

Talbot quadratures and rational approximations

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With thanks to



André Weideman
Stellenbosch



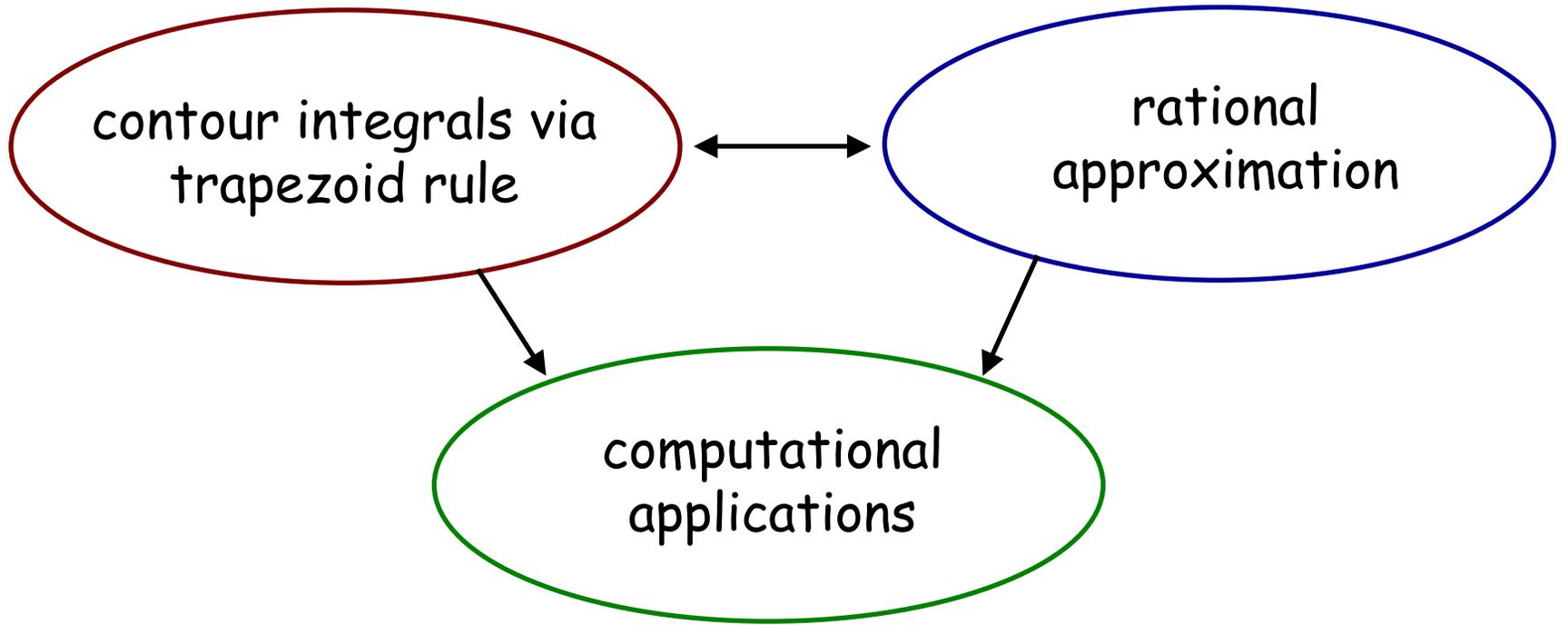
Thomas Schmelzer
Oxford

talk today
at 14.45!



T. + Weideman + Schmelzer, "Talbot quadratures and rational approximations", *BIT*, to appear

Weideman + T., "Parabolic and hyperbolic contours for computing the Bromwich integral", *Math. Comp.*, to appear



contour integrals via trapezoid rule

Exponential accuracy of trapezoid rule for analytic functions

Periodic interval

Poisson 1826, Davis 1959



Real line

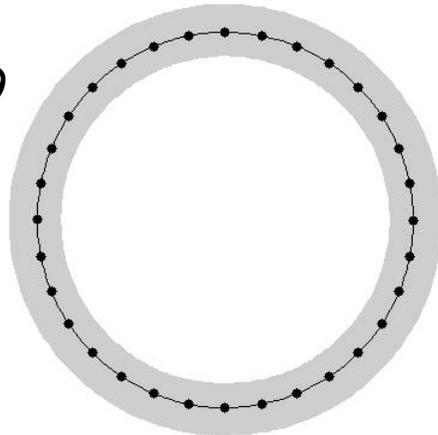
Turing 1943, Goodwin 1949, Martensen 1968, Stenger 1981



error $e^{-2\pi a / \Delta x}$

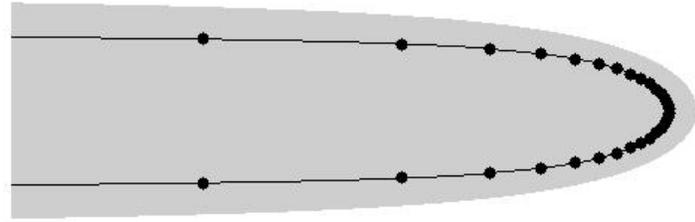
Circle

Davis 1959



Inverse Laplace transform contour

Talbot 1979, Weideman 2005



(trap. rule after change of variables)

In complex analysis a particular interest is **Cauchy integrals**

$$f(a) = \frac{1}{2\pi i} \int_C \frac{f(z)}{z - a} dz$$

rational approximation

where C encloses a , or for a matrix or operator,

$$f(A) = \frac{1}{2\pi i} \int_C (z - A)^{-1} f(z) dz$$

resolvent integral

where C encloses $\text{spec}(A)$. Use of a quadrature formula such as the trapezoid rule turns these into **rational approximations**:

$$f(a) \approx \frac{1}{2\pi i} \sum_k \frac{c_k f(z_k)}{z_k - a}$$

$r(a)$

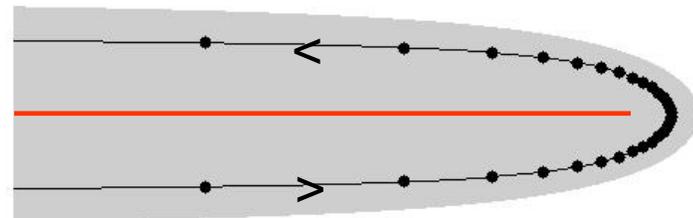
$$f(A) \approx \frac{1}{2\pi i} \sum_k c_k f(z_k) (z_k - A)^{-1}$$

$r(A)$

A special case of a Cauchy integral is the
inverse Laplace transform e^A of $(z-A)^{-1}$:

"Bromwich integral"

$$e^A = \frac{1}{2\pi i} \int_C (z - A)^{-1} e^z dz$$



C winds around $(-\infty, 0]$

This talk is about this and similar problems
 with e^z or e^{tz} in the integrand, for which
 we consider two types of numerical method:

This formula is valid
 if A is a matrix or
 hermitian operator
 with spectrum ≤ 0 .
 Generalizations e.g.
 to sectorial operators.

