

# **Chirps and waves: adaptive high-order methods for oscillatory ODEs and PDEs**

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**CU Boulder Computational Tools group introduction**

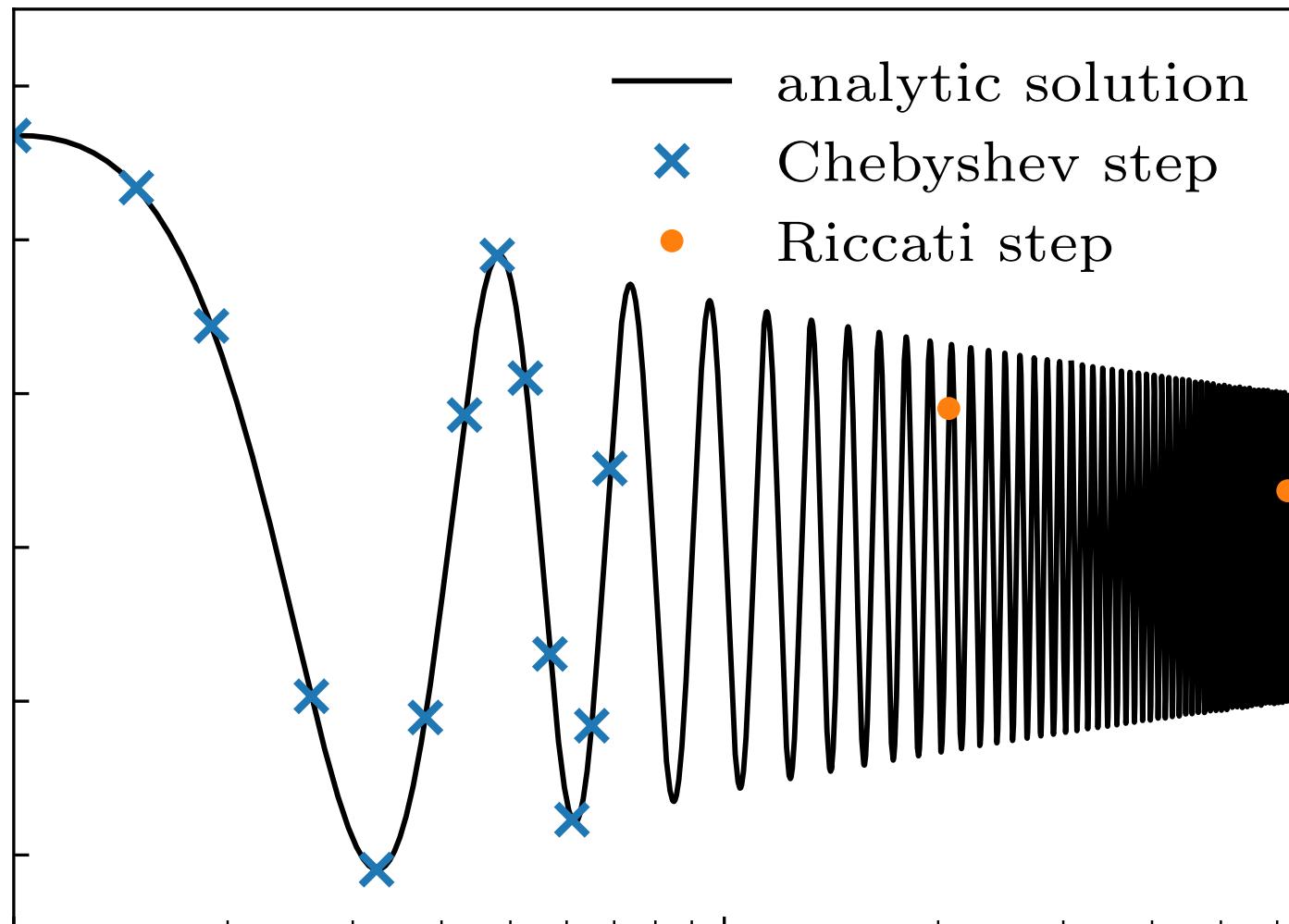
# Research profile/principles

- I build numerical methods for physics/engineering applications
- Numerical analysis × scientific computing × computational physics
- Adaptive, efficient, high-order accurate methods for **ODEs, PDEs**
  - Stay efficient when high accuracy is demanded
  - Require little user input
  - Open-source software implementation
- Insight into current problems, computational bottlenecks in  
**computational astrophysics**

# Contents – my contributions and interests

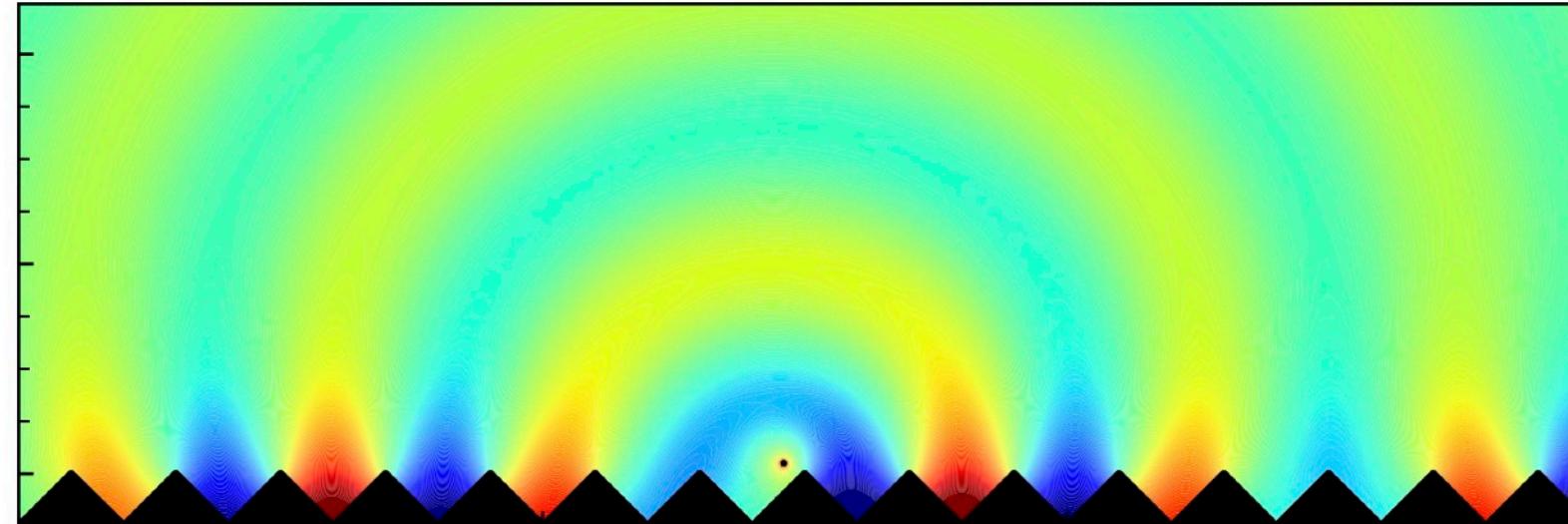
## ODEs

- Fast, high-order accurate, adaptive solvers for ODEs with **oscillatory solutions, software**
- **Motivation:** Special function evaluation, repeated oscillatory ODE solves in optimization and inference in physics



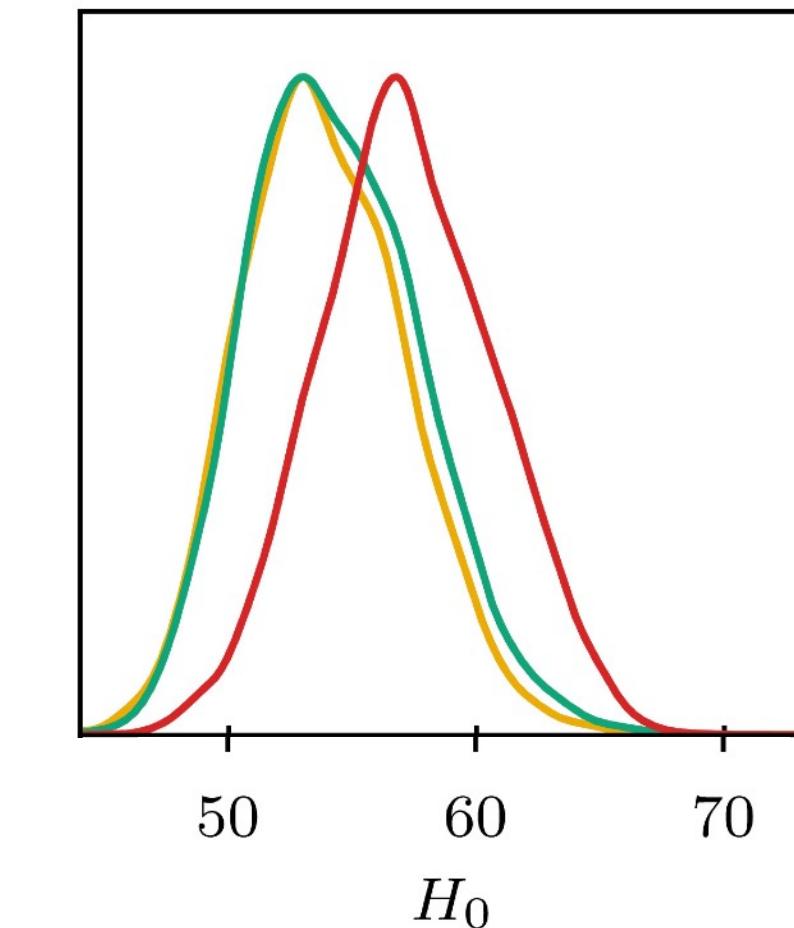
## PDEs

- Fast, high-order boundary integral equation methods for PDEs in complex geometries
- scattering from **periodic surfaces** with corners; periodic and **nonperiodic** sources
- **Motivation:** waveguides, acoustic/seismic filtering, remote sensing, topological insulators, fault detection, material design



## Computational cosmology

- Theoretical foundations (QFT)
- Fast forward modeling
- **Bayesian inference** from particle physics x cosmology data (GAMBIT)
- **Motivation:** What's dark matter? What was physics like in the early universe? What's beyond the SM?



# **ODEs**

# Frequency-independent solver for oscillatory ODEs

## The problem and why it's hard

- Build an efficient solver for second-order, linear, homogeneous ODEs of the form

$$u''(t) + 2\gamma(t)u'(t) + \omega^2(t)u(t) = 0, \quad t \in [t_0, t_1],$$
$$u(t_0) = u_0, \quad u'(t_0) = u'_0.$$

From now on, set  $\gamma(t) = 0$  for simplicity.

- Assumptions:  $\omega(t), \gamma(t)$  real-valued,  $\omega(t) \geq 0$ ,  $\omega(t)$  is **large and slowly-varying** for some of  $[t_0, t_1]$ .
- Conventional<sup>\*</sup> methods need  $\mathcal{O}(1/\omega)$  discretization length  $\rightarrow \mathcal{O}(\omega)$  runtime, **prohibitively slow** at large  $\omega$ !
- But small  $\omega(t)$ , large  $\gamma(t)$  results in nonoscillatory behavior; solver needs to handle this

## Goals and motivation

- Build **4-6th- and high-order, adaptive, efficient** solvers,  $\mathcal{O}(1)$  (**frequency-independent**) runtime
- User-friendly, open-source software
- Ubiquitous: **cosmology**, quantum mech, **special functions**, electric circuits, ...
- Often part of Bayesian inference or optimization loop  $\rightarrow 10^6 - 10^9$  solves needed

# Previous work and my contributions

## Existing specialized oscillatory solvers

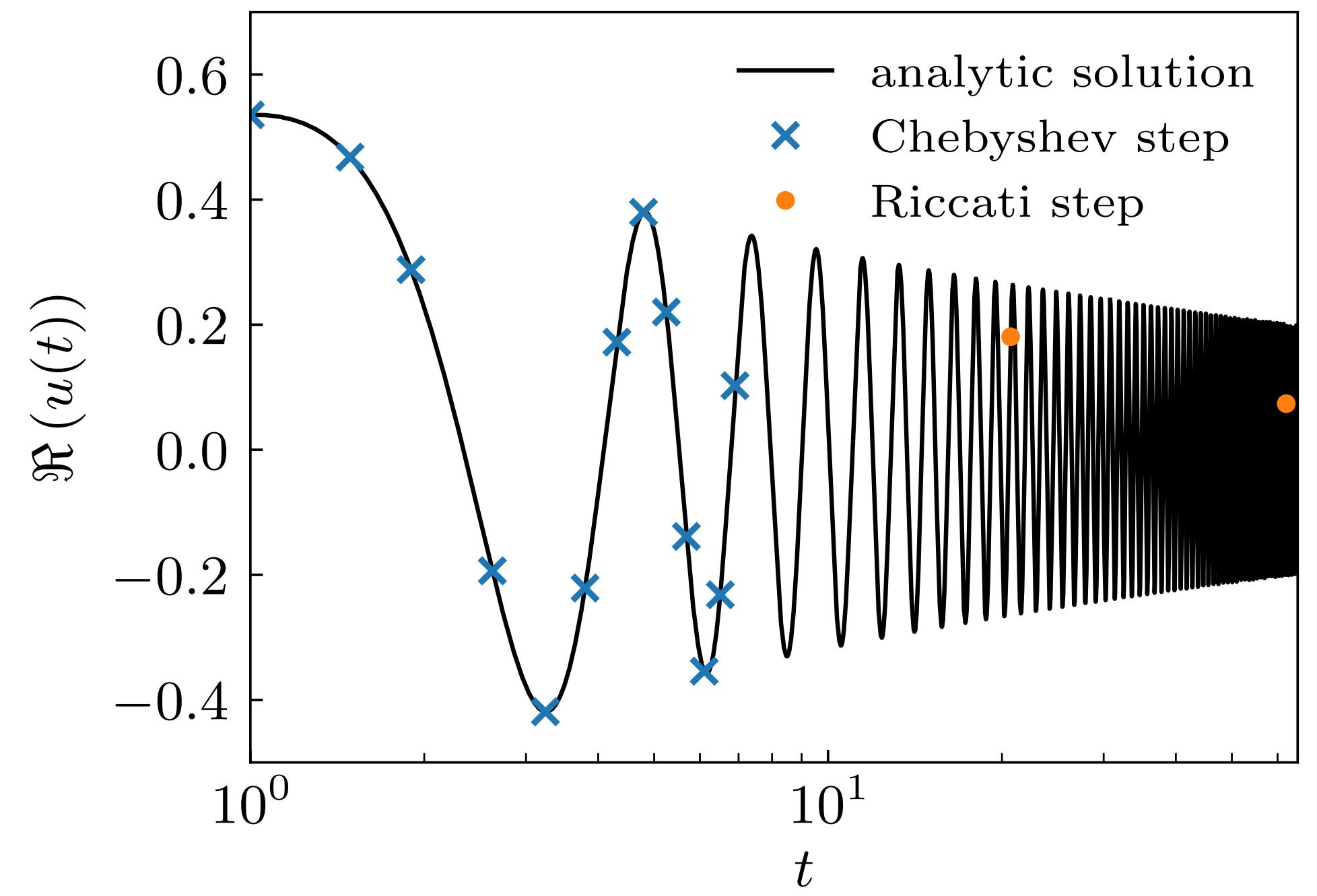
- None can deal with  $\omega(t)$  changing significantly in magnitude
- Other high-order specialized oscillatory solvers exist, but only for  $\omega(t) \gg 1$  (e.g. Bremer, ACHA, 2018.)
- Asymptotic expansions for oscillatory functions, applied analytically (“by hand”) and at low order
- **No software in large numerical libraries!**

## My contributions

- 4-6th-order, adaptive method for 3-6 digits of accuracy, physics applications: Agocs *et al*, *Phys Rev Research*, 2020., [arXiv:1906.01421](https://arxiv.org/abs/1906.01421)
  - Includes novel switching algorithm
- Arbitrarily high-order, adaptive method for higher accuracy: Agocs & Barnett, *SINUM*, 2023., [arXiv:2212.06924](https://arxiv.org/abs/2212.06924)
  - Includes new, simple asymptotic expansion, and error bound
- Software: `oscode` ([10.21105/joss.02830](https://doi.org/10.21105/joss.02830)), `riccati` ([10.21105/joss.05430](https://doi.org/10.21105/joss.05430))

# Methods overview

- Time-stepping with **adaptive stepsize**  $h(t)$ , keep local error estimate below user-defined (relative) **tolerance**  $\varepsilon$
- Right strategy: exploit known behavior of the solution  $u(t)$  and always work in terms of a slowly-varying quantity
  - $\rightarrow$  larger timesteps,  $\mathcal{O}(1)$  runtime
- Two different methods for  $u(t)$  **oscillatory** or **slowly-varying**
  - $\omega \lesssim 1$ : spectral collocation on Chebyshev nodes / 4-5th order Runge–Kutta
  - $\omega \gg 1$ : asymptotic expansion: **Riccati defect correction** or Wentzel–Kramers–Brillouin (WKB)
- Automatic **switching** between the two methods: choose whichever maximizes stepsize  $h$  while still keeping the error below  $\varepsilon$



# Asymptotic expansions: Riccati defect correction

- Work in terms of slowly-varying “phase function”  $x(t)$ , defined as  $u(t) = e^{\int^t x(\sigma)d\sigma}$
- $x(t)$  obeys **Riccati eq:**  $0 = x' + x^2 + \omega^2$ , **oscillatory!**
- Construct approximate, non oscillatory phase function  $x(t)$  by functional iteration:  $x_0(t), x_1(t), \dots, x_j(t)$
- If  $\omega \gg 1$ , start from the initial approximation  $x_0(t) = \pm i\omega(t)$  (exact if  $\omega(t)$  const)
- Define **residual of the Riccati eq.:**

$$R[x](t) := R[x] = x' + x^2 + \omega^2, \text{ then}$$

$$R[x_j + \delta] = R[x_j] + \cancel{\delta} + 2x_j\delta + \cancel{\mathcal{O}(\delta^2)}$$

- Seek a function  $\delta(t)$  that gives  $R[x_j + \delta] = 0$
- **Linearize**, then **neglect  $\delta'^1$** , get **defect correction scheme**:

$$x_{j+1}(t) = x_j(t) - \underbrace{\frac{R[x_j](t)}{2x_j(t)}}_{\delta(t)}, \quad \text{for all } t \in [t_i, t_{i+1}].$$

<sup>1</sup>If  $\delta$  is non oscillatory (which we choose it to be), then  $\delta'$  is  $\mathcal{O}(\omega)$  smaller than all other terms.

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## Summary:

Change variables from  $u(t)$  to “phase”  $x(t)$

Construct an (asymptotic) approximation for the phase

Approximation is especially good when ODE coefficients are smooth and large

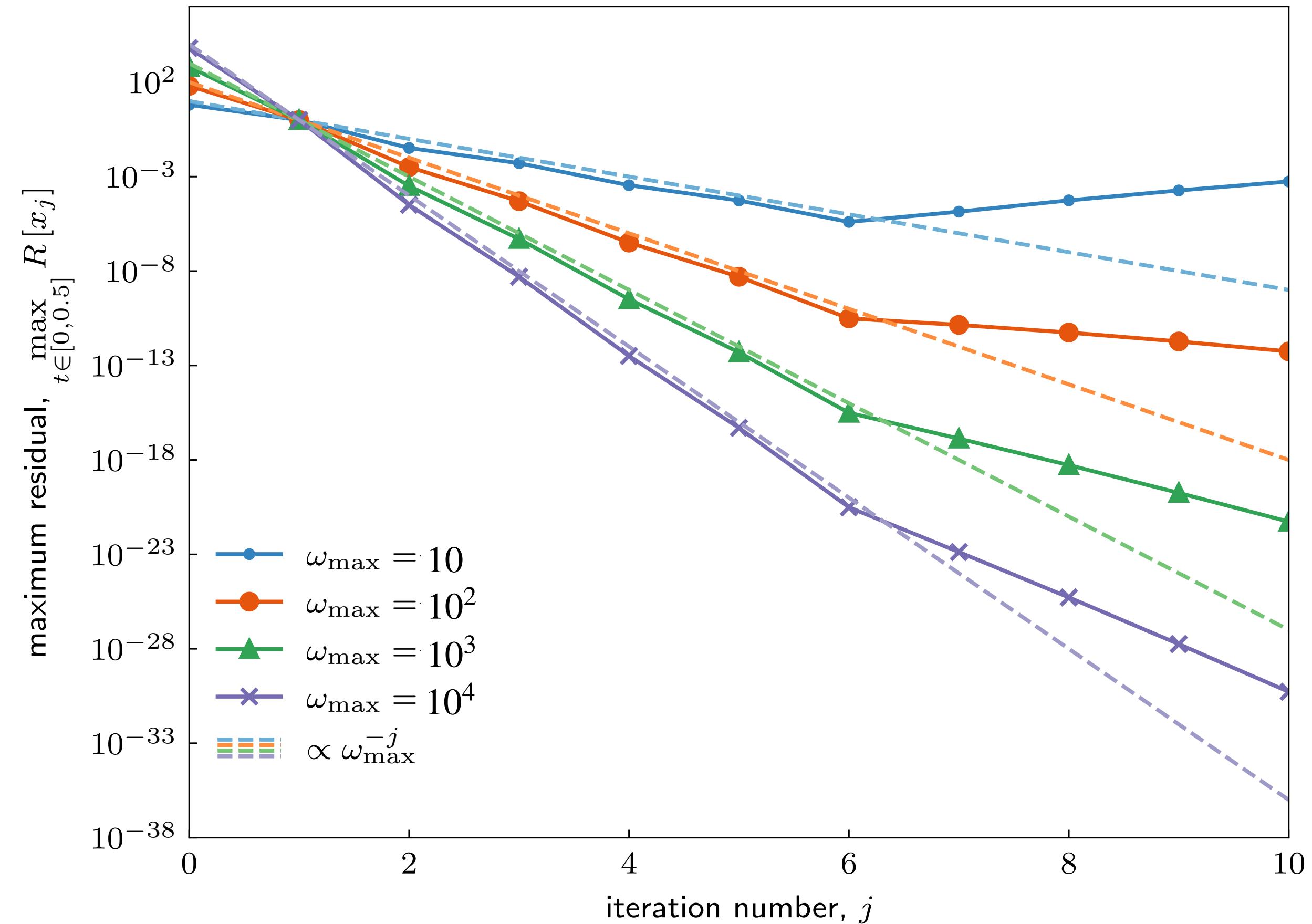
This results in large stepsizes

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# Asymptotic expansions: Riccati defect correction

- Let  $\omega$  be analytic in the closed ball  $B_\rho := \{z \in \mathbb{C} : |z - t| \leq \rho\}$  centered on a given  $t$ .
  - Then for  $j = 1, 2, \dots, k$ ,
- $R_j(t) \leq Ar^j$ , with
- $$r(|\omega'|_{B_\rho}, |\omega|_{B_\rho}, k).$$
- If  $|\omega'|/|\omega|$  is small and  $|\omega|$  is large in  $B_\rho$ , then geometric reduction of residual up to  $j \leq k$  iterations.

