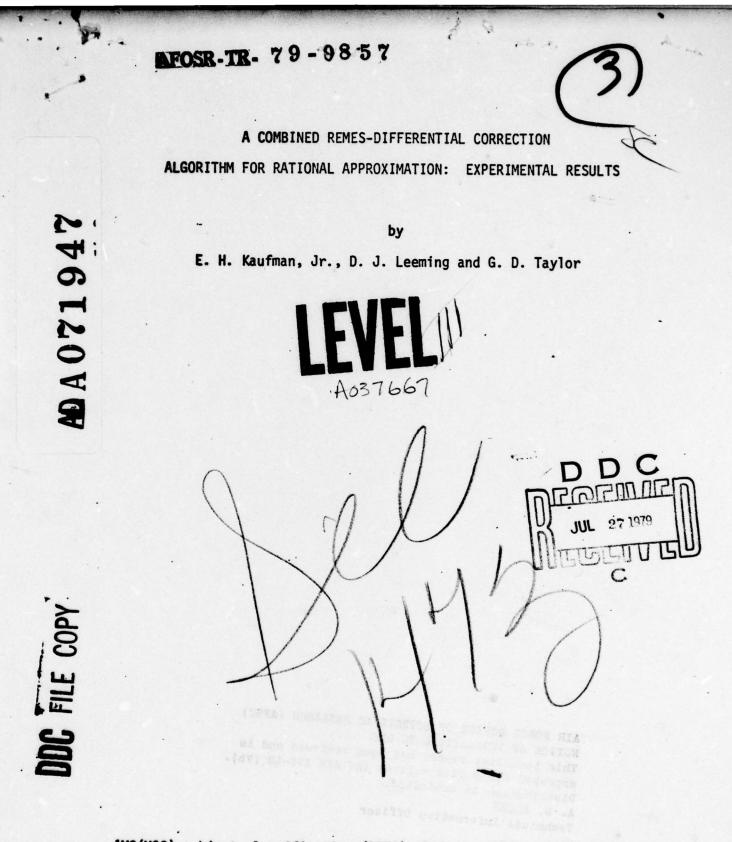


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A numerical study is done comparing three algorithms for computing best rational approximations using the uniform (Chebyshev) norm. The experimental results and theoretical considerations indicate that the Remes-difcor algorithm is superior as a general-purpose routine to both the widely-used Remes algorithm and the differential correction algorithm. The three algorithms are briefly described and discussed, and the experimental results for 70 examples are presented in six tables.

#### 1. Introduction

We consider the problem of approximating a given real-valued function f(x) on a finite subset T of an interval [a, b] by a rational function

$$R_{n}^{m}(x) = P_{m}(x)/Q_{n}(x) = \left[\sum_{j=0}^{m} a_{j}x^{j}\right] / \left[\sum_{j=0}^{n} b_{j}x^{j}\right]$$
(1)

where the integers m and n are given,  $(P_m, Q_n) = 1$ ,  $Q_n(x) > 0$  on T, and  $Q_n(x)$  is normalized by taking max  $|b_j| = 1$ . It is desired to choose  $0 \le j \le n$ .

 $R_n^m(x)$  to minimize the error norm  $||f - R_n^m|| \equiv \max\{|f(x) - R_n^m(x)|: x \in T\}$ . We note that if  $f \in C[a, b]$  and the best approximation to f on [a, b] is nondegenerate (i.e. min $(m - \partial P_m, n - \partial Q_n) = 0$ , where  $\partial P =$  degree of P), then the best approximation on T can be made arbitrarily close everywhere on [a, b] to the best approximation on [a, b] by taking T sufficiently dense in [a, b] ([3]). Thus in many cases the continuous problem can be effectively treated by discretization to a finite subset.

Research supported in part by National Research Council of Canada under grant A8061, by a University of Victoria Faculty Research grant, by the Air Force Office of Scientific Research, Air Force Systems Command, USAF, under grant AFOSR-76-2878C, and by the National Science Foundation under grant MCS-78-05847. If a computer installation wished to have a single library routine for calculating best uniform rational approximations, then according to Lee and Roberts [7] they should select either the Remes or differential correction algorithm. To be safe they should select the differential correction algorithm because of its guaranteed convergence properties; however, the costs of this choice are a significantly slower routine than the Remes algorithm and increased storage requirements. The main purpose of this paper is to provide evidence that the Remes-difcor algorithm ([4], [8]) would be a better choice than either Remes or differential correction as a general purpose algorithm.