TW = Talbot/Weideman

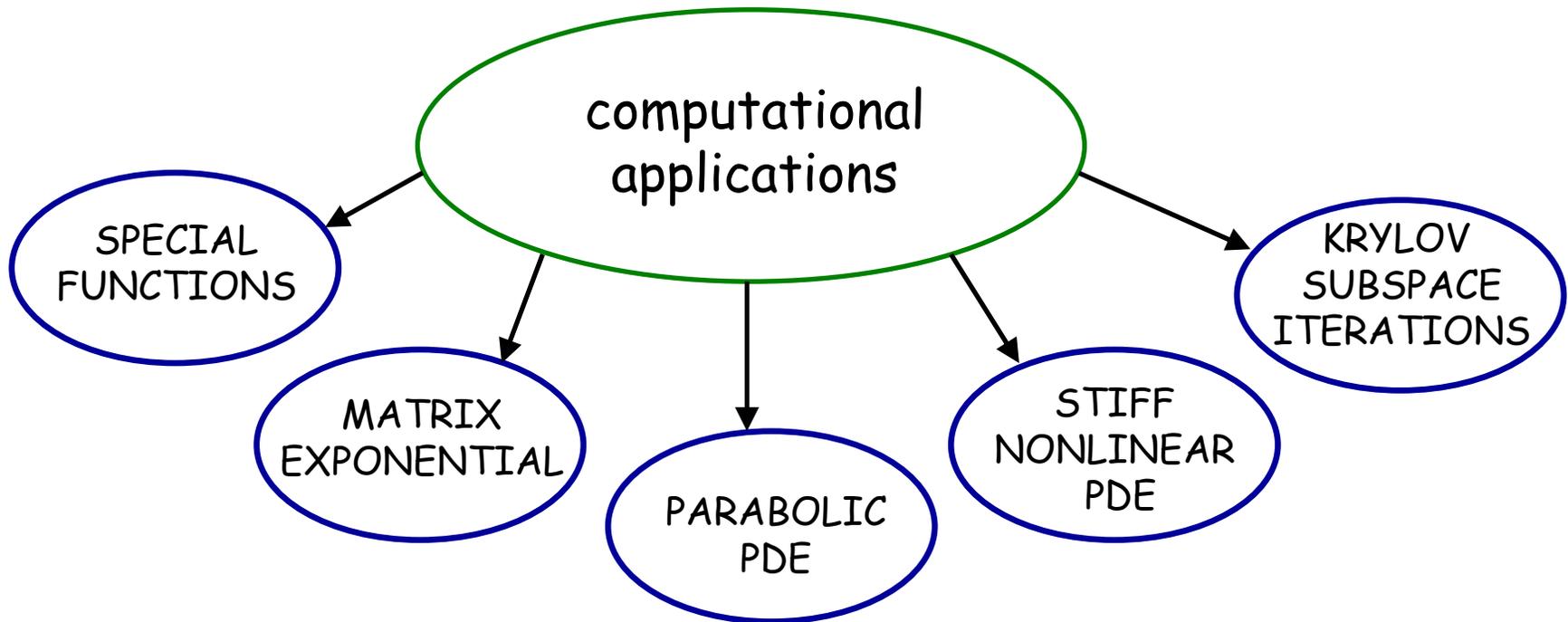
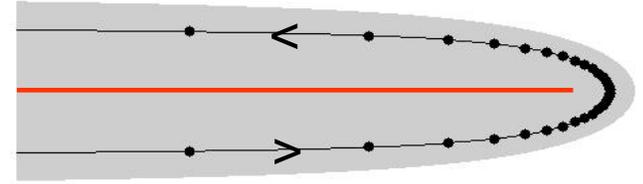
based on quadrature
 formulas on contour

CMV = Cody-Meinardus-Varga

based on best approximation
 of e^z on $(-\infty, 0]$

$$e^A = \frac{1}{2\pi i} \int_C (z - A)^{-1} e^z dz$$

and similar integrals



Plan for the rest of the talk:

- (1) Describe and compare TW contours vs. CMV best approxs.
- (2) Show a couple of computed examples

TALBOT-WEIDEMAN COTANGENT CONTOUR

Talbot (1979) proposed transplanting the trap. rule from $[-\pi, \pi]$:

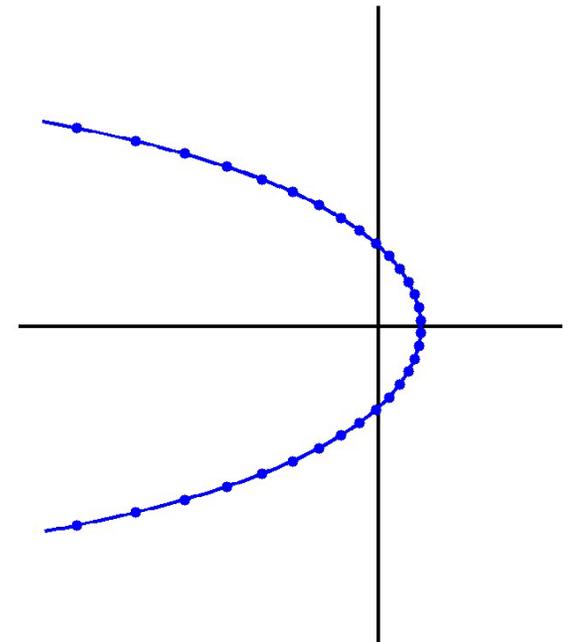
$$z(\theta) = \sigma + \mu(\theta \cot \theta + \nu i \theta)$$

