# **Approximation Theory**

## **Rational Function Approximation**

Lecture Notes #13

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### Disadvantage of Polynomial Approximation:

[1] Polynomials tend to be oscillatory, which causes errors. This is sometimes, but not always, fixable: — *E.g.* if we are free to select the node points we can minimize the interpolation error (*Chebyshev polynomials*), or optimize for integration (*Gaussian Quadrature*).

#### Moving Beyond Polynomials: Rational Approximation.

We are going to use rational functions, r(x), of the form

$$r(x) = \frac{p(x)}{q(x)} = \frac{\sum_{i=0}^{n} p_i x^i}{1 + \sum_{j=1}^{m} q_i x^i}$$

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Since this is a richer class of functions than polynomials — rational functions with  $q(x) \equiv 1$  are polynomials, we expect that rational approximation of degree N gives results that are at least as good as polynomial approximation of degree N.

Extension of Taylor expansion to rational functions; selecting the  $p_i$ 's and  $q_i$ 's so that  $r^{(k)}(x_0) = f^{(k)}(x_0) \ \forall k = 0, 1, \dots, N$ .

$$f(x) - r(x) = f(x) - \frac{p(x)}{q(x)} = \frac{f(x)q(x) - p(x)}{q(x)}$$

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Now, use the Taylor expansion  $f(x) \sim \sum_{i=0}^{\infty} a_i (x-x_0)^i$ , for simplicity  $x_0 = 0$ :

$$f(x) - r(x) = \frac{\sum_{i=0}^{\infty} \mathbf{a_i} \mathbf{x^i} \sum_{i=0}^{m} \mathbf{q_i} \mathbf{x^i} - \sum_{i=0}^{n} \mathbf{p_i} \mathbf{x^i}}{q(x)}.$$

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Next, we choose  $p_0, p_1, \ldots, p_n$  and  $q_1, q_2, \ldots, q_m$  so that the numerator has no terms of degree  $\leq N$ .

For simplicity we (sometimes) define the "indexing-out-of-bounds" coefficients:

$$\begin{cases} p_{n+1} = p_{n+2} = \dots = p_N = 0 \\ q_{m+1} = q_{m+2} = \dots = q_N = 0, \end{cases}$$

so we can express the coefficients of  $x^k$  in

$$\sum_{i=0}^{\infty} a_i x^i \sum_{i=0}^{m} q_i x^i - \sum_{i=0}^{n} p_i x^i = 0, \quad k = 0, 1, \dots, N$$

as

$$\sum_{i=0}^{k} a_i q_{k-i} = p_k, \quad k = 0, 1, \dots, N.$$

Find the Padé approximation of f(x) of degree 5, where  $f(x) \sim a_0 + a_1 x + \dots a_5 x^5$  is the Taylor expansion of f(x) about the point  $x_0 = 0$ .

The corresponding equations are:

| $x^0$ | $a_0$  | _ | $p_0$ | = | 0 |
|-------|--|---|-------|---|---|
| $x^1$ | $a_0q_1 + a_1$   | _ | $p_1$ | = | 0 |
| $x^2$ | $a_0q_2 + a_1q_1 + a_2$ $a_0q_3 + a_1q_2 + a_2q_1 + a_3$                                     | _ | $p_2$ | = | 0 |
| $x^3$ | $a_0q_3 + a_1q_2 + a_2q_1 + a_3$   | _ | $p_3$ | = | 0 |
| $x^4$ | $a_0q_4 + a_1q_3 + a_2q_2 + a_3q_1 + a_4$ $a_0q_5 + a_1q_4 + a_2q_3 + a_3q_2 + a_4q_1 + a_5$ | _ | $p_4$ | = | 0 |
| $x^5$ | $a_0q_5 + a_1q_4 + a_2q_3 + a_3q_2 + a_4q_1 + a_5$   | _ | $p_5$ | = | 0 |

Note:  $p_0 = a_0!!!$  (This reduces the number of unknowns and equations by one (1).)

