

Solving Painlevé II (and KdV) numerically with Riemann–Hilbert problems

Sheehan Olver
Junior Research Fellow at St John's College
NA Group
Oxford University Mathematical Institute

Anonymous referee report:

“[redacted embarrassing comments]. Reference [16] may serve as a wonderful example of a caring handling of complicated mathematical formulas.”

(You can guess what reference [16] was...)

- We present a new method for computing solutions to matrix-valued Riemann–Hilbert problems:
 - It is a collocation method which converges spectrally (almost exponentially) quickly
- We investigate two applications:
 - Painlevé transcendents
 - KdV equation (joint work with Tom Trogdon)
- Other applications:
 - Integrable systems: nonlinear Schrödinger equation, Kadomtsev–Petviashvili equation, Benjamin–Ono equation etc.
 - Orthogonal polynomials
 - Can compute arbitrarily large order orthogonal polynomials for arbitrary weights
 - Random matrix theory
 - Can compute distributions for large but finite n

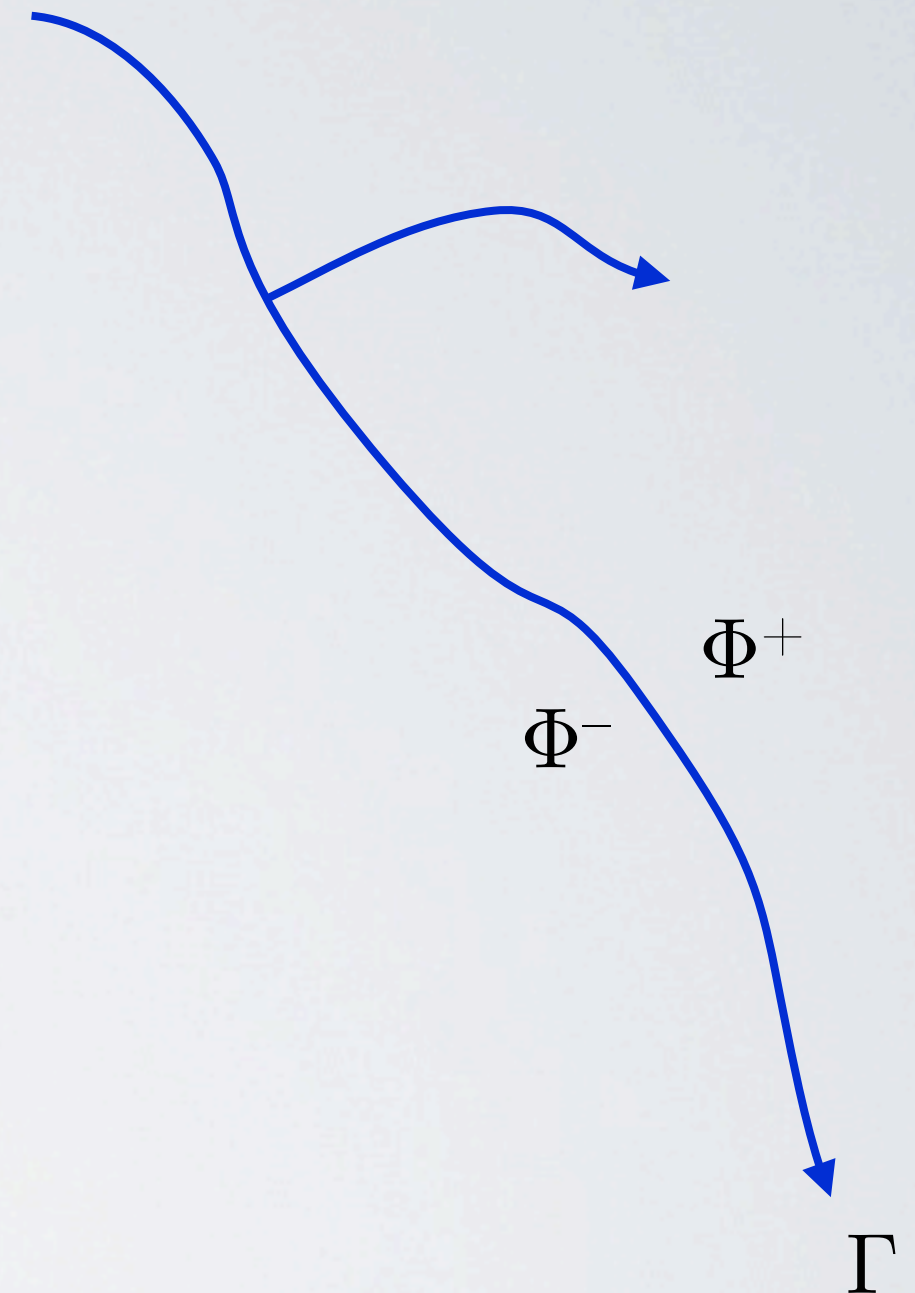
- A matrix-valued *Riemann–Hilbert problem* is the following:
 - Given an oriented contour Γ in the complex plane and a matrix-valued function G defined on Γ (here, all functions on Γ are analytic along each piece of Γ);
 - Find a matrix-valued function Φ that is analytic everywhere in the complex plane off of Γ such that

$$\Phi^+(z) = \Phi^-(z)G(z) \quad \text{for } z \in \Gamma \quad \text{and} \quad \Phi(\infty) = I$$

where

$$\Phi^+(z) = \lim_{x \rightarrow z} \Phi(x) \quad \text{where } x \text{ is left of } \Gamma$$

$$\Phi^-(z) = \lim_{x \rightarrow z} \Phi(x) \quad \text{where } x \text{ is right of } \Gamma$$



(see eg. Muskhelishvili 1953)

- Many linear differential equations have well-known integral representations
 - e.g., Airy equation, Bessel equation, Hypergeometric equation and heat and wave equations (via Fourier transform)
- Matrix-valued RH problems can be (loosely) viewed as an analogy of integral representations for *nonlinear equations*
- Importantly, RH problems can be used to determine asymptotics of solutions
 - This works similar to integral representations: the contour is deformed along the *path of steepest descent*
- Using a new approach I have constructed, RH problems can now be used as a **numerical tool**
- Previous method: the Sine kernel RH problem (on the unit interval) and a special solution to Painlevé V were computed in (Dienstfrey 1998), by adapting standard **singular integral equation** (SIE) methods
 - Required **exponentially clustered collocation points** near the endpoints

Painlevé Transcendents

- Our preliminary application is computing solutions to Painlevé transcendents
- Applications of Painlevé transcendents
 - Asymptotics and special solutions of integrable systems
 - Random matrix distributions
 - Physical applications (quantum gravity, Bose gases, convective flows, general relativity, poly-electrolytes, nonlinear optics, etc.)
- In short: Painlevé equations are *nonlinear special functions*
- The computation of RH problems and Painlevé transcendents was an open problem (Deift 2008)
- We construct a black box routine for Painlevé II, which is reliable uniformly on the real axis

Hastings–McLeod solution to Painlevé II

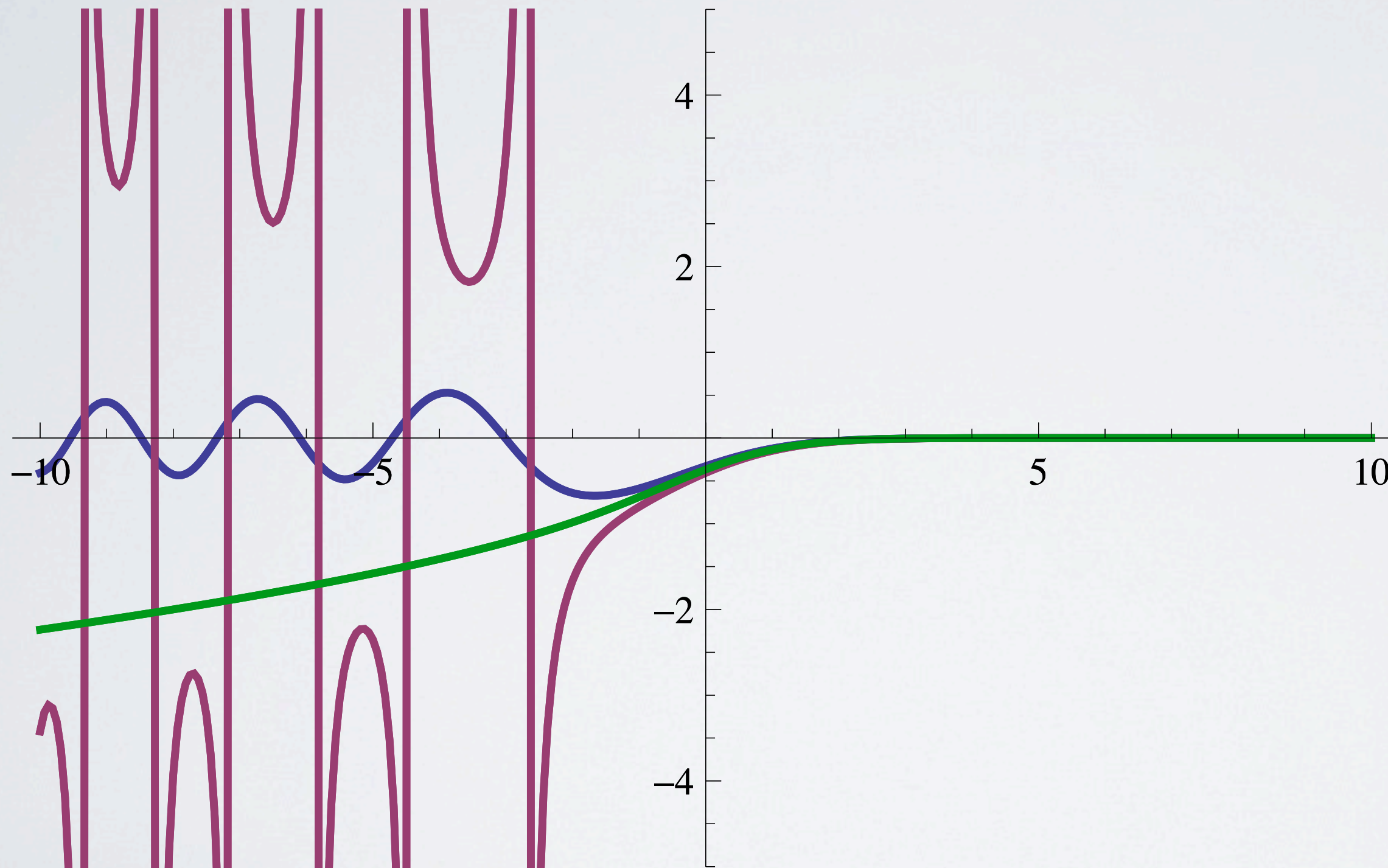


$$u'' = xu + 2u^3$$

$$u(x) \underset{x \rightarrow +\infty}{\sim} -\operatorname{Ai}(x)$$

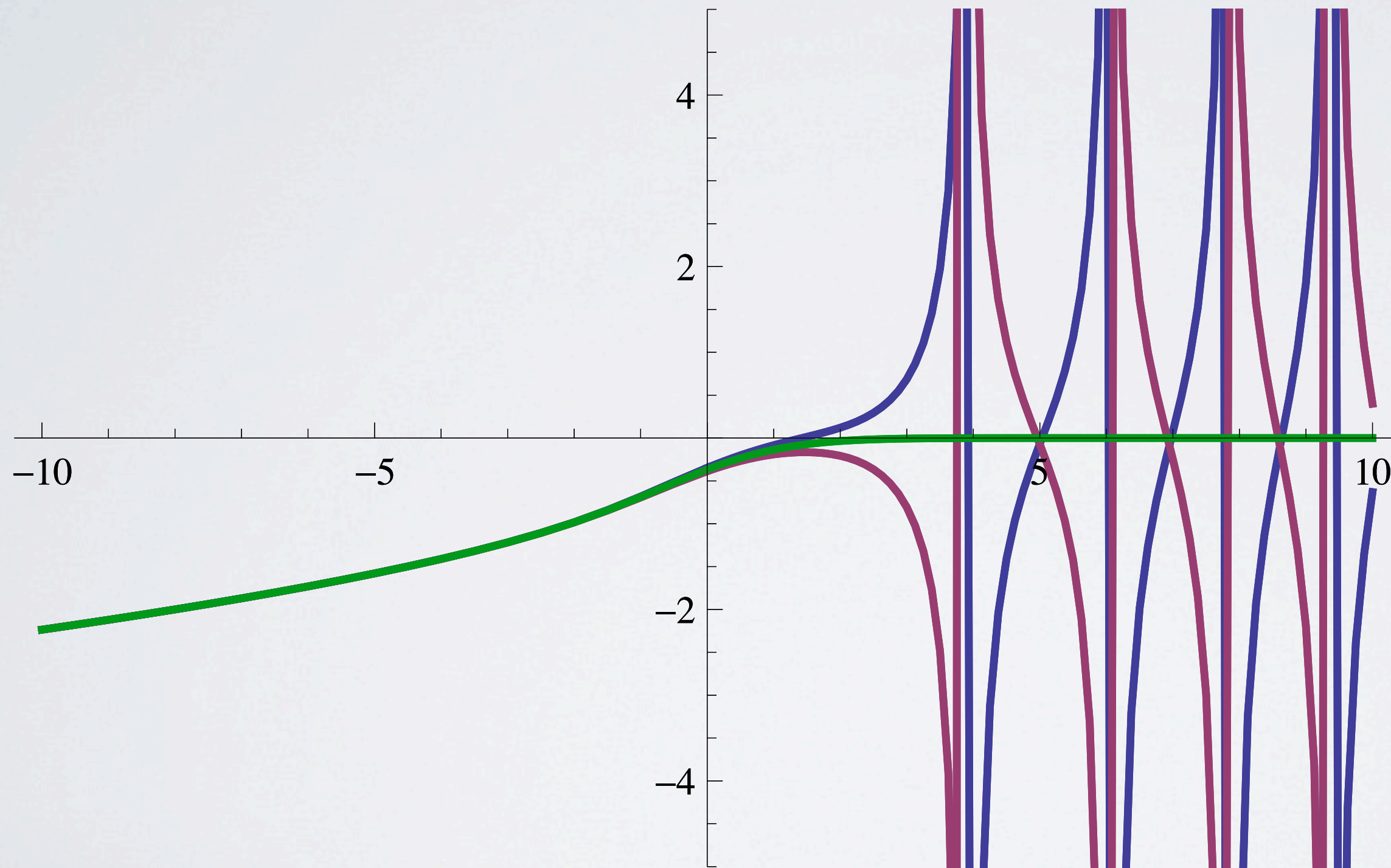
$$u(x) \underset{x \rightarrow -\infty}{\sim} -\sqrt{\frac{|x|}{2}}$$