$$u'' + \frac{\omega_{\max}^2}{1+t^2} u = 0$$



# Asymptotic expansions: Riccati defect correction

- Once we have  $x_j$ , transform back:

$$u(t) = e^{\int^t x_j(\sigma) d\sigma}$$

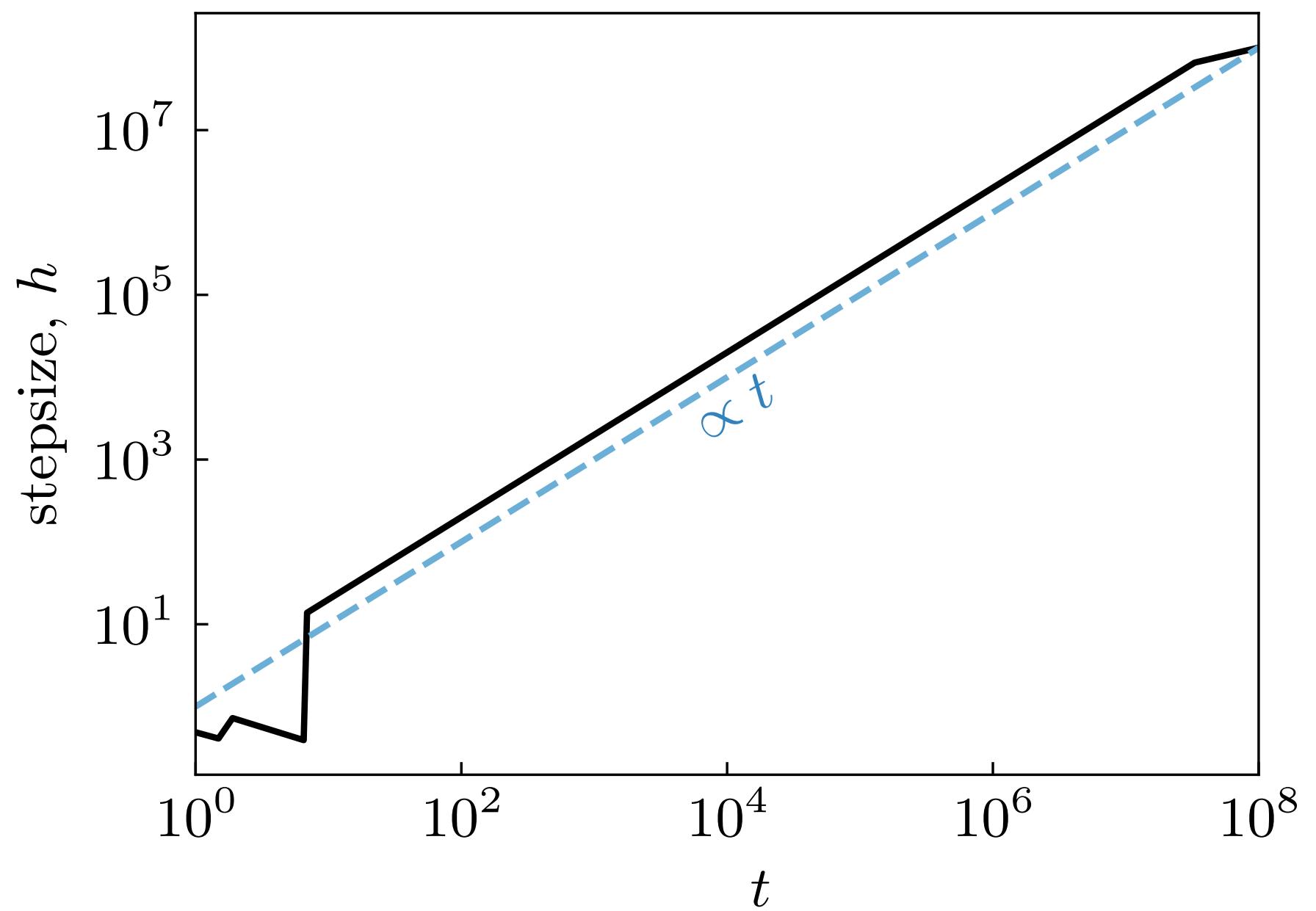
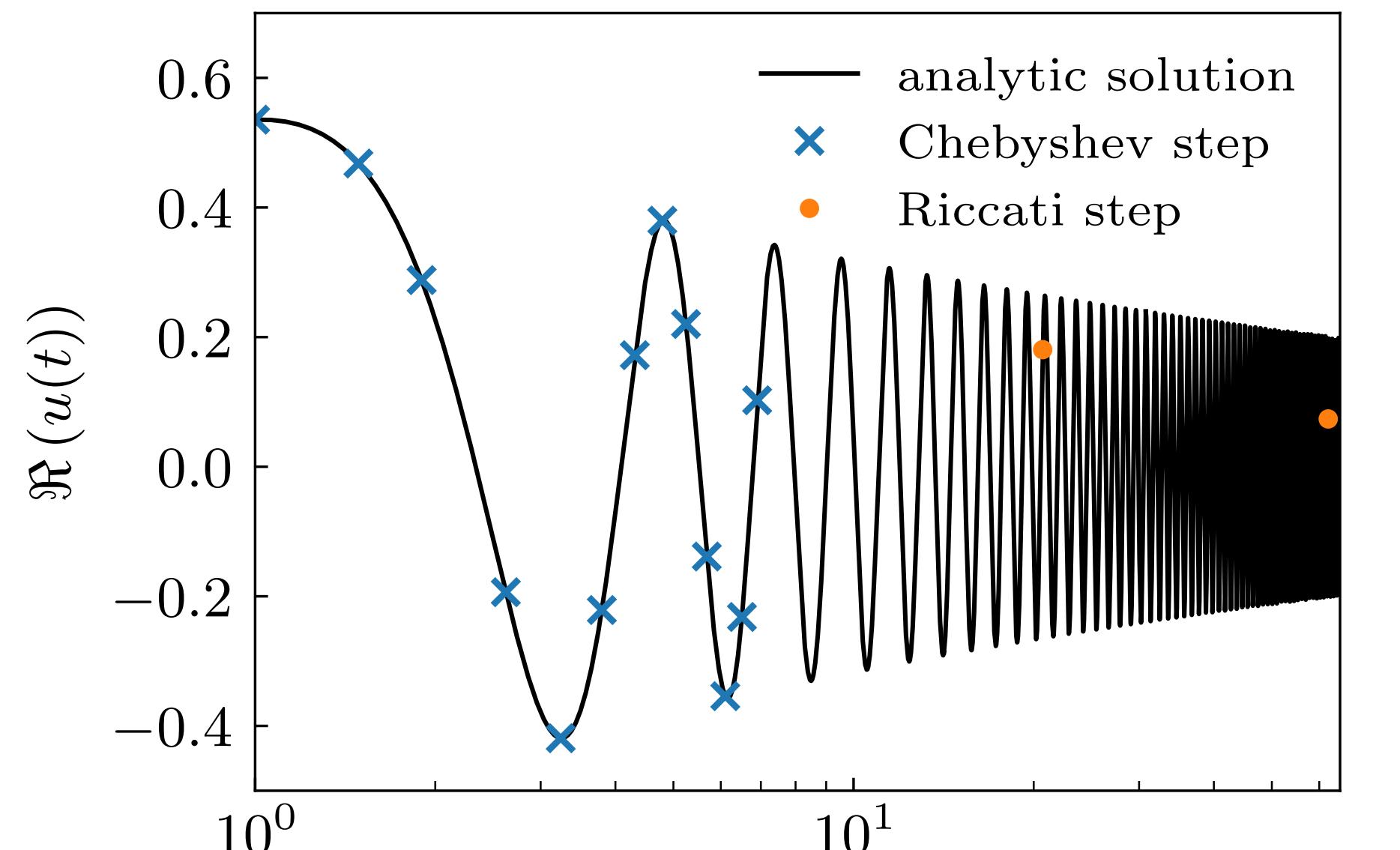
- Two solutions for  $x_j$ :  $x_{j\pm}$  (starting from  $\pm i\omega$ ) give linearly independent solutions for  $u$ ;  $u_\pm$ :
- Linearly combine to match initial conditions at the start of each timestep:

$$u(t_{i+1}) = Au_+ + Bu_-, \quad u'(t_{i+1}) = Au'_+ + Bu'_-$$

- Error estimate is via residual  $R[x_j]$ . Fix stepsize, iterate over  $j$ .
- Derivatives and integral via spectral differentiation / integration matrix with  $n = 16$  nodes.
- Right: to 12 digits, solve

$$u'' + tu = 0, \quad t \in [1, 10^8]$$

$$u(t) = \text{Ai}(-t) + i\text{Bi}(-t)$$



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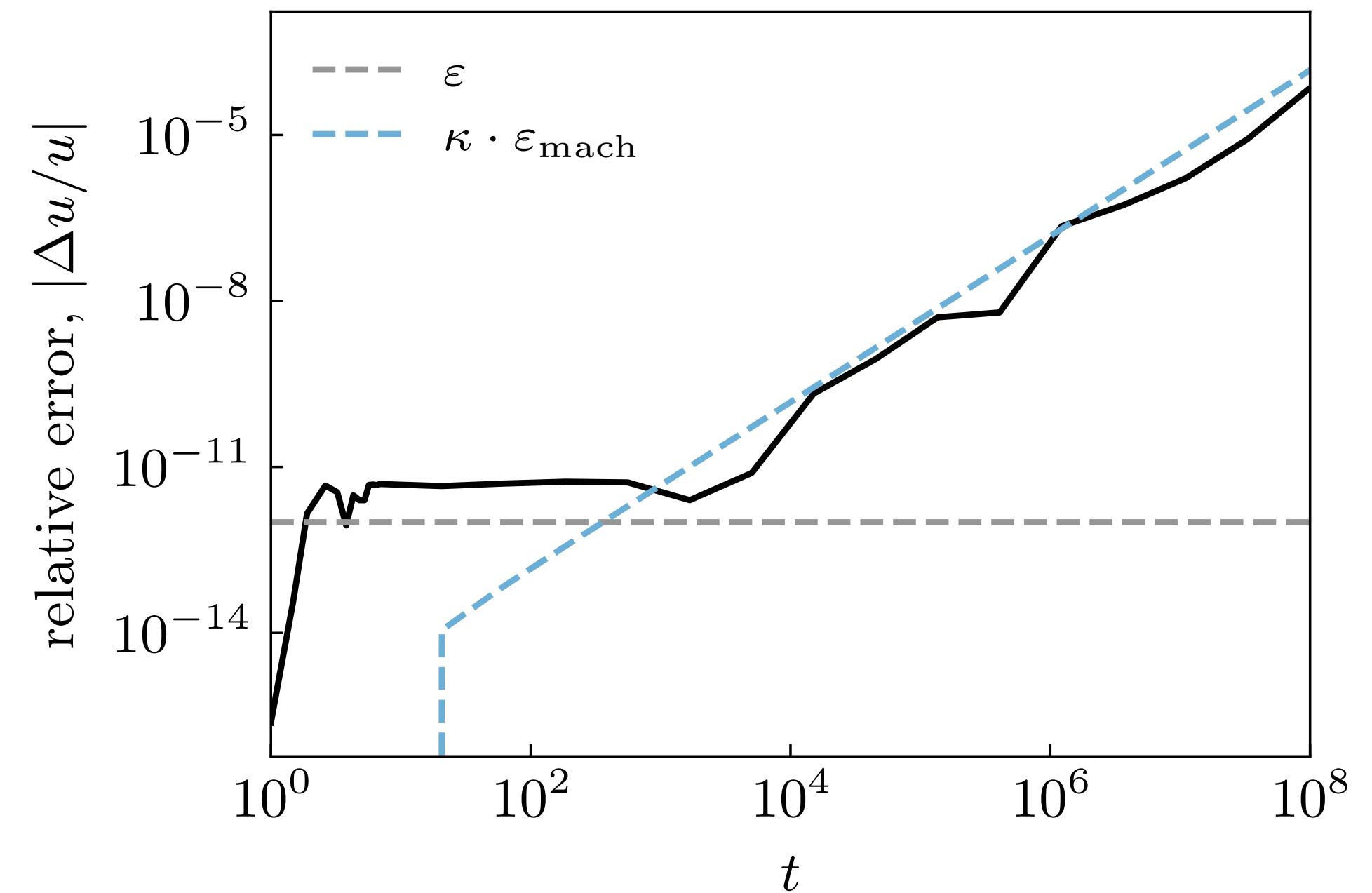
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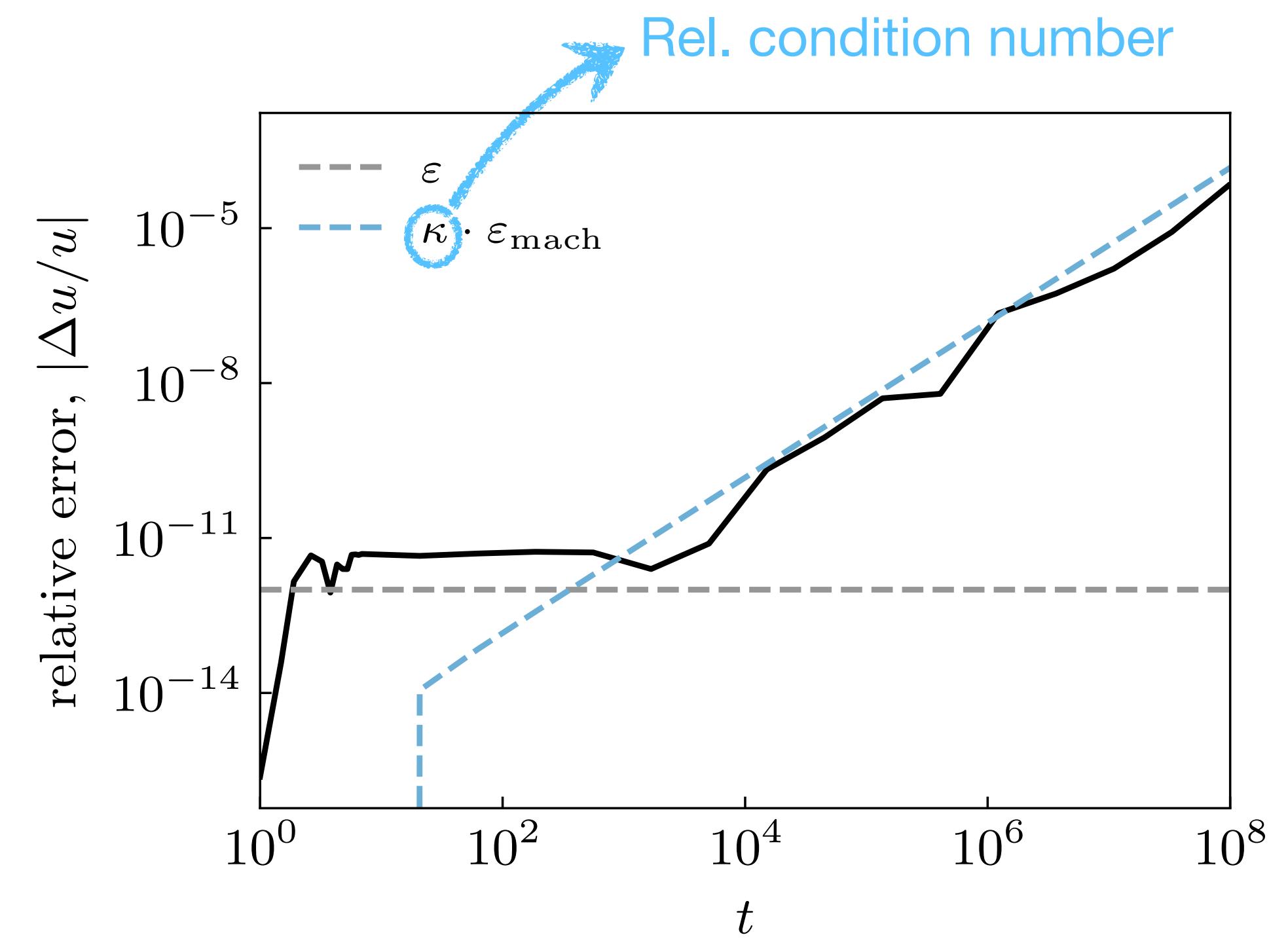
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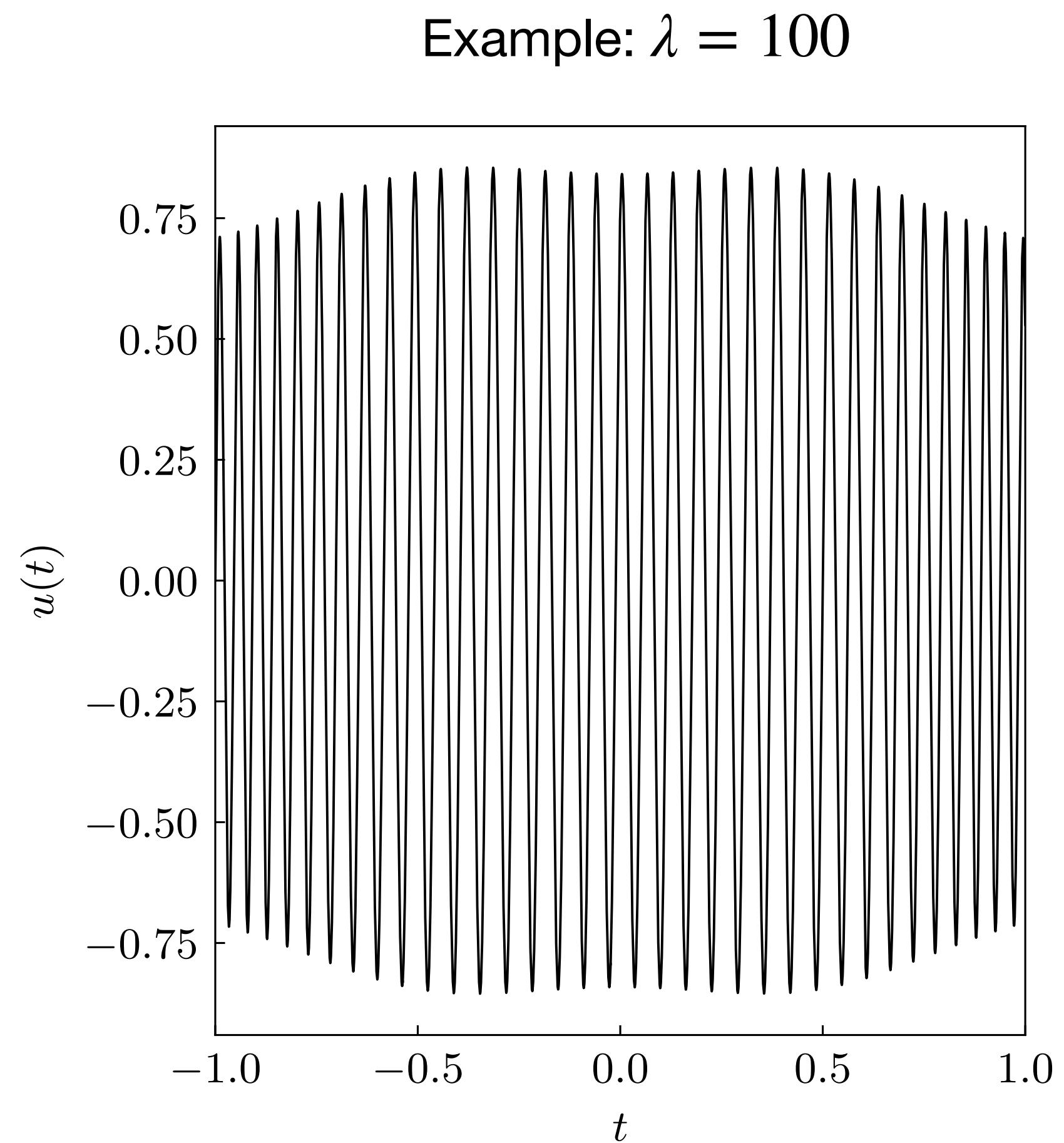
# Example solution and solver comparison

- Compare state-of-the-art oscillatory solvers and a standard high-order Runge–Kutta method on:

$$u''(t) + \lambda^2 q(t)u(t) = 0,$$

$$t \in [-1, 1],$$

$$q(t) = 1 - t^2 \cos(3t)$$



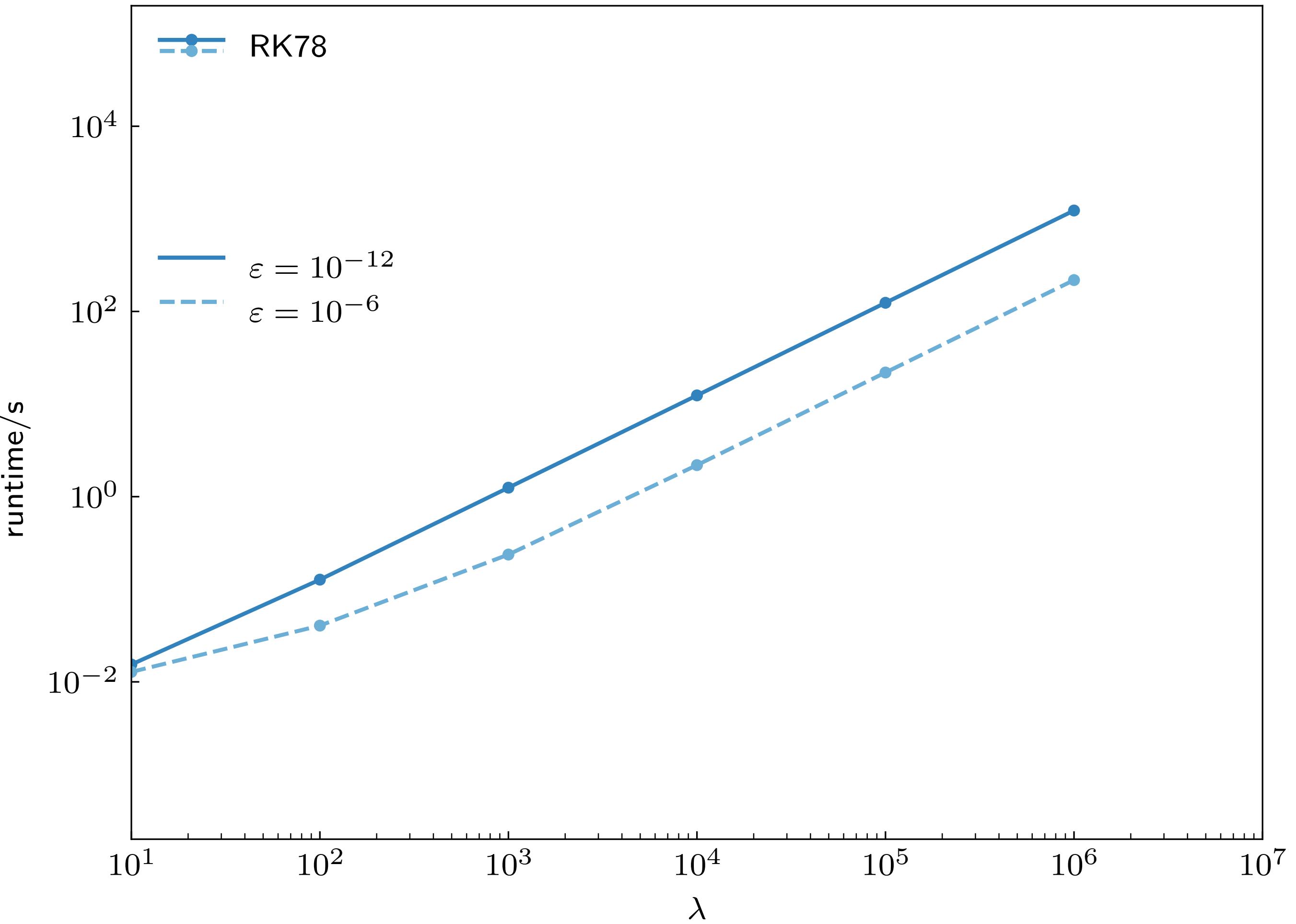
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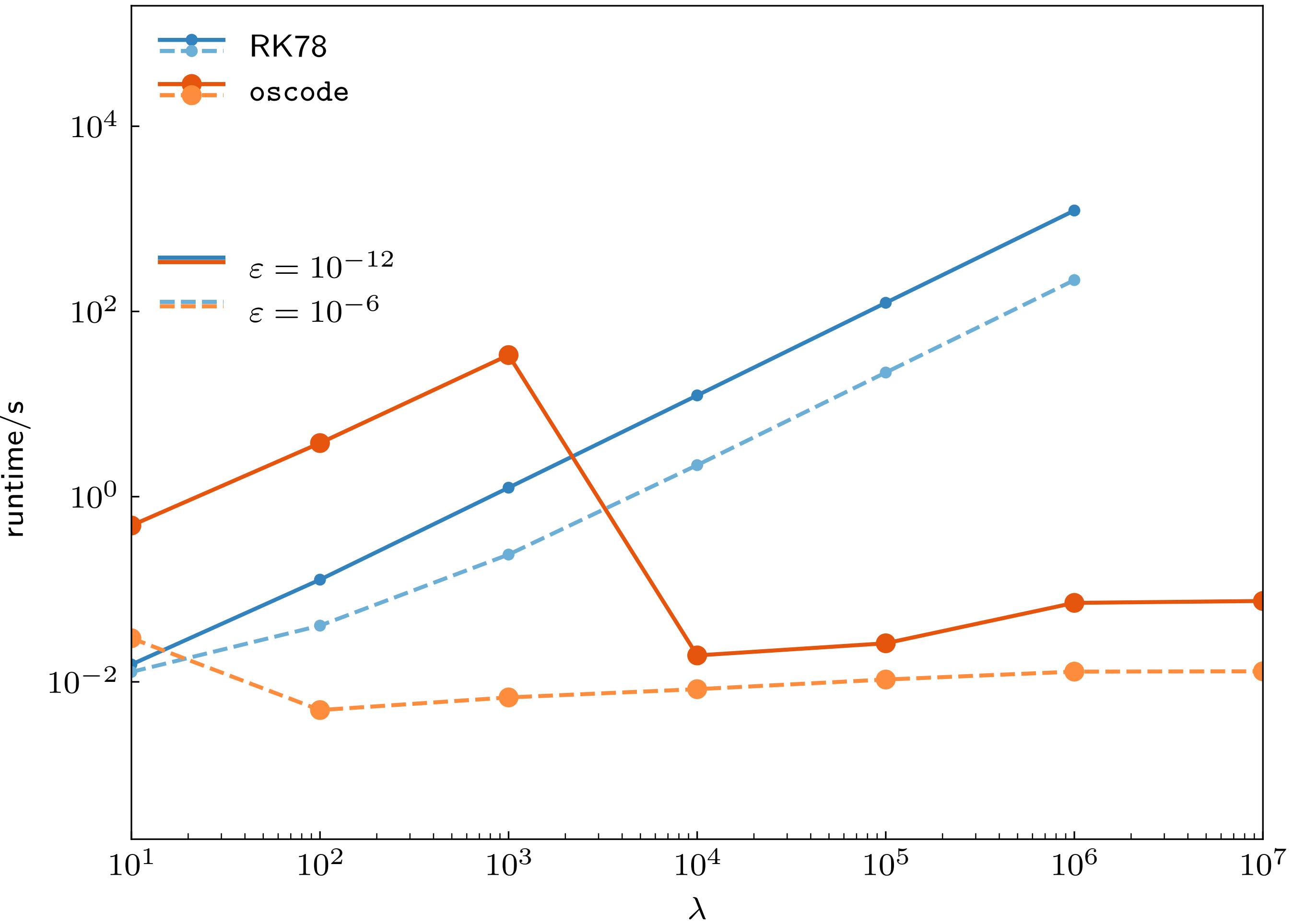
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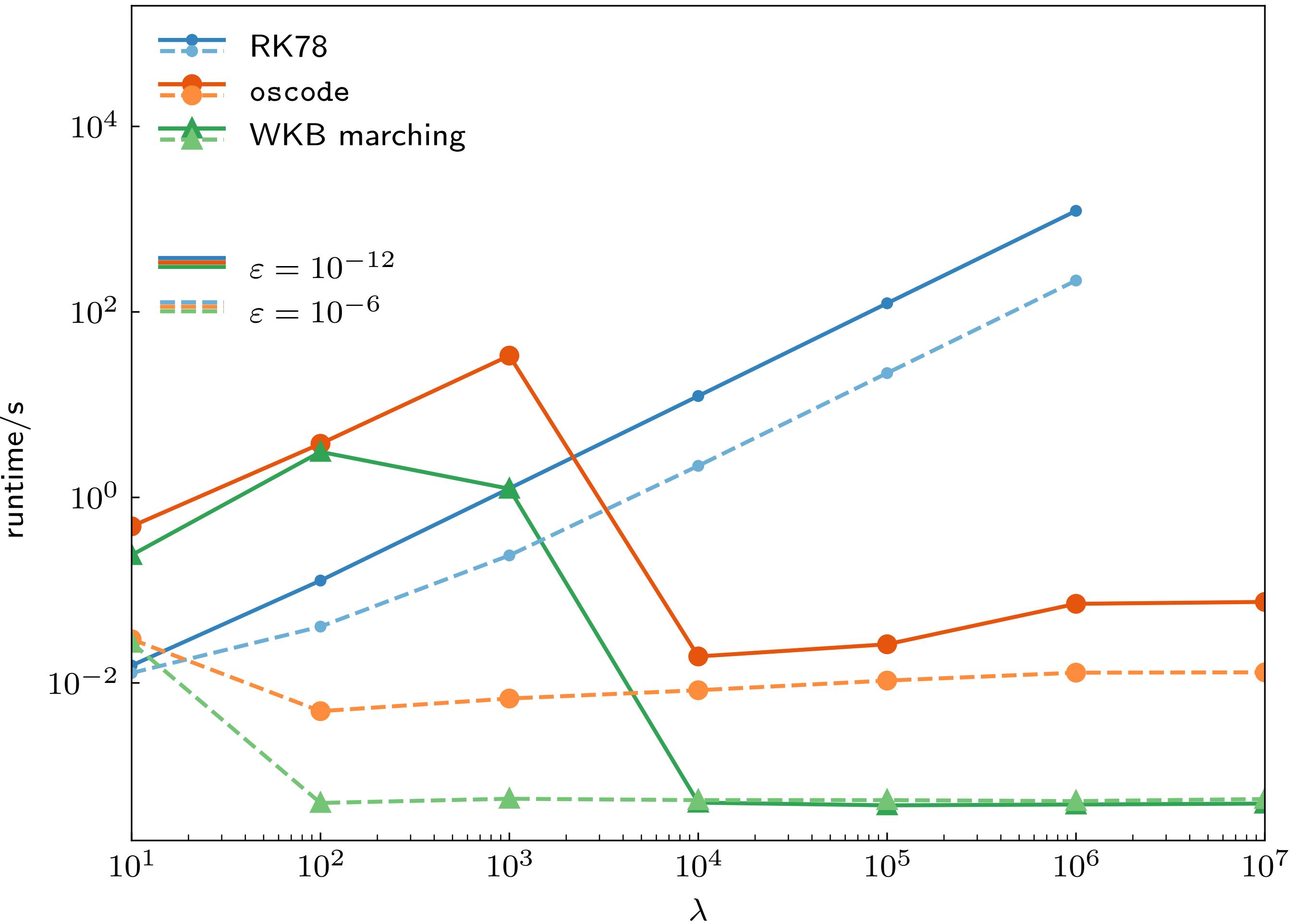
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  - Uses `oscode`'s switching algorithm
  - User needs to supply derivatives



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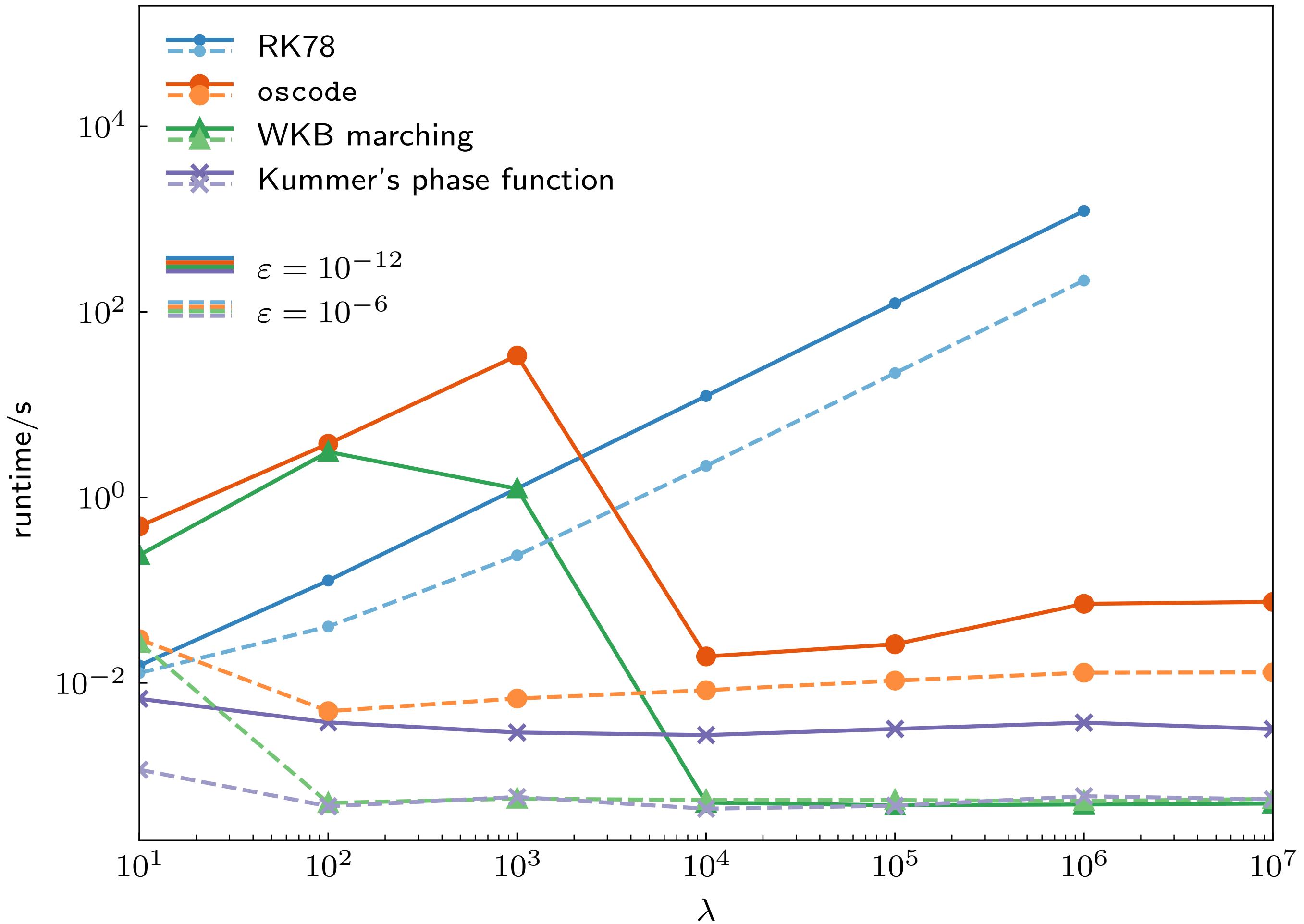
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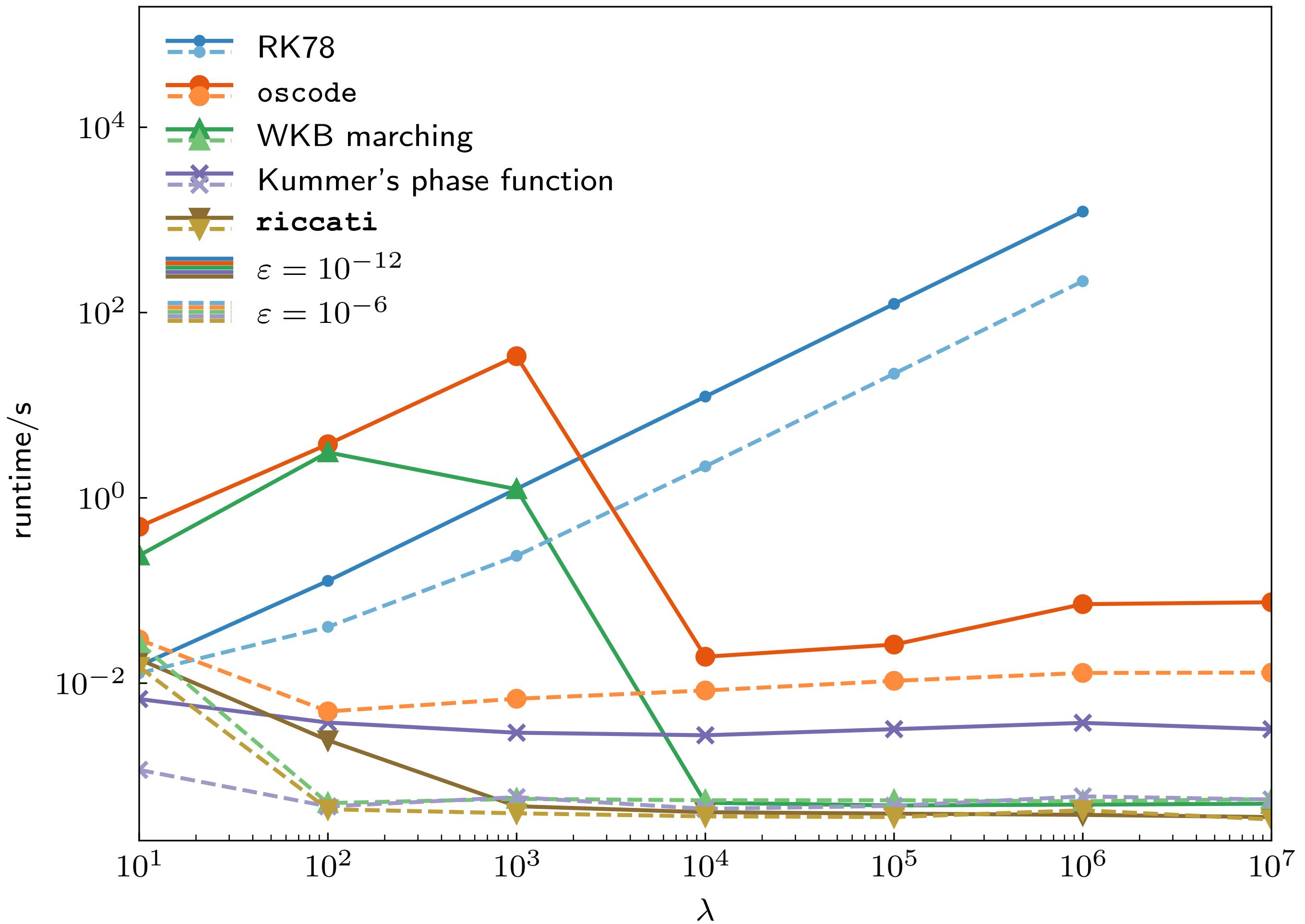
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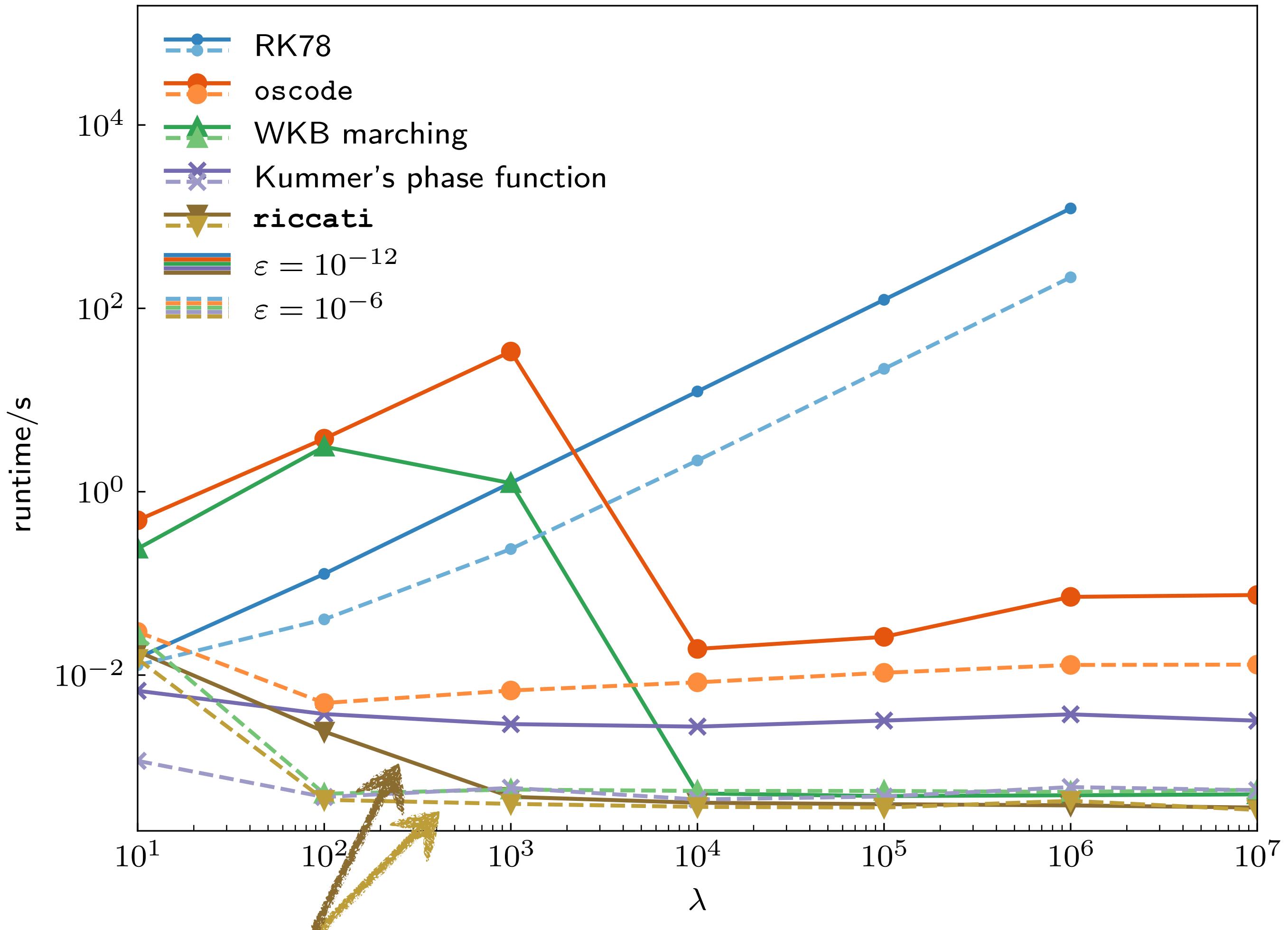
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# Software

- Open-source, unit tested (with **continuous integration**), documented, with [executable tutorials](#)
- Easy install via pip or conda (-forge) (or from source)
- C++ header-only library + Python wrapper (oscode) or + pure Python (`riccati`)
- Both codes are **peer-reviewed** and published in JOSS (Journal of Open-Source Software)
- **SUNDIALS** integration in progress

## riccati

`riccati` is a Python package implementing the [adaptive Riccati defect correction \(ARDC\) method](#) by Agocs & Barnett.

ARDC is a numerical method for solving ordinary differential equations (ODEs) of the form

$$u''(t) + 2\gamma(t)u'(t) + \omega^2(t)u(t) = 0,$$

on some solution interval  $t \in [t_0, t_1]$  and subject to the initial conditions  $u(t_0) = u_0$ ,  $u'(t_0) = u'_0$ .

This documentation will show you how to use the package which is under active development on [GitHub](#).

Shields

### How to use the docs

Start by following the (brief) [Installation](#) guide. After that you may get started straight away with the [Quick Start](#), or check out some more [Examples](#). Each function in the module is documented in the [API](#).

#### User Guide

##### Installation

[Via package managers](#)

[Testing the installation](#)

##### Quick Start

##### Examples

[Quick summary of the algorithm](#)

[Basic example](#)

$w, \gamma$  can be any callable

[Optional and tuning parameters](#)

#### Basic example

We'll first demonstrate the basic functionality of the module with a minimal working example.

```
import numpy as np
import riccati

# Set up the ODE
w = lambda t: 100*np.sqrt(1 - t**2*np.cos(3*t))
g = lambda t: np.zeros_like(t) # Make sure the result is vectorised!

# Set up the solver
info = riccati.solversetup(w, g)

# Integration range and initial conditions
ti = -1.0
tf = 1.0
ui = 0.0
dui = 100.0

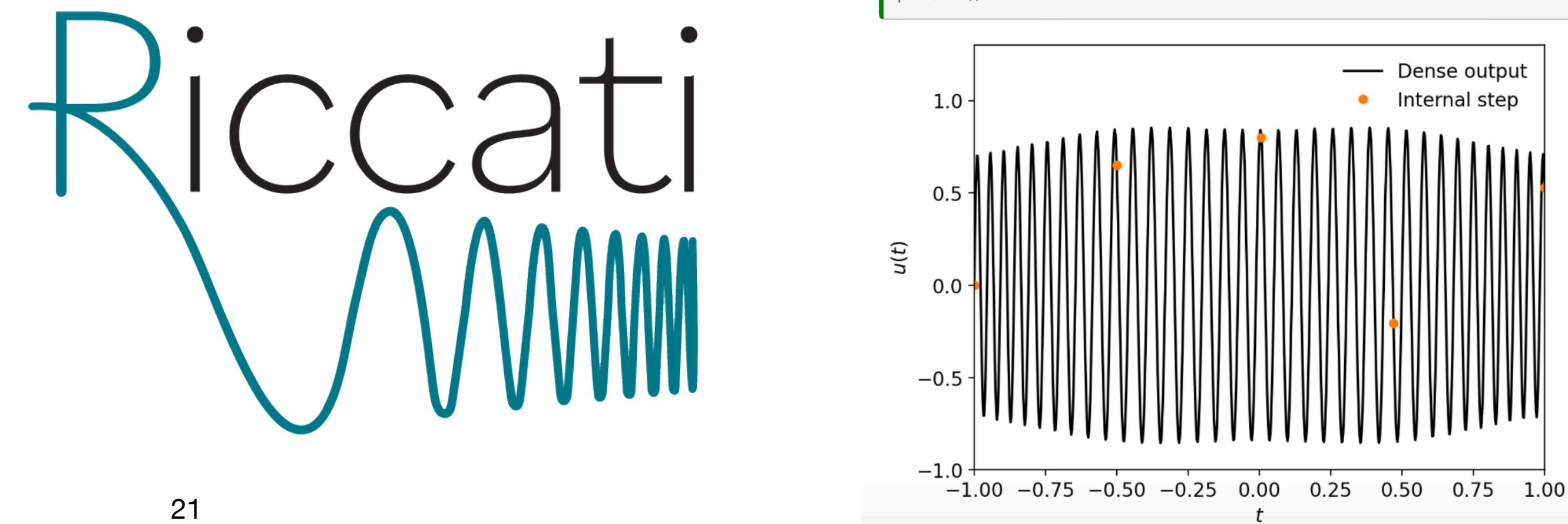
# We ask for the solution to be interpolated and output at the following "dense"
t_eval = np.linspace(ti, tf, 800)

# Solve!
ts, ys, *misc, y_eval = riccati.solve(info, ti, tf, ui, dui, xeval = t_eval, ha
```