$$\begin{bmatrix} a_0 & & & & & \\ a_1 & a_0 & & & & \\ a_2 & a_1 & a_0 & & & \\ a_3 & a_2 & a_1 & a_0 & & \\ a_4 & a_3 & a_2 & a_1 & a_0 \end{bmatrix} \begin{bmatrix} q_1 \\ q_2 \\ q_3 \\ q_4 \\ q_5 \end{bmatrix} - \begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ p_4 \\ p_5 \end{bmatrix} = - \begin{bmatrix} a_1 \\ a_2 \\ a_3 \\ a_4 \\ a_5 \end{bmatrix}.$$

$$\begin{bmatrix} a_0 & & & & & \\ a_1 & a_0 & & & & \\ a_2 & a_1 & a_0 & & & \\ a_3 & a_2 & a_1 & a_0 & & \\ a_4 & a_3 & a_2 & a_1 & a_0 \end{bmatrix} \begin{bmatrix} q_1 \\ q_2 \\ q_3 \\ q_4 \\ q_5 \end{bmatrix} - \begin{bmatrix} p_1 \\ p_2 \\ p_3 \\ p_4 \\ p_5 \end{bmatrix} = - \begin{bmatrix} a_1 \\ a_2 \\ a_3 \\ a_4 \\ a_5 \end{bmatrix}.$$

$$\begin{bmatrix} a_0 & -\mathbf{1} \\ a_1 & a_0 \\ a_2 & a_1 & \mathbf{0} \\ a_3 & a_2 & \mathbf{0} & a_0 \\ a_4 & a_3 & \mathbf{0} & a_1 & a_0 \end{bmatrix} \begin{bmatrix} q_1 \\ q_2 \\ \mathbf{p_1} \\ 0 \\ 0 \end{bmatrix} - \begin{bmatrix} \mathbf{0} \\ p_2 \\ p_3 \\ 0 \\ 0 \end{bmatrix} = - \begin{bmatrix} a_1 \\ a_2 \\ a_3 \\ a_4 \\ a_5 \end{bmatrix}.$$

$$\begin{bmatrix} a_0 & -1 & \\ a_1 & a_0 & -1 \\ a_2 & a_1 & 0 \\ a_3 & a_2 & 0 & 0 \\ a_4 & a_3 & 0 & 0 & a_0 \end{bmatrix} \begin{bmatrix} q_1 \\ q_2 \\ p_1 \\ p_2 \\ 0 \end{bmatrix} - \begin{bmatrix} 0 \\ 0 \\ p_3 \\ 0 \\ 0 \end{bmatrix} = - \begin{bmatrix} a_1 \\ a_2 \\ a_3 \\ a_4 \\ a_5 \end{bmatrix}.$$

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The Taylor series expansion for  $e^{-x}$  about  $x_0 = 0$  is  $\sum_{k=0}^{\infty} \frac{(-1)^k}{k!} x^k$ , hence  $\{a_0, a_1, a_2, a_3, a_4, a_5\} = \{1, -1, \frac{1}{2}, \frac{-1}{6}, \frac{1}{24}, \frac{-1}{120}\}$ .

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$$\begin{bmatrix} 1 & 0 & -1 & & \\ -1 & 1 & 0 & -1 & \\ 1/2 & -1 & 0 & 0 & -1 \\ -1/6 & 1/2 & 0 & 0 & 0 \\ 1/24 & -1/6 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} q_1 \\ q_2 \\ p_1 \\ p_2 \\ p_3 \end{bmatrix} = - \begin{bmatrix} -1 \\ 1/2 \\ -1/6 \\ 1/24 \\ -1/120 \end{bmatrix},$$

which gives  $\{q_1, q_2, p_1, p_2, p_3\} = \{2/5, 1/20, -3/5, 3/20, -1/60\}$ 

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which gives  $\{q_1, q_2, p_1, p_2, p_3\} = \{2/5, 1/20, -3/5, 3/20, -1/60\}$ , *i.e.* 

$$r_{3,2}(x) = \frac{1 - \frac{3}{5}x + \frac{3}{20}x^2 - \frac{1}{60}x^3}{1 + \frac{2}{5}x + \frac{1}{20}x^2}$$