Hastings–McLeod solution to Painlevé II



$$u'' = xu + 2u^3$$
$$u(x) \underset{x \rightarrow +\infty}{\sim} -\operatorname{Ai}(x)$$
$$u(x) \underset{x \rightarrow -\infty}{\sim} -\sqrt{\frac{|x|}{2}}$$

Hastings–McLeod solution to Painlevé II



$$u'' = xu + 2u^3$$
$$u(x) \underset{x \rightarrow +\infty}{\sim} -\text{Ai}(x)$$
$$u(x) \underset{x \rightarrow -\infty}{\sim} -\sqrt{\frac{|x|}{2}}$$

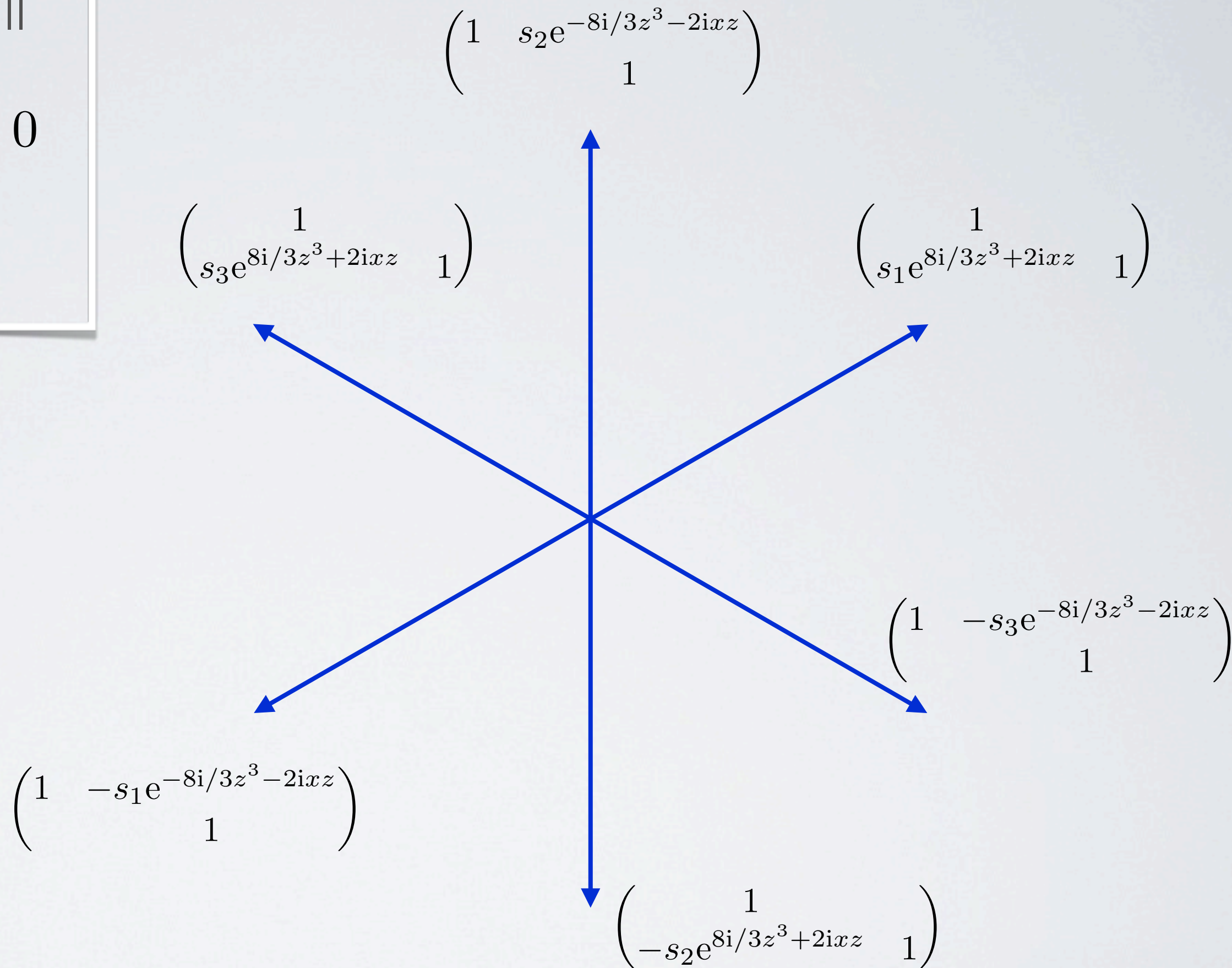
Homogeneous Painlevé II

$$u'' = xu + 2u^3$$

$$s_1 - s_2 + s_3 + s_1 s_2 s_3 = 0$$

$$\Phi^+(z) = \Phi^-(z)G(z)$$

$$u(x) = 2 \lim_{z \rightarrow \infty} z \Phi_{12}(z)$$



(see eg. Fokas et al 2006)

Where the RH
formulation comes
from (Rough sketch)

Nonlinear differential equation

$$u'' = xu + 2u^3 - \alpha$$

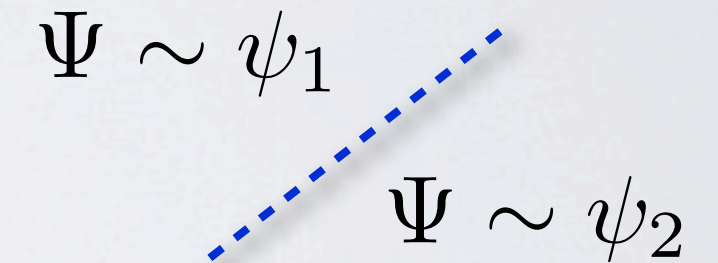


Lax pair representation

$$\begin{aligned}\Psi_z(x, z) &= A(u, x, z)\Psi(x, z) \\ \Psi_x(x, z) &= U(u, x, z)\Psi(x, z)\end{aligned}$$



Monodromy and Stokes data


$$\begin{aligned}\Psi &\sim \psi_1 \\ \Psi &\sim \psi_2\end{aligned}$$



Riemann–Hilbert problem

$$\Phi^+(z) = \Phi^-(z)G(z)$$

(see eg. Fokas et al 2006)

Construction of a collocation method

- Consider the *Cauchy transform*

$$\mathcal{C}_\Gamma f(z) = \frac{1}{2i\pi} \int_\Gamma \frac{f(t)}{t - z} dt.$$

This map defines a one-to-one correspondence between a function defined on Γ and a function which is analytic everywhere off Γ which decays at ∞

- Let

$$\Phi = I + \mathcal{C}V$$

- The RH problem $\Phi^+ = \Phi^- G$ becomes

$$\mathcal{C}^+ V(x) - \mathcal{C}^- V(x) G(x) = G(x) - I \quad \text{for} \quad x \in \Gamma$$

- Having a method to compute the Cauchy transform and its left and right limits allows us to apply the linear operator

$$\mathcal{M}V = \mathcal{C}^+ V - (\mathcal{C}^- V)G$$

(similar to Dienstfrey 1998)

- We want to construct an approximation to V which satisfies

$$\mathcal{M}V = G - I$$

at a sequence of points; i.e., we construct a **collocation method**:

- For some basis $\{\psi_1, \dots, \psi_n\}$ of functions defined on Γ and set of nodes $\{z_1, \dots, z_m\}$ on Γ

- Write

$$V = \sum \mathbf{c}_k \psi_k$$

- Solve the **linear system**

$$\mathbf{c}_1 \mathcal{M}\psi_1(z_1) + \dots + \mathbf{c}_n \mathcal{M}\psi_n(z_1) = G(z_1) - I$$

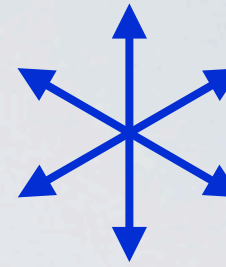
$$\vdots$$

$$\mathbf{c}_1 \mathcal{M}\psi_1(z_m) + \dots + \mathbf{c}_n \mathcal{M}\psi_n(z_m) = G(z_m) - I$$

Two remaining difficulties

- We must **compute the Cauchy transform** of our basis over Γ
 - By splitting the domain and using **conformal maps**, this can be reduced to computing the Cauchy transform over the **unit interval**
 - The Cauchy transform for **Chebyshev polynomials** over the unit interval can be found in closed form!
- We must include the **junction points** of Γ in the collocation system
 - This is needed to ensure that the approximation is **bounded**
 - The Cauchy transform of our basis explodes there; therefore, we assign it a **special value**

For homogeneous Painlevé II, we need to compute \mathcal{C} over the domain



- But we can decompose the transform to a sum over each of Γ 's parts:

$$\mathcal{C}_{\star} = \mathcal{C}_{\swarrow} + \mathcal{C}_{\downarrow} + \mathcal{C}_{\searrow} + \mathcal{C}_{\nearrow} + \mathcal{C}_{\uparrow} + \mathcal{C}_{\nwarrow}$$

- Using a **conformal map** M_k from the unit interval to each ray Γ_k of the jump contour, the Cauchy transform is (due to Plemelj's lemma)

$$\mathcal{C}_{\Gamma_k} f(z) = \mathcal{C}_{(-1,1)}[f \circ M_k](M_k^{-1}(z)) - \mathcal{C}_{(-1,1)}[f \circ M_k](M_k^{-1}(\infty))$$

- Thus we have reduced the construction of our collocation method to one problem: the **computation of the Cauchy transform over the unit interval** $\mathcal{C}_{(-1,1)}$

- There are two standard numerical methods (cf., for eg. [King 2009](#)) for computing Cauchy/Hilbert transforms on the unit interval:

- **Standard quadrature**, which blows up on the interval

$$\frac{1}{2\pi i} \int_{-1}^1 \frac{f(x)}{x - z} dx \approx \frac{1}{2\pi i} \sum_i w_i \frac{f(x_i)}{x_i - z}$$

- **Removal of the singularity** (and higher order analogues) which is not defined off the interval

$$\frac{1}{2\pi i} \int_{-1}^1 \frac{f(x)}{x - z} dx \approx \frac{1}{2\pi i} \sum_i w_i \frac{f(x_i) - f(z)}{x_i - z} + \frac{f(z)}{2\pi i} \int_{-1}^1 \frac{1}{x - z} dx$$

(Higher order analogues of this discretization are standard in singular integral equations on the unit interval, used by [Elliot 1982](#) and for RH problems in [Dienstfrey 1998](#))

- Instead, we derived a method which is **uniform** for all z using **Chebyshev polynomial moments**:

$$\frac{1}{2\pi i} \int_{-1}^1 \frac{f(x)}{x - z} dx \approx \sum \check{f}_k \frac{1}{2\pi i} \int_{-1}^1 \frac{T_k(x)}{x - z} dx = \sum \check{f}_k \mathcal{C}_{(-1,1)} T_k(z)$$

- These moments can be expressed in closed form using a very simple and stable one-term **recurrence relationship** and **hypergeometric functions**