And plot the output:

```
from matplotlib import pyplot as plt

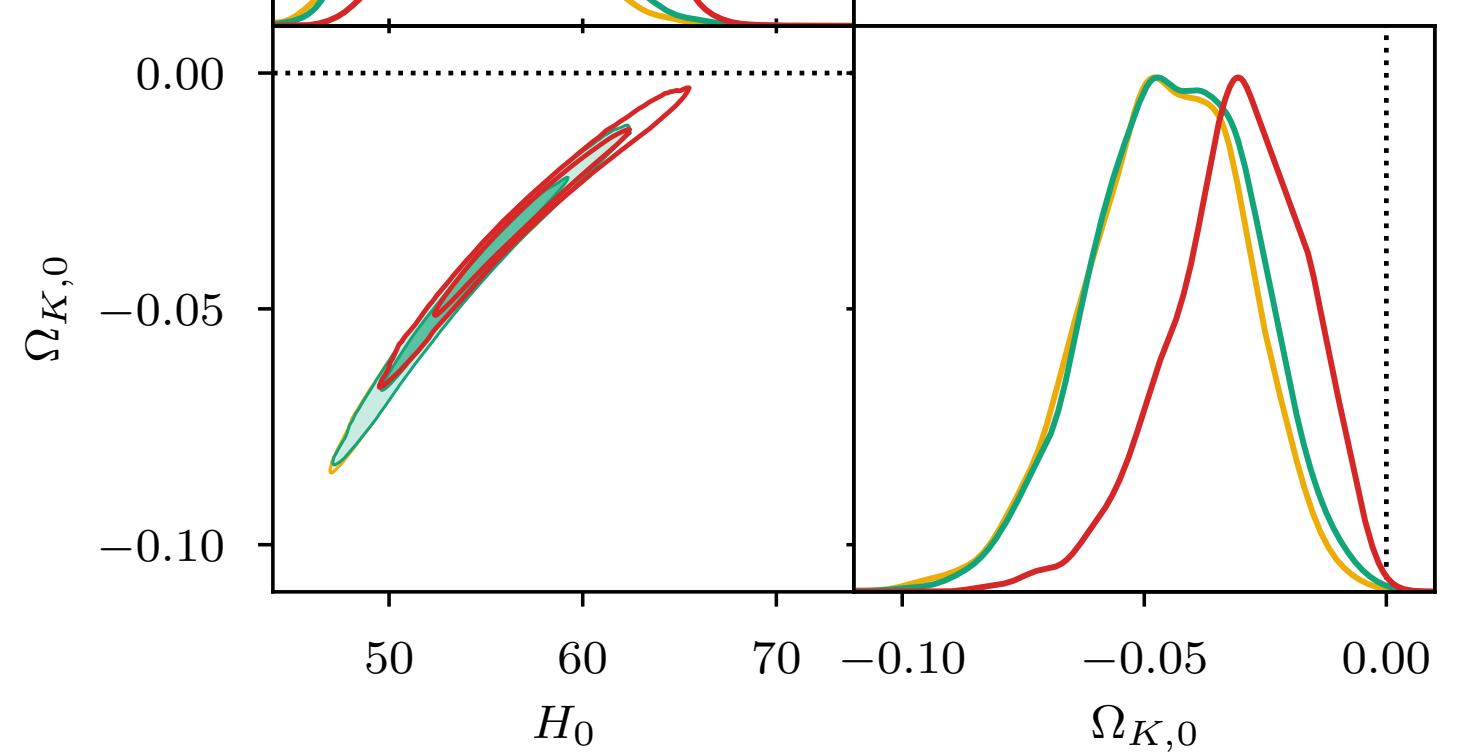
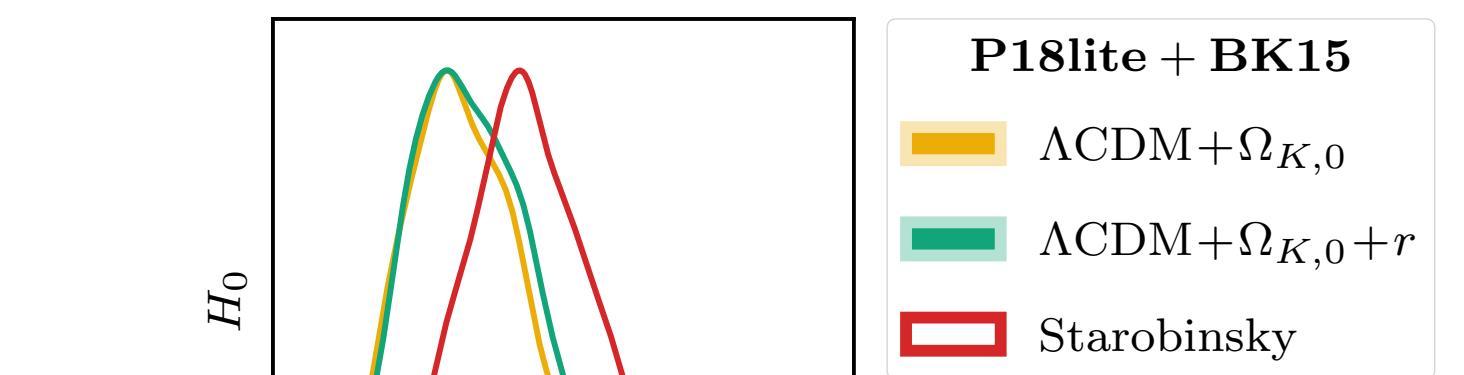
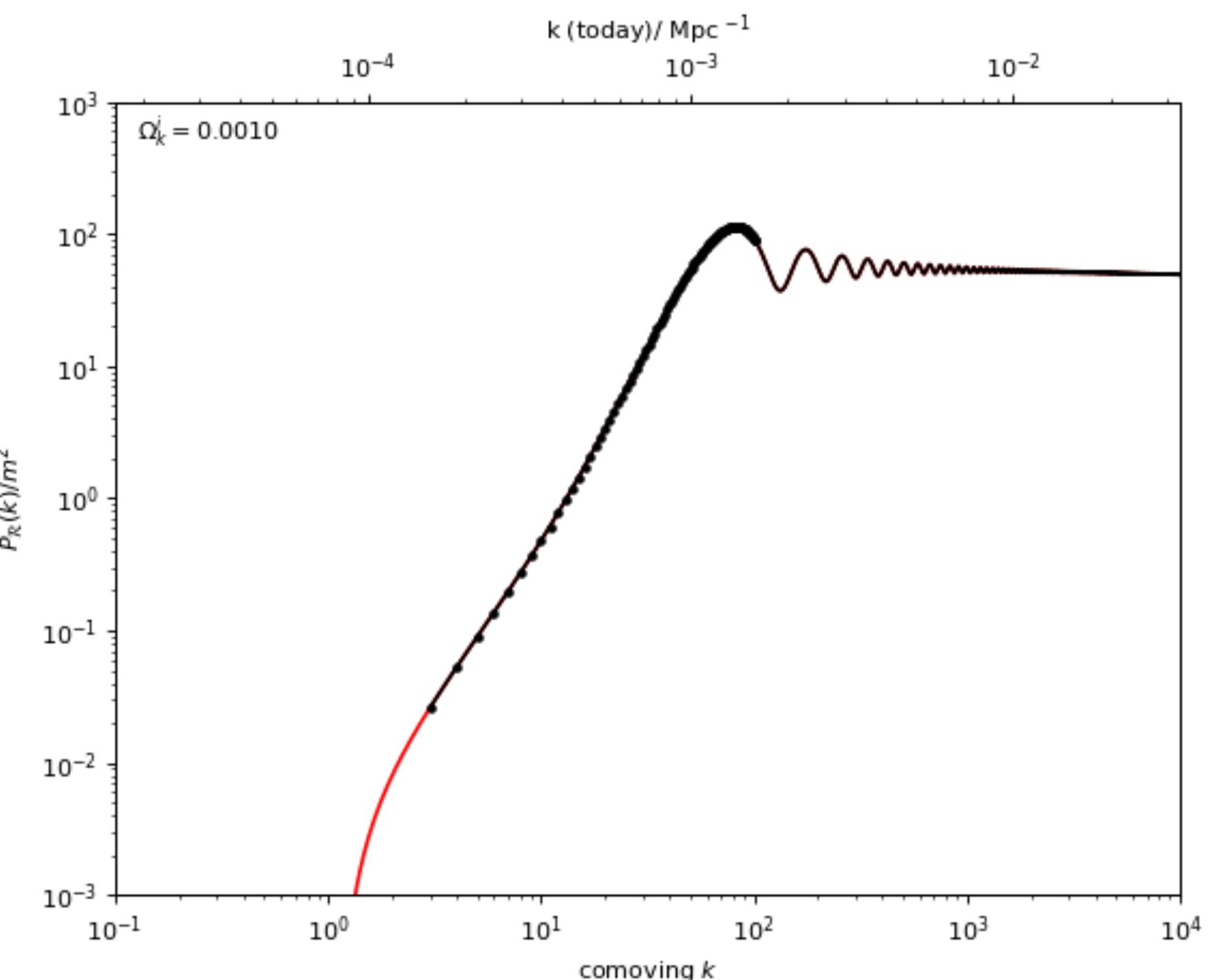
plt.figure()
plt.plot(t_eval, y_eval, label = "Dense output", color = 'k')
plt.plot(ts, ys, '.', label = "Internal step", color = 'C1')
plt.xlim(ti, tf)
plt.ylim(-1, 1.3)
plt.xlabel('$t$')
plt.ylabel('$u(t)$')
plt.legend()
plt.show()
```



# Applications & future work

## Cosmology

- Forward-modeling step of CMB (Cosmic Microwave Background) involves  $\approx 10^3$  osc. ODE solves, expensive → replaced with approximations
- Part of inference loop:  $10^9$  solves needed
- Computationally challenging models made possible to consider by oscode, riccati:
  - **curved (closed) universes** (currently favored by data): *Hergt, Agocs, et al. Phys Rev D, 2022.*
  - **Spectral distortion:** allows for particle physics scenarios during inflation, e.g. phase transitions, SUSY, strings



# Applications & future work

## Special function evaluation

- New fast solvers allow special functions to be evaluated by brute-force solving their ODE + interpolating (in terms of nonoscillatory phase function)
- Easier to parallelize for GPUs than currently preferred recursive formulae
- E.g. Associated Legendre functions, (spin) spherical harmonics, Wigner d functions

Timing results for evaluating Legendre polynomials via

$$(1 - t^2)P_\nu'' - 2tP_\nu' + \nu(\nu + 1)P_\nu = 0,$$
$$-1 < t < 1$$

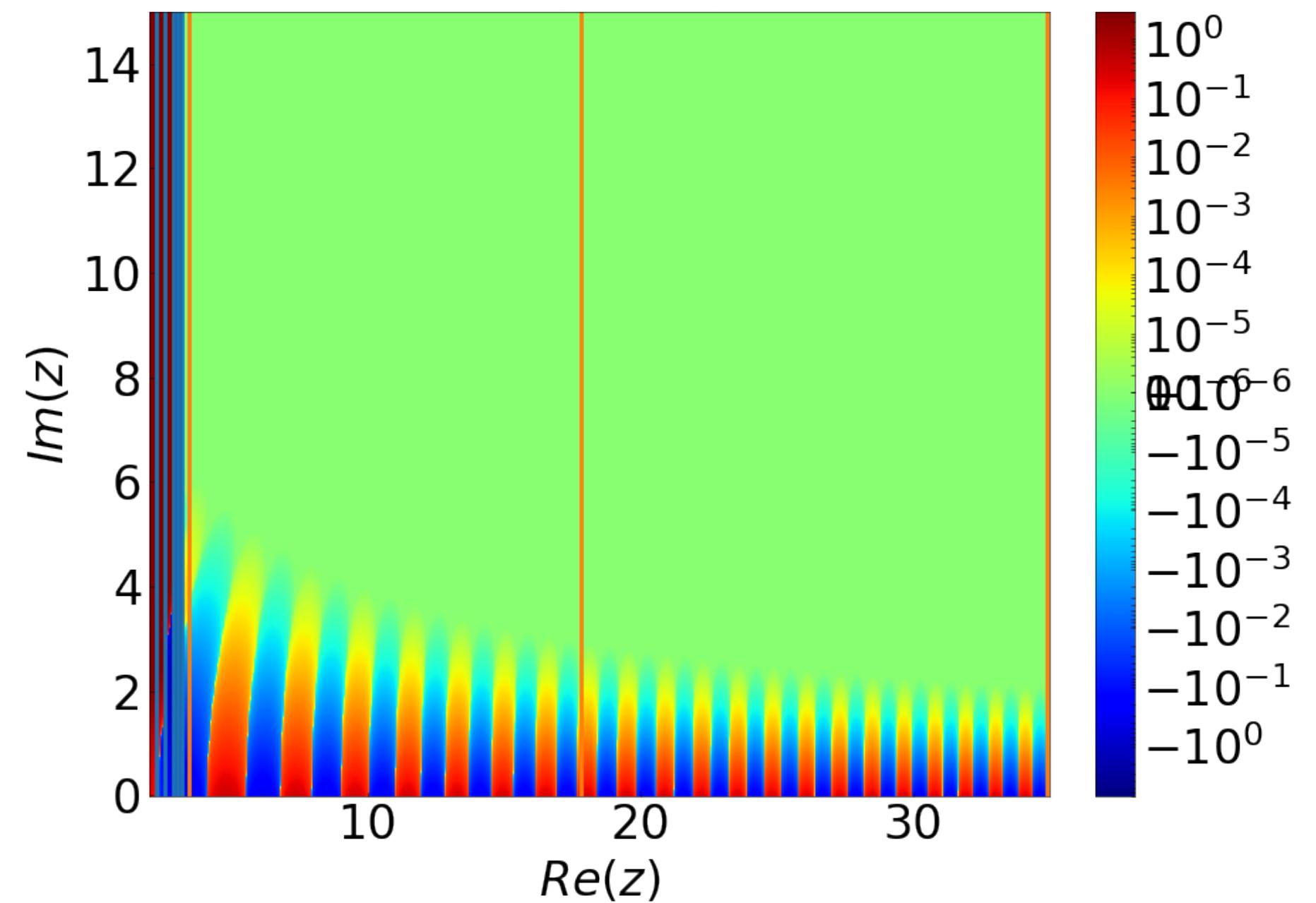
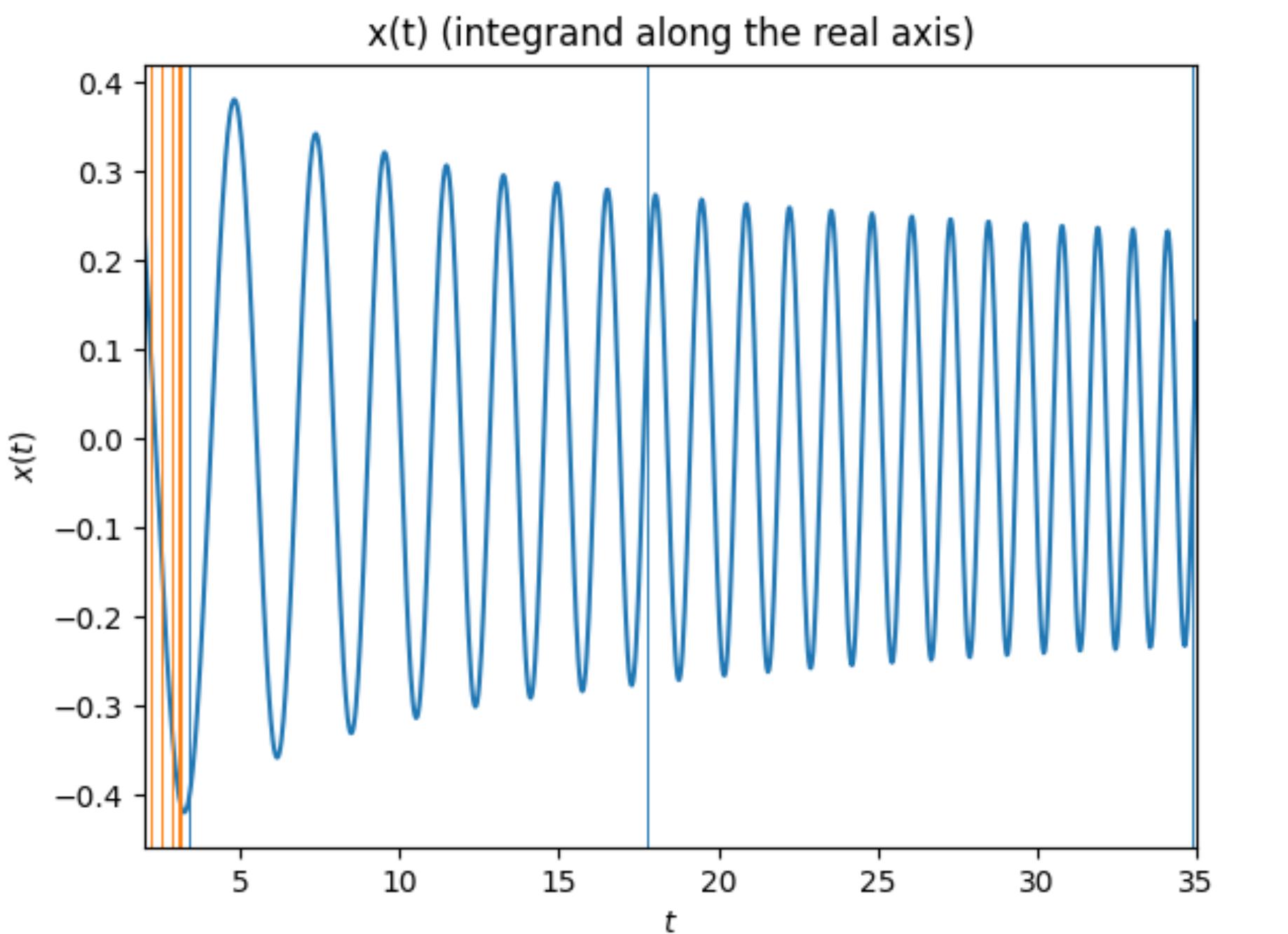
$\nu$	Abs. error	ODE solve time/s	Func evals
$10^1$	$8.76 \times 10^{-12}$	$1.07 \times 10^{-2}$	5540
$10^2$	$7.43 \times 10^{-12}$	$3.88 \times 10^{-2}$	17840
$10^3$	$3.51 \times 10^{-13}$	$1.20 \times 10^{-2}$	5690
$10^4$	$6.51 \times 10^{-13}$	$5.54 \times 10^{-3}$	4108
$10^5$	$2.06 \times 10^{-12}$	$4.87 \times 10^{-3}$	4108
$10^6$	$6.97 \times 10^{-12}$	$4.55 \times 10^{-3}$	4108
$10^7$	$1.76 \times 10^{-11}$	$4.40 \times 10^{-3}$	4108
$10^8$	$6.76 \times 10^{-11}$	$4.25 \times 10^{-3}$	4108
$10^9$	$2.06 \times 10^{-10}$	$4.20 \times 10^{-3}$	4108

Each evaluation of  $P_\nu(t)$  at a new  $t$  takes  $\approx 10^{-6}$ s

# Applications & future work

## Generalizations

- Quadrature of oscillatory functions
  - Represent an osc. function with its nonosc. phase function
  - Numerical steepest descent “goes around” the oscillations in the complex plane
  - **Gravitational wave template matching, CMB bispectrum calculation, wavefunction normalization**
- Nonlinear, oscillatory, second-order, homogeneous ODE
  - Inspired by Linda Petzold’s work: solve ODE system obeyed by Fourier coefficients
  - Numerical Poincaré—Lindstedt method
  - **Axion (dark matter candidate) realignment mechanism**
- Linear systems of coupled oscillatory ODEs



# **PDEs**

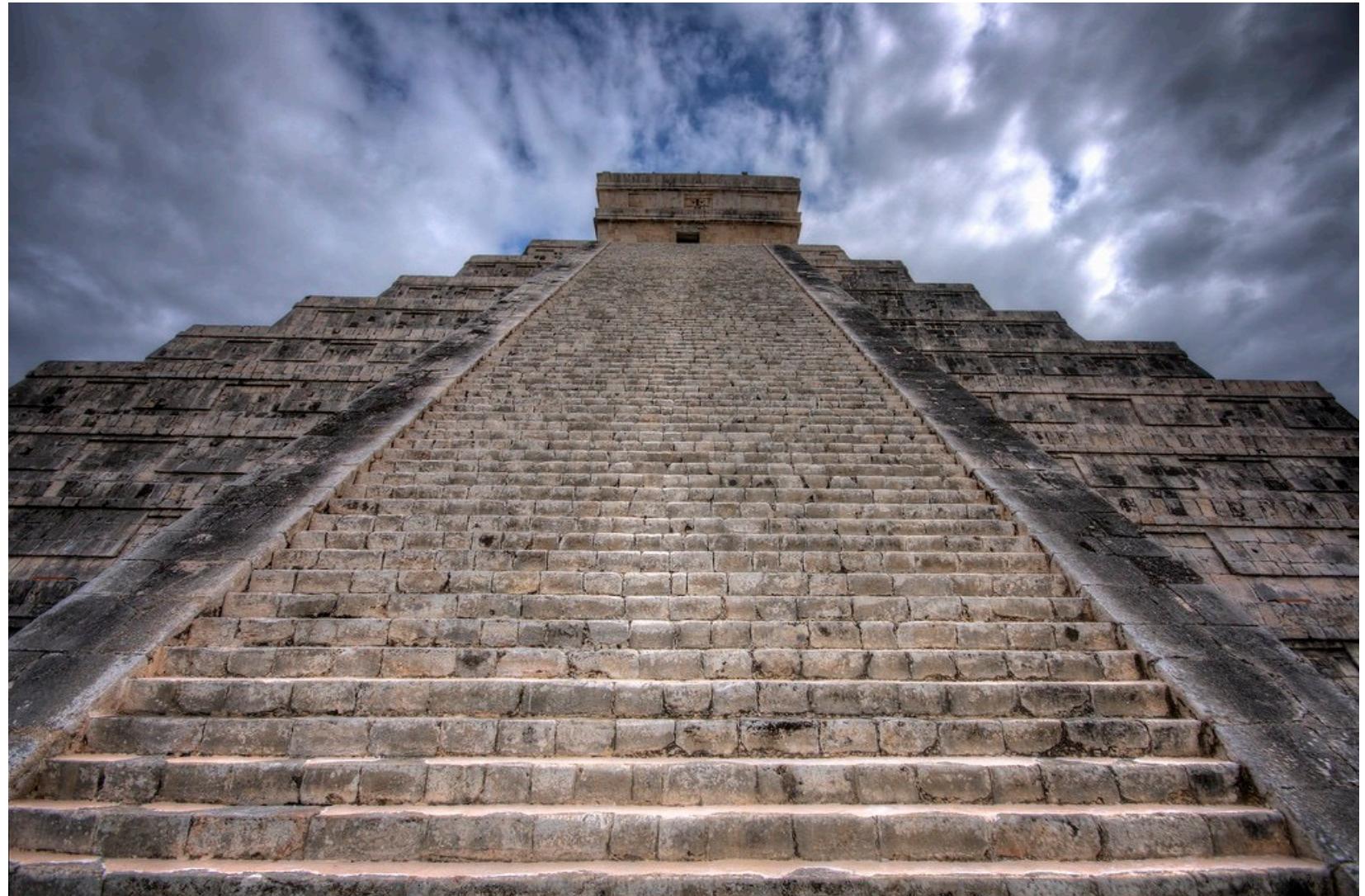
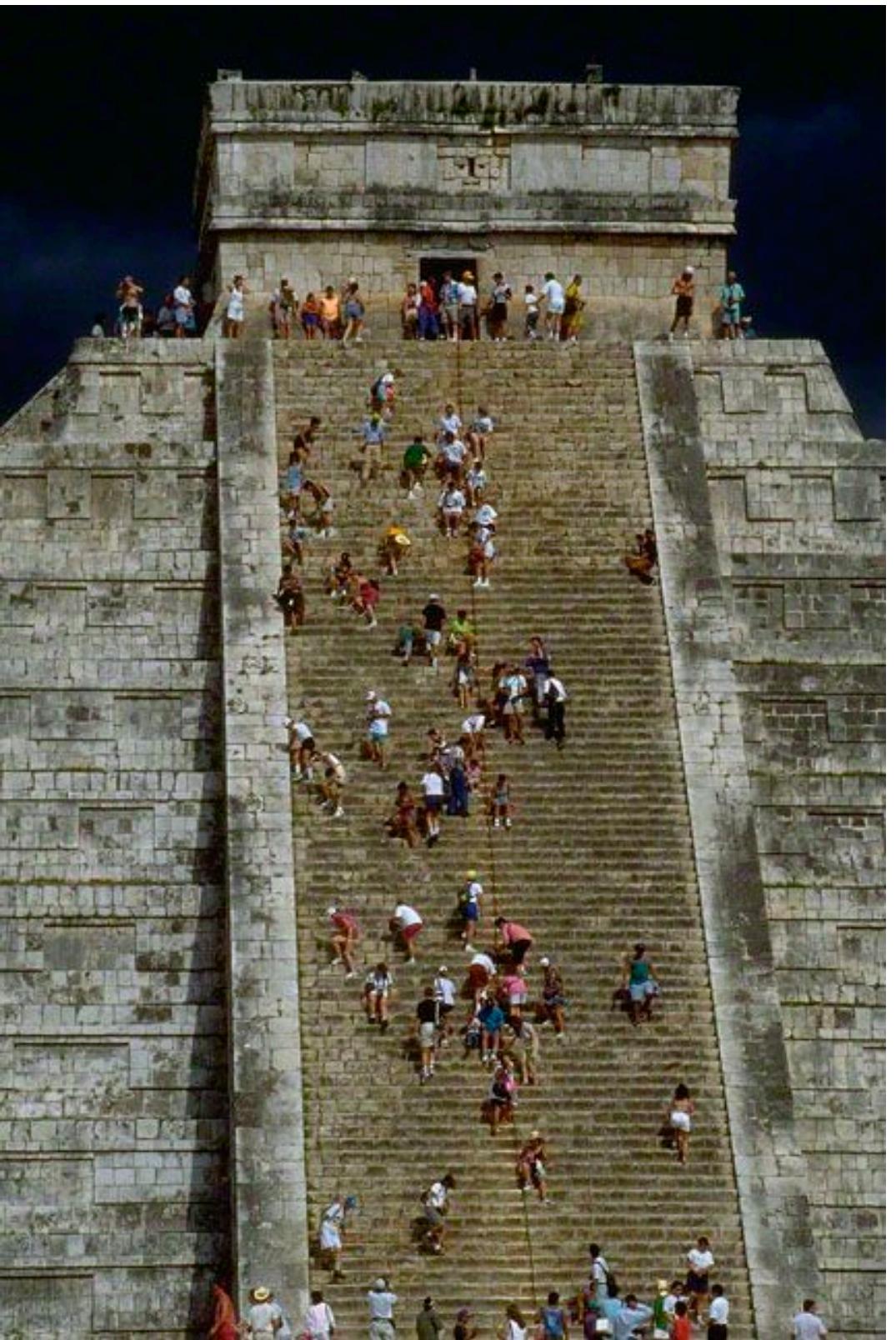
# Scattering of a nonperiodic source from a periodic, corrugated surface