All the possible Padé approximations of degree 5 are:

$$r_{5,0}(x) = 1 - x + \frac{1}{2}x^2 - \frac{1}{6}x^3 + \frac{1}{24}x^4 - \frac{1}{120}x^5$$

$$r_{4,1}(x) = \frac{1 - \frac{4}{5}x + \frac{3}{10}x^2 - \frac{1}{15}x^3 + \frac{1}{120}x^4}{1 + \frac{1}{5}x}$$

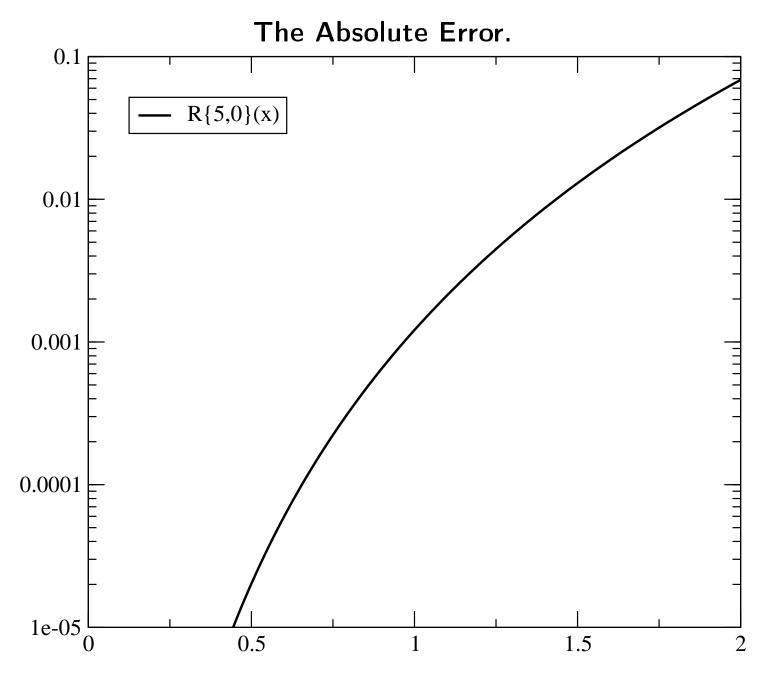
$$r_{3,2}(x) = \frac{1 - \frac{3}{5}x + \frac{3}{20}x^2 - \frac{1}{60}x^3}{1 + \frac{2}{5}x + \frac{1}{20}x^2}$$

$$r_{2,3}(x) = \frac{1 - \frac{2}{5}x + \frac{1}{20}x^2}{1 + \frac{3}{5}x + \frac{3}{20}x^2 + \frac{1}{60}x^3}$$

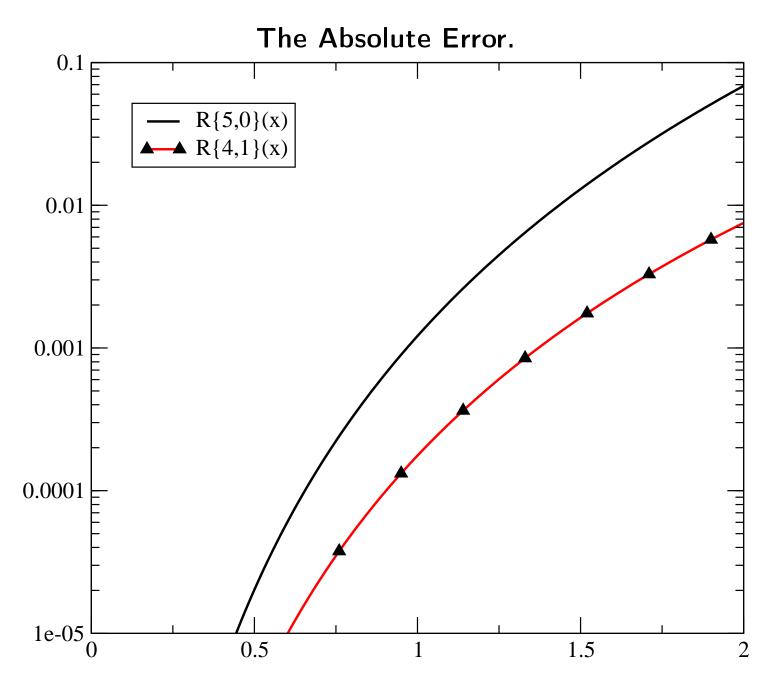
$$r_{1,4}(x) = \frac{1 - \frac{1}{5}x}{1 + \frac{4}{5}x + \frac{3}{10}x^2 + \frac{1}{15}x^3 + \frac{1}{120}x^4}$$

