# **The Pseudospectral Method**

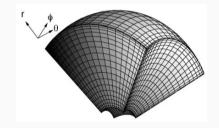
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# Introduction

#### **Motivation**



- 1. Orthogonal basis functions, special case of FD
- 2. Spectral accuracy of space derivatives
- 3. High memory efficiency
- 4. Explicit method
- 5. No requirement of grid staggering
- 6. Problems with strongly heterogeneous media

- Coining as transform methods as their implementation was based on the Fourier transform (Gazdag, 1981; Kossloff and Bayssal, 1982)
- Initial applications to the acoustic wave equation were extended to the elastic case (Kossloff et al., 1984), and to 3D (Reshef et al., 1988)
- Developing efficient time integration schemes (Tal-Ezer et al., 1987) that allowed large times steps to be used in the extrapolation procedure
- Replacing harmonic functions as bases for the function interpolation by Chebyshev poly-nomials (Kosloff et al., 1990)
- To improve the accurate modelling of curved internal interfaces and surface topography grid stretching as coordinate transforms was introduced and applied (Tessmer et al., 1992; Komatitsch et al., 1996)
- By mixing finite-difference operators and pseudospectral operators in the different spatial directions, the method was used for interesting seismological problems (Furumura et al., 1998b; Furumura and Kennett, 2005)

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#### The Pseudospectral Method in a Nutshell

The Pseudospectral method is:

- a grid point method
- a series expansion method (Fourier or Chebyshev)

Looking at the acoustic wave equation using finite-difference method leaves us with

$$\frac{p(x,t+\mathrm{d}t)-2p(x,t)+p(x,t-\mathrm{d}t)}{\mathrm{d}t^2} = c(x)^2 \partial_x^2 p(x,t) + s(x,t)$$

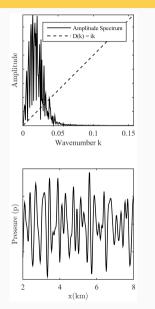
The remaining task is to calculate the space derivative on the r.h.s.

$$\partial_x^{(n)} p(x,t) = \mathscr{F}^{-1}[(-ik)^n P(k,t)]$$

where *i* is the imaginary unit,  $\mathscr{F}^{-1}$  is the inverse Fourier transform, and P(k, t) is the spatial Fourier transform of the pressure field p(x, t), *k* being the wavenumber.

Using discrete Fourier transform of functions defined on a regular grid, we obtain exact derivatives up to the Nyquist wavenumber  $k_N = \pi/dx$ .

# The Pseudospectral Method in a Nutshell



# Principle of the pseudospectral method based on the Fourier series

- Use of sine and cosine functions for the expansions implies periodicity
- Using Chebyshev polynomials similar accuracy of common boundary conditions (free surface, absorbing) can be achieved

The Pseudospectral Method: Ingredients

#### In many situations we either...

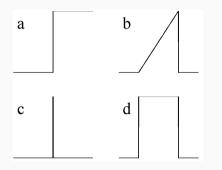
- seek to approximate a known analytic function by an approximation
- know a function only at a discrete set of points and we would like to interpolate in between those points

Let us start with the first problem such that our known function is approximated by a finite sum over some N basis functions  $\Phi_i$ 

$$f(x) \approx g_N(x) = \sum_{i=1}^N a_i \Phi_i(x)$$

and assume that the basis functions form an orthogonal set

Why would one want to replace a known function by something else?



Dynamic phenomena are mostly expressed by PDEs

Either nature is not smooth and differentiable mathemical functions are non-differentiable

With the right choice of differentiable basis functions  $\Phi_i$  the calculation becomes

$$\partial_x f(x) \approx \partial_x g_N(x) = \sum_{i=1}^N a_i \partial_x \Phi_i(x)$$

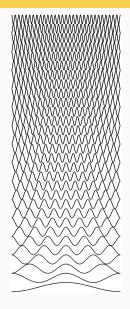
Consider the set of (trigonometric) basis functions

$$cos(nx)$$
  $n = 0, 1, ..., \infty$   
 $sin(nx)$   $n = 0, 1, ..., \infty$ 

with

1,  $\cos(x)$ ,  $\cos(2x)$ ,  $\cos(3x)$ , ... 0,  $\sin(x)$ ,  $\sin(2x)$ ,  $\sin(3x)$ , ...