## Why this problem?

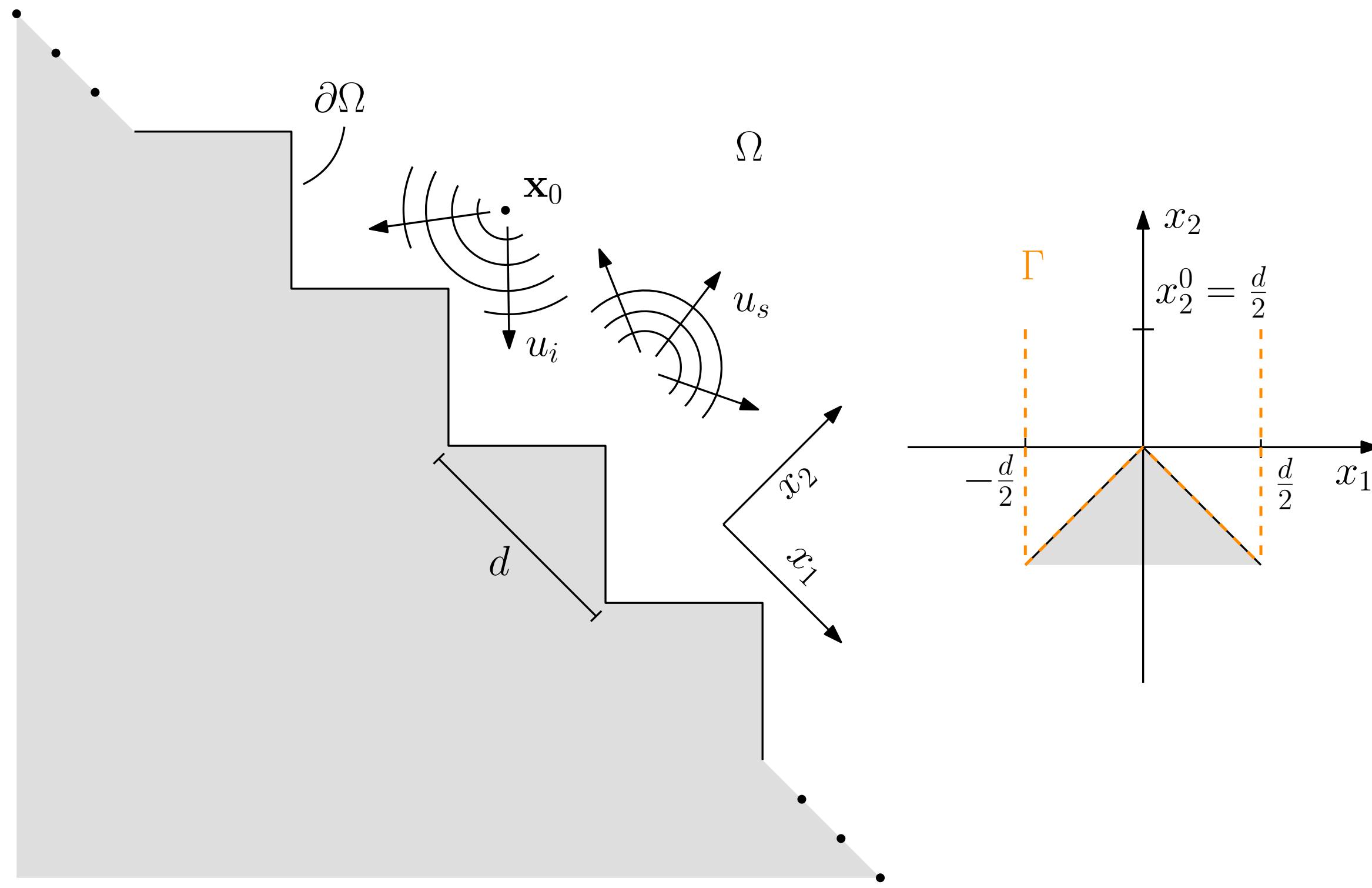
- Challenges:
  - Domain is infinite
  - Periodic boundary → cannot truncate due to artificial reflections
  - Nonperiodic source breaks periodicity → cannot reduce to single unit cell\*
  - Corners introduce singularities
- Uses: **waveguides**, photonic crystals, acoustic metamaterials, diffraction gratings, antennae, anechoic chambers, amphitheaters, ...
  - Fast, robust methods needed in **optimization** loops

## What's novel?

- First **high-order accurate** scattering of a **nonperiodic source** from a **periodic surface with corners**: [arXiv:2310.12486](https://arxiv.org/abs/2310.12486) (with Alex Barnett)
- Explains acoustic “raindrop” effect at pyramids via trapped acoustic modes
- Calculated power fraction transported away by trapped modes



# Problem setup - quasiperiodic set of sources



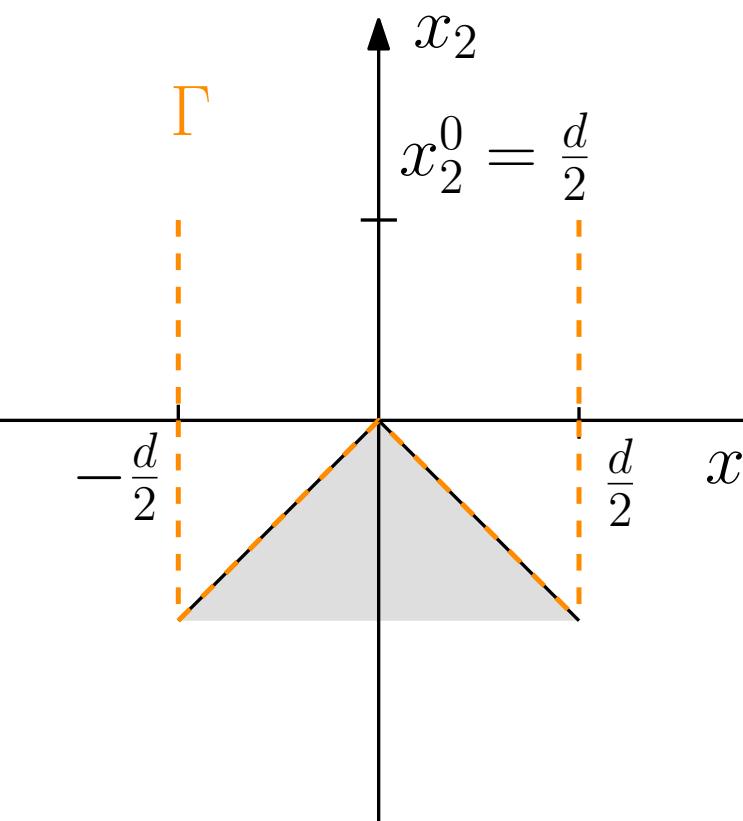
$$-(\Delta + \omega^2)u = \sum_{n=-\infty}^{\infty} e^{inkd} \delta(\mathbf{x} - \mathbf{x}_0 - n\mathbf{d}) \quad \text{in } \Omega,$$

$$u_n = 0$$

$$u(x_1 + nd, x_2) = \alpha^n u(x_1, x_2)$$

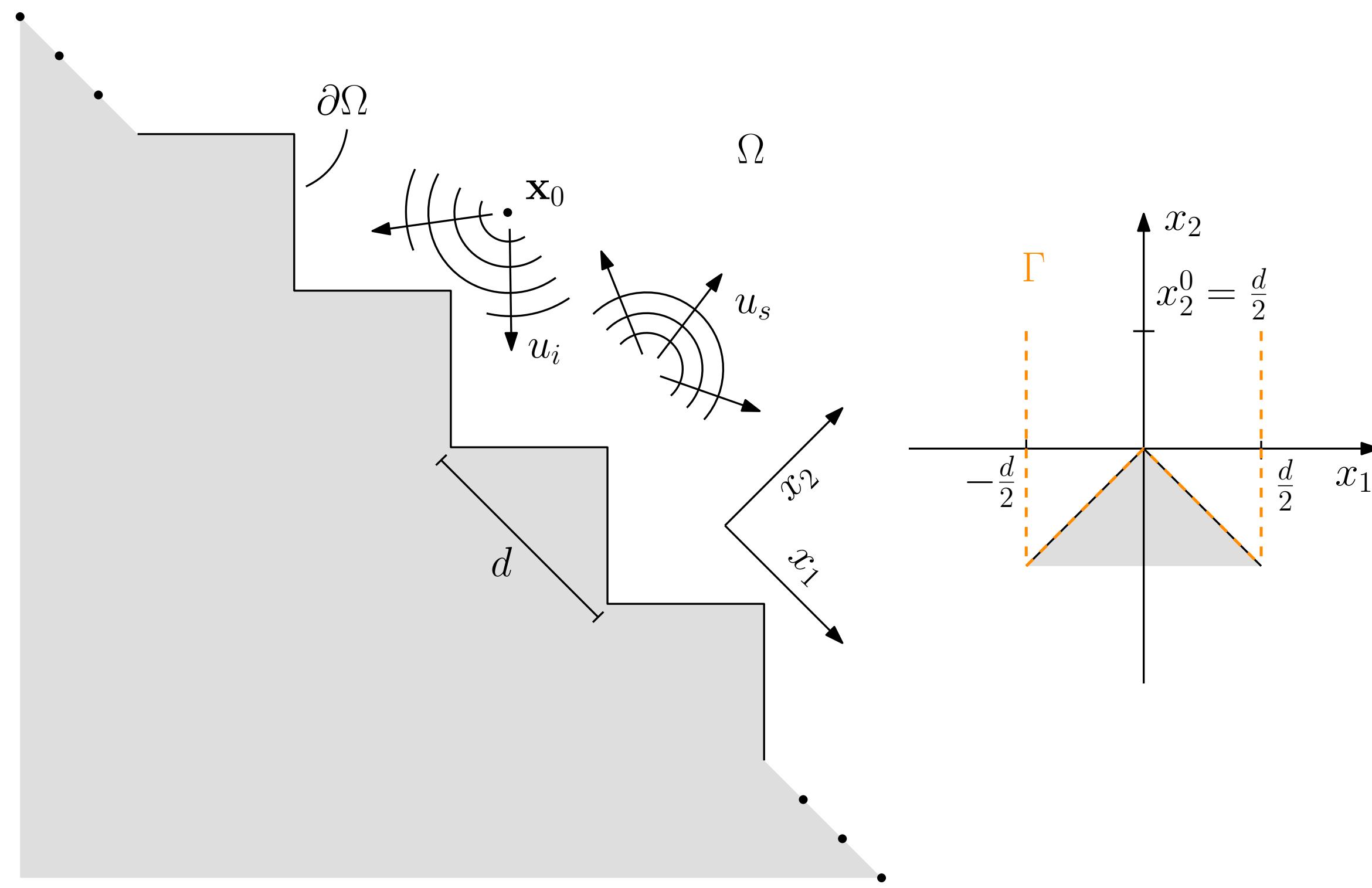
$$u(x_1, x_2) = \sum_{n \in \mathbb{Z}} c_n e^{i(k_n x_1 + k_n x_2)},$$

PDE (Helmholtz)  
on  $\partial\Omega$ ,      boundary condition (Neu)  
 $(x_1, x_2) \in \Omega$ ,      **quasiperiodicity**  
 $x_2 > x_2^0$       radiation condition



- $\mathbf{x} = (x_1, x_2)$  position vector,  $\mathbf{d} = (d, 0)$  lattice vector.
- $u = u_i + u_s$  is the total solution (incident + scattered)
- $\kappa$  is the **horizontal (on-surface) wavenumber**
- $u_n := \mathbf{n} \cdot \nabla u$  normal derivative in the outward sense
- Solution accrues a **phase**  $\alpha = e^{ikd}$  over one **period**  
*d. Quasiperiodicity condition*
- Set of horizontal wavevectors  $\kappa_n = \kappa + \frac{2\pi n}{d}$ ,  
 $n \in \mathbb{Z}$ , all equivalent
- If the total wavevector is  $\mathbf{k} = (\kappa_n, k_n)$ , then  
 $k_n = \sqrt{\omega^2 - \kappa_n^2}$  is the vertical wavevector
  - Vertically propagating or evanescent
  - $k_n = 0$  are **Wood anomalies** (change in behavior)

# Problem setup - quasiperiodic set of sources



## Summary:

Start from a set of quasiperiodic point sources (of sound)

We can move by a period  $d$ , solution only changes by a complex phase.

System to solve is PDE + boundary condition + symmetry + far-away behavior

- $\mathbf{x} = (x_1, x_2)$  position vector,  $\mathbf{d} = (d, 0)$  lattice vector.
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# Boundary integral formulation; theory

- Use a single-layer potential (**SLP**) representation for the scattered wave:

$$u_s(\mathbf{x}) = \mathcal{S}\sigma = \int_{\Gamma} \Phi_p(\mathbf{x}, \mathbf{y})\sigma(\mathbf{y})ds_y, \quad \mathbf{x} \in \mathbb{R}^2,$$

ensures  $u$  will satisfy the PDE.

- Using the appropriate **jump relations**, this gives the Fredholm integral equation

$$(I - 2D^T)\sigma = 2(u_i)_n \quad \text{on } \Gamma,$$

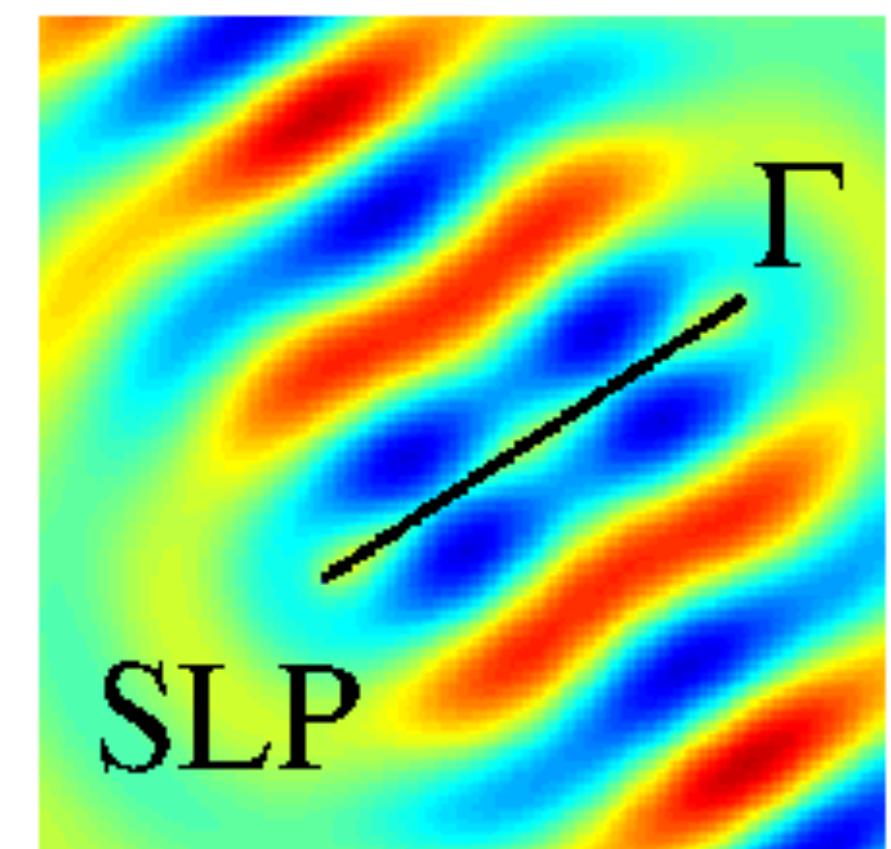
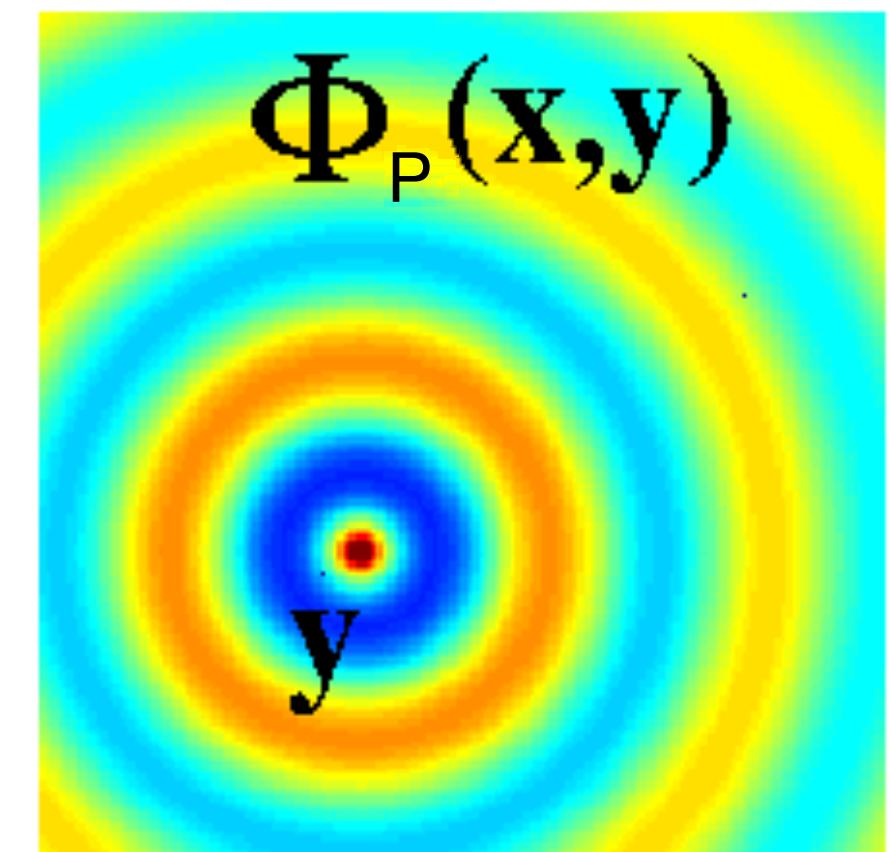
where  $\sigma$  is the unknown density, and

$$D^T\sigma = \int_{\Gamma} \mathbf{n}_x \cdot \nabla \Phi_p(\mathbf{x}, \mathbf{y})\sigma(\mathbf{y})ds_y \quad \text{on } \Gamma.$$

- Discretize via Nystrom's method, get dense linear system:  $A\sigma = \mathbf{b}$
- Reconstruct solution  $u_s$  from  $\sigma$  via **SLP** everywhere
- $\mathcal{O}(N)$  instead of  $\mathcal{O}(N^2)$ , can deal with singularities and be accurate via high-order quadrature

Quasiperiodic Green's function/fundamental solution:

- Solves PDE for quasiperiodic set of point sources
- Therefore depends on  $\kappa, \omega$
- Sum of Hankel functions



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## Summary:

Represent the solution with an ansatz.