- We include the origin as a collocation point to ensure that the computed solution is bounded. This is *crucial*, and the reason (Dienstfrey 1998) needed exponentially many points; to simulate boundedness
- At the origin, the Cauchy transforms over the individual rays *blow up*:

$$\mathcal{C}_{\Gamma_k} V_k(z) \underset{z \rightarrow 0}{\sim} -\frac{V_k(0)}{2i\pi} \log(-e^{i\theta_k} z) + C_k$$

We define the finite part along a curve at angle t as the circled part:

$$\mathcal{C}_{\Gamma_k} V_k(z) \sim \boxed{C_k - \frac{V_k(0)}{2i\pi} i \arg(-e^{i(\theta_k+t)})} - \frac{V_k(0)}{2i\pi} \log |z|$$

Whenever the limits of V along each ray sum to zero, this expression is an equality

$$\begin{aligned} \mathcal{C}_{\Gamma} V(z) &= \mathcal{C}_{\Gamma_1} V_1(z) + \cdots + \mathcal{C}_{\Gamma_6} V_6(z) \\ &= -\frac{1}{2i\pi} (V_1(0) + \cdots + V_6(0)) \log |z| + \text{bounded terms} \\ &\sim \text{bounded terms} \end{aligned}$$

- Final collocation method for the homogeneous Painlevé II equation:
 - Choose the basis of **Chebyshev polynomials** mapped to each ray
 - Using the **Cauchy transform formulæ**, construct the **linear system**, where we take the **finite part** as the definition of the Cauchy transform at zero
 - This will be justified because the collocation system itself ensures that the limits along each ray of the computed solution will always sum to zero whenever $s_1 s_3 - s_1 s_2 - s_2 s_3 \neq 9$
 - Otherwise, the linear system has an extra degree of freedom, and we can add as an extra condition that the contributions at the origin sum to zero

- We transform the RH problem to solution value:

$$u(x) \approx 2 \lim_{z \rightarrow \infty} z \frac{1}{2\pi i} \int_{\Gamma} \frac{V(t)}{t - z} dt = -\frac{1}{2\pi i} \int_{\Gamma} V(t) dt$$

- The integral can be evaluated using *Clenshaw–Curtis quadrature*
- We can also apply this approach for computing the derivative of $u(x)$, reusing most of the computation
- This is the first reliable numerical method for computing the *initial conditions* for given *Stokes' constants*
 - And asymptotics are determined from the Stokes' constants

Painlevé II Examples

- Consider again the *Hastings–McLeod solution*, which is equivalent to the choice $(s_1, s_2, s_3) = (i, 0, -i)$
- This solution is important in random matrix theory, in particular, the distribution of the largest eigenvalue of almost all random matrix ensembles is the *Tracy–Widom distribution*, which is expressed in terms of the Hastings–McLeod solution
- Numerical values of the Hastings–McLeod solution at a set of points are available (Prähofer and Spohn 2004)
 - Computed by using the known asymptotics to determine initial conditions for large x , then very high precision arithmetic with Taylor series methods: a very inefficient approach
 - As mentioned before, this computation is particularly difficult because a small perturbation of initial conditions can introduce oscillations or poles

Absolute Error

collocation
points per ray

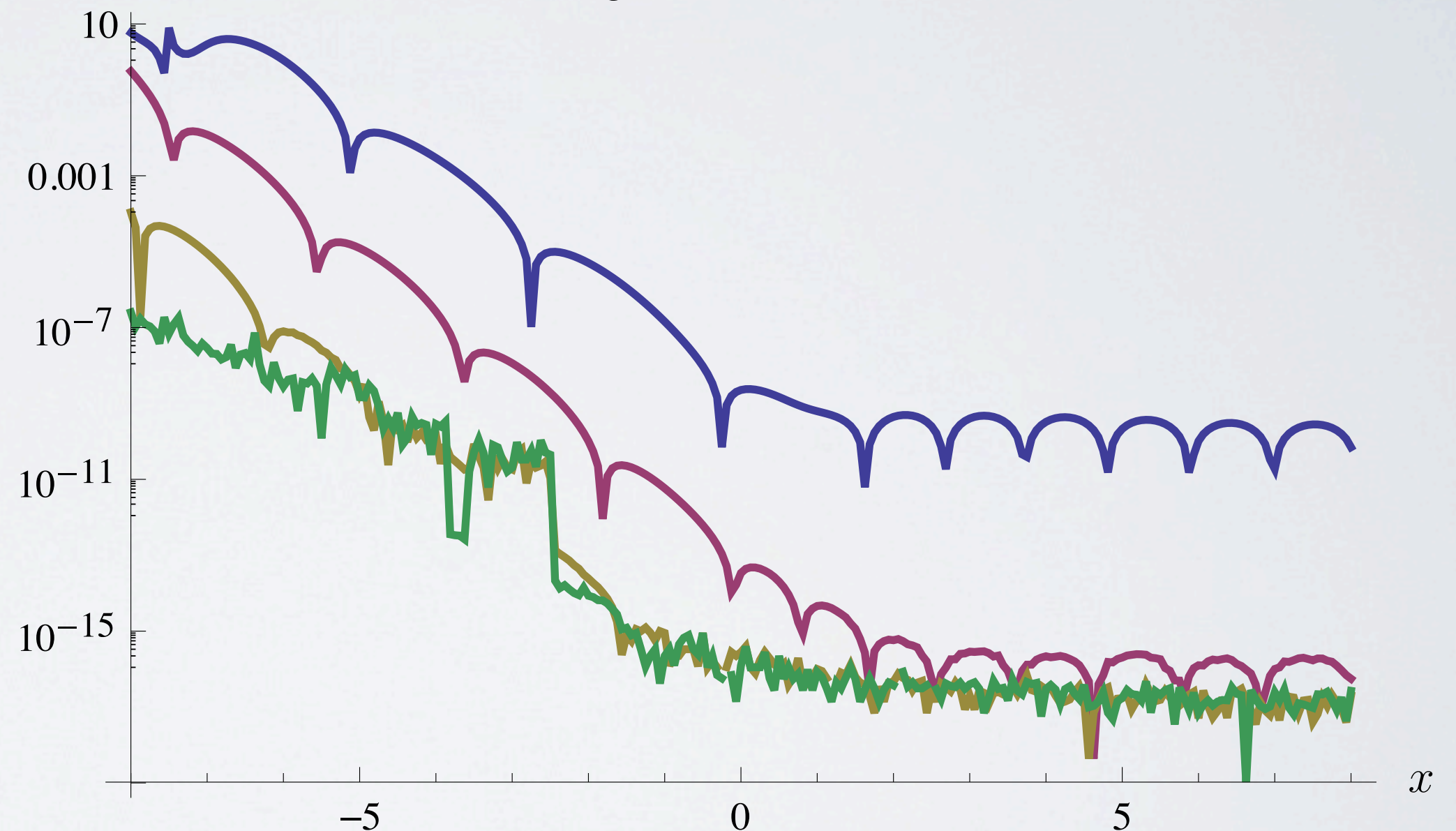
Hastings– McLeod solution

40

80

120

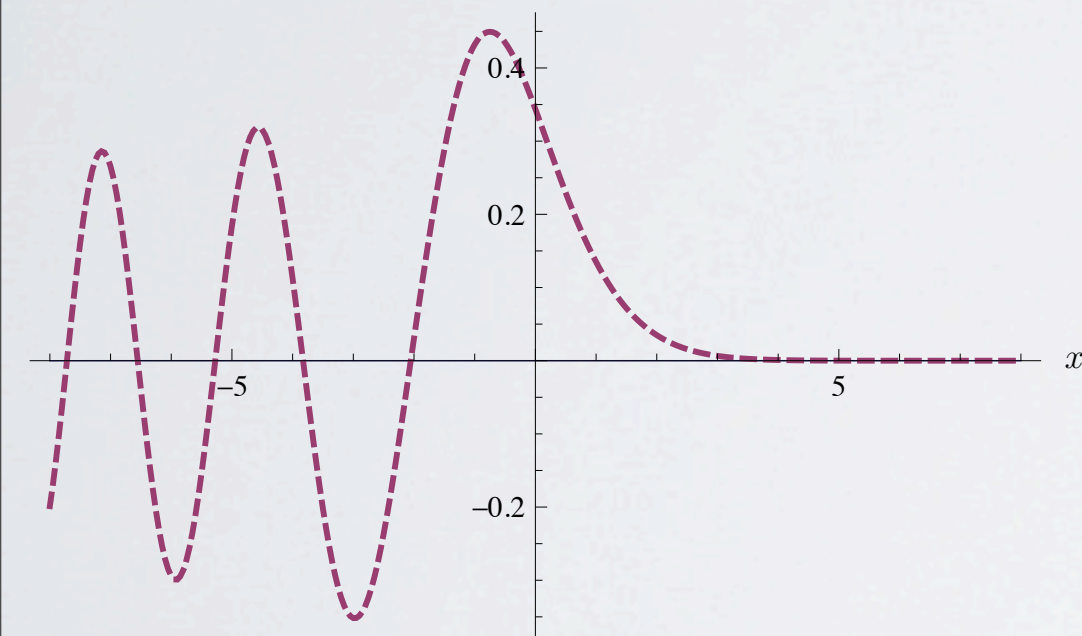
160



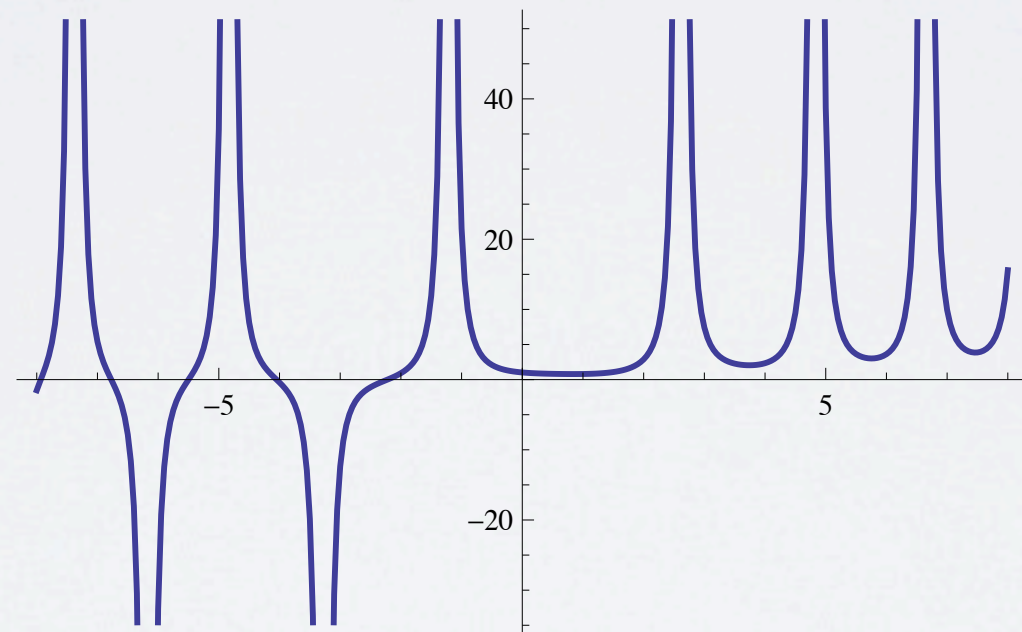
- Spectral convergence is evident
- The method takes less than 1.5 seconds per point for $n = 120$ (except the first evaluation, where it takes 5.5 seconds)
- For large x , we see the same instability issues as the ODE
- This will be resolved by deforming the RH problem