$$r_{0,5}(x) = \frac{1}{1 + x + \frac{1}{2}x^2 + \frac{1}{6}x^3 + \frac{1}{24}x^4 + \frac{1}{120}x^5}$$

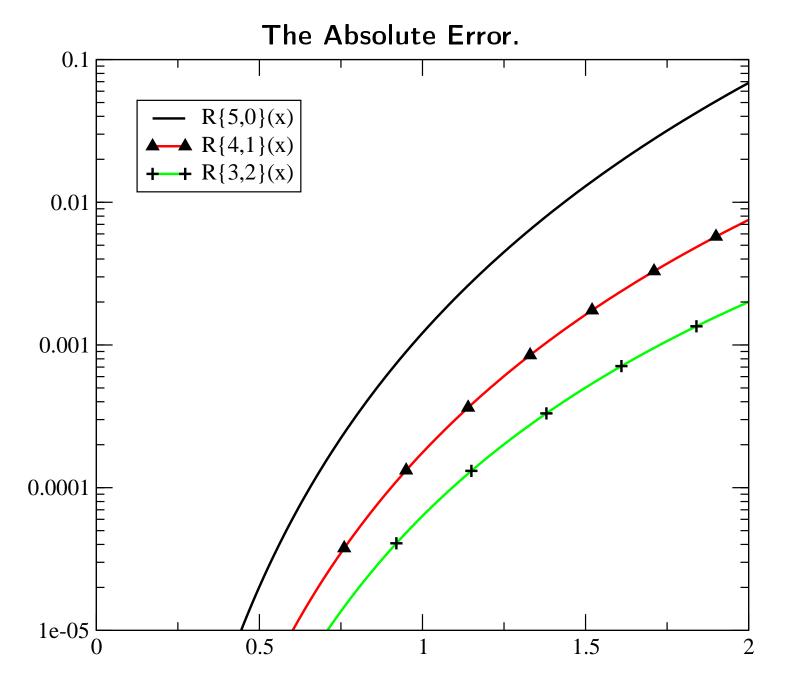
**Note:**  $r_{5,0}(x)$  is the Taylor polynomial of degree 5.



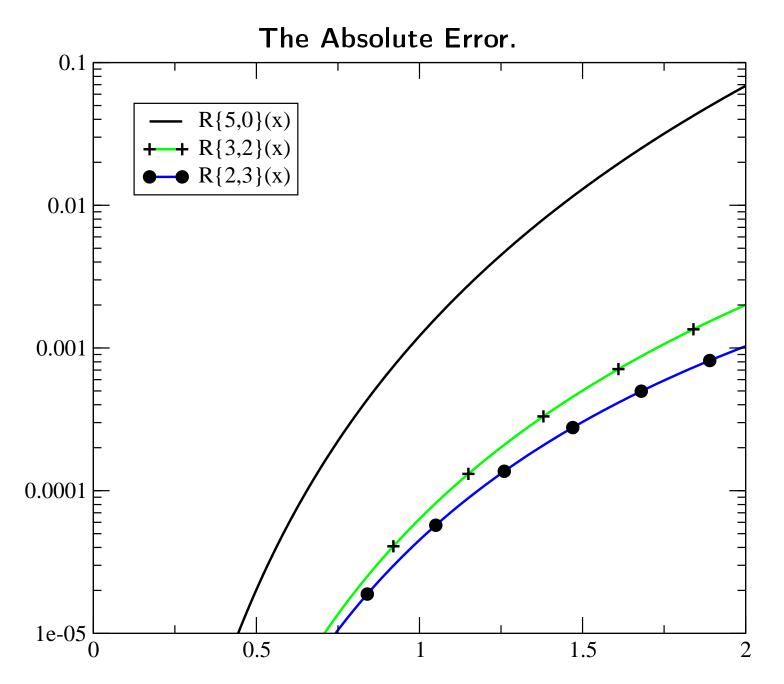
Approximation Theory: Rational Function Approximation - p. 10/20