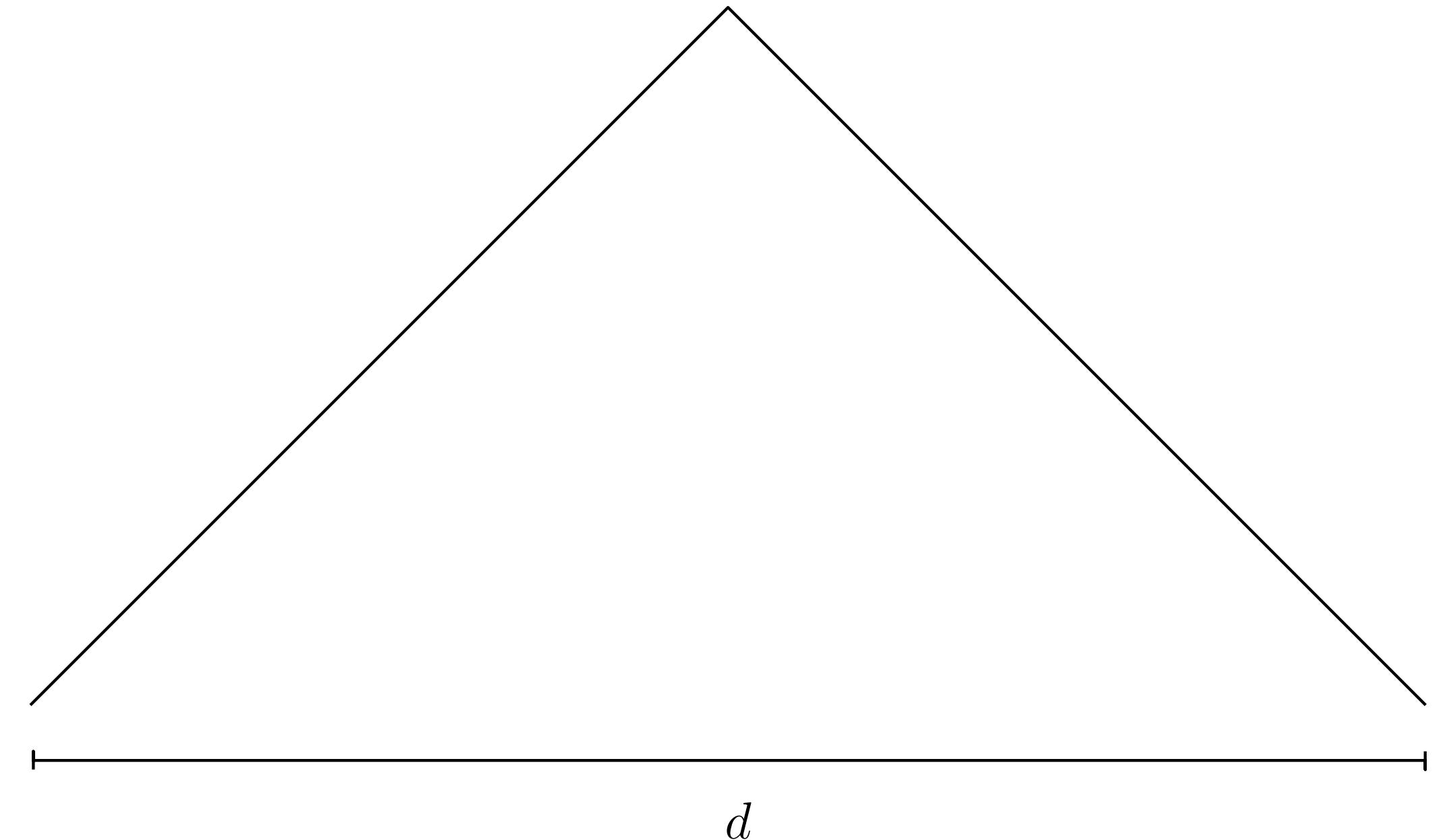
Ensuring the boundary conditions gives an integral equation that lives on the boundary

Discretize integral equation  $\rightarrow$  dense linear system

We reduced the number of dimensions by 1

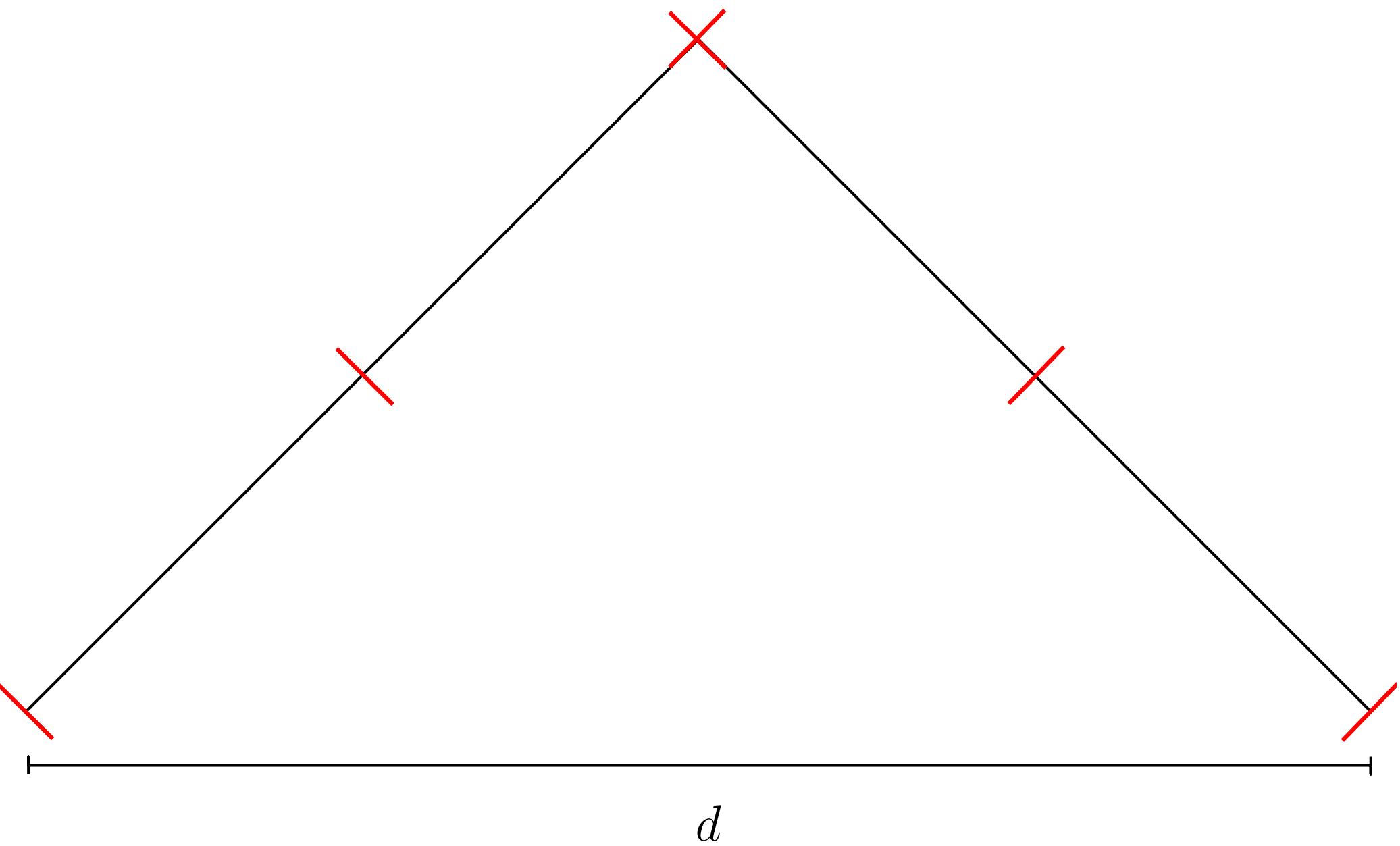
# Boundary integral formulation; quadrature

- How to choose the quadrature nodes  $\{s_i\}_{i=1}^N$ ?
- Integrand is singular at corners!
- → use panel quadrature with **adaptive corner refinement**:



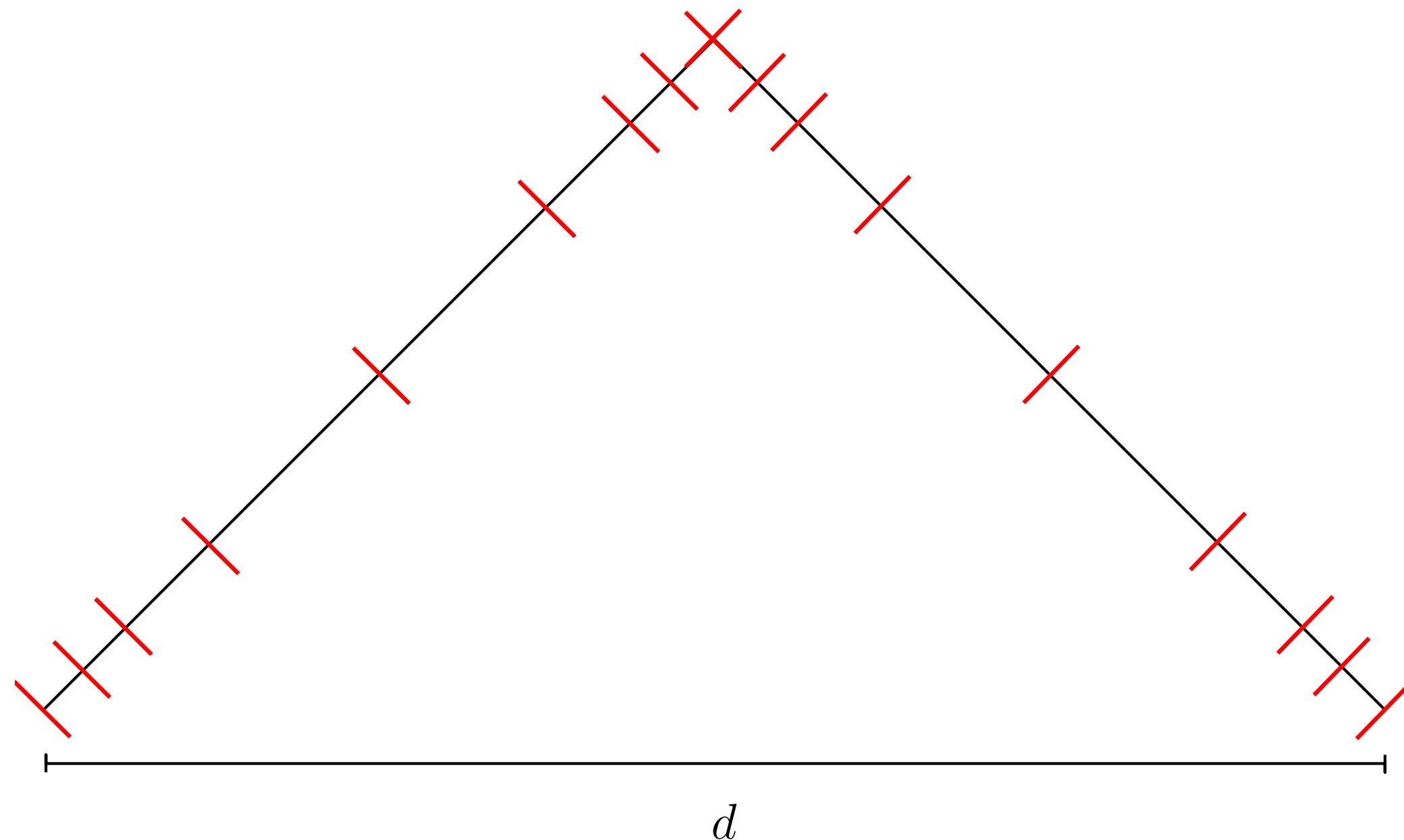
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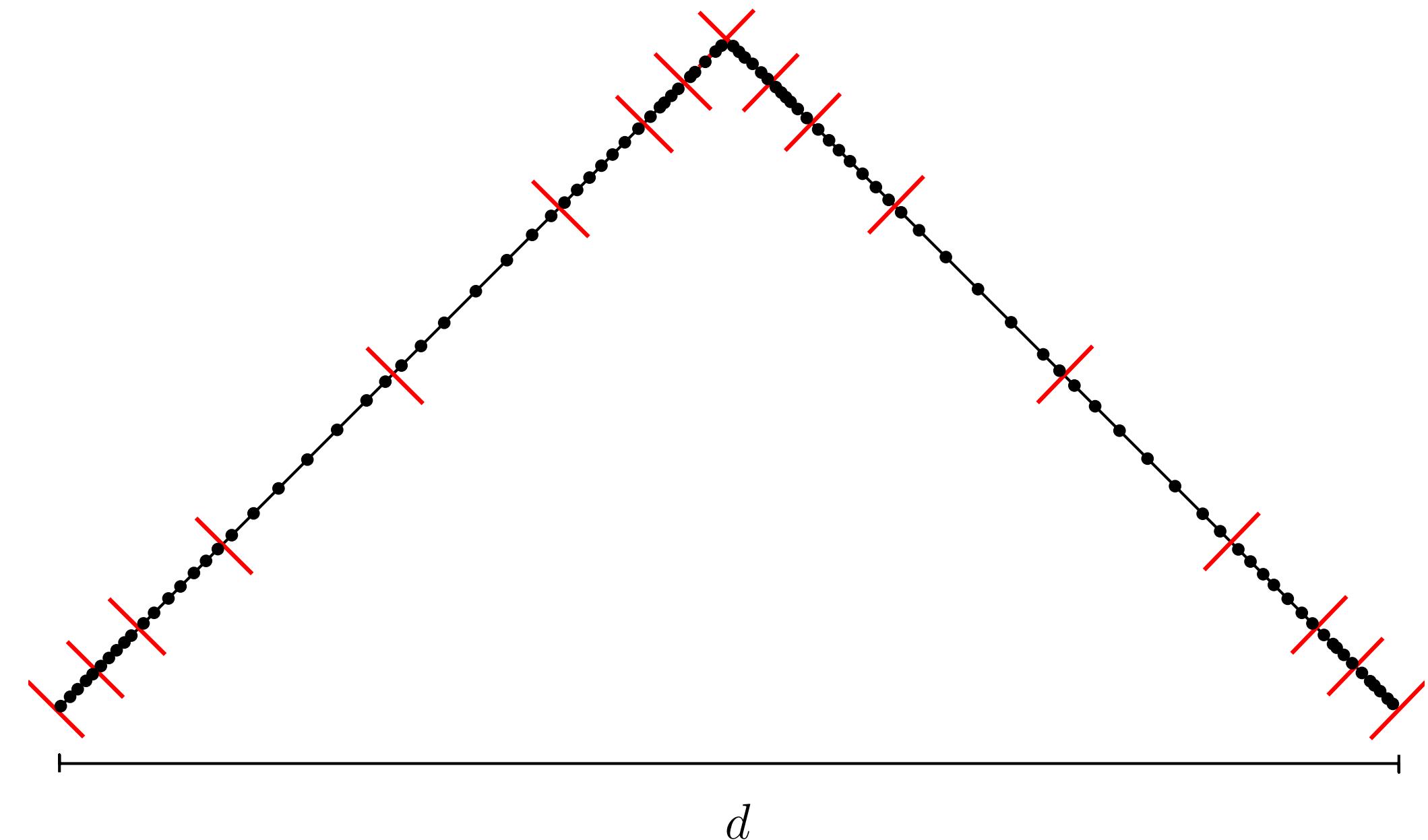
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  1. Lay down some equally sized initial panels
  2. Split corner-adjacent panels in a  $1 : (r - 1)$  ratio ( $r = 2$ , dyadic refinement shown)
  3. Lay down **Gauss—Legendre** quadrature nodes on panels.
- Quadrature coordinates **relative** to the nearest corner to avoid catastrophic cancellation



# Finding trapped modes, chirp reconstruction via ray model

- Trapped modes occur when the Fredholm determinant is singular, i.e.

$$(I - 2D^T)\sigma = 0$$

has a nontrivial solution.

Recall that previously, we had  $(I - 2D^T)\sigma = 2(u_i)_n$

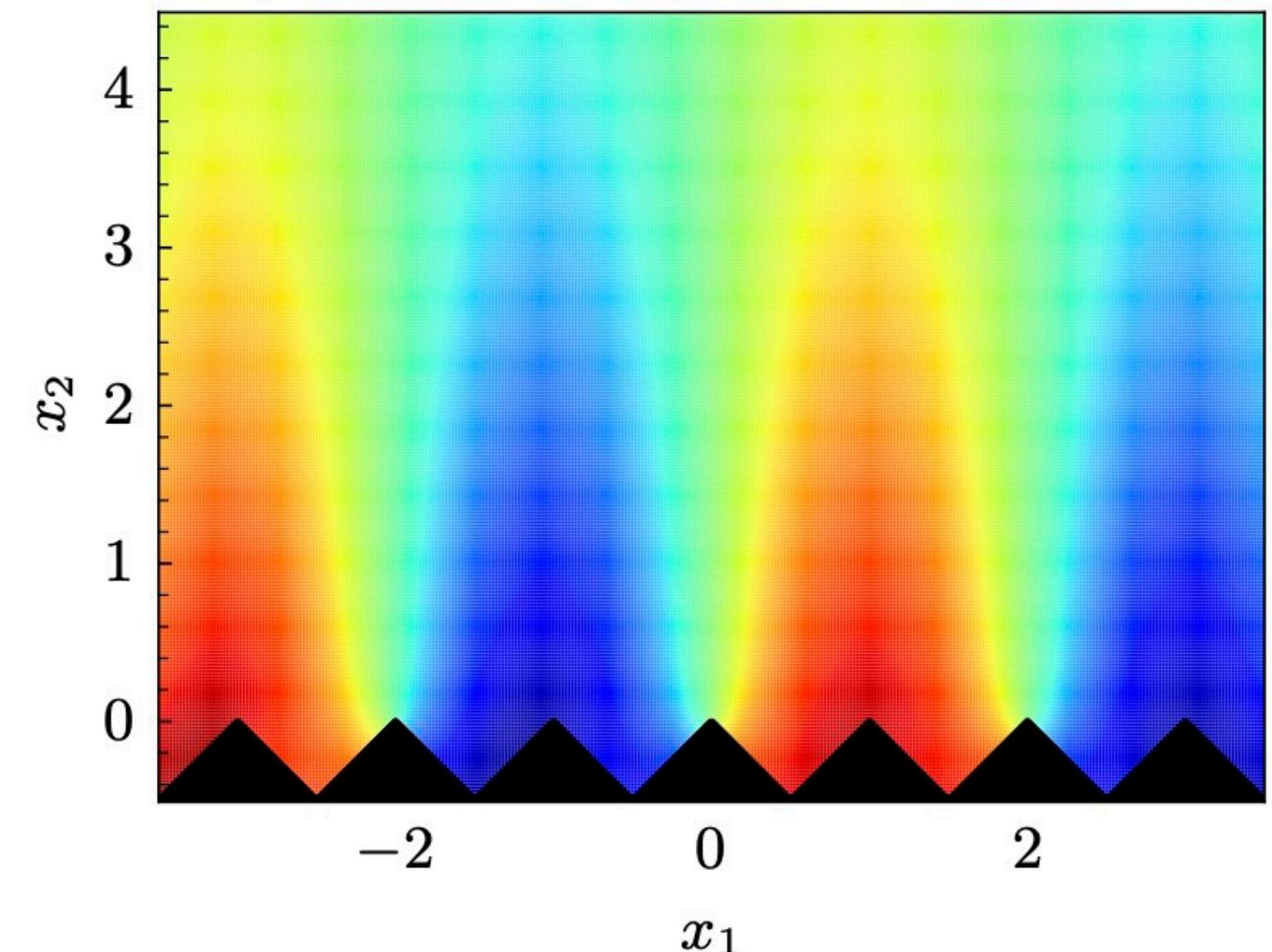
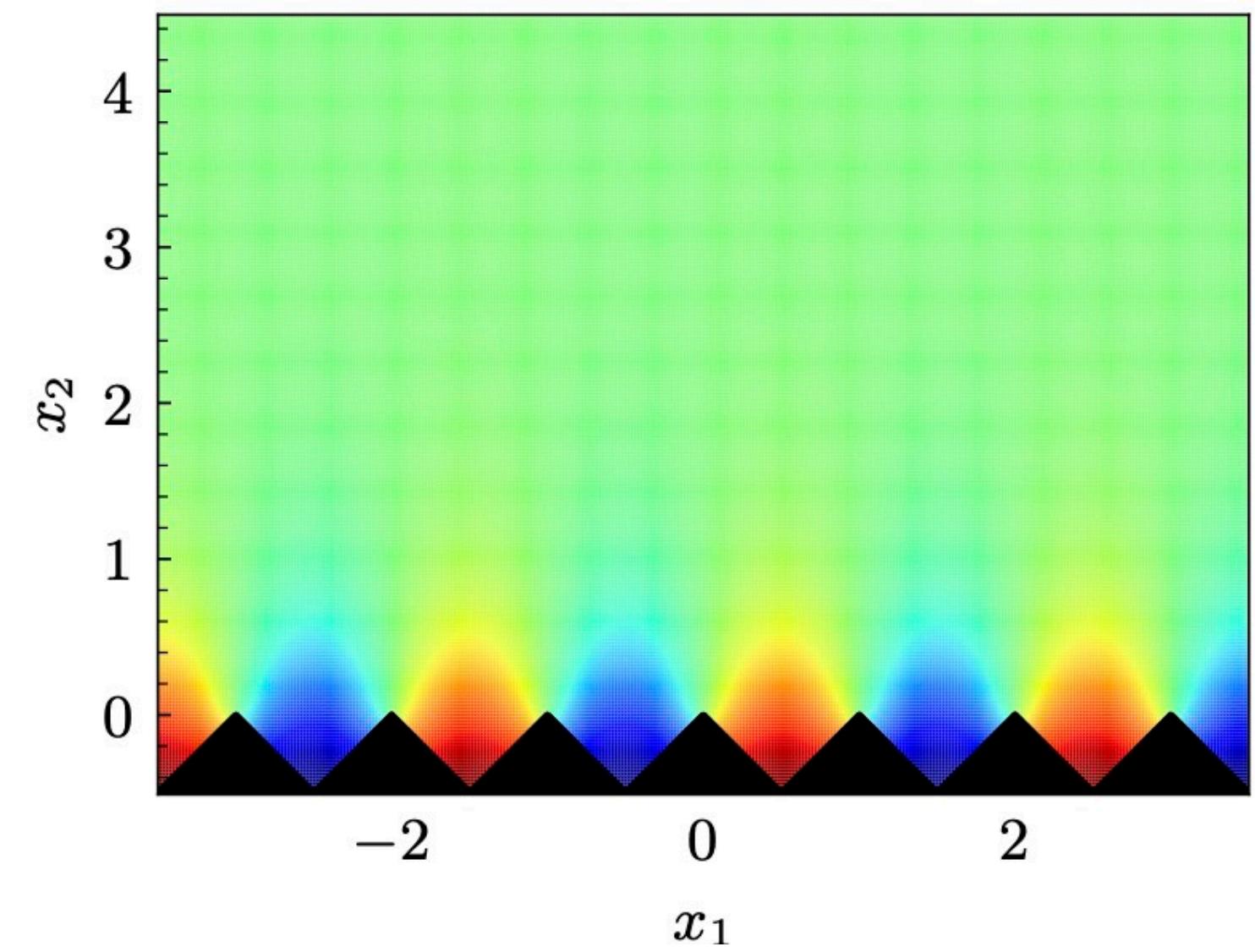
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- To find them: fix  $\omega$ , sweep over all possible  $\kappa$ ,  $\kappa \in \left[-\frac{\pi}{d}, \frac{\pi}{d}\right]$  and find roots of  $\det(I - 2D^T)$  (with Newton's method)



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$$\left[-\frac{\pi}{d}, \frac{\pi}{d}\right]$$