in the interval  $[-\pi,\pi]$ 



Checking whether these functions are orthogonal by evaluating integrals with all possible combinations

$$\int_{-\pi}^{\pi} \cos(jx) \cos(kx) dx = \begin{cases} 0 & \text{for } j \neq k \\ 2\pi & \text{for } j = k = 0 \\ \pi & \text{for } j = k > 0 \end{cases}$$
$$\int_{-\pi}^{\pi} \sin(jx) \sin(kx) dx = \begin{cases} 0 & \text{for } j \neq k ; j, k > 0 \\ \pi & \text{for } j = k > 0 \end{cases}$$
$$\int_{-\pi}^{\pi} \cos(jx) \sin(kx) dx = 0 \text{ for } j \ge 0, \ k > 0$$

The approximate function  $g_N(x)$  can be stated as

$$f(x) \approx g_N(x) = \sum_{k=0}^N a_k \cos(kx) + b_k \sin(kx)$$

By minimizing the difference between approximation  $g_N(x)$  and the original function f(x), the so-called  $l_2$ -norm, the coefficients  $a_k$ ,  $b_k$  can be found

$$||f(x) - g_N(x)||_{l_2} = \left[\int_a^b \{f(x) - g_N(x)\}^2 dx\right]^{\frac{1}{2}} = Min$$

 $\implies$  independent of the choice of basis functions

The most important concept of this section will consist of the properties of Fourier series on regular grids.

The approximate function  $g_N(x)$  has the following form

$$g_N(x) = \frac{1}{2}a_0 + \sum_{k=1}^n a_k \cos(kx) + b_k \sin(kx)$$

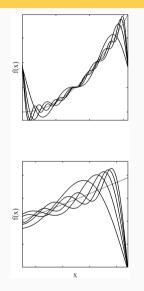
and leads to the coefficients

$$a_{k} = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \cos(kx) dx \qquad k = 0, 1, ..., n$$
  
$$b_{k} = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \sin(kx) dx \qquad k = 0, 1, ..., n$$

Using Euler's formulae, yields to

$$g_N(x) = \sum_{k=-n}^{k=n} c_k e^{ikx}$$

with complex coefficients  $c_k$  given by



Finding the interpolating trigonometric polynomial for the periodic function

$$f(x+2\pi x) = f(x) = x^2$$
  $x \in [0,2\pi]$ 

The approximation  $g_N(x)$  can be obtained with

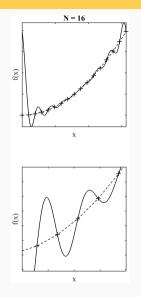
$$g_N(x) = \frac{4\pi^2}{3} + \sum_{k=1}^{N} \{\frac{4}{k^2}\cos(kx) - \frac{4\pi}{k}\sin(kx)\}$$

We assume that we know our function f(x) at a discrete set of points  $x_i$  given by

$$x_i = \frac{2\pi}{N}i$$
  $i = 0,\ldots,N$ .

Using the "trapezoidal rule" for the integration of a definite integral we obtain for the Fourier coefficients

$$a_{k}^{*} = \frac{2}{N} \sum_{j=1}^{N} f(x_{j}) \cos(kx_{j}) \qquad k = 0, 1, ..., n$$
  
$$b_{k}^{*} = \frac{2}{N} \sum_{j=1}^{N} f(x_{j}) \sin(kx_{j}) \qquad k = 0, 1, ..., n$$

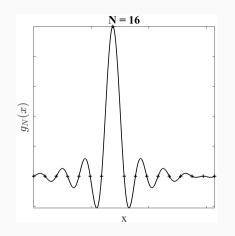


We thus obtain the specific Fourier polynomial with N = 2n

$$g_n^* := rac{1}{2}a_0^* + \sum_{k=1}^{n-1} \{a_k^*\cos(kx) - b_k^*\sin(kx)\} + rac{1}{2}a_n^*\cos(nx)$$

with the tremendously important property

$$g_n^*(x_i) = f(x_i) .$$



Discrete interpolation and derivative operations can also be formulated in terms of convolutions It is unity at grid point  $x_i$  and zero at all other points on the discrete grid It has the form of a *sinc*-function

#### **Forward Transform**

$$F(k) = \mathscr{F}[f(x)] = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} f(x) e^{ikx} dx$$

#### **Inverse Transform**

$$f(x) = \mathscr{F}^{-1}[F(k)] = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} F(k) e^{-ikx} dk$$