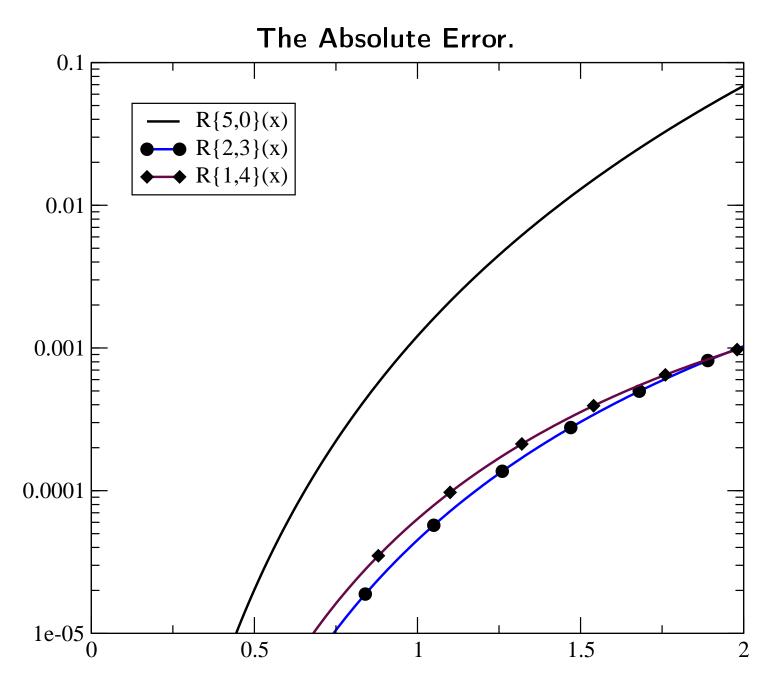
Approximation Theory: Rational Function Approximation - p. 10/20



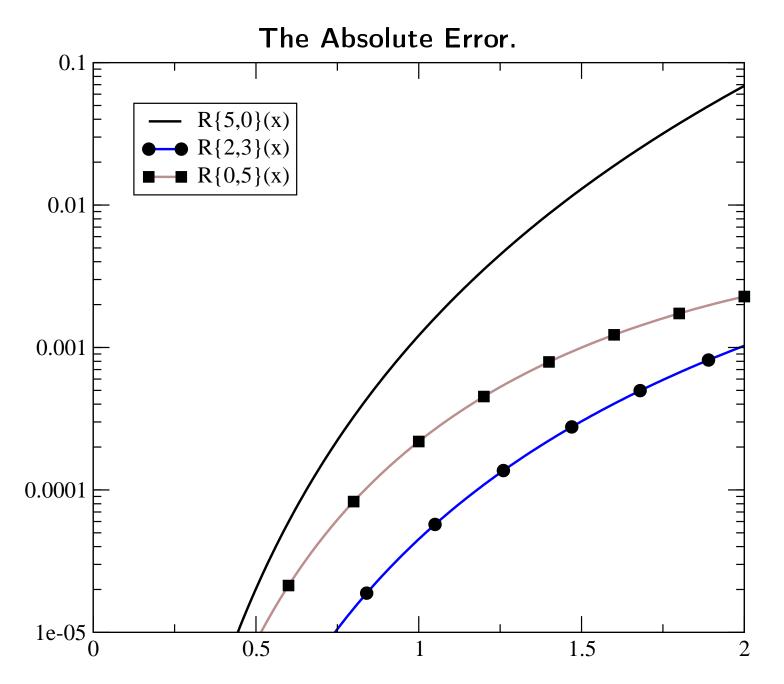
Approximation Theory: Rational Function Approximation – p. 10/20