Recall that  $\kappa$  and  $\kappa + \frac{2\pi n}{d}$  are equivalent

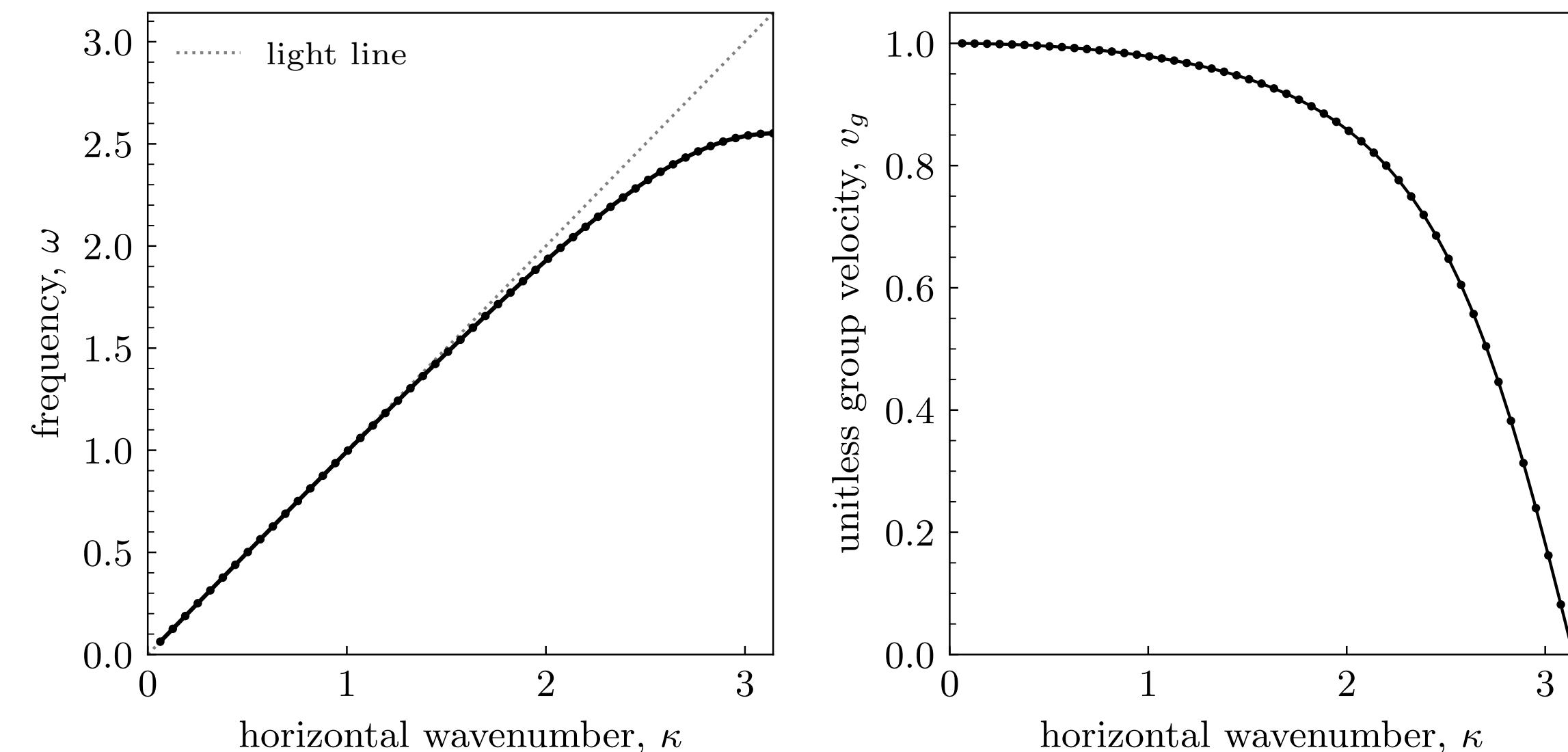
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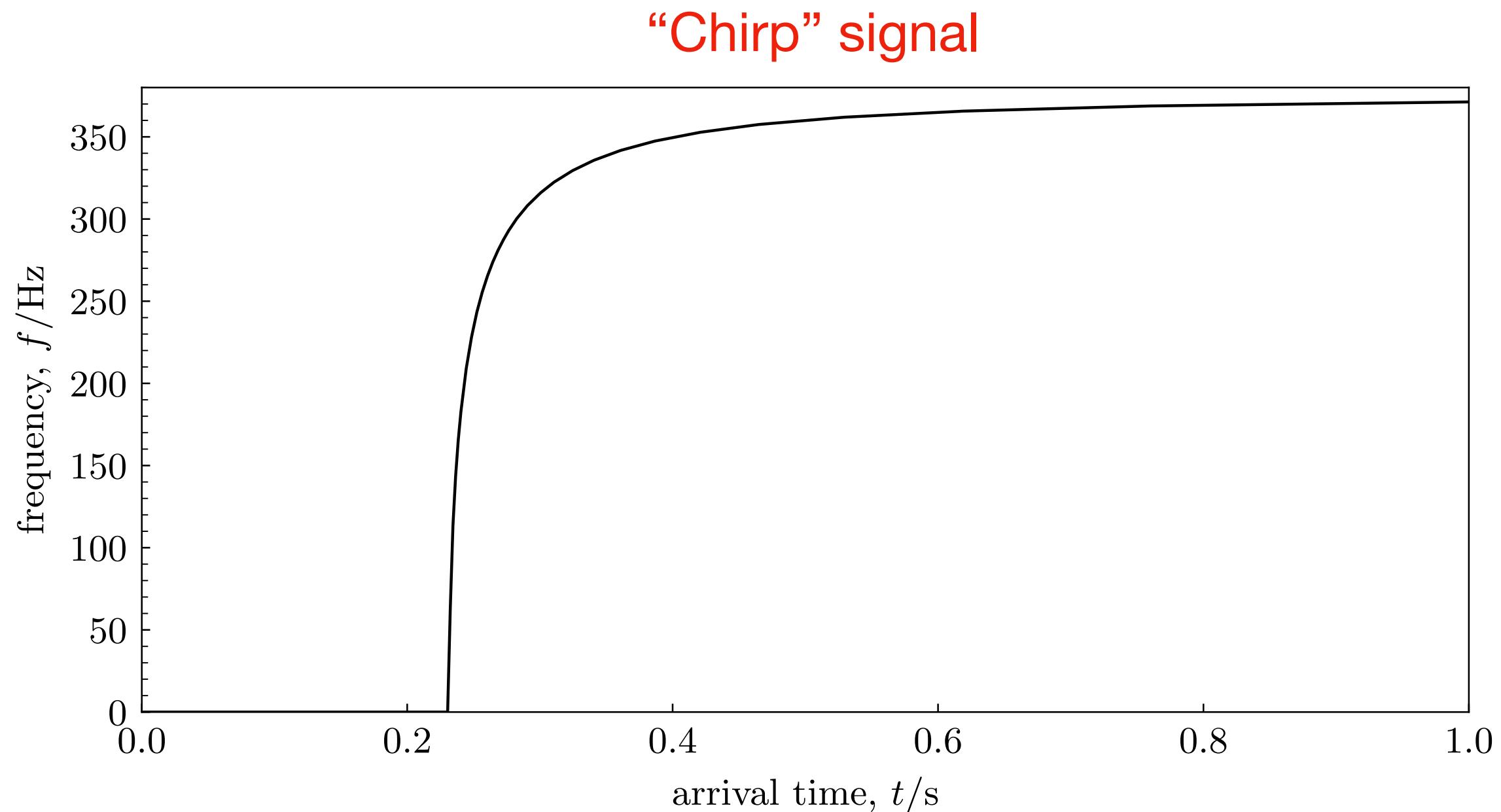
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  - **Ray model:** arrival time of different frequencies at El Castillo
    - Neglect: spreading along stairs in 3rd dimension; changes in amplitude; assume all trapped modes are excited



# Array scanning / Floquet–Bloch transform

- A neat trick: write point source as an integral of quasiperiodic sets of point sources over the horizontal wavenumber  $\kappa$

$$\delta(\mathbf{x} - \mathbf{x}_0) = \frac{d}{2\pi} \int_{-\pi/d}^{\pi/d} \sum_{n=-\infty}^{\infty} e^{inkd} \delta(\mathbf{x} - \mathbf{x}_0 - n\mathbf{d}) dk,$$

→ solution for a single point source is quasiperiodic solution

integrated over all possible wavenumbers  $\kappa \in \left[ -\frac{\pi}{d}, \frac{\pi}{d} \right]$ . (Munk & Burrell, IEEETAP, 1979)

Recall  $\mathbf{d} = (d, 0)$  is the lattice vector



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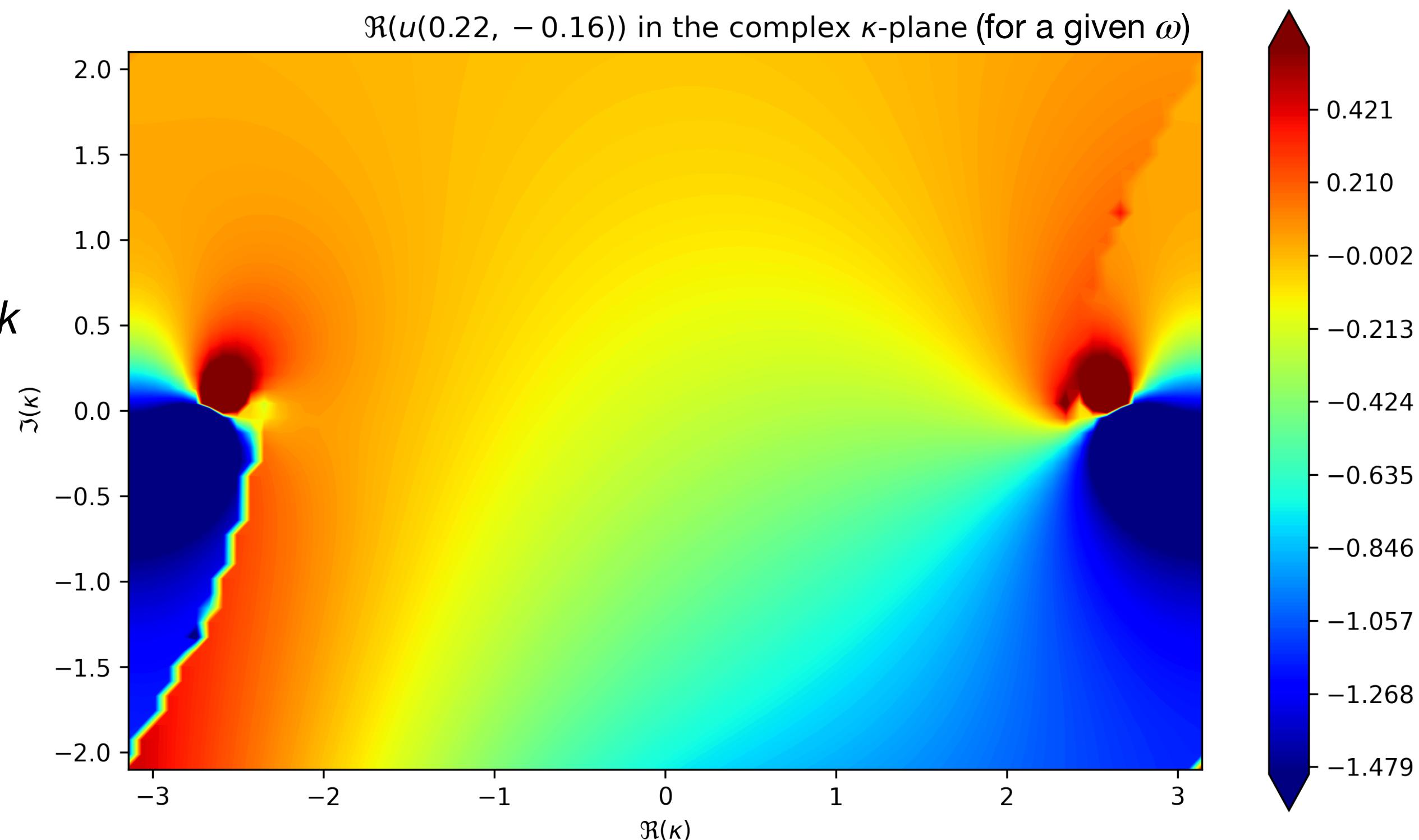
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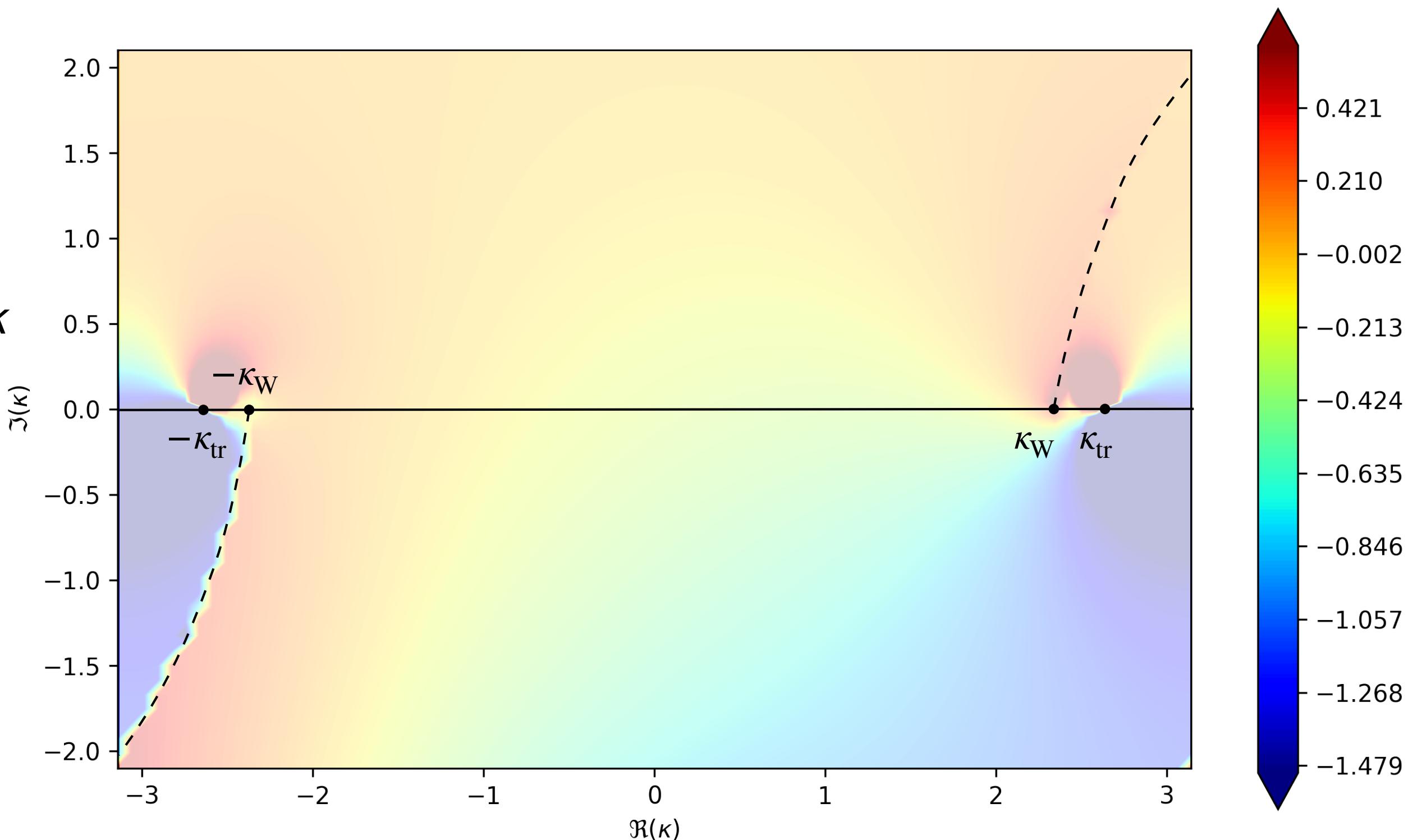
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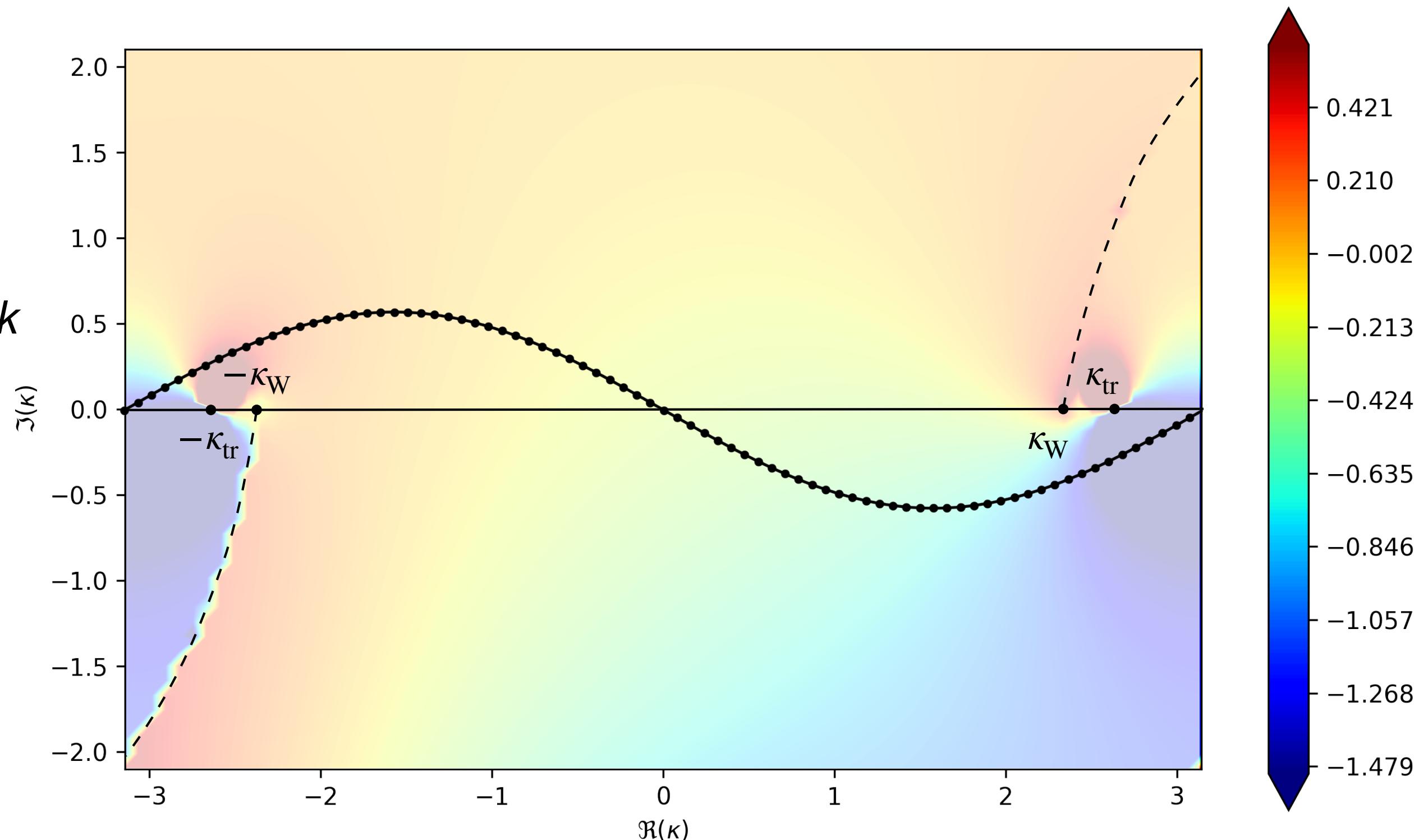
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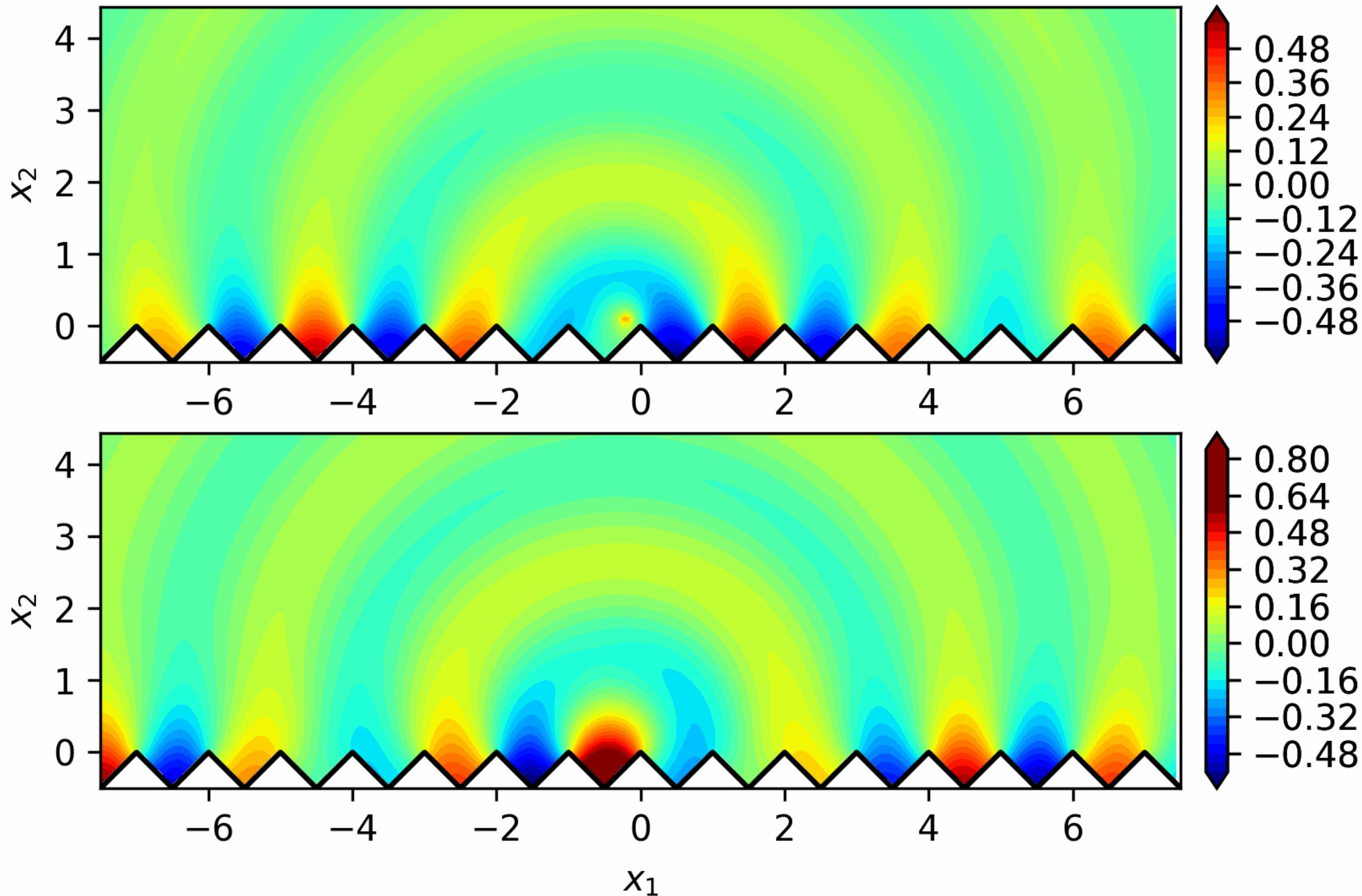
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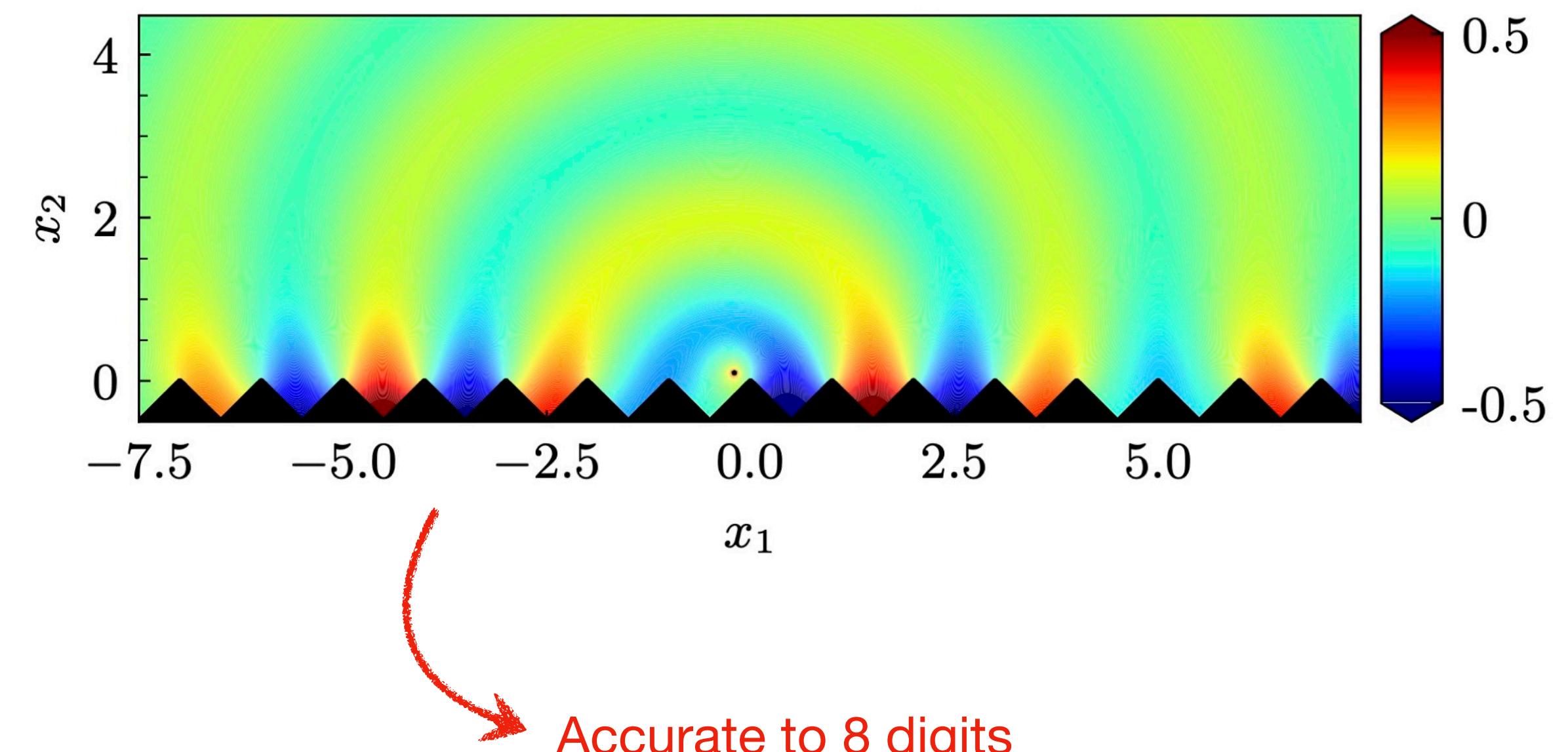
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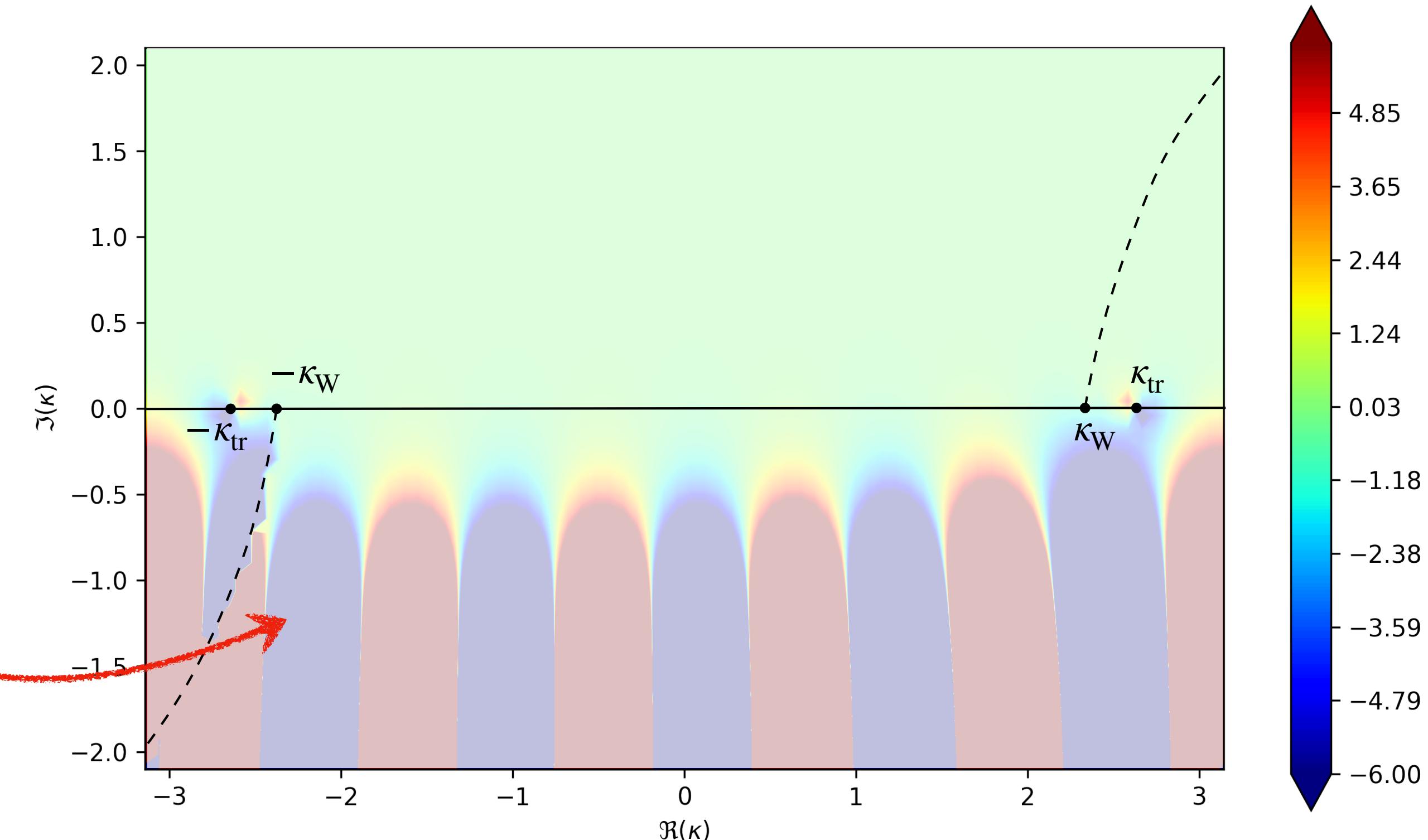
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- Claim: **in the far-away limit near the surface, only trapped mode remains**, i.e. only contribution to  $\kappa$ -integral will be from

