

Problem: Solve the equation $z = (1 - \exp(-p \cdot z))/(p \cdot z)$ for $z \geq 0$ as a function of $p \geq 0$. In particular, we are interested in z when p is extremely tiny and roundoff corrupts the equation by introducing spurious roots z instead of the one true root $z = 1 - p/2 + 5p^2/12 - \dots$.

To obtain numbers of reasonable size when p is tiny, we shall recast the equation in terms of the number $u := 1 \text{ ulp of } 1$, which is the difference between 1 and the floating-point number next less than 1. Let $p := P \cdot u$. Now we seek the set of roots $z = Z(P)$ of the equation

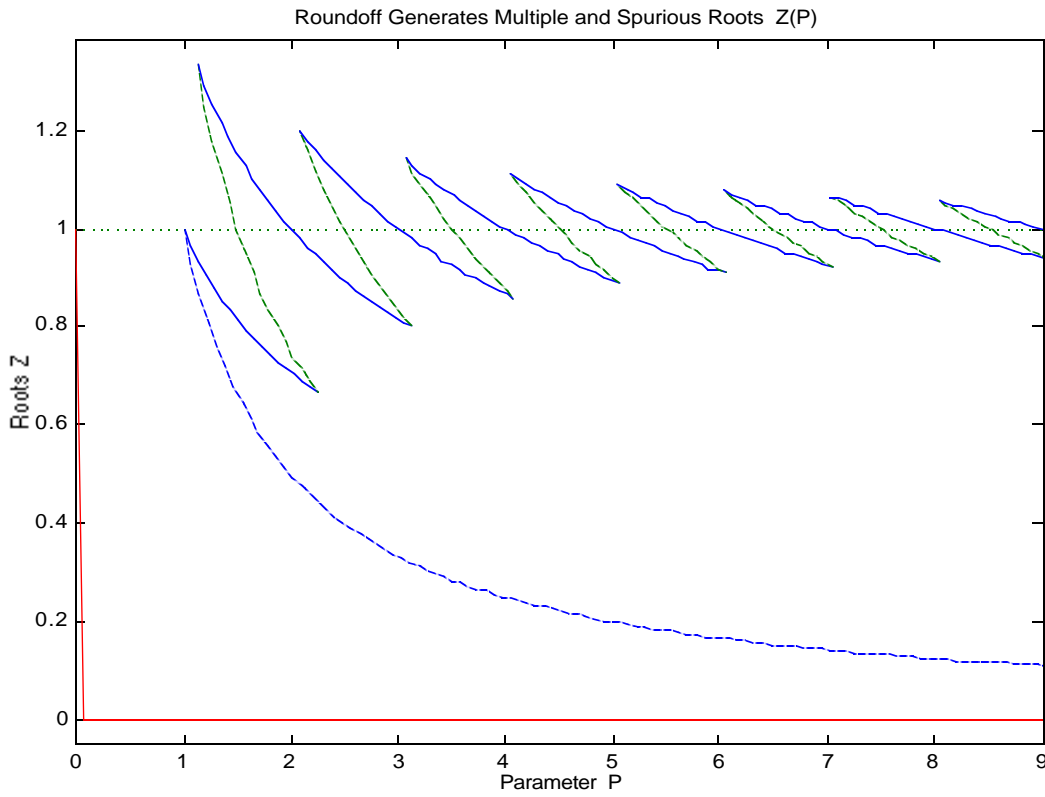
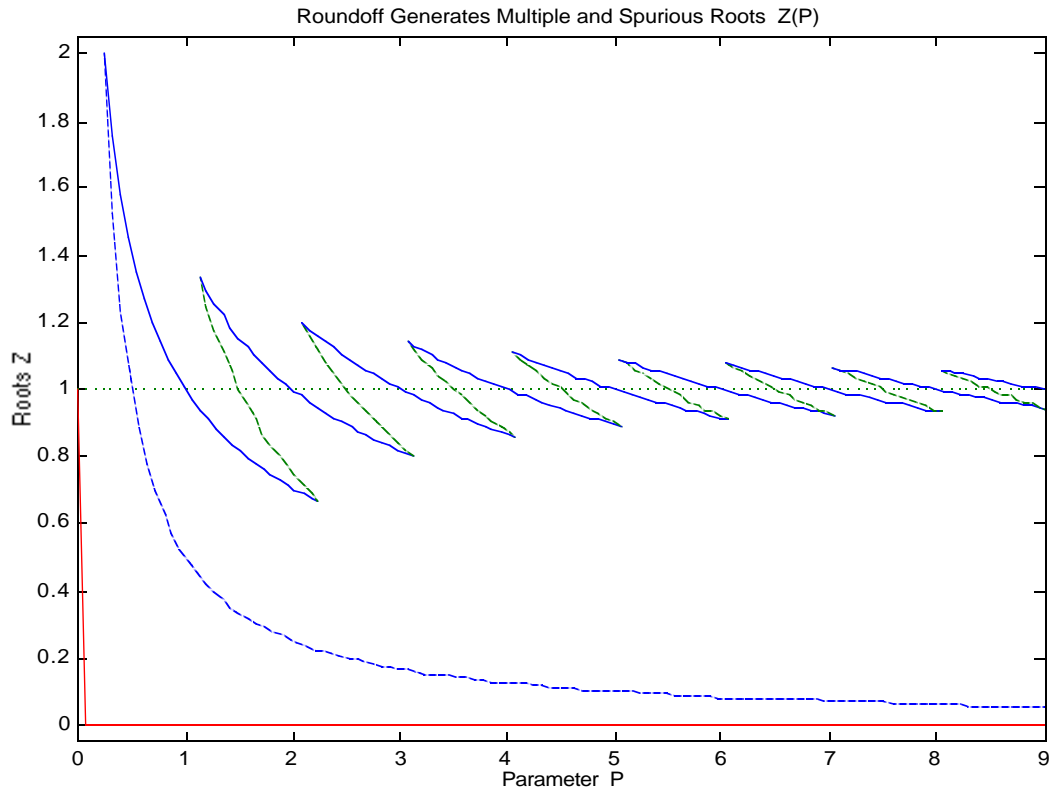
$$z = (1 - \text{Rounded}(\exp(-P \cdot z \cdot u)))/(P \cdot z \cdot u).$$