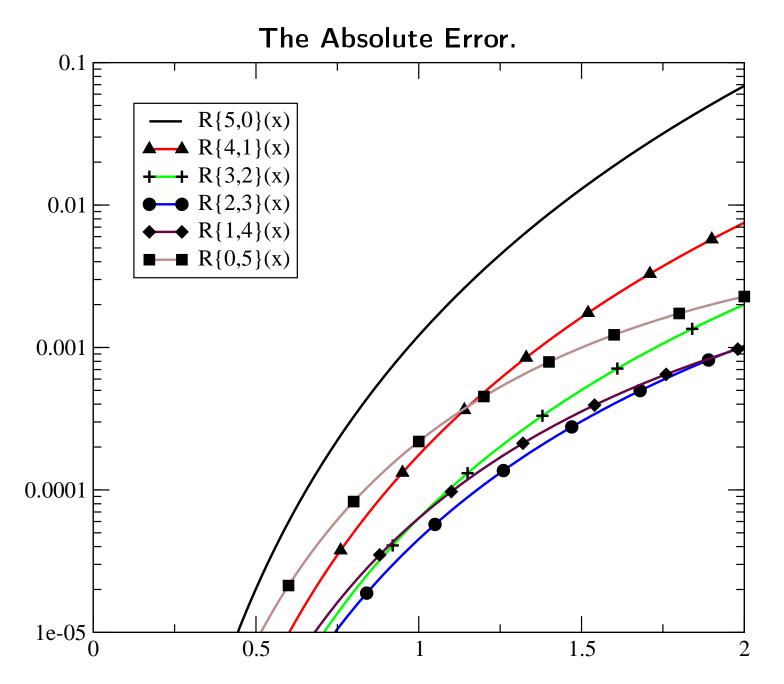
Approximation Theory: Rational Function Approximation - p. 10/20



Approximation Theory: Rational Function Approximation - p. 10/20



Approximation Theory: Rational Function Approximation - p. 10/20



Approximation Theory: Rational Function Approximation - p. 10/20

The algorithm in the book looks very frightening! If we think in term of the matrix problem defined earlier, it is easier to figure out what is going on:

```
% The Taylor Coefficients, a_0, a_1, a_2, a_3, a_4, a_5
a = \begin{bmatrix} 1 & -1 & 1/2 & -1/6 & 1/24 & -1/120 \end{bmatrix}';
N = length(a); A = zeros(N-1,N-1);
% m is the degree of q(x), and n the degree of p(x)
m = 3; n = N-1-m;
% Set up the columns which multiply q_1 through q_m
for i=1:m
  A(i:(N-1),i) = a(1:(N-i));
end
% Set up the columns that multiply p_1 through p_n
A(1:n,m+(1:n)) = -eye(n)
% Set up the right-hand-side
b = - a(2:N);
% Solve
c = A b;
Q = [1 ; c(1:m)]; % Select q_0 through q_m
P = [a_0 ; c((m+1):(m+n))]; % Select p_0 through p_n
```

|                    | One Point | Optimal Points |
|--------------------|-----------|----------------|
| Polynomials        | Taylor    | Chebyshev      |
| Rational Functions | Padé      | ???            |

From the example  $e^{-x}$  we can see that Padé approximations suffer from the *same problem* as Taylor polynomials – they are very accurate near *one point*, but away from that point the approximation degrades.

"Chebyshev-placement" of interpolating points for polynomials gave us an optimal (uniform) error bound over the interval.

Can we do something similar for rational approximations???

#### Chebyshev Basis for the Padé Approximation!

We use the **same** idea — instead of expanding in terms of the basis functions  $x^k$ , we will use the **Chebyshev polynomials**,  $T_k(x)$ , as our basis, *i.e.* 

$$r_{n,m}(x) = \frac{\sum_{k=0}^{n} p_k T_k(x)}{\sum_{k=0}^{m} q_k T_k(x)}$$

where N = n + m, and  $q_0 = 1$ .

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where N = n + m, and  $q_0 = 1$ .