Taking the formulation of the inverse transform to obtain the derivative of function f(x)

$$\frac{d}{dx}f(x) = \frac{d}{dx}\frac{1}{\sqrt{2\pi}}\int_{-\infty}^{\infty}F(k)e^{-ikx}dk$$
$$= \frac{1}{\sqrt{2\pi}}\int_{-\infty}^{\infty}-ik\ F(k)e^{-ikx}dk$$
$$= \frac{1}{\sqrt{2\pi}}\int_{-\infty}^{\infty}D(k)\ F(k)e^{-ikx}dk$$

with D(k) = -ik

We can extend this formulation to the calculation of the n - th derivative of f(x) to achieve

$$F^{(n)}(k) = D(k)^n F(k) = (-ik)^n F(k)$$

Thus using the condense Fourier transform operator  $\mathscr{F}$  we can obtain an exact n - th derivative using

$$f^{(n)}(x) = \mathscr{F}^{-1}[(-ik)^n F(k)]$$
  
=  $\mathscr{F}^{-1}[(-ik)^n \mathscr{F}[f(x)]]$ 

Adopting the complex notation of the forward transform we gain

$$F_k = \sum_{j=0}^{N-1} f_j e^{j 2\pi j k/N} \ k = 0, \dots, N$$

and the inverse transform

$$f_j = \frac{1}{N} \sum_{k=0}^{N-1} F_k e^{-i 2\pi j k/N} j = 0, \dots, N$$

We are able to gain exact n - th derivatives on our regular grid by performing the following operations on vector  $f_i$  defined at grid points  $x_j$ 

$$\partial_x^{(n)} f_j = \mathscr{F}^{-1}[(-ik)^n F_k]$$

where

$$F_k = \mathscr{F}[f_j]$$

#### Example

We initialize a  $2\pi$ -periodic Gauss-function in the interval  $x \in [0, 2\pi]$  as

$$f(x) = e^{-1/\sigma^2 (x-x_0)^2}$$

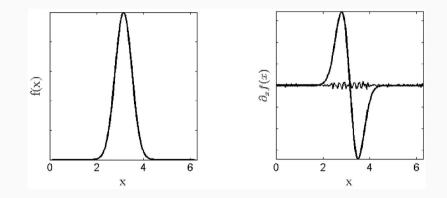
with  $x_0 = \pi$  and the derivative

$$f'(x) = -2\frac{(x-x_0)}{\sigma^2} e^{-1/\sigma^2 (x-x_0)^2}$$

Grid spacing of  $dx = \frac{2\pi}{N}$  with N = 127 and  $x_j = j\frac{2\pi}{N}$ , j = 0, ..., N.

% Main program % % Initialize function vector f %(...) % Calculate derivative of vector f in interval [a,b] df = fder(f,a,b)% % (...) % Subroutines/Functions function df = fder(f.a.b)% Fourier Derivative of vector f % (...) % length of vector f n = max(size(f)): % initialization of k vector (wavenumber axis) k = 2\*pi/(b-a)\*[0:n/2-1]0 - n/2 + 1 - 1: % Fourier derivative  $df = ifft(-i^{k}, *fft(f))$ : (...)

# Result



# The Fourier Pseudospectral Method

# The Fourier Pseudospectral Method

#### Constant-density acoustic wave equation in 1D

$$\ddot{p} = c^2 \partial_x^2 p + s$$

The time-dependent part is solved using a standard 3-point finite-difference operator leading to

$$\frac{p_j^{n+1} - 2p_j^n + p_j^{n-1}}{dt^2} = c_j^2 \partial_x^2 p_j^n + s_j^n$$

where upper indices represent time and lower indices space.

Calculating the 2<sup>nd</sup> derivatives using the Fourier transform

$$\partial_x^2 p_j^n = \mathscr{F}^{-1}[(-ik)^2 P_\nu^n]$$
$$= \mathscr{F}^{-1}[-k^2 P_\nu^n]$$

where  $P_{\nu}^{n}$  is the discrete complex wavenumber spectrum at time *n* leading to an exact derivative with only numerical rounding errors. % Main program %(...) % Time exploration for i=1 nt % (...) % 2nd space derivate d2p=s2der1d(p.dx): % Extrapolation pnew=2\*p-pold+c.\*c.\*d2p\*dt\*dt: % Add sources pnew=pnew+sa\*src(i)\*dt\*dt: % Remap pressure field pold=p: p=pnew: % (...) end % (...) % Subroutines function df=s2der1d(f.dx) % (...) % 2nd Fourier derivative ff=fft(f): ff=k.\*k.\*ff: df=real(ifft(ff)):