$$\kappa = \kappa_{\text{tr}}$$

- **Why?** Take solution in the limit of  $n$  (cell index)  $\rightarrow \infty$ ,

$$\lim_{n \rightarrow +\infty} u(\mathbf{x} + n\mathbf{d}) = \frac{d}{2\pi} \lim_{n \rightarrow +\infty} \int_{-\pi/d}^{\pi/d} u_\kappa(\mathbf{x}) e^{ink} d\kappa.$$



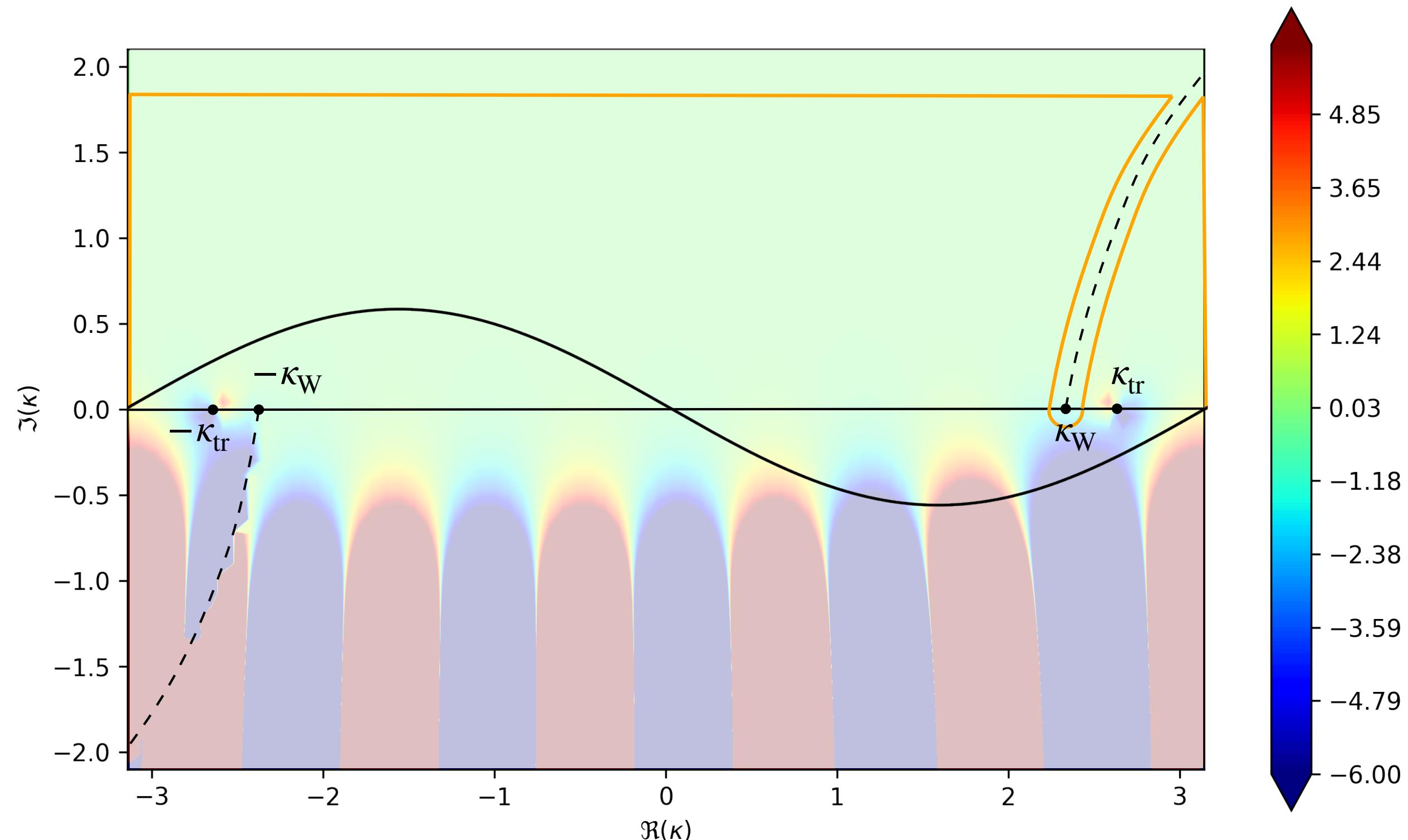
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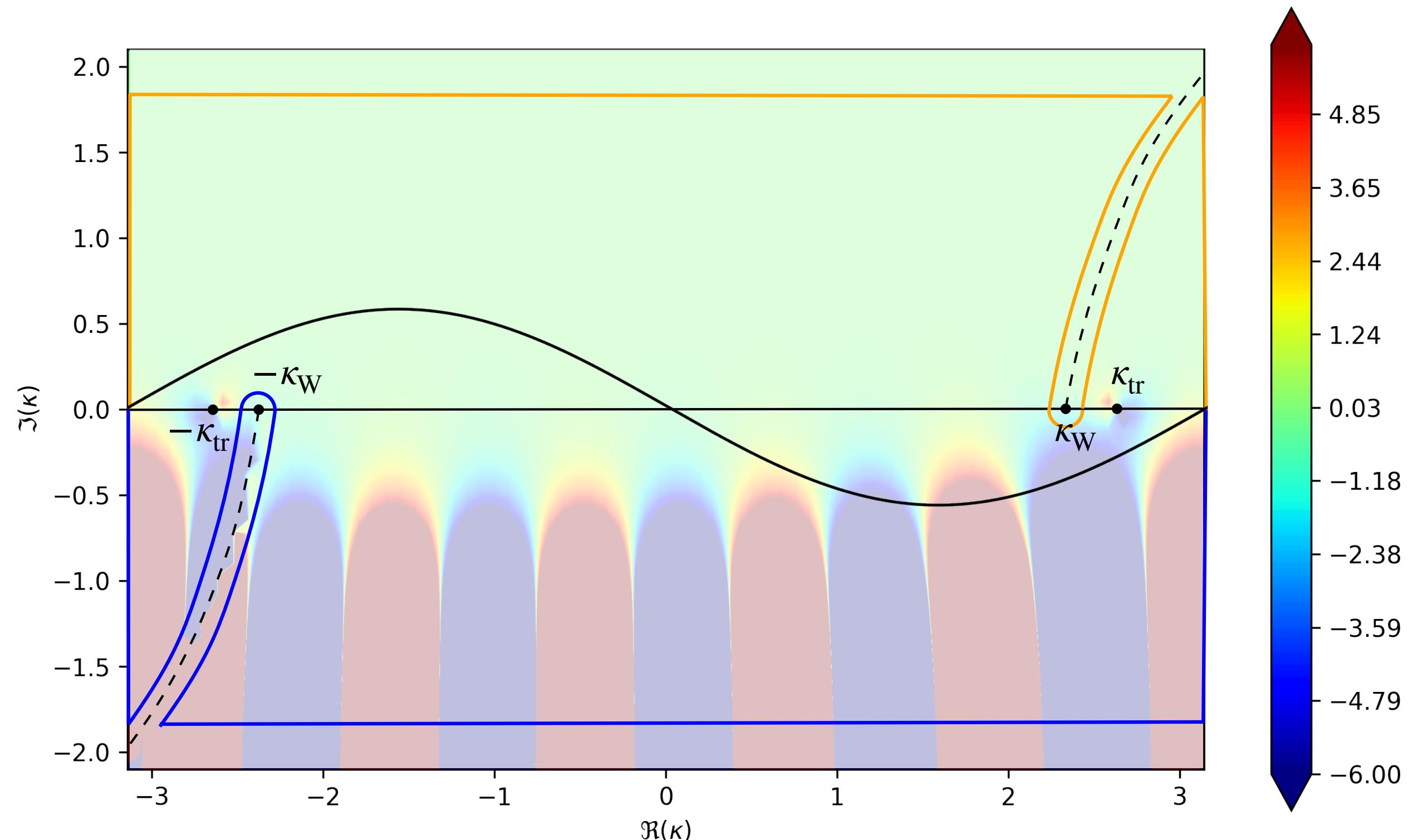
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For  $n \rightarrow -\infty$ , **residue of left-hand pole dictates**.

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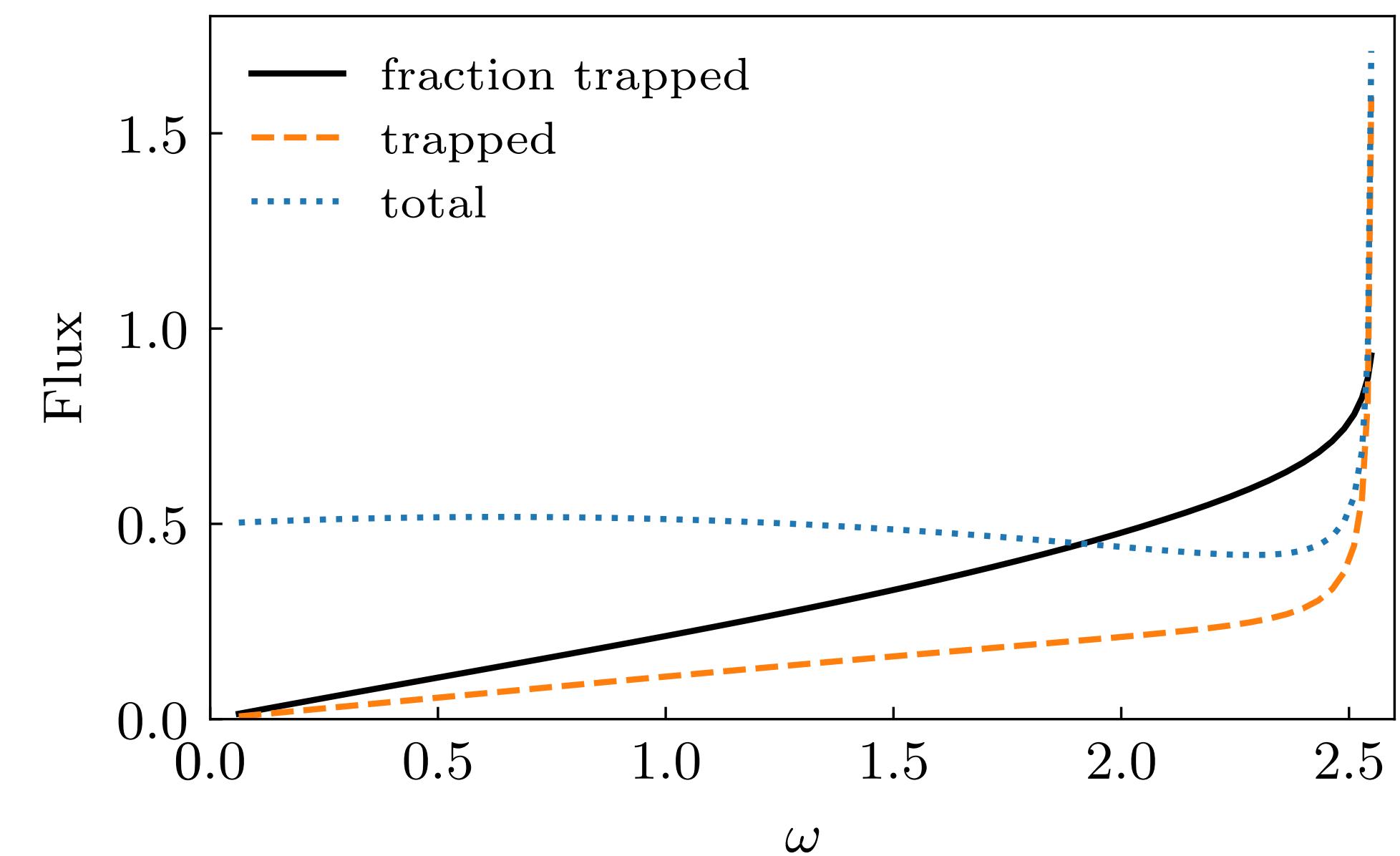
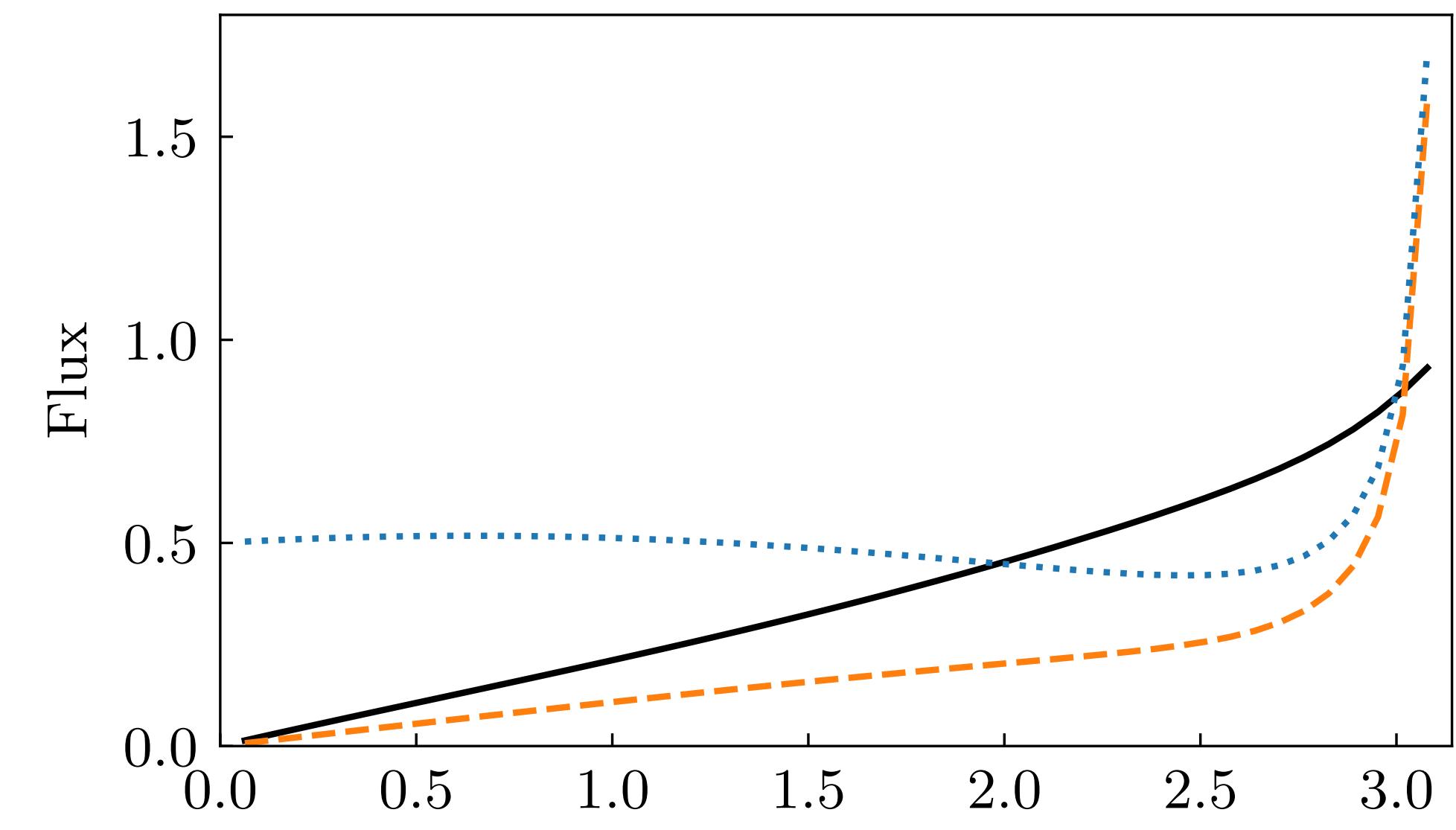
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# Future work & applications

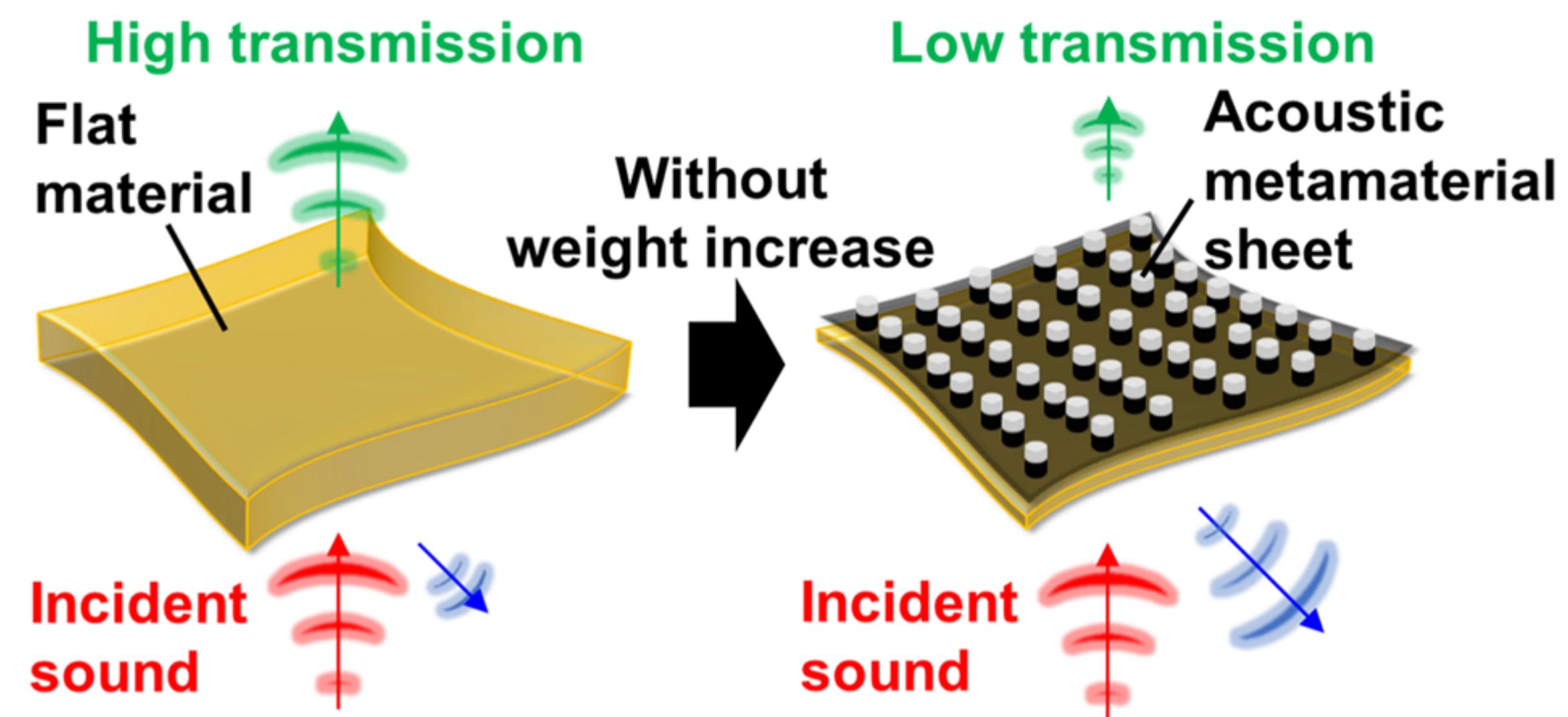
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  - What happens in asymmetric geometries?
  - Derive a fast, approximate model for the power distribution



Could make good PhD student projects

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  - Derive a fast, approximate model for the power distribution
- 3D generalization
  - Doubly periodic surfaces: **acoustic and seismic filtering, nondestructive testing of thin materials**
    - band structure complex, poles are lines
  - Triply periodic lattices
- Inverse problem for **fault detection** in periodic structures (e.g. photonic crystals)
- Klein—Gordon equation for **topological insulators**



From Nakayama, *Polymer Journal*, 2024. "Acoustic metamaterials based on polymer sheets: from material design to applications as sound insulators and vibration dampers"

# Thank you



\*Mountain bluebirds get their colors not from pigment but from diffraction by (microscopic) periodic structures in their feathers.

Credit: Mountain Bluebird by Krista Hinman;  
Cornell Lab of Ornithology | Macaulay Library