3}{8}$ ; otherwise  $R = R^{max} - \frac{4}{8}$ . Either way we need these two ones or we lose  $\frac{5}{8}$ .

- $\eta_{\bigstar}$  We have already lost  $\frac{4}{8}$  so the next digit is a 2 and we cannot lose any more.
- $\theta_{\blacklozenge}$  This is the contradiction! It must be a 0 because if it were 1 we would have a 1 in the line above where we already have a 0. On the other hand, to reach either the foothold or the buggy entry on the next step, the value must be 1 or R is too small. This is the contradiction.

Explanation (Case II):

Case II has only been started above. The only two possibilities for the three spades pattern in the diagram above are

$$\stackrel{0}{\blacklozenge} \stackrel{\blacklozenge}{\blacklozenge} = \begin{array}{c} 0 & 1 \\ 0 & 1 \end{array} \quad \text{and} \quad \begin{array}{c} 0 & 0 \\ 1 & 0 \end{array} ,$$

since the foothold must be 2 modulo 4. Following through on the first possibility it becomes clear that the pattern

perpetuates ad infinitum. Following the bug backwards in the second possibility would show that the pattern of bits for every step when q = 2 from the *j*th iteration until the bug is hit would have the pattern

which quickly leads to a contradiction.

7. At least nine steps to failure. Naively, one might have thought that the bad table entries would be hit uniformly at random. If this had been the case, the bug surely would have been noticed earlier and would have had the potential to cause more significant damage in every instance it went unnoticed.

Even in the worst case of the error, the absolute error in the quotient is roughly 0.00005 = 5e - 5 when dividing two numbers in the interval  $1 \le x < 2$ . This is the

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worst case; the actual errors can be far smaller. Pratt [11] has exhaustively computed all the single precision errors and has found that the quotient 14909255/11009918 has an absolute error that is roughly 5e - 5. (In fact, it is 4.65e - 5.) This may be used to test a Pentium chip. The correct answer is 1.35416585. One must exercise care in testing. Matlab 4.2 will trap and patch the bug. Other programs may simulate division in software or use non-IEEE compliant formulas such as x/y = (1/y)\*x. The highest relative error Pratt reported is roughly 6e - 5.

The reason the error is bounded is that, no matter what, the Pentium is guaranteed to compute  $q_0$  through  $q_7$  correctly. This is what we will now prove. The result is a straightforward consequence of the results in the previous section.

In particular, if the bug occurs at step 8, we saw in section 6 that step 6 must have the form shown in the diagram below, which shows the sum, carry, and  $q_k d$  bits, respectively, starting with bit number 4. Taking into account that all the carry bits are 0 at step 1, it is fairly easy to show (following and up and down "wave" motion) that the bit patterns must fall as in the diagram below. However, since  $q_1$  is positive, it must follow that all of  $q_2, \ldots, q_6$  are positive by observing the overlap in the  $q_k d$  row from one step to the next. However, we know that  $q_6 < 0$ , so we have a contradiction. Therefore, the pattern shown below as step 6, which must occur to trigger the bug, cannot appear before the seventh step, and hence the bug appears no earlier than the ninth step.

Key to diagram below

START WITH  $\blacklozenge_0$  and follow  $\diamondsuit_1$  up the chart. Then start with  $\heartsuit_0$  and follow the  $\heartsuit$ s down the chart. Next follow the  $\clubsuit$ , the  $\diamondsuit$ , then the  $\alpha$  and the  $\beta$ . This notation makes it easier to spot the flow on the page.