Other solutions

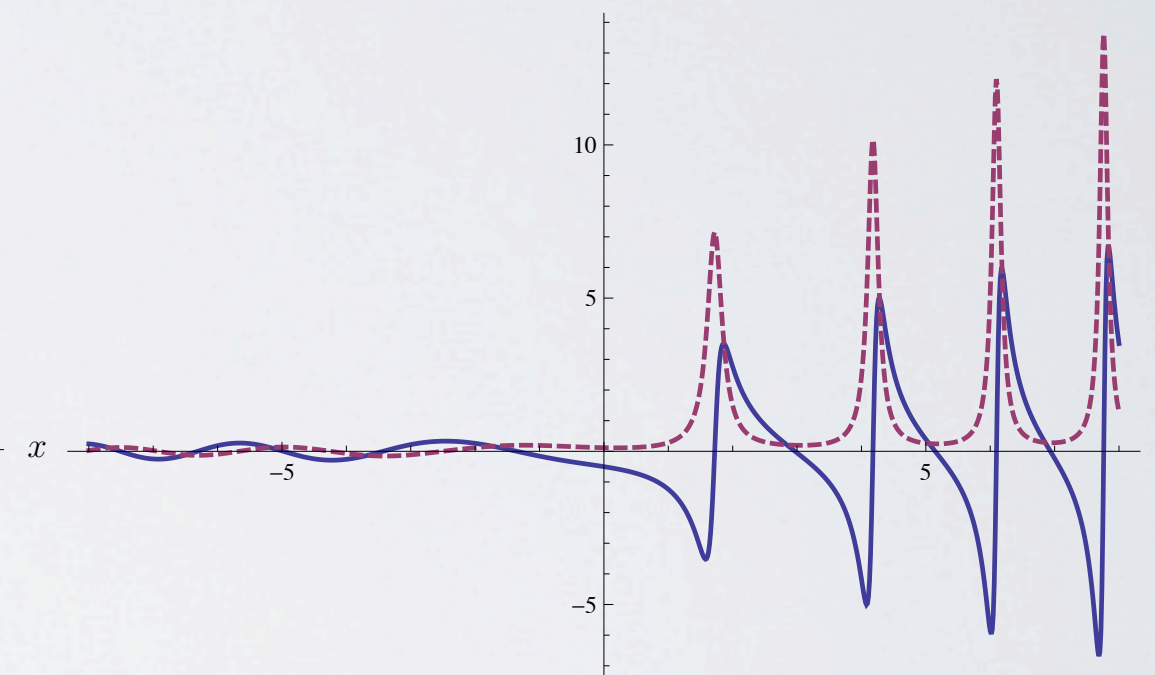
$$(s_1, s_2, s_3) = (1, 0, -1)$$



$$(1 + i, -2, 1 - i)$$



$$(1, 2, 1/3)$$



Real and imaginary parts

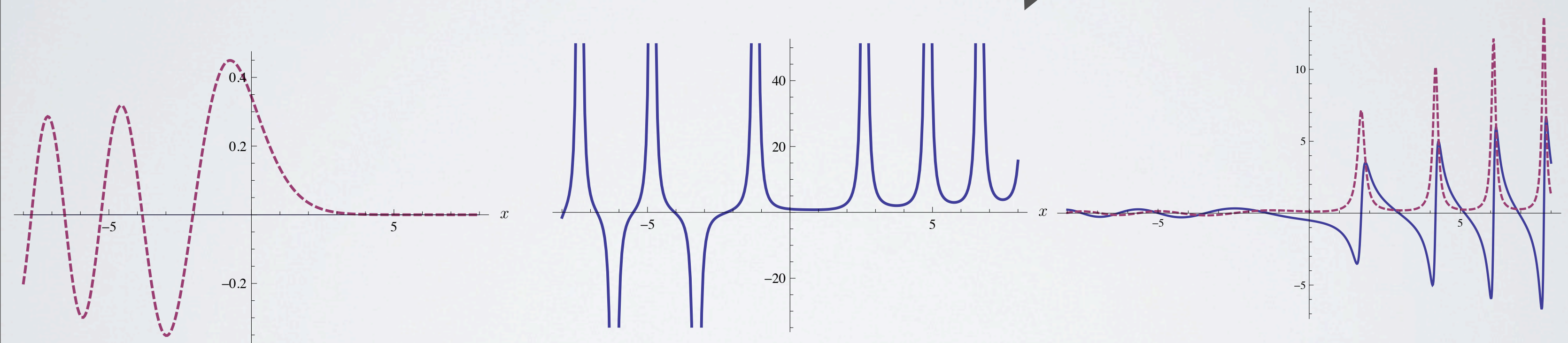
Other solutions

Spectral system becomes badly conditioned at poles (can be used to compute location of poles)

$$(s_1, s_2, s_3) = (1, 0, -1)$$

$$(1 + i, -2, 1 - i)$$

$$(1, 2, 1/3)$$



Real and imaginary parts

NONLINEAR STEEPEST DESCENT

- As x becomes large, the $e^{\pm(8i/3z^3+2ixz)}$ terms in the jump matrix G becomes increasingly oscillatory
 - Resolving oscillations requires more collocation points
 - The representation on six rays is also inherently badly conditioned
- We use three tools from the asymptotic analysis to remove the oscillations (Deift & Zhou 1995):
 - Deformation along the path of steepest descent
 - Matrix factorization and lensing
 - Replace the oscillator with a similar oscillator

Numerical nonlinear steepest descent:
negative x

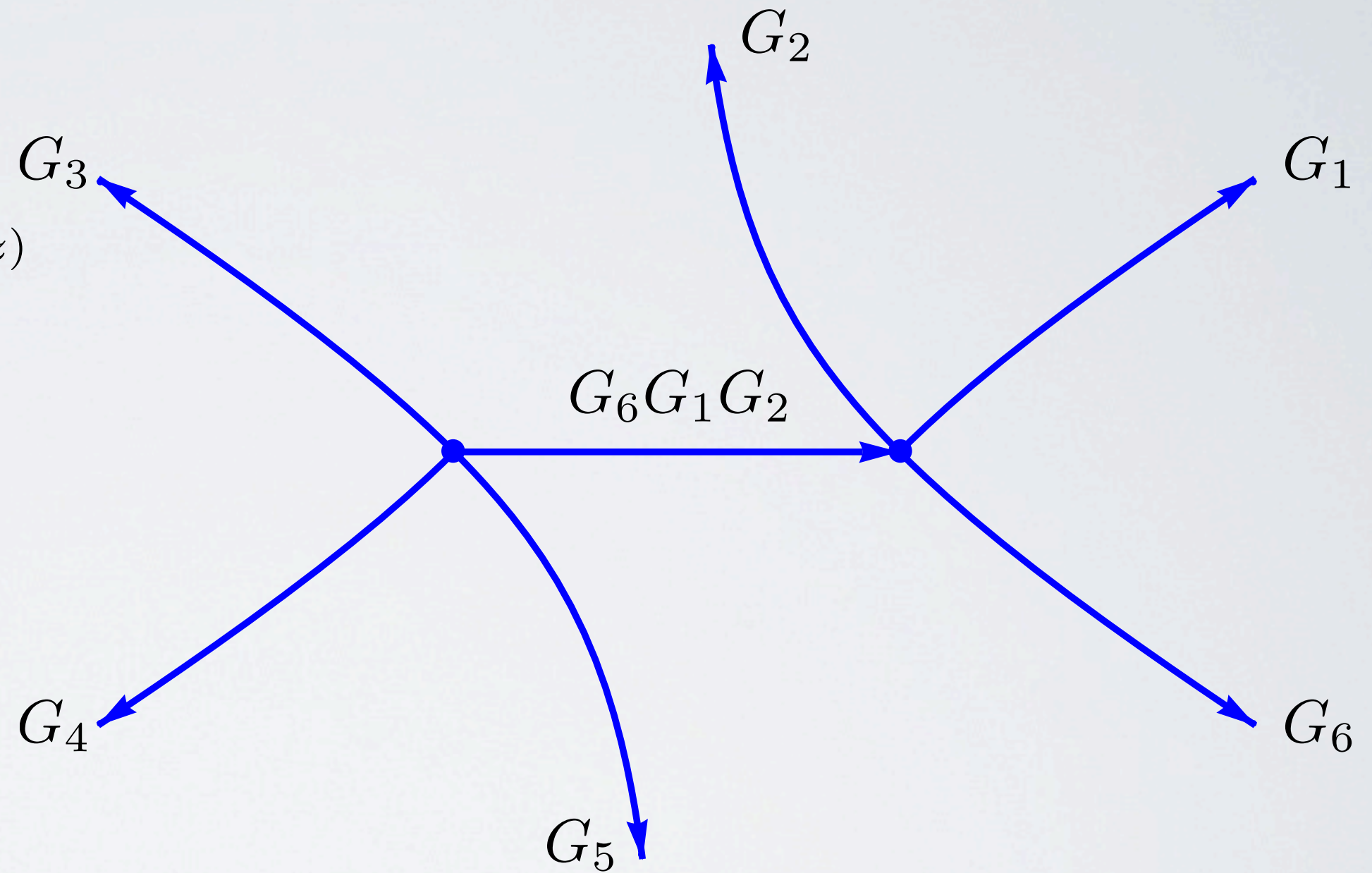
- We first do the transformation

$$z \mapsto \sqrt{-xz}$$

so that

$$e^{\pm(8i/3z^3+2ixz)} \mapsto e^{\pm i(-x)^{3/2}(8/3z^3-2z)}$$

- This has two stationary points at $\pm 1/2$, thus we deform the contour to obtain the Riemann–Hilbert problem:



(based on Deift & Zhou 1995 and
Fokas et al 2006)

- We first do the transformation

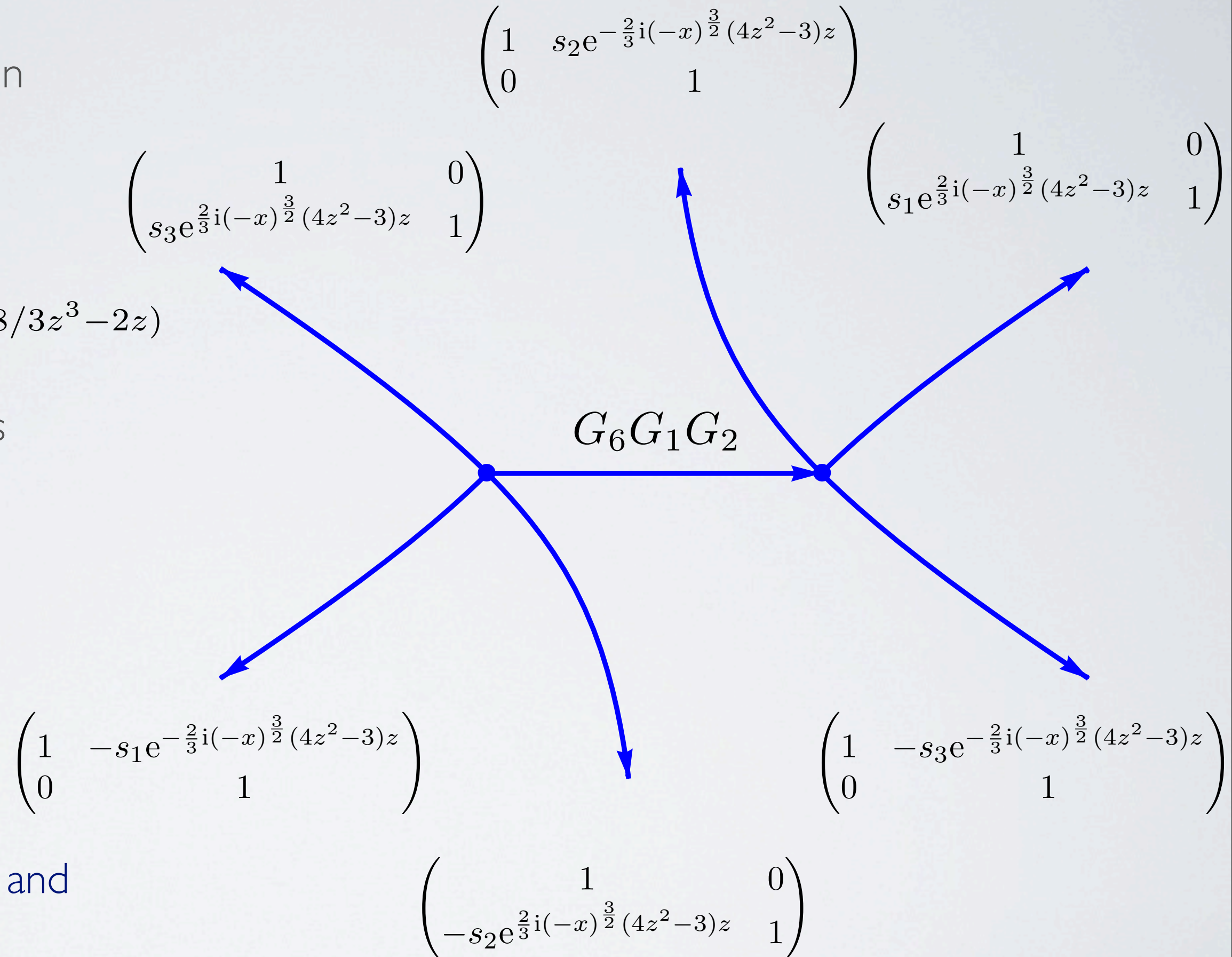
$$z \mapsto \sqrt{-xz}$$

so that

$$e^{\pm(8i/3z^3+2ixz)} \mapsto e^{\pm i(-x)^{3/2}(8/3z^3-2z)}$$

- This has two stationary points at $\pm 1/2$, thus we deform the contour to obtain the Riemann–Hilbert problem:

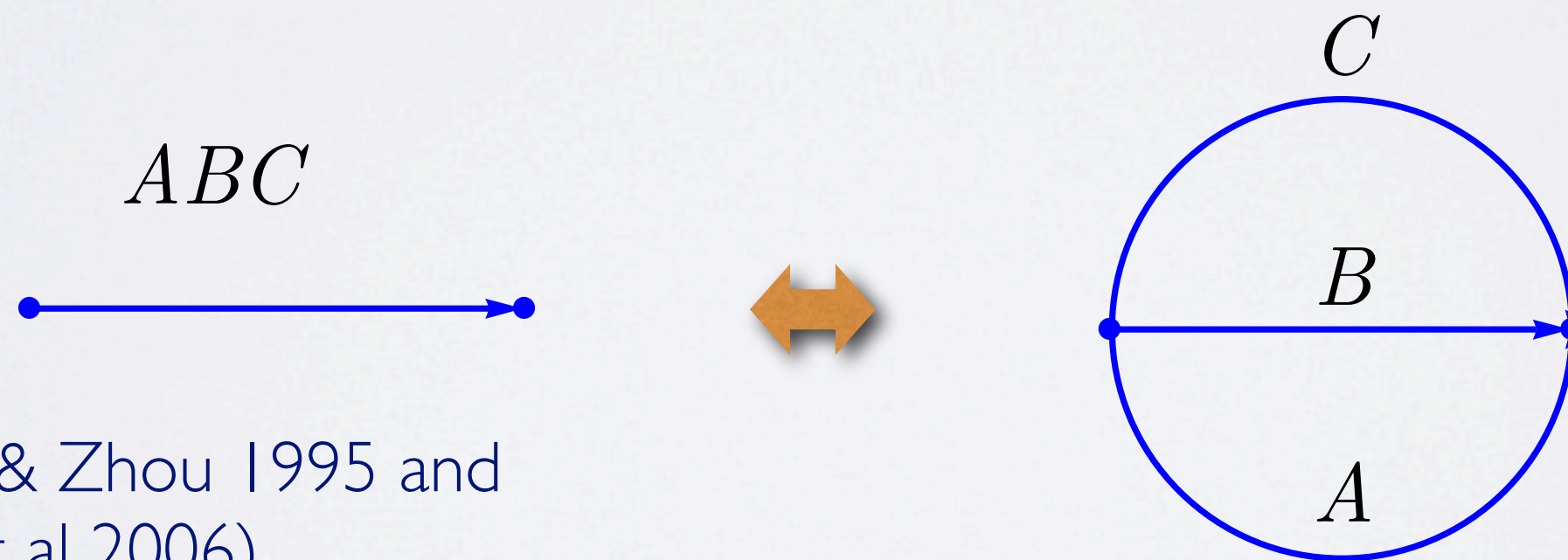
(based on Deift & Zhou 1995 and Fokas et al 2006)



- Each of the paths to infinity have no oscillations and super-exponential decay
- But the path connecting $\pm 1/2$ is still oscillatory:

$$\begin{aligned}
 G_6 G_1 G_3 &= \begin{pmatrix} 1 & -s_3 e^{-\frac{2}{3}i(-x)^{\frac{3}{2}}(4z^2-3)z} \\ 0 & 1 \end{pmatrix} \begin{pmatrix} 1 & 0 \\ s_1 e^{\frac{2}{3}i(-x)^{\frac{3}{2}}(4z^2-3)z} & 1 \end{pmatrix} \begin{pmatrix} 1 & s_2 e^{-\frac{2}{3}i(-x)^{\frac{3}{2}}(4z^2-3)z} \\ 0 & 1 \end{pmatrix} \\
 &= \begin{pmatrix} 1 - s_1 s_3 & e^{-\frac{2}{3}i(-x)^{\frac{3}{2}}(-3+4z^2)z} s_1 \\ e^{\frac{2}{3}i(-x)^{\frac{3}{2}}(-3+4z^2)z} s_1 & 1 + s_1 s_2 \end{pmatrix}
 \end{aligned}$$

- The key now is that we can split jump contours:



(based on Deift & Zhou 1995 and
Fokas et al 2006)

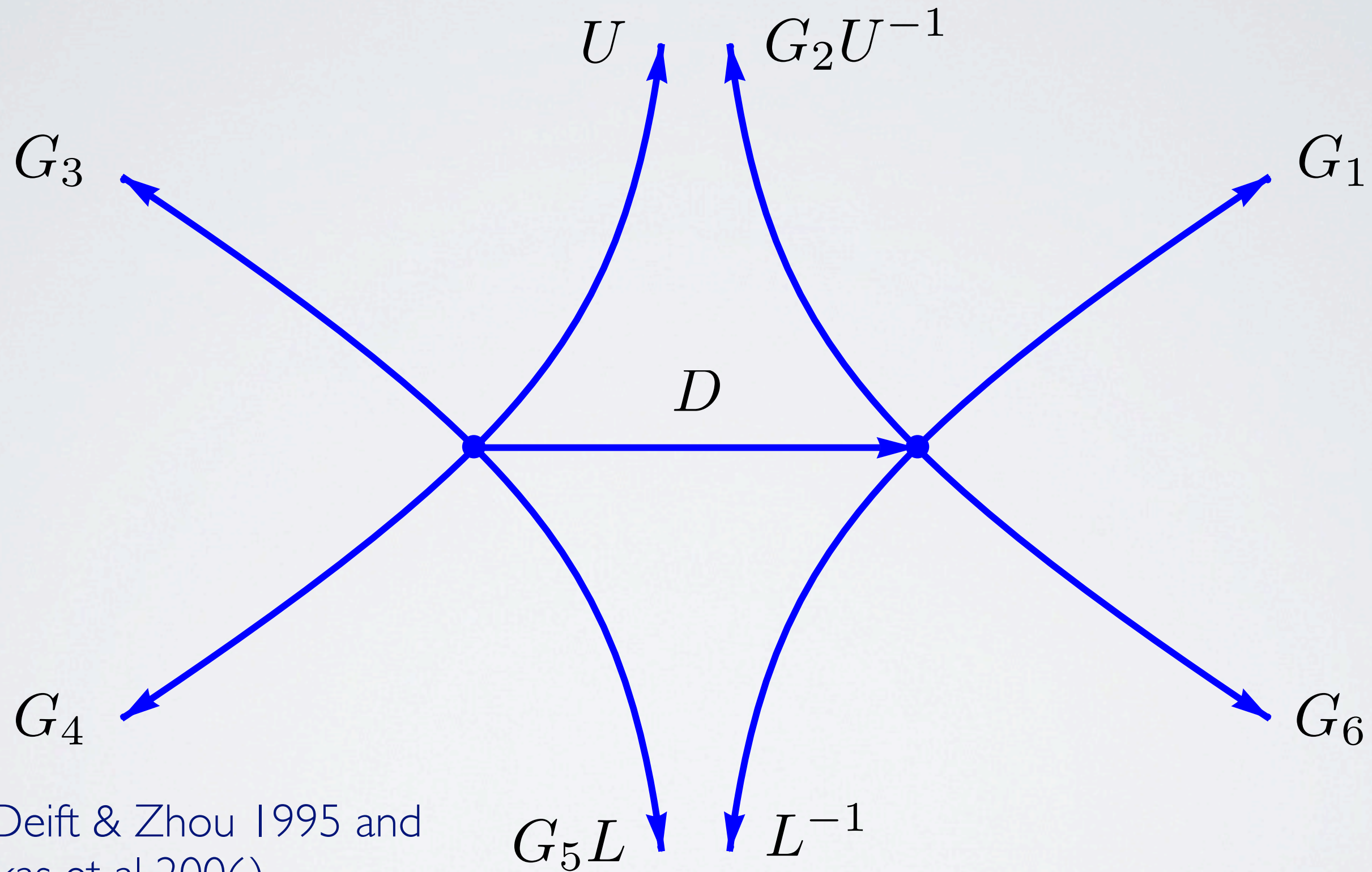
- We want to write $G_6 G_1 G_2$ as ABC where A goes to the identity matrix near the negative imaginary axis, B is nonoscillatory and C goes to the identity matrix near the positive imaginary axis
- This happens to be satisfied by the LDU factorization:

$$G_6 G_1 G_2 = LDU = \begin{pmatrix} 1 & 0 \\ \frac{s_1}{1-s_1 s_3} e^{\frac{2}{3}i(-x)^{\frac{3}{2}}(-3+4z^2)z} & 1 \end{pmatrix} \begin{pmatrix} 1-s_1 s_3 & \\ & \frac{1}{1-s_1 s_3} \end{pmatrix} \begin{pmatrix} 1 & \frac{s_1}{1-s_1 s_3} e^{-\frac{2}{3}i(-x)^{\frac{3}{2}}(-3+4z^2)z} \\ 0 & 1 \end{pmatrix}$$

- Note that we must restrict our attention to the case where $s_1 s_3 \neq 1$
 - This excludes the Hastings–McLeod solution
 - Though a different factorization can be used in this case (will touch on later)

(based on Deift & Zhou 1995 and
Fokas et al 2006)

The RH problem for negative x and $s_1 s_3 \neq 1$



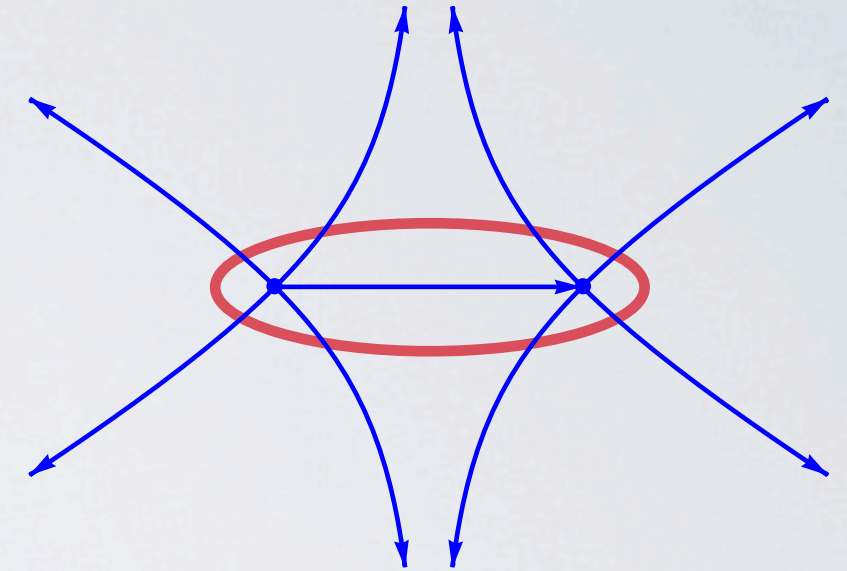
(based on Deift & Zhou 1995 and
Fokas et al 2006)

- We can implement a spectral method for this Riemann–Hilbert problem just as we did for the canonical six rays case
- The problem:
 - The solution is oscillatory along circled connecting curve
 - Fortunately, we have a closed form solution (parametrix) for the contribution from that curve from the analytic development:

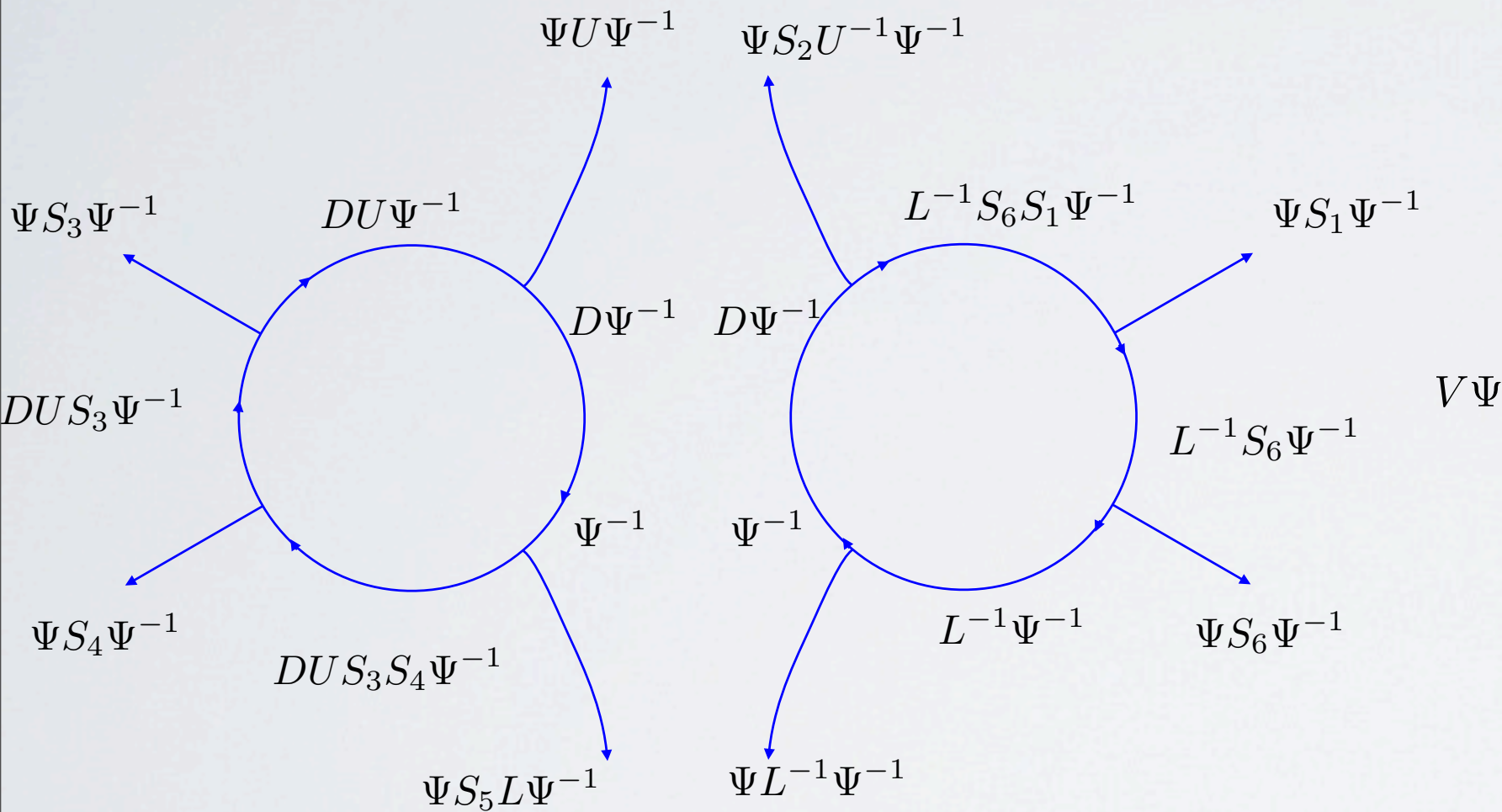
$$\Psi^+ = \Psi^- D$$

$$\Psi(z) = \begin{pmatrix} \left(\frac{1+2z}{2z-1} \right)^{\frac{i}{2\pi} \log D_{11}} & \\ & \left(\frac{1+2z}{2z-1} \right)^{\frac{i}{2\pi} \log D_{22}} \end{pmatrix}$$