Next, for small integer values $k = 0, 1, 2, 3, \dots, 100$ in turn, define $y_{-1} := 0$ and y_k to satisfy “ $\exp(-y \cdot u)$ rounds to $1 - k \cdot u$ throughout $y_{k-1} < y < y_k$.” Were $\exp(\dots)$ correctly rounded we’d find $\text{Rounded}(\exp(-y \cdot u)) = 1 - k \cdot u$ just when $1 - (k+1/2) \cdot u < \exp(-y \cdot u) < 1 - (k-1/2) \cdot u$, which would determine $y_k = -\ln(1 - (k+1/2) \cdot u)/u \approx k + 1/2 + (k+1/2)^2 \cdot u/2 + \dots$. In fact, the last equation merely approximates y_k because $\exp(\dots)$ is not quite correctly rounded; still, any respectable implementation of $\exp(\dots)$ should be monotonic in the sense that its rounded value does not decrease when its argument increases, so y_k should be well-defined and monotonic too: $0 = y_{-1} < y_0 < y_1 < y_2 < \dots$. These values have to be computed by applying binary chop to “solve” $(1 - \exp(-y_k \cdot u))/u = k + 1/2$ for y_k on your computer.

Roundoff in $\exp(\dots)$ turns the equation to be solved into $z = k/(P \cdot z)$ while $y_{k-1} < P \cdot z < y_k$. In other words, a root is $z = Z_k(P) := \sqrt{k/P}$ while $y_{k-1}^2/k < P < y_k^2/k$, and on that interval $Z_k(P)$ is a decreasing function: $k/y_{k-1} > Z_k(P) > k/y_k$. (The case $k = 0$ is a special case; $Z_0(0) = 1$ and $Z_0(P) := 0$ for all $P > 0$ although the equation involves $0/0$ then.) But numerical root-finders find more “roots” z generated by the jumps in the rounded values of $\exp(\dots)$ as follows:

Let δ stand for any sufficiently tiny positive number. Then $\text{Rounded}(\exp(-(y_k - \delta) \cdot u)) = 1 - k \cdot u$ and $\text{Rounded}(\exp(-(y_k + \delta) \cdot u)) = 1 - (k+1) \cdot u$. Therefore, while $x \approx (y_k \pm \delta)/P$ we find that the computed value of $f(x) := x - (1 - \text{Rounded}(\exp(-P \cdot x \cdot u)))/(P \cdot x \cdot u)$ jumps down from very nearly $f((y_k - \delta)/P) \approx y_k/P - k/y_k > 0$ to very nearly $f((y_k + \delta)/P) \approx y_k/P - (k+1)/y_k < 0$ provided $y_k^2/(k+1) < P < y_k^2/k$. On this interval the sign-changing jump of $f(x)$ generates another spurious “root” $z = S_k(P) := y_k/P$ that also decreases monotonically: $(k+1)/y_k > S_k(P) > k/y_k$.