The three algorithms and convergence theorems are discussed in Section 2 of this paper. The numerical examples are given in Section 3, and conclusions are drawn in Section 4.

#### 2. The Algorithms

The version of the Remes algorithm considered here is the same as considered by Lee and Roberts ([7]). This algorithm is based upon alternation. At the completion of the  $(k - 1)^{st}$  iteration it produces a "reference set"  $X_k = \{x_1^k, x_2^k, \dots, x_{m+n+2}^k\} \subseteq T$ . In the  $k^{th}$  iteration, the algorithm first calculates (if possible) the best approximation  $P_k/Q_k$ on  $X_k$  using Newton's method to solve the nonlinear system of equations for unknowns  $a_0, \dots, a_m, b_1, \dots, b_n$  (the coefficients of P and Q) and  $\lambda$ 

 $f(x_i^k) - P(x_i^k)/Q(x_i^k) = (-1)^i \lambda$ , i = 1, ..., m + n + 2, with  $b_0 = 1$  (2) or, equivalently,

 $f(x_i^k)Q(x_i^k) - P(x_i^k) = (-1)^i \lambda Q(x_i^k), i = 1, ..., m+n+2, with b_0 = 1.$  (3)

If  $P_k/Q_k$  is not the best approximation on T, the next reference set,  $X_{k+1}$ ,

is constructed from the extreme points of  $f - P_k/Q_k$ . This is done by selecting  $x_1^{k+1} < ... < x_{m+n+2}^{k+1}$  each in T, such that  $sgn(f(x_i^{k+1}) - P_k(x_i^{k+1})/Q_k(x_i^{k+1}))$ =  $-sgn(f(x_{i+1}^{k+1}) - P_k(x_{i+1}^{k+1})/Q_k(x_{i+1}^{k+1}))$ , i = 1, ..., m + n + 1,  $|f(x_i^{k+1}) - P_k(x_i^{k+1})/Q_k(x_i^{k+1})| \ge \max_i |f(x_i^k) - P_k(x_i^k)/Q_k(x_i^k)|$ , i = 1, ..., m + n + 2, and for some n,  $1 \le n \le m + n + 2$ ,  $|f(x_n^{k+1}) - P_k(x_n^{k+1})/Q_k(x_n^{k+1})|$ 

=  $||f - P_k/Q_k||$ . This is normally referred to as a multiple exchange. The initial reference set is chosen to be the points of T which are closest to the extreme points of the  $(m + n + 1)^{\text{St}}$  Chebyshev polynomial translated to [a, b]. This algorithm can fail to converge; this failure can be caused by the desired solution having a reference set of less than m + n + 2 points, by failure to be able to solve the nonlinear system for acceptable  $P_k/Q_k$ , or by making an improper exchange due to the existence of poles of  $P_k/Q_k$ off of the reference set  $X_k$ . It has been shown by Burke ([3]), however, that if the best approximation to f on [a, b] is nondegenerate, T is sufficiently dense in [a, b], and the choice of initial reference set is sufficiently good, then the algorithm will converge to the best approximation on T.

The differential correction program used in this paper is an improved version of a code which appeared in [6]. Recently, another version of [6] has appeared [2] which is claimed to be about 30% faster and a little more robust than the code in [6]. In order to describe the differential correction algorithm, let us assume that at the  $(k-1)^{st}$  step an approximation  $P_k/Q_k$  has been calculated with  $\Delta_k = ||f - P_k/Q_k||$ . The algorithm then proceeds to calculate the next approximation,  $P_{k+1}/Q_{k+1}$ , by using linear programming to solve the problem

 $\begin{cases} \underset{x \in T}{\text{minimize }} \max_{x \in T} \frac{|f(x)Q(x) - P(x)| - \Delta_k Q(x)}{Q_k(x)} \\ \text{subject to } |b_j| \le 1, j = 0, 1, \dots, n. \end{cases}$ (4)

The initial approximation is found by minimizing  $\max_{x \in T} |Q - P|$  with  $b_0 = 1$ , with extra constraints added to ensure that Q > 0 on T. It has been shown by Barrodale, Powell, and Roberts ([1]) that the algorithm has guaranteed monotone convergence; that is,  $\Delta_k + \inf ||f - R_n^m||$  even if no best approximation on T exists.