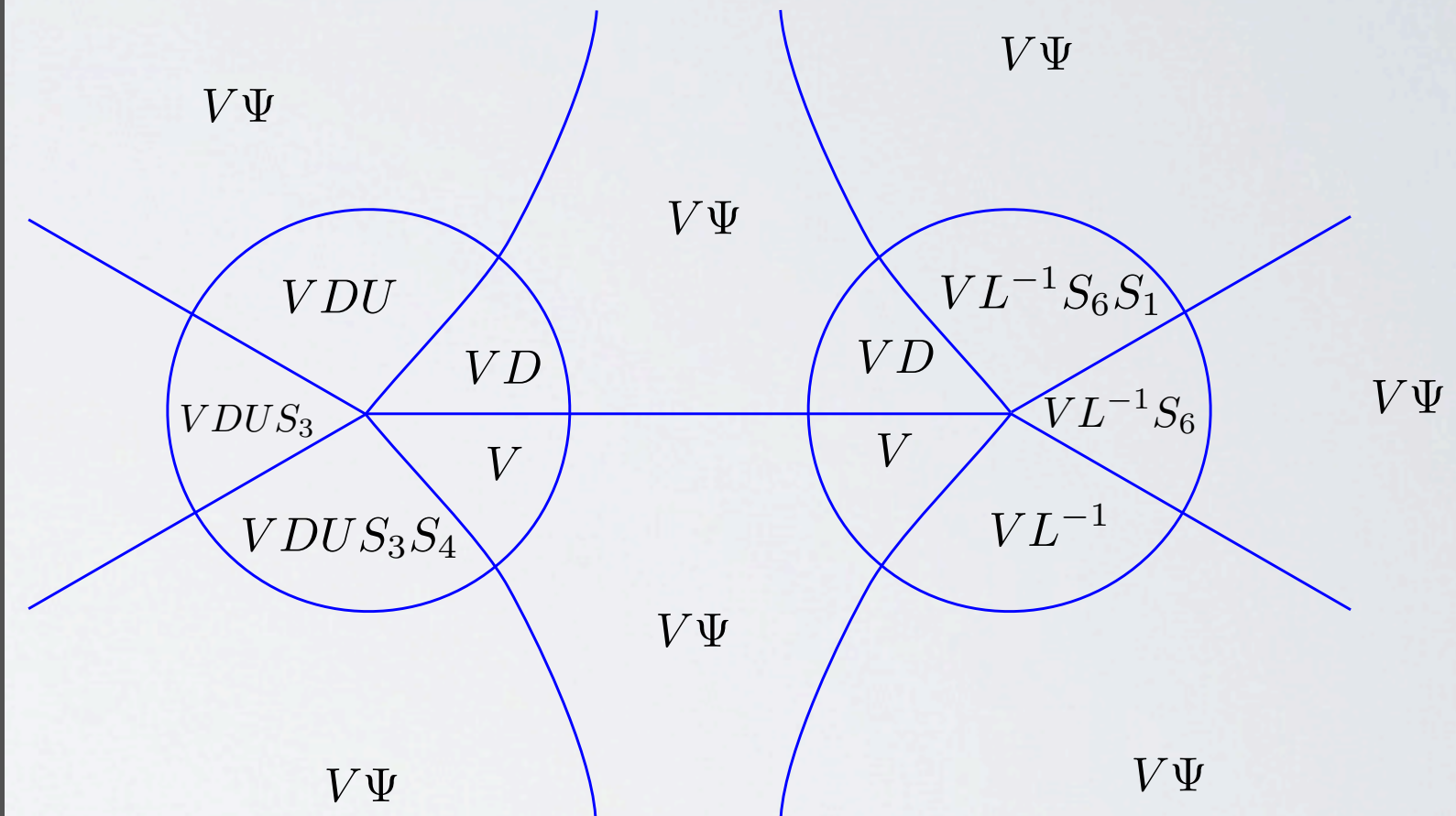
(based on Deift & Zhou 1995 and
Fokas et al 2006)



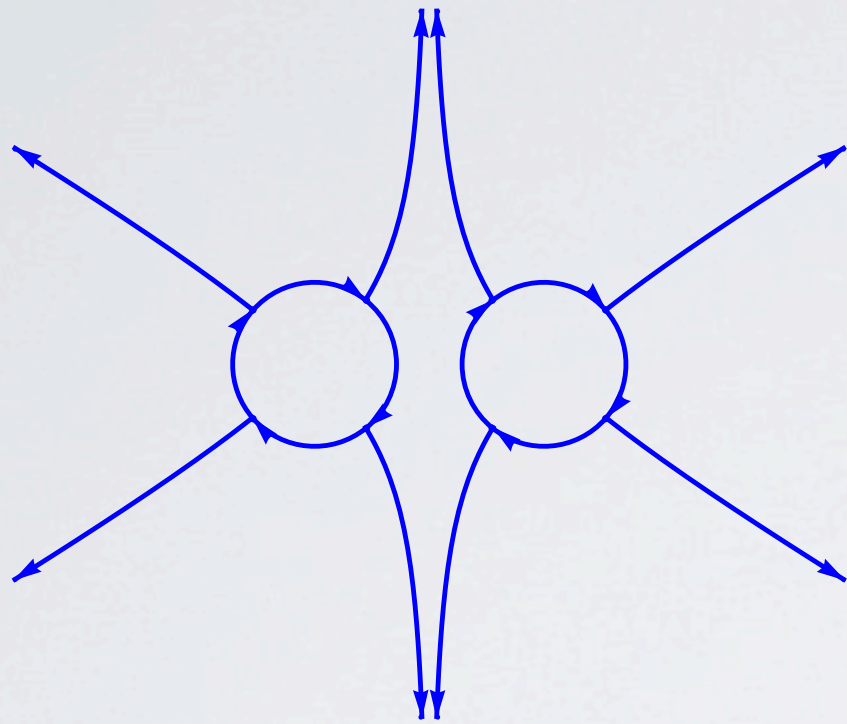
- V satisfies the RH problem:



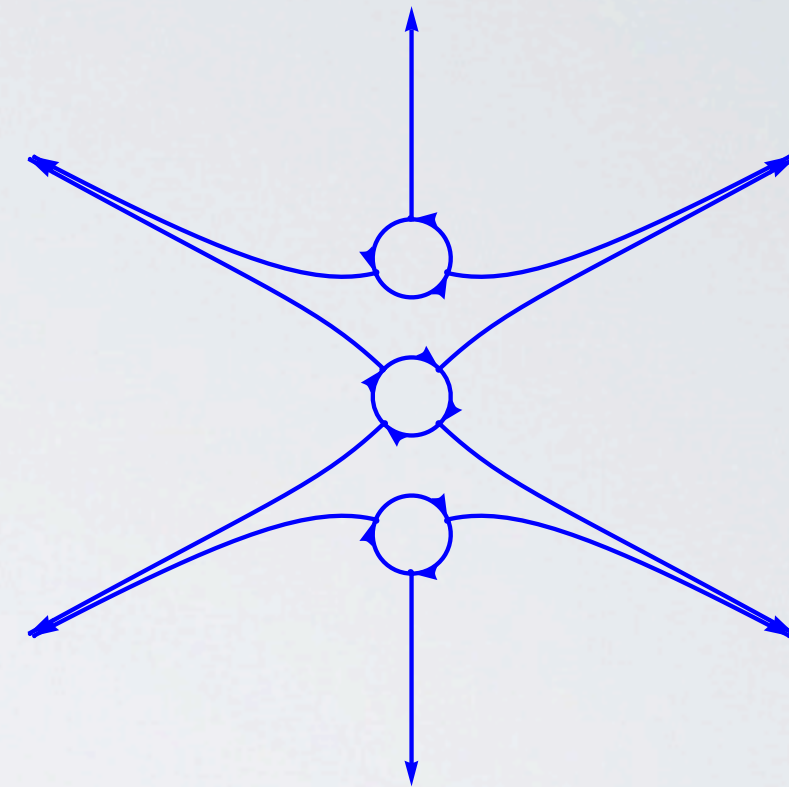
We recover the solution by:



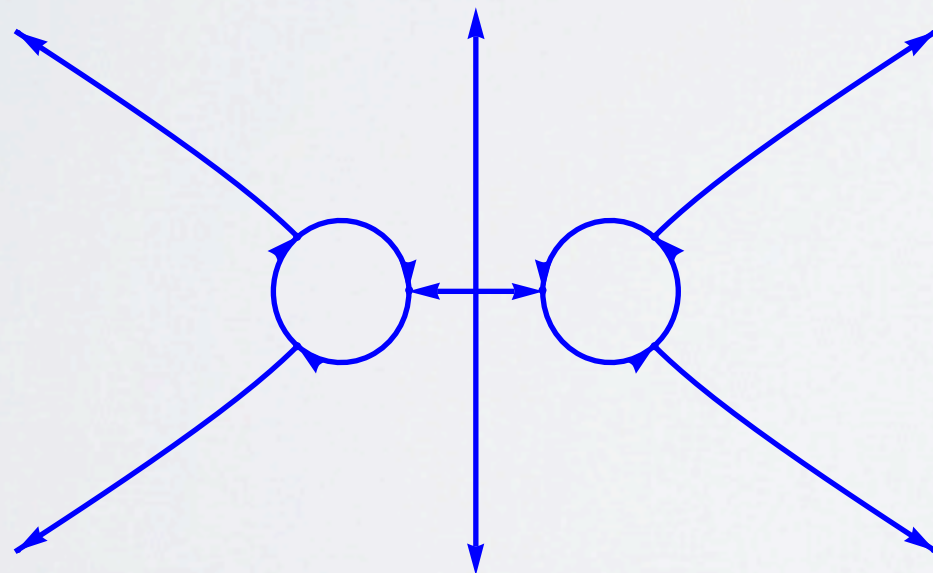
Negative x with $s_1 s_3 \neq 1$



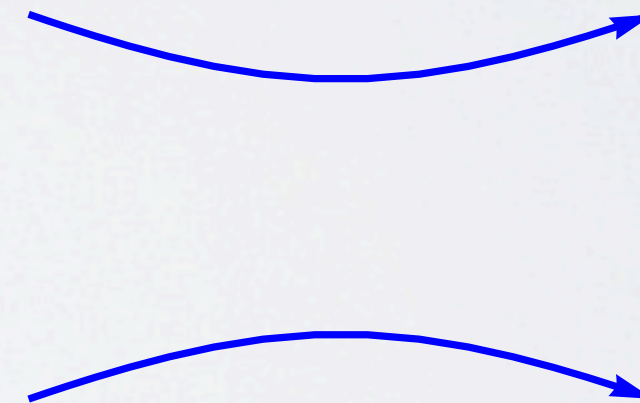
Positive x with $s_2 \neq 0$



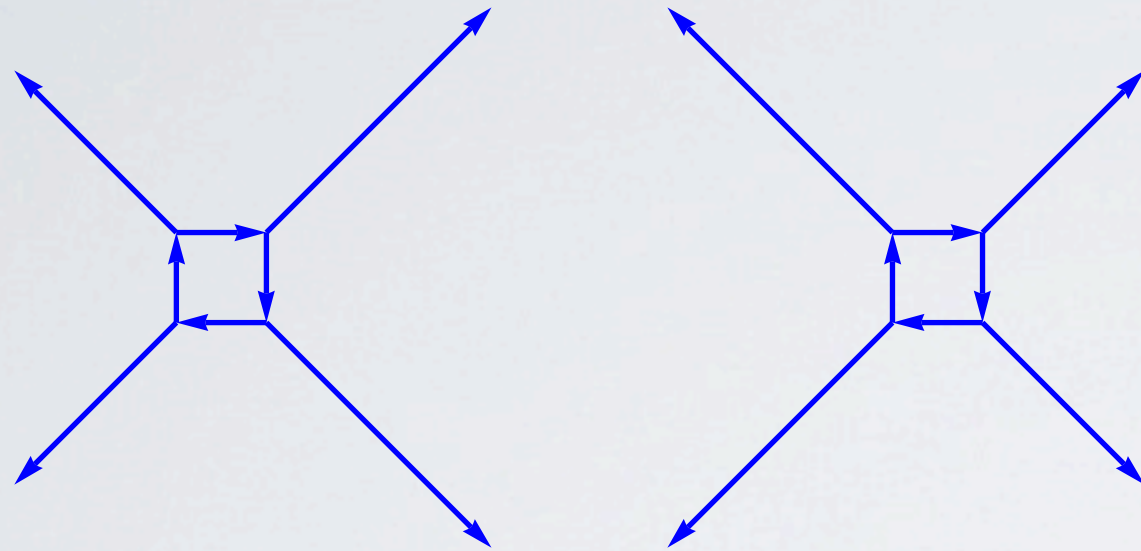
Negative x with $s_1 s_3 = 1$



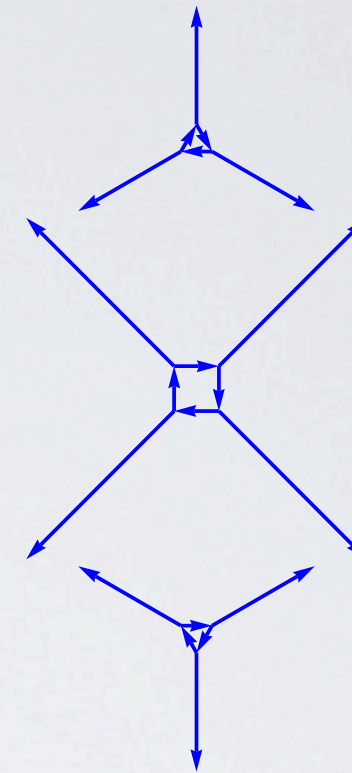
Positive x with $s_2 = 0$



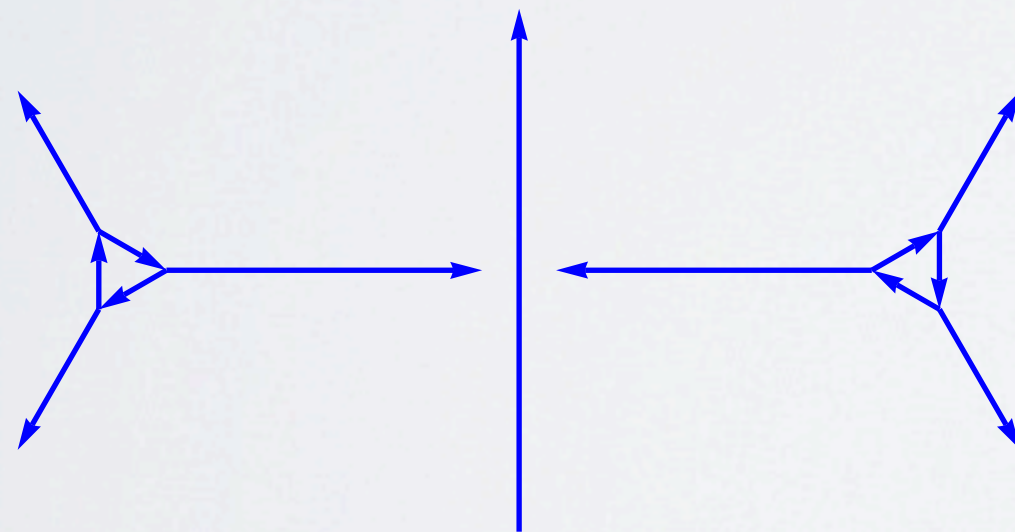
Negative x with $s_1 s_3 \neq 1$



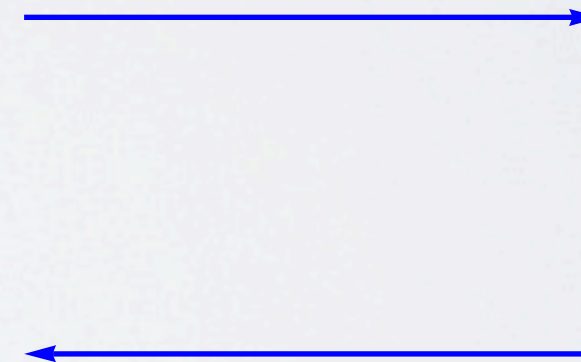
Positive x with $s_2 \neq 0$



Negative x with $s_1 s_3 = 1$

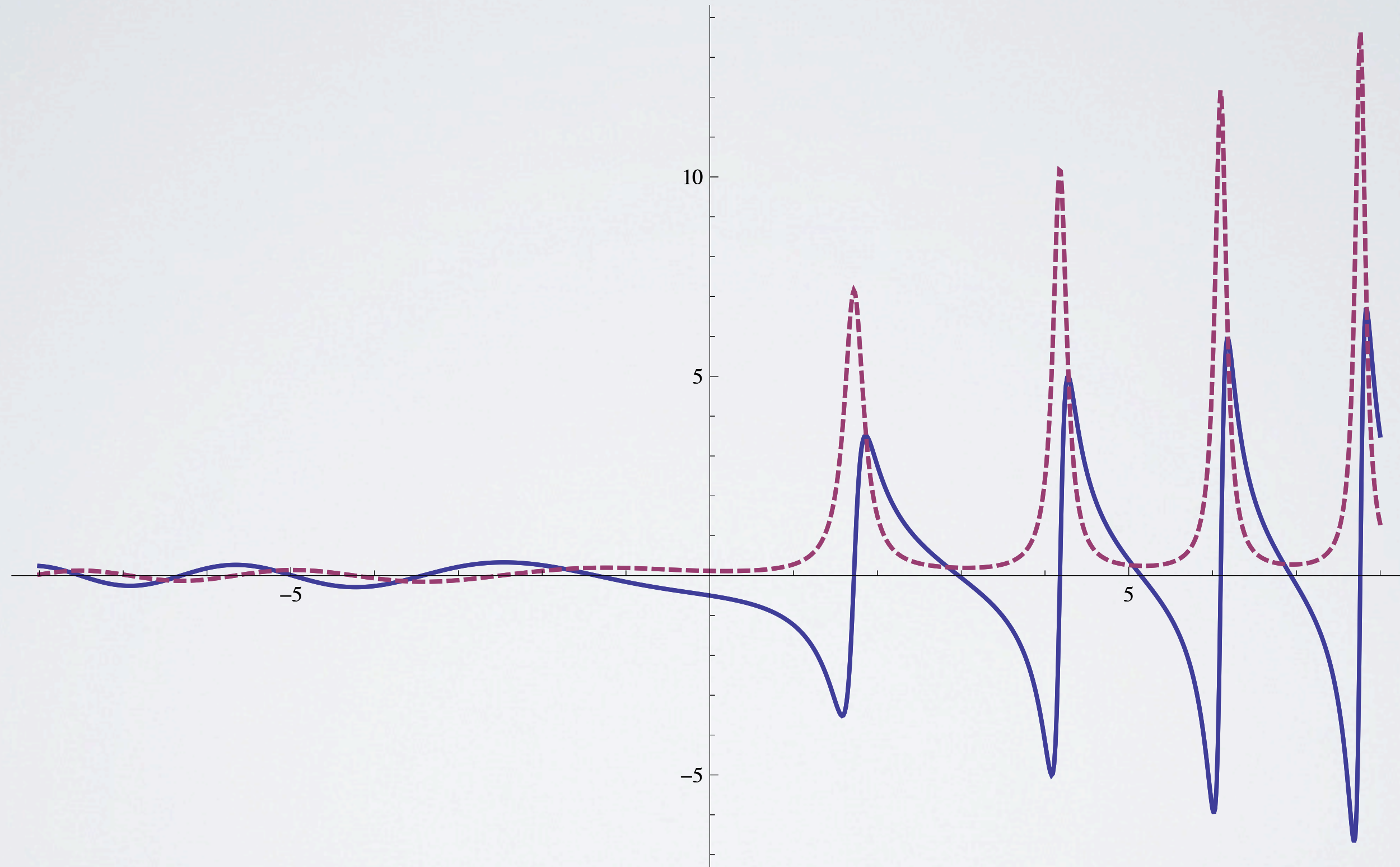


Positive x with $s_2 = 0$

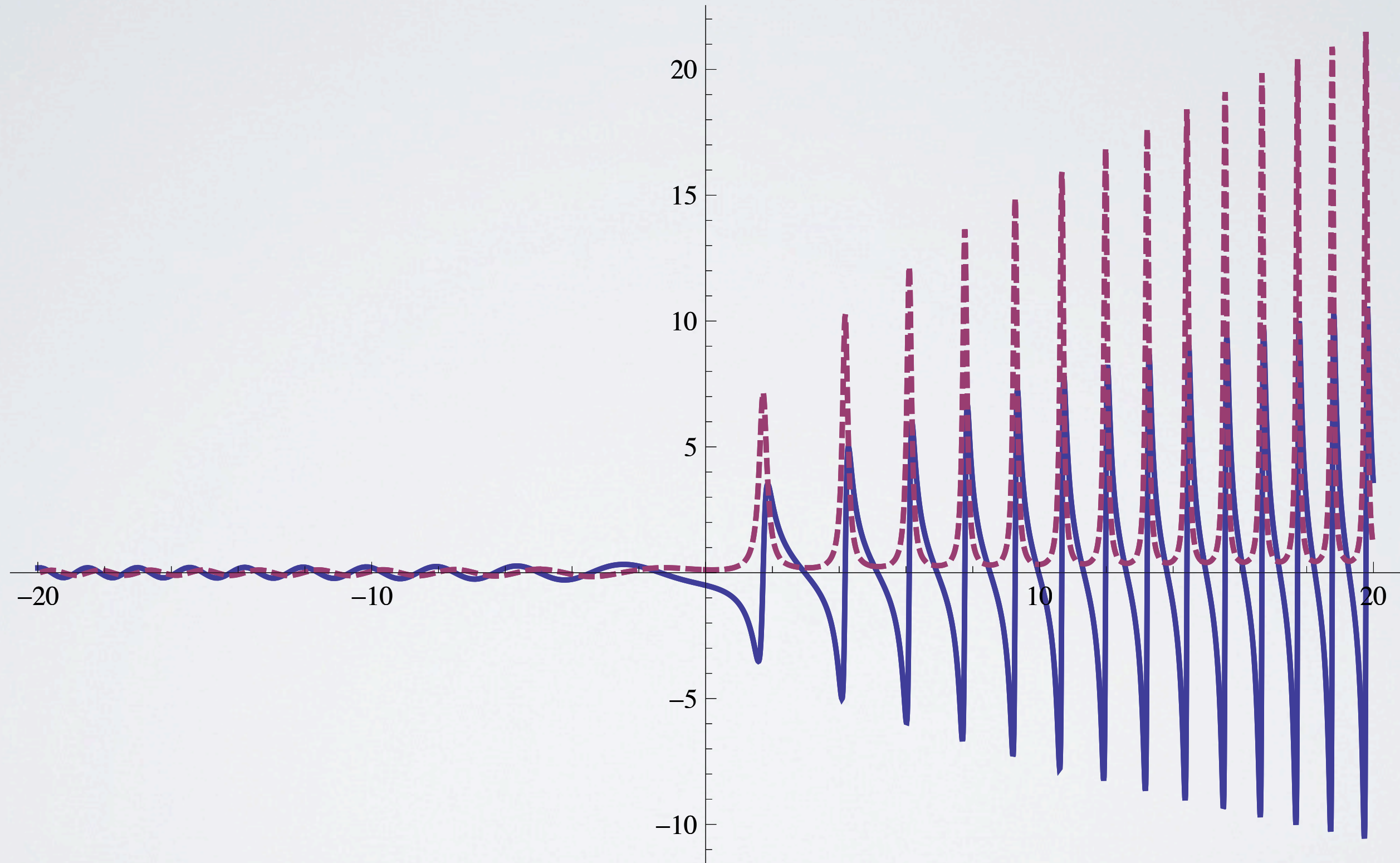


(joint work with G. Wechsburger)