Weideman (2005) optimized the parameters:

$$z(\theta) = N [0.5017 \theta \cot(0.6407 \theta) - 0.6122 + 0.2645 i \theta]$$

with the exponential convergence rate

$$\text{Error} \approx e^{-1.36N} \approx 3.89^{-N}$$



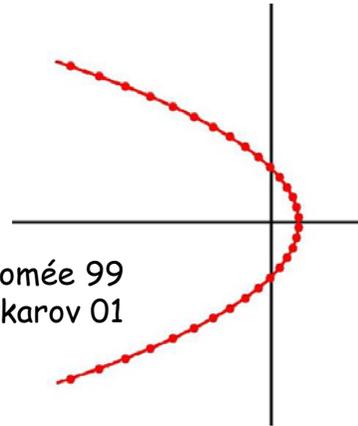
Weideman has also found an optimal **PARABOLIC CONTOUR**

$$z(\theta) = N [0.1309 - 0.1194\theta^2 + 0.2500i\theta]$$

with convergence rate

$$\text{Error} \approx e^{-1.05N} \approx 2.85^{-N}$$

cf. Sheen & Sloan & Thomée 99
Gavrilyuk & Makarov 01



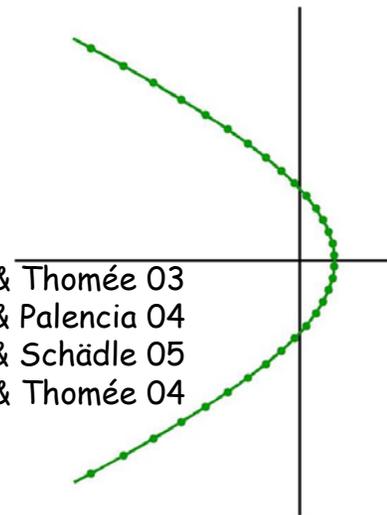
and an optimal **HYPERBOLIC CONTOUR**

$$z(\theta) = 2.246N [1 - \sin(1.1721 - 0.3443i\theta)]$$

with convergence rate

$$\text{Error} \approx e^{-1.16N} \approx 3.20^{-N}$$

cf. Sheen & Sloan & Thomée 03
López-Fernández & Palencia 04
López-Fernández & Palencia & Schädle 05
McLean & Thomée 04



These formulas are again written for $\theta \in [-\pi, \pi]$.
(Artificial periodicity: exponentially small
integrand at $|\theta| \approx \pi$.)

INTERPRETATION AS RATIONAL APPROXIMATIONS TO e^z

Suppose we approximate by quadrature

$$\frac{1}{2\pi i} \int_C e^z f(z) dz \approx \sum_{k=1}^N c_k e^{z_k} f(z_k)$$

where $f(z)$ is analytic for $z \notin (-\infty, 0]$.

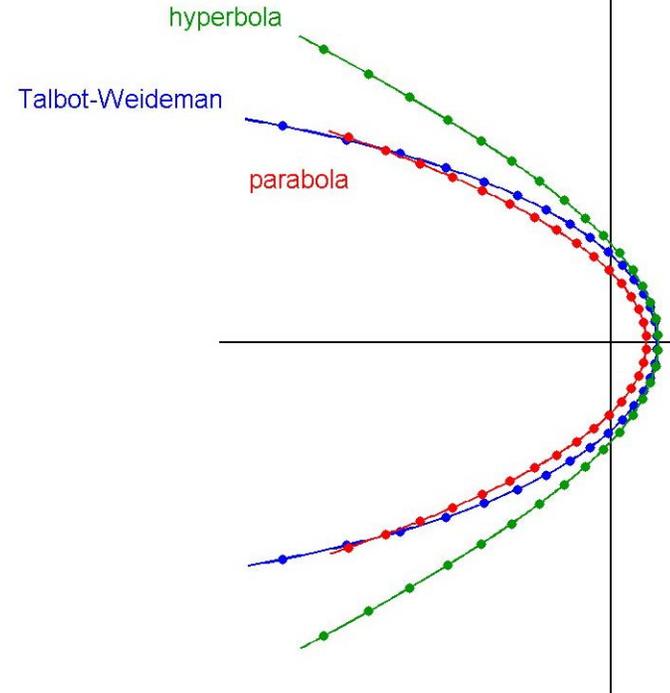
By residue calculus we can interpret this sum as

$$\frac{1}{2\pi i} \int_C r(z) f(z) dz, \quad r(z) = - \sum_{k=1}^N \frac{c_k e^{z_k}}{z - z_k}$$

assuming $|f(z)| \rightarrow 0$ as $|z| \rightarrow \infty$. In particular if $z = z(\theta)$ and we use the trapezoid rule for $\theta \in [-\pi, \pi]$, we get

$$c_k = \frac{-i}{N} (dz/d\theta)_k,$$

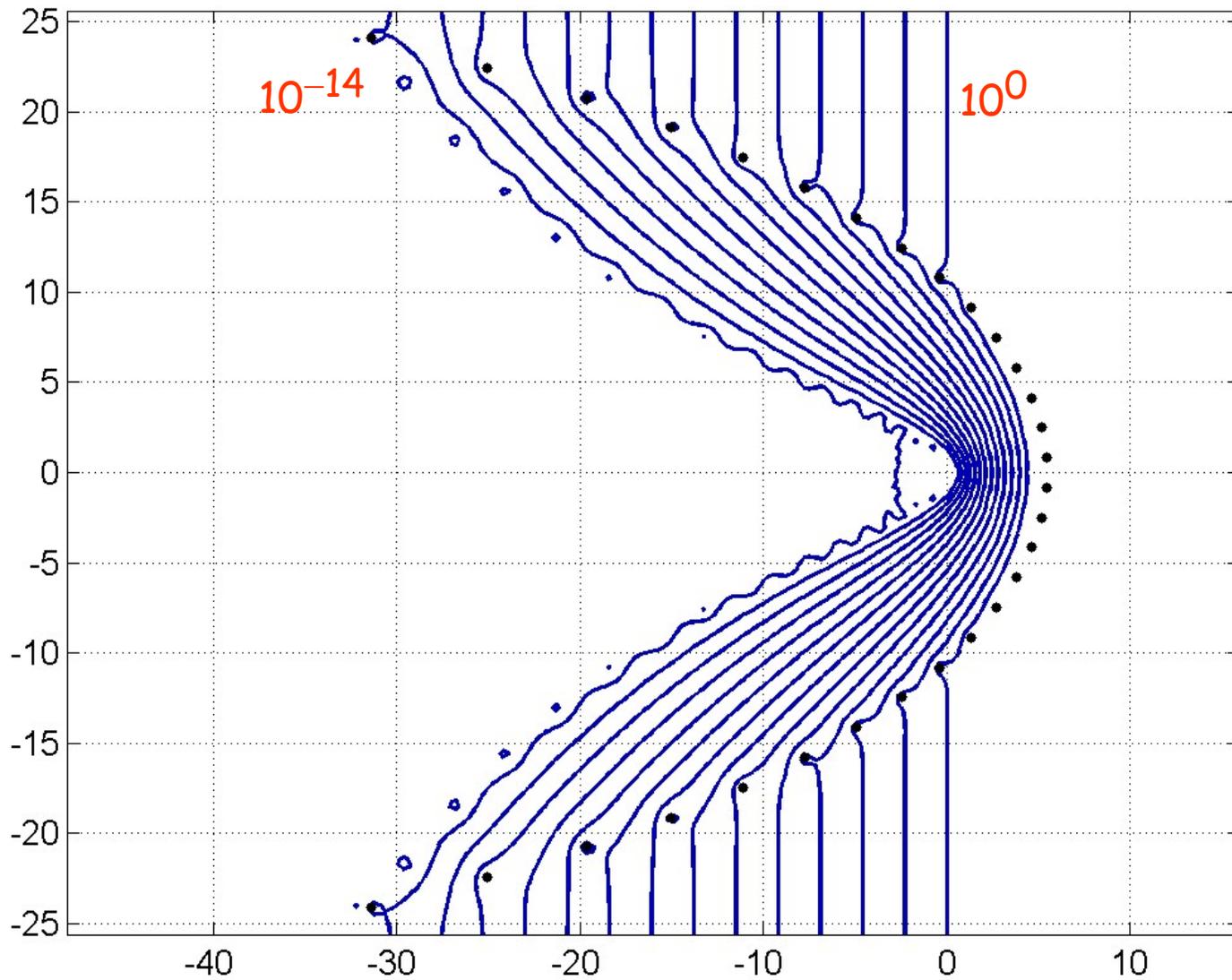
$$r(z) = \frac{i}{N} \sum_{k=1}^N \frac{e^{z_k} (dz/d\theta)_k}{z - z_k}$$