The Remes-difcor algorithm ([4], [8]) is a hybrid of the two algorithms described above. It differs from the Remes algorithm described above in two crucial respects. First, approximations on reference sets are found using the differential correction algorithm rather than by solving a nonlinear system of equations. Thus, an approximation with a positive denominator on the reference set is guaranteed even if the system has no solution. Second, if a g-pole (that is, a point where the denominator is very small in absolute value or negative) occurs somewhere in T off the reference set, and  $f - P_k/Q_k$ changes sign m + n + 1 times on the reference set, then the next reference set is expanded to include the point where  $Q_k$  is smallest. Note that the flexibility achieved by using differential correction on the reference set is essential here, since the new reference set will have m + n + 3 points instead of m + n + 2. One point will be deleted from this enlarged reference set after  $P_{k+1}/Q_{k+1}$  is computed. The Remes-difcor algorithm will converge regardless of the choice of initial reference set, providing that g-pole free best approximations exist on all reference sets encountered.

3. <u>Numerical Examples</u>

The three algorithms have been run on each of fourteen functions with given sets T (see Table I) using rational functions of the form  $P_0/Q_2$ ,  $P_1/Q_1$ ,

•

 $P_2/Q_2$ ,  $P_1/Q_3$ , and  $P_4/Q_2$ . The first eleven functions are the functions used by Lee and Roberts [7]. The next two functions were designed to give degenerate approximations. (Note that  $\{0, \frac{1}{4}, \frac{1}{2}, \frac{3}{4}, 1\}$  is a set of alternating extreme points for  $f_{12}(x)-1/(1+x)$  and  $\{0, .1, .2, ..., .9, 1\}$  is a set of alternating extreme points for  $f_{13}(x) - 1/[(11/20) - x]^2$ .) The last function provides examples where best approximations do not exist.

All computations were done with the University of Victoria IBM 370/145 computer using double precision arithmetic (15 digits). The Remes algorithm was terminated when the last two reference sets agreed. The differential correction algorithm was terminated when ( $||f - P_k/Q_k|| - ||f - P_{k+1}/Q_{k+1}||$ )/  $||f - P_k/Q_k||$  was  $\leq 10^{-7}$ , or after 50 iterations. The Remes-difcor algorithm was terminated when there were no g-poles and the maximum absolute error on the reference set was within  $10^{-10}$  of the maximum absolute error on the reference set, or after 20 exchanges.

Table II contains a summary of the results. In Tables IIIa, b, and c we give the CPU times (in seconds), and point out any examples where the computed approximation had a pole in [a, b]. In Table IV we give the error norms computed with the differential correction algorithm; the other algorithms produced the same error norms and best approximations whenever they produced pole-free approximations.

#### 4. Conclusions

From Table II we observe that Remes-difcor was nearly as robust as differential correction and much more robust than Remes on the set of examples run. The one failure of Remes-difcor was due to cycling of best

**approximations**, which occurred because of the apparent nonexistence of a **best approximation** on some of the reference sets.

Remes-difcor, although not as fast as Remes, was considerably faster than differential correction. Since the size of the point set over which approximations are actually computed at each stage is independent of the size of T for Remes and Remes-difcor, it is not surprising that as the size of T increased the ratio of differential correction time to Remes-difcor time increased, while the ratio of Remes-difcor time to Remes time decreased.

Differential correction does have the advantage of flexibility; since an alternating theory is not required, it can be used for such things as simultaneous approximation (see [5]) and approximation of functions of several variables. This provides an additional argument for Remes-difcor versus Remes, since a Remes-difcor program contains the differential correction subroutines, which can be called directly for problems on which Remes-difcor is inapplicable or fails. On the other hand, Remes-difcor can handle many problems for which differential correction cannot be used (because of storage problems) or would take excessive computer time.