	•	•	•	•	•	•	•	•	•	•	•	•	•	•	•	1	$1 \heartsuit_0$	1.	$1_{\diamond 0}$	$1_{\alpha_0}$
Step 1:	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
	•		•	·	•	•	•	•	•	•	•	•	•	•	•	$1_{\bigstar_5}$	$1_{\heartsuit_0}$	1.	$1_{\diamondsuit 0}$	$1_{\alpha_0}$
	•	·	·	·	•	•	•	•	•	•	•	•	1	$0 \heartsuit_1$	0.	$0_{\diamondsuit_1}$				·
Step 2:	•	·	•	•	•	•	•	•	•	•	•	•	$1_{\bigstar 4}$	$1 \heartsuit_1$	1.	$1 \diamond_1$	$1_{\alpha_1}$		•	•
	•	•	•		•	•	•	•	•	•	•	•				$1_{\diamondsuit 1}$			•	•
	•	•	·	•	•	•	•	·	·	1 <sub>♠3</sub>	1 <sub>♠3</sub>	$0 \heartsuit_2$	0.	$0_{\diamond_2}$	$0_{\alpha_2}$	•	•	·	·	•
Step 3:	•	•	·	·	•	·	·	·	·	$1_{\bigstar_3}$	$1_{\bigstar_3}$	$1_{\heartsuit_2}$	$1_{\clubsuit_2}$	$1_{\diamond_2}$	·	•	·	·	·	·
	•	•	•		•	•	•	•	•	$1_{\bigstar_3}$	$1_{\bigstar_3}$	$1_{\heartsuit_2}$	$1_{\clubsuit_2}$	$1_{\diamondsuit 2}$	•	•	•	•	•	•
	•	•	•	•	•	•	$1_{\bigstar_2}$	$1_{\bigstar_2}$	1 <b></b>	$0 \heartsuit_3$	0.	$0\diamond_3$	•	•	•	•	•	•	•	•
Step 4:	•	·	•	·	•	·	$1_{\bigstar_2}$	$1_{\bigstar_2}$	$1_{\bigstar_2}$	$1_{\heartsuit_3}$	1.3	•	•	•	·	•	·	·	·	•
	•	•	•	•	•	•	$1_{\bigstar_2}$	$1_{\bigstar_2}$	$1_{\bigstar_2}$	$1_{\heartsuit_3}$	$1_{\clubsuit_3}$	•	•	•	•	•	•	•	•	•
	•	•	·		$1_{\bigstar_1}$					·	·	·	·	·	·	•	·	·	·	•
Step 5:	•	·	•	$1_{\bigstar_1}$	$1_{\bigstar 1}$	$1_{\bigstar 1}$	$1_{\bigstar 1}$	$1 \heartsuit_4$	·	•	·	•	•	•	·	•	·	·	·	·
	•	•	•	$1_{\bigstar_1}$	$1_{\bigstar_1}$	$1_{\bigstar_1}$	$1_{\bigstar_1}$	$1 \heartsuit_4$	•	•	•	•	•	•	•	•	•	•	·	•
	1,	, 1 <b>♠</b> 0	$1_{\bigstar_0}$	$1_{\bigstar_0}$	$1_{\bigstar 0}$	•	•	•	•	·	·	•	•	·	·	•	•	·	·	•
Step 6:	1 <b>¢</b> (	, 1 <b>♠</b> 0	$1_{\bigstar_0}$	$1_{\bigstar_0}$	$1_{\bigstar 0}$	·	·	·	•	·	·	·	•	·	·	•	•	·	·	•
	•	$1_{\bigstar 0}$	$1_{\bigstar 0}$	$1_{\bigstar 0}$	$1_{\bigstar_0}$	•	•	•	•	•	•	•	•	•	•	•	•	•	·	•
	1																			
	Bit ≠	¥4																		

8. Conclusions. We have provided a new proof of the Coe–Tang result that the only divisors at risk are those divisors with six consecutive ones in the fifth through tenth positions. We also explain why the absolute error is bounded by 5e-5 when dividing two numbers in the standard interval [1,2). Though we do not know exactly how the error occurred, we do point out that the error was probably more than an elementary careless accident. It is this author's position that the accident was more

sophisticated, and perhaps we should think twice before laughing about the error at Intel's expense. In any event, it should be noted that the bug was discovered in 1994, and chips with copyright dates of 1995 or later should be nondefective.

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