type $(N-1, N)$ rational approximation to e^z

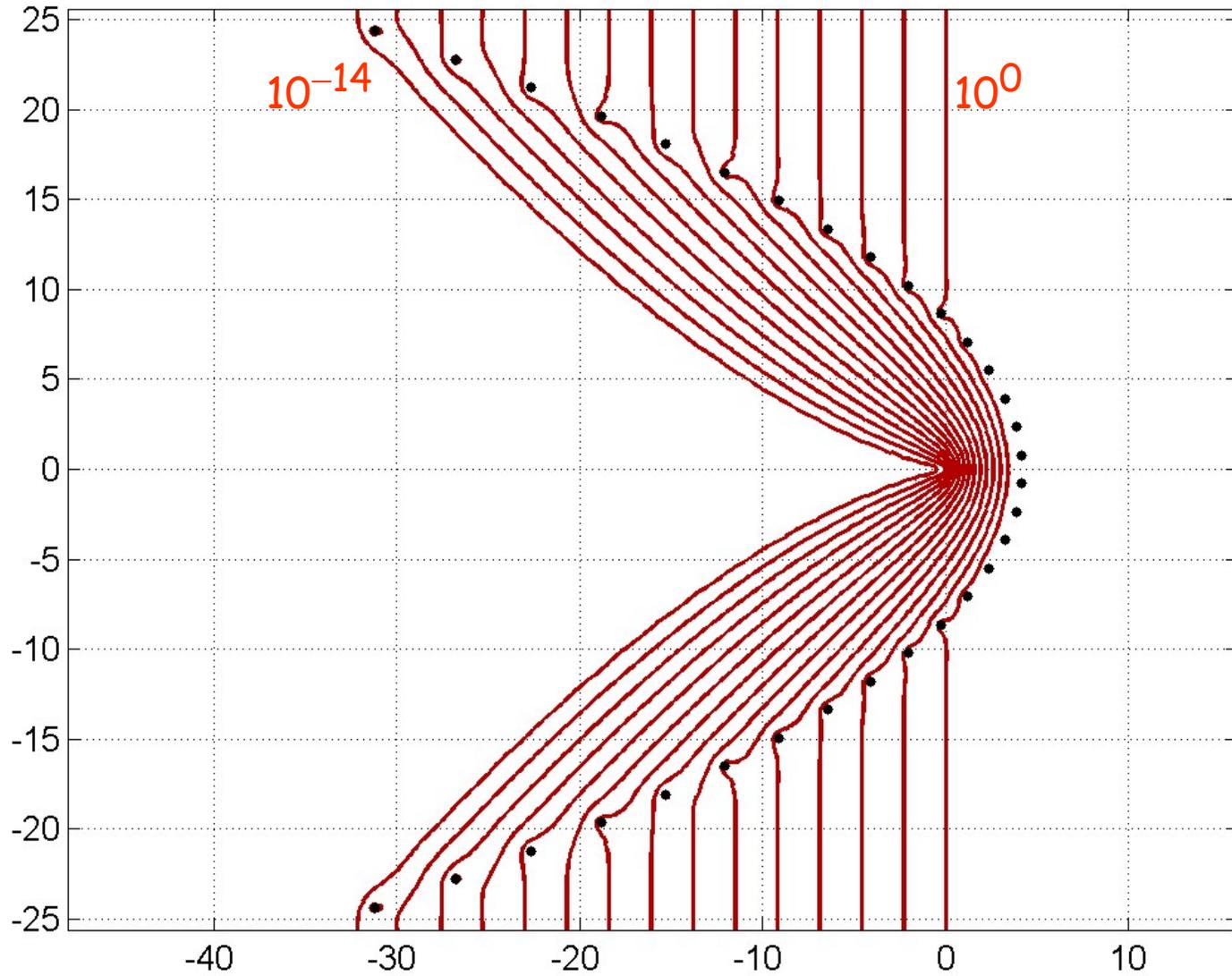
$$|e^z - r(z)|$$

Talbot-Weideman $N = 32$



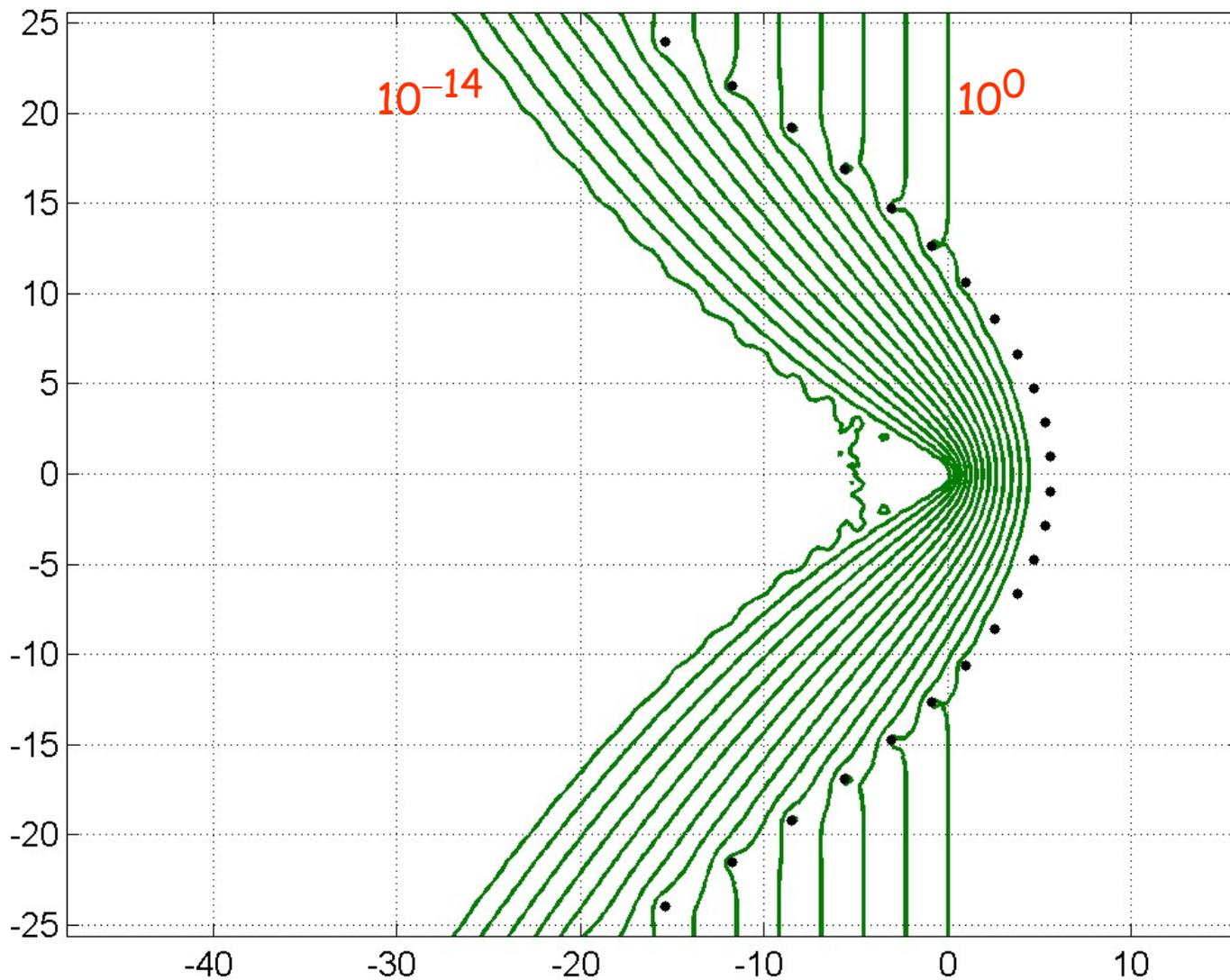
$$|e^z - r(z)|$$

parabola $N = 32$



$$|e^z - r(z)|$$

hyperbola N = 32



USE OF BEST APPROXIMATIONS ON $(-\infty, 0]$

Instead of obtaining rational approximants implicitly from quadrature formulas, we could construct them directly.