#### **Example**

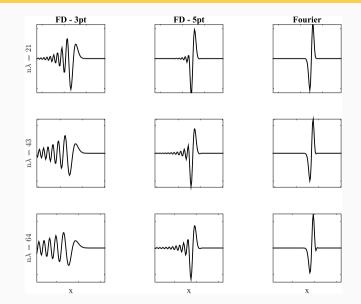
In FD method possible to initiate a point-like source at one grid point

In PS method not possible because Fourier transform of a spike-like function creates oscillations

 $\implies$  Defining a space-dependent part of the source using a Gaussian function  $e^{-1/\sigma^2(x-x_0)^2}$  with  $\sigma = 2dx$ , dx being the grid interval and  $x_0$  the source location

Parameter	Value
( <sub>max</sub>	1250 m
าx	2048
)	343 m/s
dt	0.00036 s
xk	0.62 m
r O	60 Hz
	0.2

# Result



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To understand the behaviour of numerical approximations using discrete plane waves of the form

$$p_j^n = e^{i(kjdx-\omega ndt)}$$
  
 $\partial_x^2 p_j^n = -k^2 e^{i(kjdx-\omega ndt)}$ 

The time-dependent part can be expressed as

$$\partial_t^2 p_j^n = -\frac{4}{dt^2} \sin^2(\frac{\omega dt}{2}) e^{i(kjdx-\omega ndt)}$$

where we made use of Euler's formula and that  $2\sin^2 x = 1/2(1 - \cos 2x)$ 

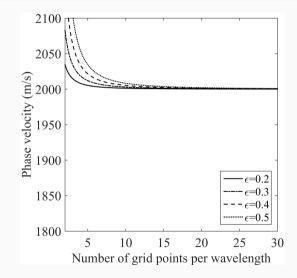
# Stability, Convergence, Dispersion

#### Phase velocity c(k)

$$c(k) = \frac{\omega}{k} = \frac{2}{kdt} \sin^{-1}(\frac{kcdt}{2}).$$

- When *dt* becomes small  $sin^{-1}(kcdt/2) \approx kcdt/2$
- *dx* does not appear in this equation
- The inverse sine must be smaller than one the stability limit requires  $k_{max}(cdt/2) \le 1$ . As  $k_{max} = \pi/dx$  the stability criterion for the 1D case is  $\epsilon = cdt/dx = 2/\pi \approx 0.64$

# Stability, Convergence, Dispersion



#### **Acoustic 2D**

#### Acoustic wave equation in 2D

$$\ddot{p} = c^2(\partial_x^2 p + \partial_z^2 p) + s$$

The time-dependent part is replaced by a standard 3-point finite-difference approximation

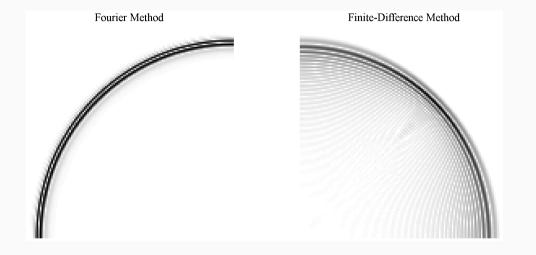
$$\frac{p_{j,k}^{n+1}-2p_{j,k}^{n}+p_{j,k}^{n-1}}{\mathrm{d}t^{2}} = c_{j,k}^{2}(\partial_{x}^{2}p+\partial_{z}^{2}p)_{j,k} + s_{j,k}^{n}$$

Using Fourier approach for approximating 2<sup>nd</sup> partial derivatives

$$\partial_x^2 p + \partial_z^2 p = \mathscr{F}^{-1}[-k_x^2 \,\mathscr{F}[p]] + \,\mathscr{F}^{-1}[-k_z^2 \,\mathscr{F}[p]]$$

Parameter	Value	
X <sub>max</sub>	200 m	% ()
nx	256	% 2nd space derivates for j=1:nz,
С	343 m/s	d2xp(:,j)=s2der1d(p(:,j)',dx); end
dt	0.00046 s	for i=1:nx, d2zp(i,:)=s2der1d(p(i,:),dx);
dx	0.78 m	end % Extrapolation
<i>f</i> <sub>0</sub>	200 Hz	pnew=2*p-pold+c.*c.*(d2xp+d2zp)*dt*dt2; % ()
$\epsilon$	0.2	