In summary, Remes-difcor combines maximum robustness with good speed, and appears to us to be the best general purpose uniform rational approximation algorithm available today. A FORTRAN listing is available from the first author.

### Acknowledgements

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Function f(x)	[x1,xN]	Number of points (Equally spaced)
f <sub>1</sub> : e <sup>x</sup>	[-1,1]	51
<b>f<sub>2</sub>: sin(x)</b>	[-3,3]	21
f <sub>2</sub> : sin(x) f <sub>3</sub> : √x	[0,1]	11
$\mathbf{f_4}: \begin{cases} 1 \\ 0 \\ -1 \end{cases}$	$ \begin{array}{l} (0,0.5) \\ x = 0.5 \\ (0.5,1] \end{array} $	21
$f_{5}: \begin{cases} x \\ 0.5x+0.4 \end{cases}$	[0,1] (1,2]	51
$f_6: \begin{cases} e^{x} \\ e^{-x} - e^{-1} + e \end{cases}$	[0,1] (1,2]	21
f <sub>7</sub> : log(1+x)	[0,1]	51
f <sub>8</sub> : erf(x)	[0,2]	21
f <sub>9</sub> : e <sup>-x<sup>2</sup></sup>	[0,2]	11
f <sub>10</sub> : $\Gamma(x)$	[2,3]	51
f <sub>11</sub> : Γ(x)	[2,3]	101
<b>-24x/5</b> +3/2	[0, 1/4]	
f <sub>12</sub> :	$(\frac{1}{4}, \frac{1}{2}]$	21
-92x/21+47/14	$(\frac{1}{2},\frac{3}{4}]$	
26x/7-19/7	(3/4,1]	
f <sub>13</sub> : (11/20-k/10) <sup>-2</sup> + 0.1(-1) <sup>k</sup> straight line joining adjacent points	x = k/10 (k = 0,1,,10) x $\varepsilon$ [0,1], x $\neq$ k/10	11
f <sub>14</sub> : {0 1	$   \begin{array}{c}     [0,1) \\     x = 1   \end{array} $	21
(adjacent points $f_{14}$ : $\begin{cases} 0 \\ 1 \end{cases}$	[0,1)	21

. .

Data Sets Used in the Numerical Study

### TABLE II

### Summary of Results

Algorithm	No.of failures (total = 70)	No.best approx. w/ poles in [x <sub>1</sub> ,x <sub>N</sub> ]	Avg.CPU time (sec) <sup>†</sup>	Avg CPU time(sec) <sup>++</sup>
Remes	13	7	0.66	.93
Differential Correction	0	4	4.40	7.82
Remes-difcor	1	4	2.38	2.31

<sup>†</sup>average based on the 57 examples in which all three algorithms converged.

tfaverage based on the 23 examples in which all three algorithms converged and T contained 51 or more points.

# Symbols used in Tables IIIa, IIIb, IIIc

F = algorithm fails to converge.

\* = algorithm converges to an approximation with a pole in [a, b].

## TABLE II.Ia

The Remes Algorithm

CPU Times (in seconds)

	P1/Q1	P0/Q2	P2/Q2	P1/Q3	P4/Q2
f1	0.75	0.72	0.83	0.82	0.65
f <sub>2</sub>	0.24	F	0.43*	0.50*	0.30
f3	0.27	0.17	0.41	0.39	0.60
f4	0.20	F	0.56	0.53	0.92
f <sub>5</sub>	F	0.98	F	1.21	2.36
f <sub>6</sub>	0.27	0.40	0.70	0.58	1.24
f <sub>7</sub>	0.47	0.72	0.59	0.56	1.04
f <sub>8</sub>	0.24	0.24	0.50	0.46	0.45
f <sub>9</sub>	0.26	0.20	0.36	0.39	0.33
f <sub>10</sub>	0.73	0.69	0.56	0.56	. 0.76
f11	1.38	1.36	1.01	1.56	1.10
f <sub>12</sub>	0.58*	F	F	0.60*	F
f13	0.29	0.38*	1.16*	F	0.99*
f <sub>14</sub>	F	F	F	F	F

3-3

# TABLE IIIb

The Differential Correction Algorithm

CPU times (in seconds)