Cody, Meinardus & Varga (1969) made famous the problem of best approximation of e^z in the sup-norm on $(-\infty, 0]$.

Here the convergence rate is famous:

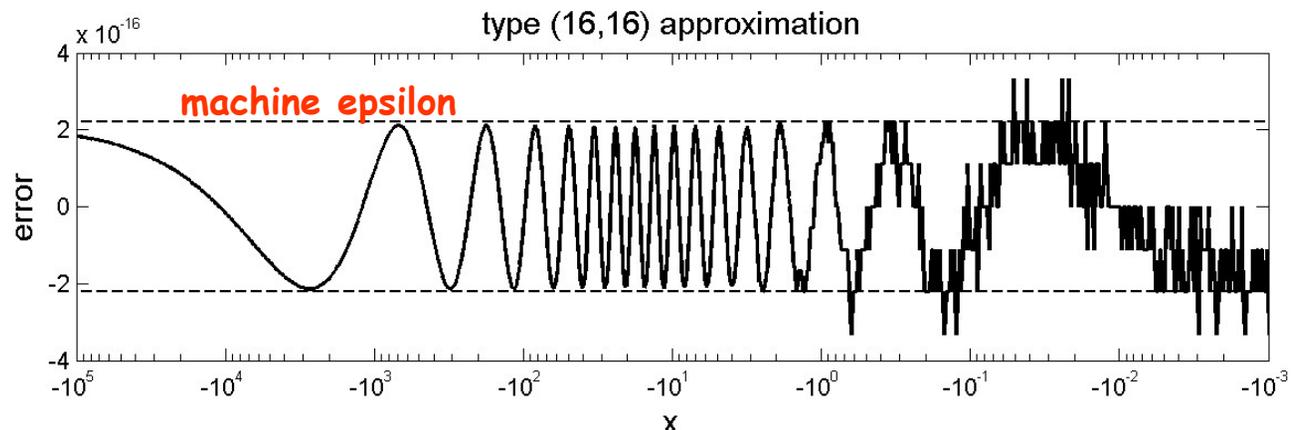
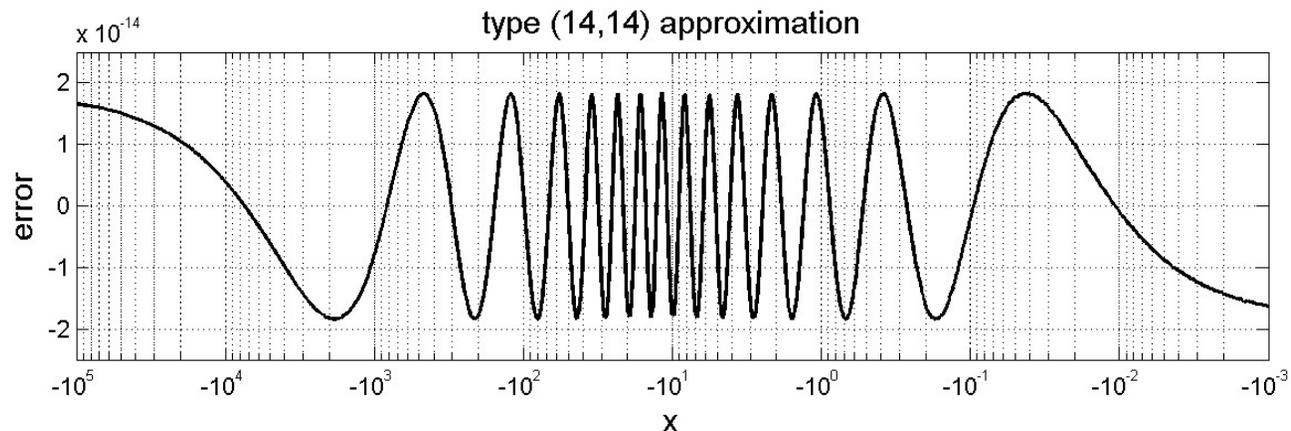
$$\text{Error} \approx e^{-2.2288N} \approx 9.28903^{-N}$$

*Gonchar &
Rakhmanov 1987*

Aptekarev, Magnus, Saff, Stahl, Totik, ...