# **Acoustic 2D**



### **Numerical anisotropy**

Investigating the dispersion behaviour by finding solutions to monochromatic plane waves propagating in the direction  $\mathbf{k} = (k_x, k_z)$ 

$$p_{j,k}^n = e^{i(k_x j dx + k_z k dx - \omega n dt)}$$

With Fourier method the derivatives can be calculated by

$$\partial_x p_{j,k}^n = -k_x^2 e^{i(k_x j dx + k_z k dx - \omega n dt)}$$
  
$$\partial_z p_{j,k}^n = -k_z^2 e^{i(k_x j dx + k_z k dx - \omega n dt)}$$

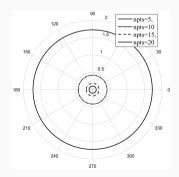
Combining this with the 3-point-operator for the time derivative

$$\partial_t^2 p_{j,k}^n = -\frac{4}{dt^2} \sin^2(\frac{\omega dt}{2}) e^{i(k_x j dx + k_z k dx - \omega n dt)}$$

# **Numerical anisotropy**

We obtain the numerical dispersion relation in 2D for arbitrary wave number vectors (i.e., propagation directions)  $\mathbf{k}$  as

$$c(\mathbf{k}) = \frac{\omega}{|\mathbf{k}|} = \frac{2}{|\mathbf{k}|dt} \sin^{-1}(\frac{cdt\sqrt{k_x^2 + k_z^2}}{2}).$$



### Elastic 1D

#### **1D Elastic wave equation**

$$\rho(x)\ddot{u}(x,t) = \partial_x \left[\mu(x)\partial_x u(x,t)\right] + f(x,t)$$

- u displacement field
- $\mu$  space-dependent shear modulus

The finite-difference approximation of the extrapolation part leads to

$$\rho_i \frac{u_i^{j+1} - 2u_i^j + u_i^{j-1}}{dt^2} = (\partial_x [\mu(x) \partial_x u(x,t)])_i^j + t_i^j$$

with space derivatives to be calculated using the Fourier method.

The sequence of operations required to obtain the r.h.s. reads

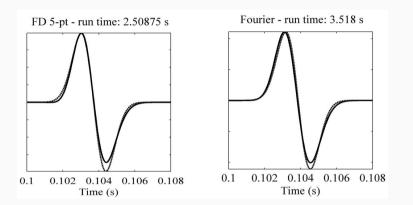
$$\begin{split} u_{i}^{j} &\to \mathscr{F}[u_{i}^{j}] \to U_{\nu}^{j} \to -ikU_{\nu}^{j} \to \mathscr{F}^{-1}[-ikU_{\nu}^{j}] \to \partial_{x}u_{i}^{j} \\ \partial_{x}u_{i}^{j} \to \mathscr{F}[\mu_{i}\partial_{x}u_{i}^{j}] \to \tilde{U}_{\nu}^{j} \to \mathscr{F}^{-1}[-ik\tilde{U}_{\nu}^{j}] \to \partial_{x}[\mu(x)\partial_{x}u(x,t)] \end{split}$$

where capital letters denote fields in the spectral domain, lower indices with Greek letters indicate discrete frquencies, and  $\tilde{U}_{\nu}^{j} = \mu_{i}\partial_{x}u_{i}^{j}$  was introduced as an intermediate result to facilitate notation.

Finding a setup for a classic staggeredgrid finite-difference solution to the elastic 1D problem, leads to an energy misfit to the analytical solution  $u_a$  of 1%. The energy misfit is simply calculated by  $(u_{FD} - u_a)^2/u_a^2$ 

	FD	PS
nx	3000	1000
nt	2699	3211
С	3000 m/s	3000 m/s
dx	0.33 m	1.0 m
dt	5.5e-5 s	4.7e-5 s
$f_0$	260 Hz	260 Hz
$\epsilon$	0.5	0.14
$n/\lambda$	34	11

# **Elastic 1D**



Comparing memory requirements and computation speed between the Fourier method (**right**) and a 4th-order finite-difference scheme (**left**). In both cases the relative error compared to the analytical solution (misfit energy calculated by  $\frac{u_{FD}-u_a}{u_a^2}$ ) is approximately 1%. The big difference is the number of grid points along the x dimension. The ratio is 3:1 (FD:Fourier)

### Summary

- Pseudospectral methods are based on discrete function approximations that allow exact interpolation at so-called collocation points. The most prominent examples are the Fourier method based on trigonometric basis functions and the Chebyshev method based on Chebyshev polynomials.
- The Fourier method can be interpreted as an application of discrete Fourier series on a regular-spaced grid. The space derivatives can be obtained exactly (except for rounding errors). Derivatives can be efficiently calculated with the discrete Fourier transform requiring *n* log *n* operations.
- The Fourier method implicitly assumes periodic behavior. Boundary conditions like the free surface or absorbing behaviour are difficult to implement.