We also need to expand f(x) in a series of Chebyshev polynomials:

$$f(x) = \sum_{k=0}^{\infty} a_k T_k(x),$$

so that

$$f(x) - r_{n,m}(x) = \frac{\sum_{k=0}^{\infty} a_k T_k(x) \sum_{k=0}^{m} q_k T_k(x) - \sum_{k=0}^{n} p_k T_k(x)}{\sum_{k=0}^{m} q_k T_k(x)}.$$

Again, the coefficients  $p_0, p_1, \ldots, p_n$  and  $q_1, q_2, \ldots, q_m$  are chosen so that the numerator has zero coefficients for  $T_k(x)$ ,  $k=0,1,\ldots,N$ , i.e.

$$\sum_{k=0}^{\infty} a_k T_k(x) \sum_{k=0}^{m} q_k T_k(x) - \sum_{k=0}^{n} p_k T_k(x) = \sum_{\mathbf{k}=\mathbf{N}+1}^{\infty} \gamma_k T_k(x).$$

We will need the following relationship:

$$T_i(x)T_j(x) = \frac{1}{2} [T_{i+j}(x) + T_{|i-j|}(x)].$$

Also, we must compute (usually numerically)

$$a_0 = \frac{1}{\pi} \int_{-1}^1 \frac{f(x)}{\sqrt{1 - x^2}} dx$$
 and  $a_k = \frac{2}{\pi} \int_{-1}^1 \frac{f(x)T_k(x)}{\sqrt{1 - x^2}} dx$ ,  $k \ge 1$ .

### Example: Revisiting $e^{-x}$ with Chebyshev-Padé Approximation 1/5

The 8<sup>th</sup> order Chebyshev-expansion (ALL PRAISE MAPLE) for  $e^{-x}$  is

$$P_8^{\mathsf{CT}}(x) = 1.266065878 \, T_0(x) - 1.130318208 \, T_1(x) + 0.2714953396 \, T_2(x)$$
$$-0.04433684985 \, T_3(x) + 0.005474240442 \, T_4(x)$$
$$-0.0005429263119 \, T_5(x) + 0.00004497732296 \, T_6(x)$$
$$-0.000003198436462 \, T_7(x) + 0.0000001992124807 \, T_8(x)$$

and using the same strategy — building a matrix and right-hand-side utilizing the coefficients in this expansion, we can solve for the Chebyshev-Padé polynomials of degree  $(n+2m) \leq 8$ : —

Next slide shows the matrix set-up for the  $r_{3,2}^{\sf CP}(x)$  approximation.

Note: Due to the "folding",  $T_i(x)T_j(x)=\frac{1}{2}\left[T_{i+j}(x)+T_{|i-j|}(x)\right]$ , we need n+2m Chebyshev-expansion coefficients. (Burden-Faires do not mention this, but it is "obvious" from algorithm 8.2; Example 2 (p. 519) is broken, – it needs  $\tilde{P}_7(x)$ .)

# Example: Revisiting $e^{-x}$ with Chebyshev-Padé Approximation 2/5

## Example: Revisiting $e^{-x}$ with Chebyshev-Padé Approximation 3/5

$$\mathbf{R_{4,1}^{CP}(x)} =$$

$$\frac{1.155054 T_0(x) - 0.8549674 T_1(x) + 0.1561297 T_2(x) - 0.01713502 T_3(x) + 0.001066492 T_4(x)}{T_0(x) + 0.1964246628 T_1(x)}$$

$$\mathbf{R_{3,2}^{CP}(x)} =$$

$$\frac{1.050531166\,T_0(x) - 0.6016362122\,T_1(x) + 0.07417897149\,T_2(x) - 0.004109558353\,T_3(x)}{T_0(x) + 0.3870509565\,T_1(x) + 0.02365167312\,T_2(x)}$$