Notice this is around twice as fast as for the quadrature methods.

Some CMV best approximation error curves

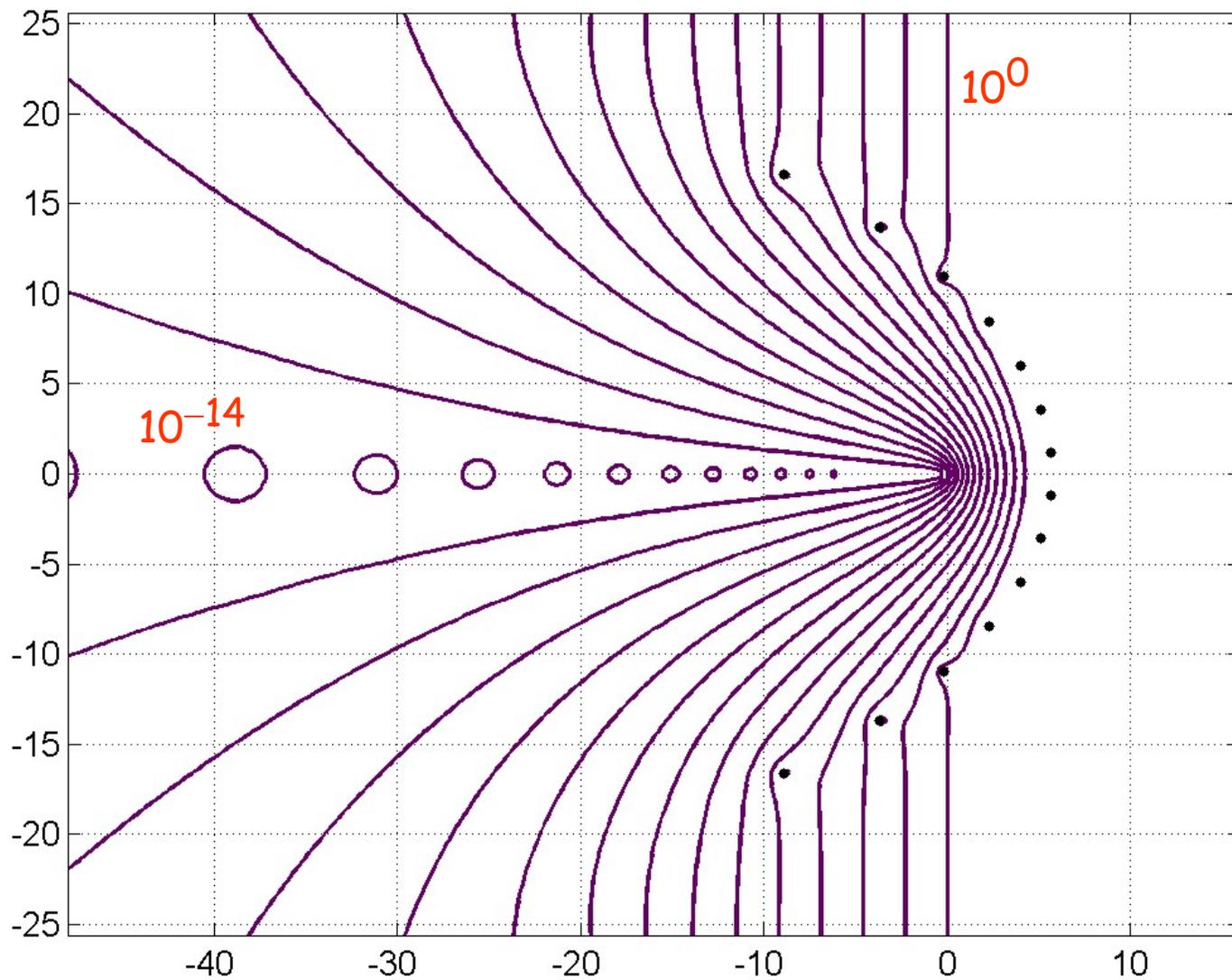


In practice we can compute these approximants effortlessly with CF = Carathéodory-Fejér approximation, based on SVD of Hankel matrix of transplanted Chebyshev coefficients.