The graphs of Z_k and S_k on their respective intervals connect each other alternately to form a single zig-zag curve. See page 25 of “Personal Calculator Has Key to Solve Any Equation $f(x) = 0$.” *Hewlett-Packard Journal* **30** #12 (Dec. 1979) pp. 20-26. (A scanned copy is at <http://www.cs.berkeley.edu/~wkahan/Math128/SOLVEkey.pdf>.) The following figure, produced by Matlab 5 on a $\mu 68040$ -based Macintosh Quadra 950 shows true root $Z(P)$ as a nearly horizontal dotted line; the roots $Z_k(P)$ are shown solid red and blue, and $S_k(P)$ dashed or grey. The figure after that was produced by the same Matlab 5 program on a Power Mac 8500, whose $\exp(\dots)$ is less accurate; its missing legend on the left is a Matlab \rightarrow PICT \rightarrow PDF bug. On both computers, numerical root-finders can find as many as five “roots” instead of one.



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function y = solvezag(R, pts)
% solvezag(R) exhibits a zig-zag graph of the nonnegative roots z of the
% equation  $z = (1 - \exp(-u*P*z)) / (u*P*z)$  where  $u = \text{eps}/2$  and  $0 < P < R$ 
% and roundoff corrupts the equation (mainly by corrupting  $\exp(\dots)$ ).
% Restriction:  $2 < R < 100$ .  $y = \text{solvezag}(R)$  returns a column of the first
% several (about R) points y where  $(1 - \exp(-y*u))/u$  jumps; they
% should be very near the consecutive half-integers 0.5, 1.5, 2.5, ...
% solvezag(R, pts) plots at a density of pts/R instead of 128/R. And
% R = 10 by default if omitted.
if ( nargin < 2 ), pts = 128 ; end
if ( nargin < 1 ), R = 10 ; end
if (R<2)|(R>100), error( ' solvezag( R out of range ) ' ), end
K = round(R) ; y = yk(K) ;
h = R/pts ; P = h*[0:pts]' ; Pend = P(1+pts) ;
u = eps/2 ; Zt = 1 - 0.5*u*P.*(1 - (5/6)*u*P) ; % ... Zt = true root.
Z0 = 0*P ; Z0(1) = 1 ; % ... Z0 = degenerate root.
SP0 = [ y(1)^2 : h : Pend ]' ; S0 = y(1)./SP0 ; % ... S0 = 1st spurious root
plot( SP0,S0,'--', P,Zt,'.', P,Z0 )
ytop = max( [ S0(1), 2/y(2) ] ) + 0.05 ;
axis( [0, R-1, -0.05, ytop ] ) ; hold on ;
for k = 1:(K-1) , % ... superpose graphs of "roots" Zk and Sk .
    pl = y(k)*y(k)/k ; pr = y(k+1)*y(k+1)/k ; % ... ends of range for Zk
    prl = pr - pl ; ptsk = round( prl/h ) + 1 ;
    ZPk = pl + (prl/ptsk)*[0:ptsk]' ;
    Zk = sqrt( k ./ ZPk ) ;
    pl = y(k+1)*y(k+1)/(k+1) ; % adjust left end of range for Sk
    prl = pr - pl ; ptsk = round( prl/h ) + 1 ;
    SPk = pl + (prl/ptsk)*[0:ptsk]' ;
    Sk = y(k+1) ./ SPk ;
    plot( ZPk,Zk, '-', SPk,Sk, '--' )
end % ... k
hold off , xlabel(' Parameter P' ) , ylabel(' Roots Z' )
title( ' Roundoff Generates Multiple and Spurious Roots Z(P) ' )

function y = yk(K)
% yk(K) = [ yc(0.5), yc(1.5), yc(2.5), ..., yc(K+0.5) ]' for yc below,
% and for nonnegative integer K < 101 .
k = round(K)+1 ;
if (k<1)|(k>101), error(' yk( K out of range )'), end
y = zeros( k, 1 ) ;
for j = [1:k]
    y(j) = yc(j - 0.5) ;
end

function y = yc(c)
% yc(c) = solution y of  $ef(y) = c$ , which see below, by binary chop.
y = c-1.25 ; fl = ef(y)-c ; if fl==0, return, end
yl = y ;
y = c+1.25 ; fr = ef(y)-c ; if fr==0, return, end
yr = y ;
if fl*fr > 0 , error('Oops! Missed the sign reversal!'), end
y = (yl + yr)*0.5 ;
while (y ~= yl) & (y ~= yr)
    f = ef(y)-c ; if f==0, return, end
    if f*fr > 0 , yr = y ; fr = f ;
    else yl = y ; fl = f ; end
    y = (yl + yr)*0.5 ;
end

function y = ef(x)
%  $ef(x) = (1 - \exp(-u*x))/u$  where  $u = \text{eps}/2$  .
u = eps/2 ;
y = (1 - exp(-u*x))/u ;

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