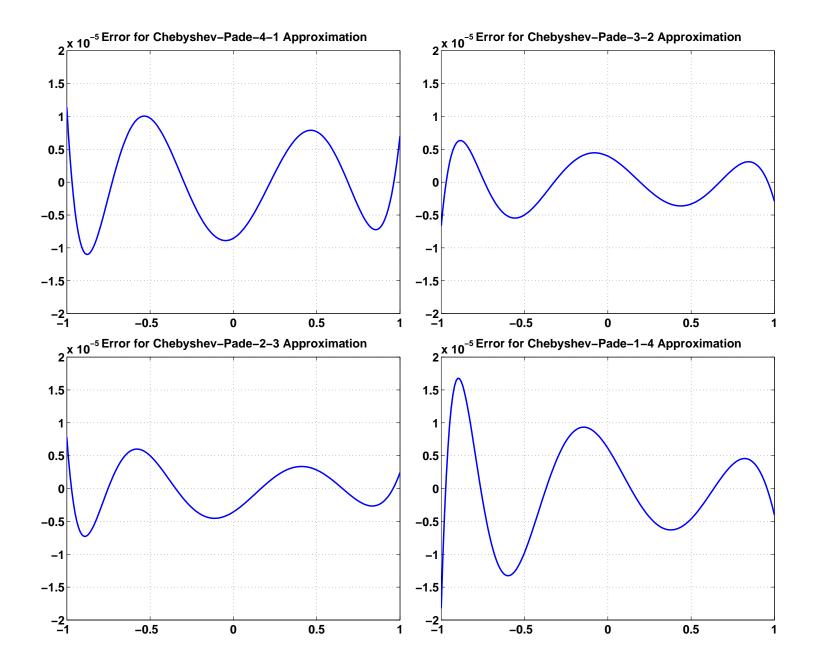
$$\mathbf{R_{2,3}^{CP}(x)} =$$

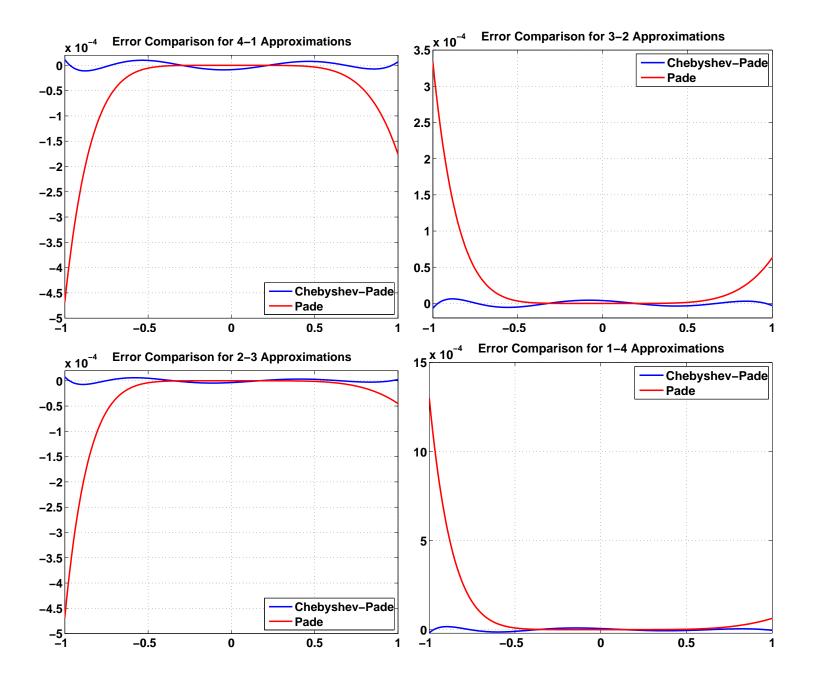
$$\frac{0.9541897238 \, T_0(x) - 0.3737556255 \, T_1(x) + 0.02331049609 \, T_2(x)}{T_0(x) + 0.5682932066 \, T_1(x) + 0.06911746318 \, T_2(x) + 0.003726440404 \, T_3(x)}$$

$$\mathbf{R_{1,4}^{CP}}(\mathbf{x}) =$$

$$0.8671327116 T_0(x) - 0.1731320271 T_1(x)$$

$$\overline{T_0(x) + 0.73743710 T_1(x) + 0.13373746 T_2(x) + 0.014470654 T_3(x) + 0.00086486509 T_4(x)}$$





The Chebyshev basis does not give an optimal (in the min-max sense) rational approximation. However, the result can be used as a starting point for the second Remez algorithm. It is an iterative scheme which converges to the best approximation.

A discussion of how and why (and why not) you may want to use the second Remez' algorithm can be found in *Numerical Recipes in C:*The Art of Scientific Computing (Section 5.13). [You can read it for free on the web — just Google for it!]