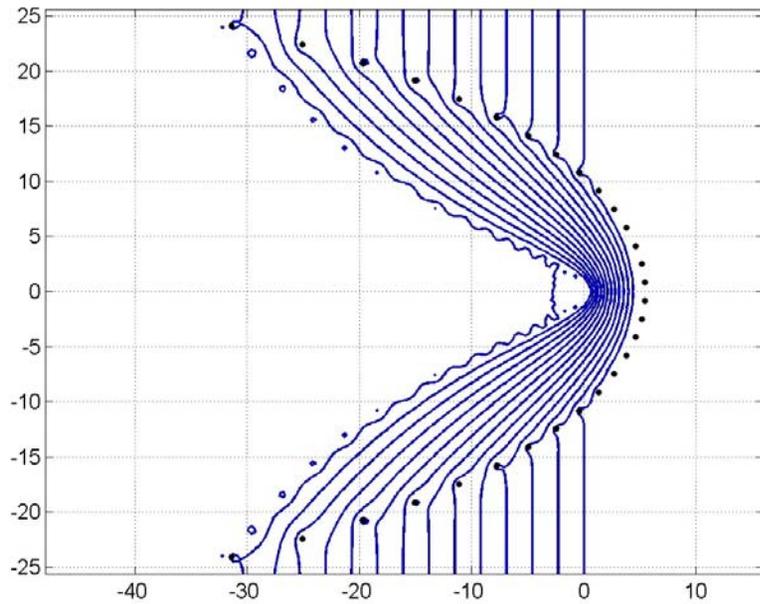
exp_x_cf.m

$$|e^z - r(z)|$$

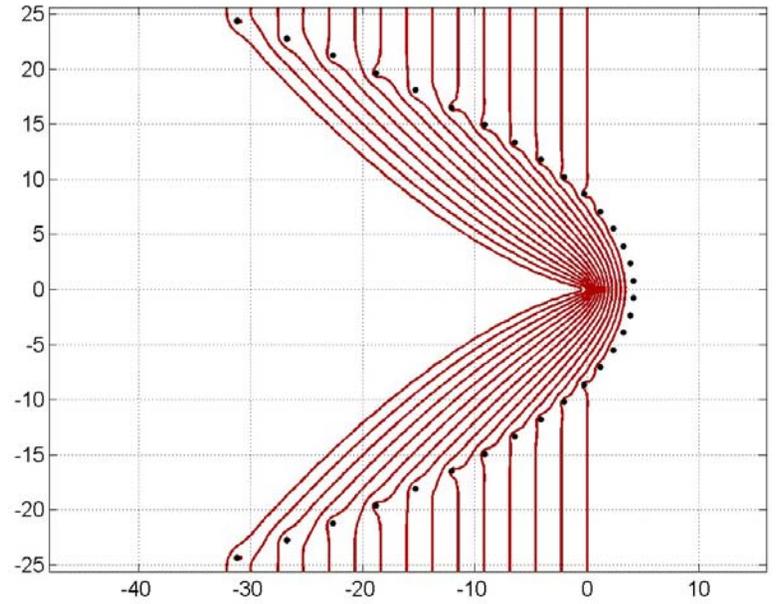
Cody-Meinardus-Varga $N = 14$



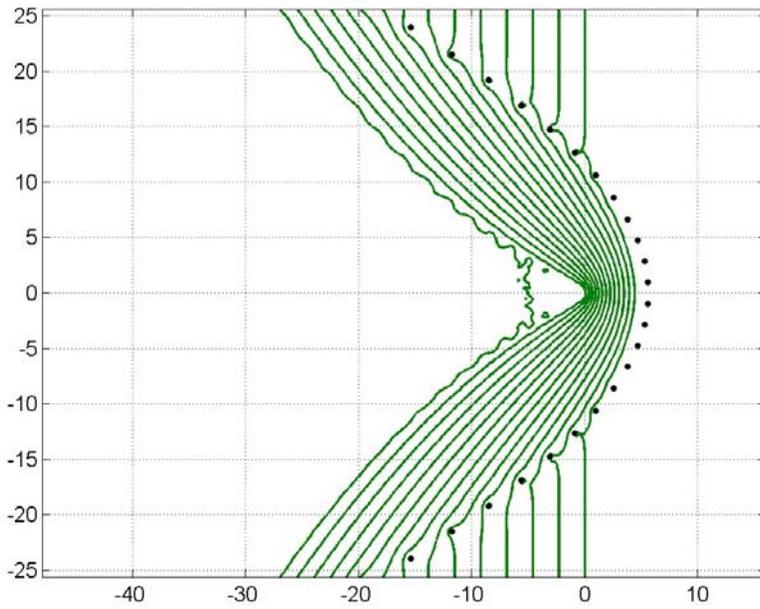
Talbot-Weideman N = 32



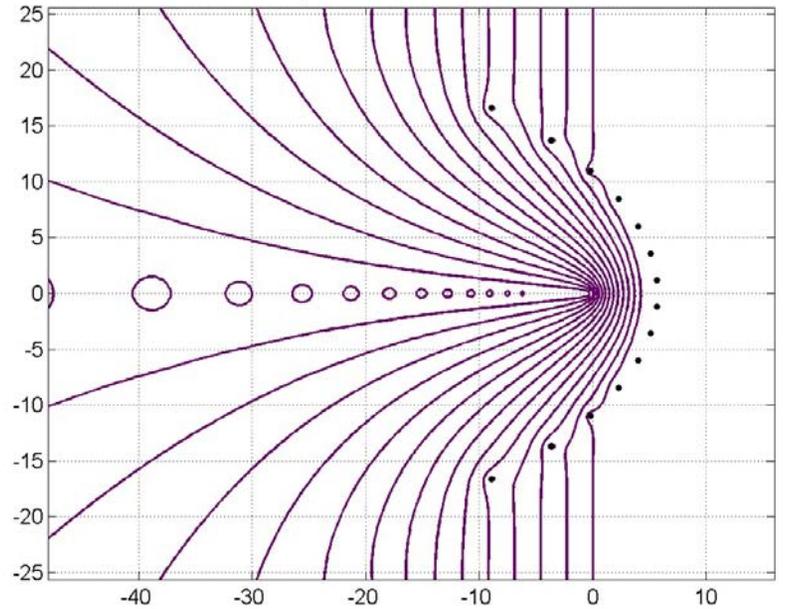
parabola N = 32



hyperbola N = 32



Cody-Meinardus-Varga N = 14



SUMMARY OF THE TWO APPROACHES

Given: inverse Laplace integral $g = \int_C f(z) e^z dz$

(C winds around $(-\infty, 0]$)

Best approximation ("CMV")