	P1/Q1	P0/Q2	P2/Q2	P1/Q3	P4/Q2
fl	1.36	0.90	2.37	4.13	5.11
f <sub>2</sub>	0.64	0.60	3.13	4.79	2.58
f <sub>3</sub>	0.54	1.15	1.08	1.31	2.12
f <sub>4</sub>	1.30	1.31	5.00	2.66	3.57
f <sub>5</sub>	. 3.00	3.50	7.75	5.51	19.77
F <sub>6</sub>	1.38	0.97	2.50	4.43	5.41
f <sub>7</sub>	2.28	5.93	5.34	5.46	11.05
F8	1.14	1.44	2.26	2.35	3.56
5	0.56	0.87	1.47	1.40	1.63
F10	2.47	2.65	5.54	12.70	12.98
F11	5.03	5.09	10.51	23.87	26.36
F12	1.99	1.24	3.12	2.81	7.67
F13	0.82	0.78*	1.64*	2.91*	1.52*
f <sub>14</sub>	2.15	2.14	3.52	3.69	6.00

### TABLE IIIC

The Remes-difcor Algorithm

CPU times (in seconds)

	P1/Q1	P0/Q2	P2/Q2	P1/Q3	P4/Q2
<b>f</b> 1	0.86	0.97	1.82	1.68	2.43
f <sub>2</sub>	0.33	0.10	2.87	6.42	1.01
f <sub>3</sub>	0.72	1.03	1.93	2.01	4.51
f <sub>4</sub>	0.64	0.18	4.10	2.53	5.25
f <sub>5</sub>	. 1.06	2.06	4.66	3.19	13.31
f <sub>6</sub>	0.59	0.81	2.70	3.95	7.14
f <sub>7</sub>	0.46	1.84	1.13	1.14	3.39
F <sub>8</sub>	0.60	0.87	2.24	2.10	2.49
F.9	0.79	0.82	2.33	2.32	2.95
F10	0.71	0.90	1.21	3.30	2.63
fn:	0.78	0.90	1.30	4.82	2.26
F12	2.22	1.21	2.76	2.97	F
F <sub>13</sub>	0.68	0.90*	2.59*	3.48*	7.19*
f <sub>14</sub>	1.08	1.38	4.01	2.59	4.95

## TABLE IV

Errors of Best Approximation

	P1/Q1	P0/Q2	P2/Q2	P1/Q3	P4/Q2
f1	0.20932(-1)	0.34791(-1)	0.86644(-4)	0.12392(-3)	0.21037(-6)
f <sub>2</sub>	0.62542(0)	0.99749(0)	0.30608(0)	0.30608(0)	0.66482(-2)
f <sub>3</sub>	0.36243(-1)	0.18078(0)	0.77019(-3)	0.37281(-2)	0.10202(-4)
f <sub>4</sub>	0.81818(0)	0.10000(1)	0.26923(0)	0.26923(0)	0.70465(-1)
f <sub>5</sub>	0.58916(-1)	0.22594(0)	0.54260(-1)	0.48581(-1)	0.18717(-1)
f <sub>6</sub>	0.30872(0)	0.20697(0)	0.86504(-1)	0.95354(-1)	0.30919(-1)
f <sub>7</sub>	0.85978(-3)	0.92869(-1)	0.17028(-5)	0.74224(-5)	0.58255(-8)
f <sub>8</sub>	0.44085(-1)	0.19844(0)	0.13754(-2)	0.92931(-3)	0.44515(-4)
fg	0.72164(-1)	0.69042(-1)	0.25586(-2)	0.41421(-2)	0.38213(-4)
f <sub>10</sub>	0.64376(-2)	0.64307(-2)	0.36395(-4)	0.55096(-4)	0.17428(-6)
f11	0.64420(-2)	0.64351(-2)	0.36432(-4)	0.55160(-4)	0.17660(-6)
f <sub>12</sub>	0.50000(0)	0.50000(0)	0.50000(0)	0.50000(0)	0.10186(0)
f <sub>13</sub>	0.19754(+3)	0.10000(0)	0.10000(0)	0.10000(0)	0.10000(0)
f14	0.28934(-7)	0.31263(-7)	0.41851(-7)	0.16880(-7)	0.84017(-7)

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