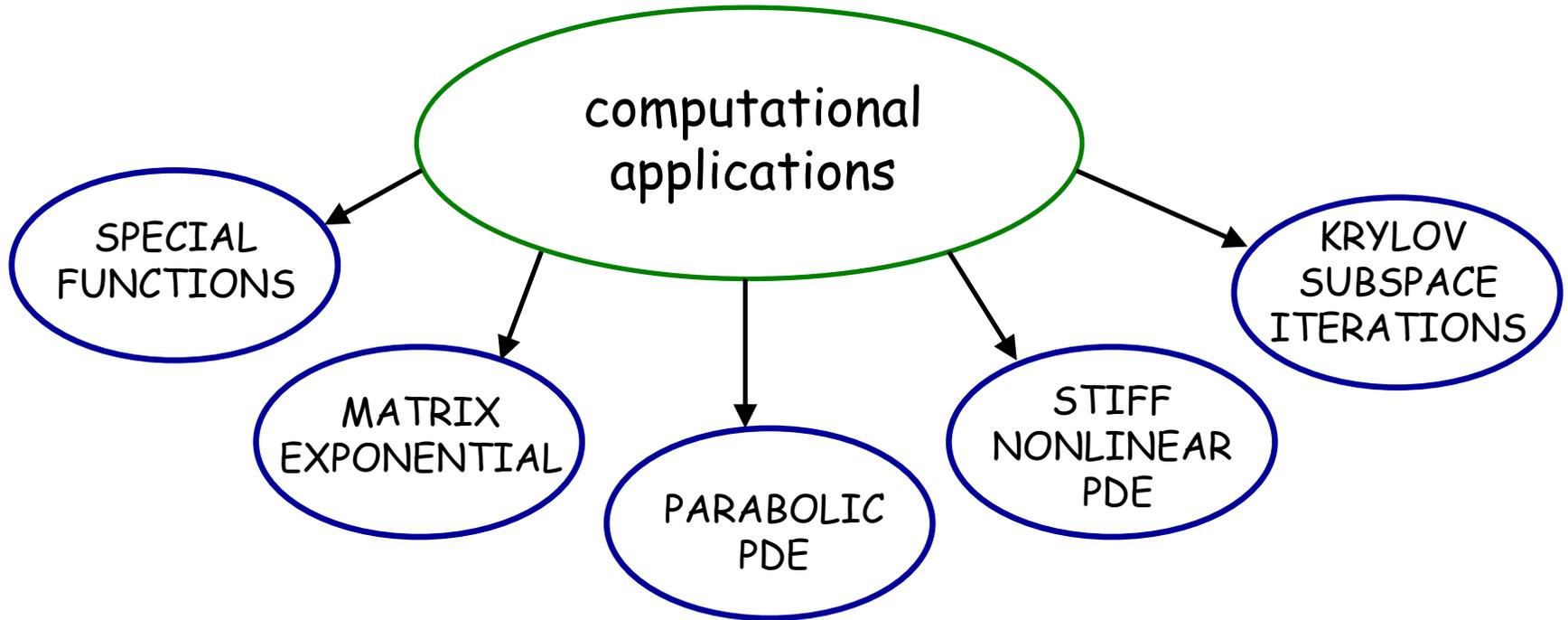
- (1) Replace e^z by $r(z)$
- (2) Deform C to contour Γ enclosing poles
- (3) Evaluate integral by residue calculus

Quadrature contours ("TW")

- (1) Deform C to contour Γ
- (2) Evaluate integral by quadrature formula (typically trapezoid rule after change of variables)
- (3) Interpret this as evaluation by residues of a contour integral involving a rational function $r(z)$

EXAMPLES

Recall:



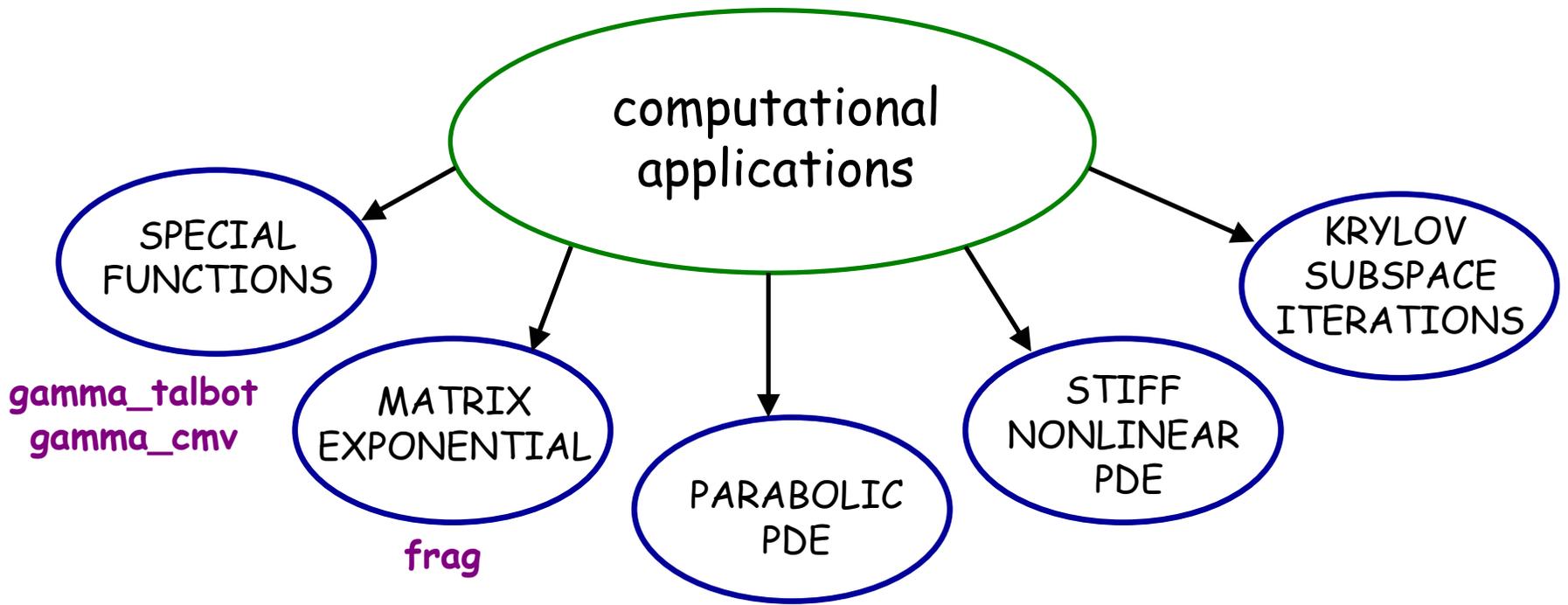
Here are some references for these five applications:

TW = quadrature
over contours

CMV = best approximation
on $(-\infty, 0]$

Laplace transforms & special functions	Luke 69 Talbot 79 Temme 96 Gil & Segura & Temme 02	Schmelzer 05
matrix exponential (e^A or e^{Av})	Sidje 98 Kellems 05	Lu 98
parabolic PDE	Gavrilyuk & Makarov 01 Sheen & Sloan & Thomée 99 & 03 Mclean & Thomée 04 López-Fernández & Palencia 04	Varga 61 Cody & Meinardus & Varga 69 Cavendish & Culham & Varga 84 Gallopoulos & Saad 89, 92
stiff nonlinear PDE	Kassam & T. 03	Lu 05
Krylov subspace its.		Gallopoulos & Saad 89, 92

+ related work by Baldwin, Calvetti, Druskin, Eiermann, Freund, Hochbruck, Knizhnerman, Krogstad, Lubich, Minchev, Moret, Novarti, Ostermann, Reichel, Sadkane, Schädle, Sorensen, Tuckerman, Tal-Ezer, Wright...



IN CONCLUSION

Rational approximations, quadrature formulas, the complex plane... these sound old-fashioned!

But they are still the basis of some of the most powerful algorithms.