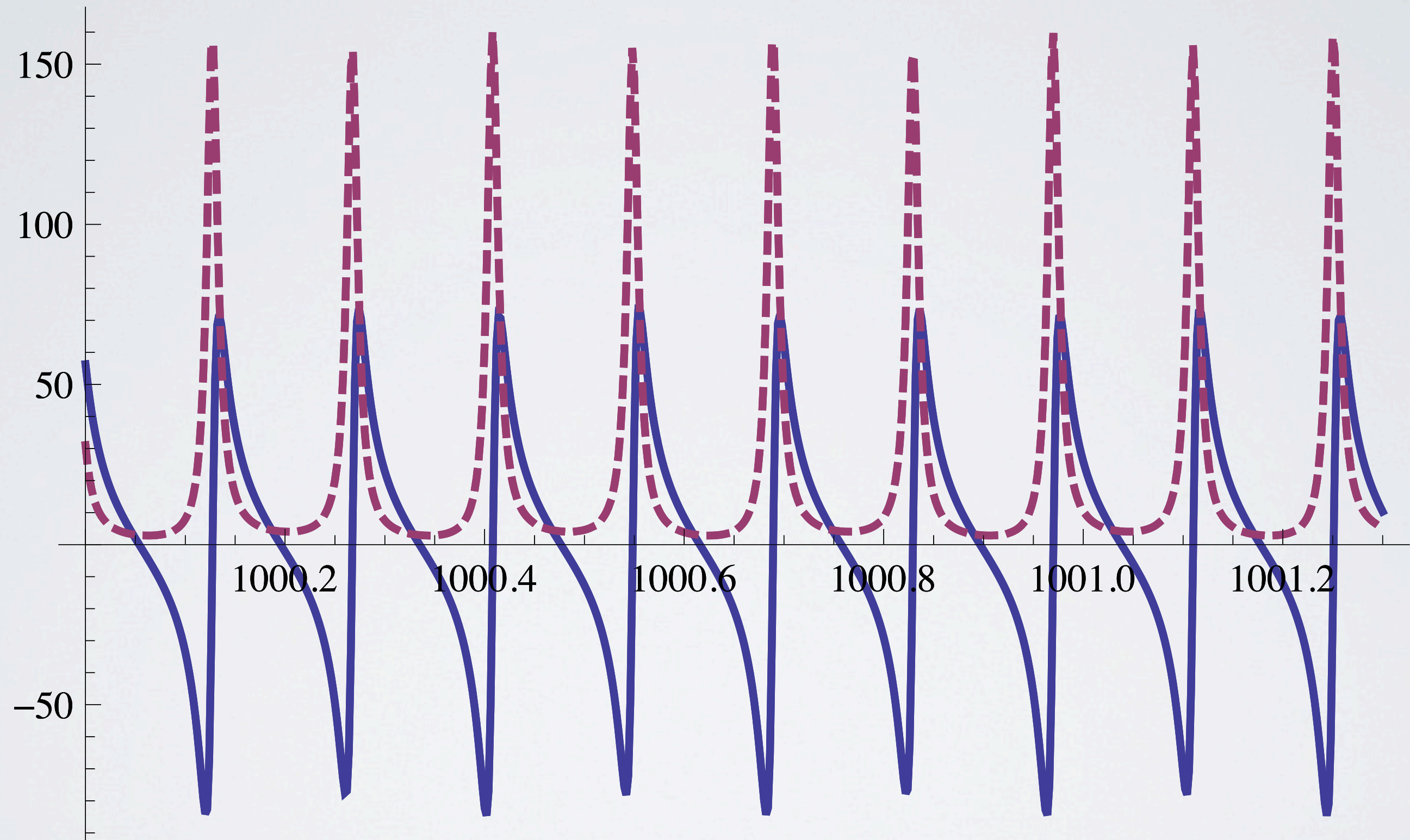
We can now extend the graph for $(s_1, s_2, s_3) = (1, 2, 1/3)$



We can now extend the graph for $(s_1, s_2, s_3) = (1, 2, 1/3)$

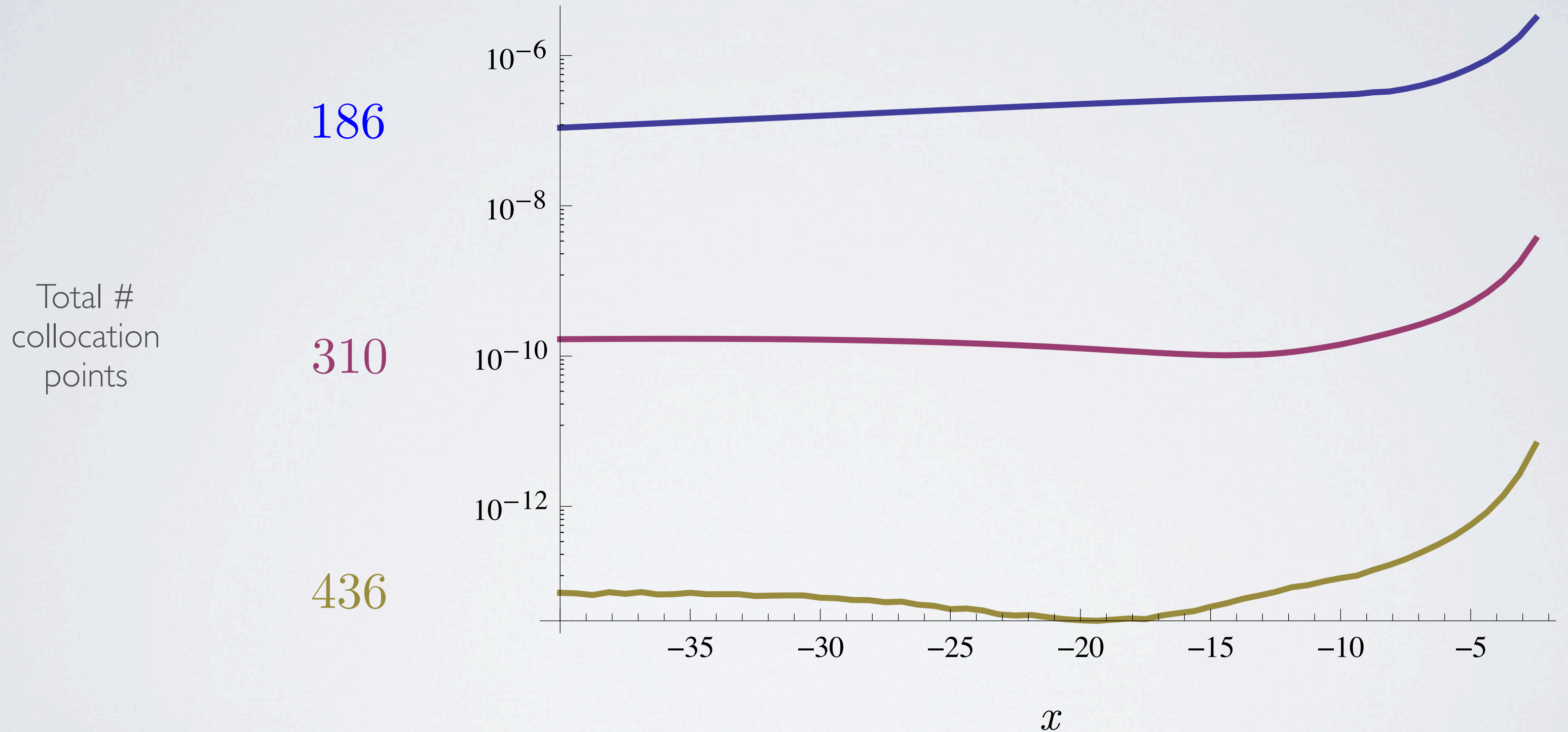


We can now extend the graph for $(s_1, s_2, s_3) = (1, 2, 1/3)$



$$\text{Hastings-McLeod } (s_1, s_2, s_3) = (i, 0, -i)$$

Relative error compared to [\(Prähofer and Spohn 2004\)](#)



Integrable Systems

- Many **integrable systems** can be written as RH problems
 - Here, RH problems are **generalizations of the Fourier transform solutions** to linear PDEs, such as the heat, wave, linear Schrödinger and linear KdV equations
- Examples include

- Nonlinear Schrödinger (NLS) equation
$$\mathrm{i}u_t + u_{xx} + |u|^2 u = 0$$

- Davey–Stewartson (DS) I equation
$$\mathrm{i}u_t + \frac{1}{2}(u_{xx} + u_{yy}) = u\phi - |u|^2 u$$

$$\phi_{xx} - \phi_{yy} = 2\left(|u|^2\right)_{xx}$$

- Shallow water waves:

- Korteweg–de Vries (KdV) equation
$$u_t + 6uu_x + u_{xxx} = 0$$

- Kadomtsev–Petviashvili (KP) I equation
$$(u_t + 6uu_x + u_{xxx})_x - 3u_{yy} = 0$$

KdV equation

- We want to find Φ which satisfies the following jump on the real axis:

$$\Phi^+ = \Phi^- \begin{pmatrix} 1 - |r(z)|^2 & -\bar{r}(z)e^{-2i(4tz^3+xz)} \\ r(z)e^{2i(4tz^3+xz)} & 1 \end{pmatrix}$$

where r is the *reflection coefficient* (essentially, a generalization of the Fourier transform)

- Given a reasonable initial condition, we can efficiently compute r numerically by solving an oscillatory, time-independent *linear Schrödinger equation*
 - But here we will just assume r is given
- Now Φ is not analytic, but rather *meromorphic*, with simple poles (depending on the initial condition)
- We can transform the poles to *small circles* surrounding the pole (suggested by J. DiFranco)

(joint work with T. Trogden, U. Washington)

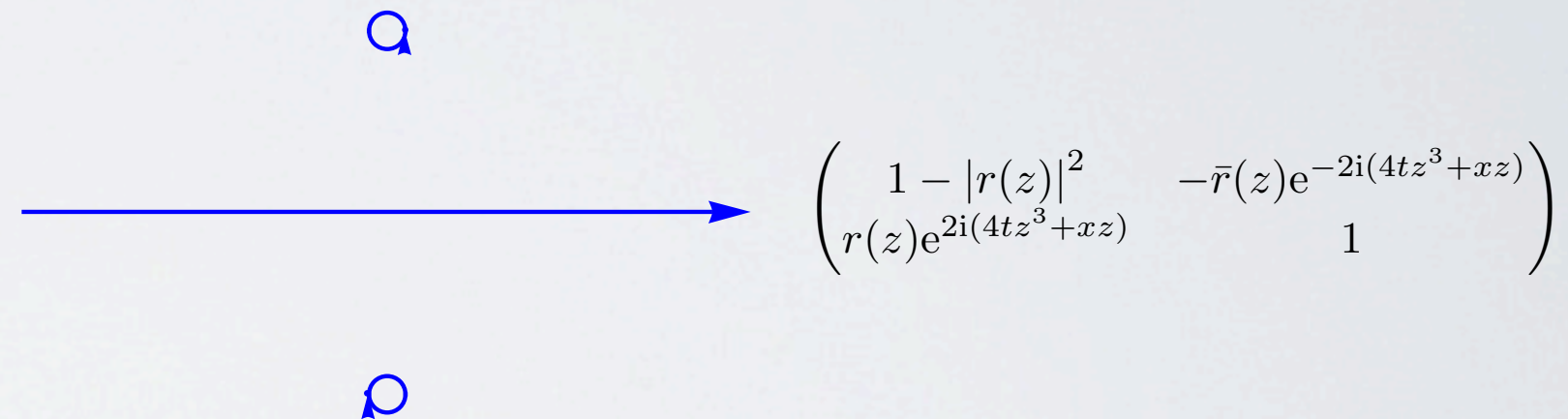
Deformations

- We have two stationary points at

$$\pm \sqrt{-\frac{x}{12t}}$$

- We will deform the contour through these stationary points along the paths of steepest descent
- Different regimes of x and t require different *lensings*
 - Added difficulty: the lensing introduces a *pole*

Undeformed

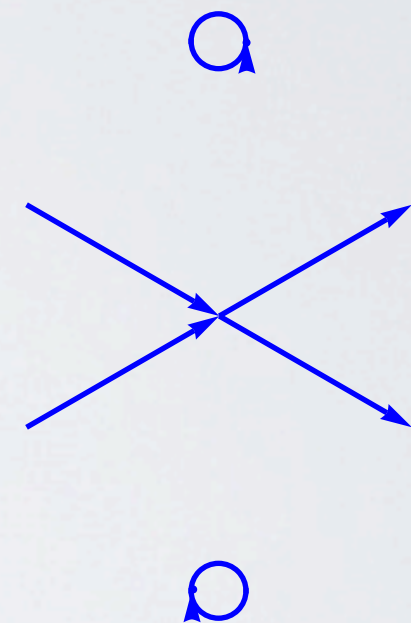
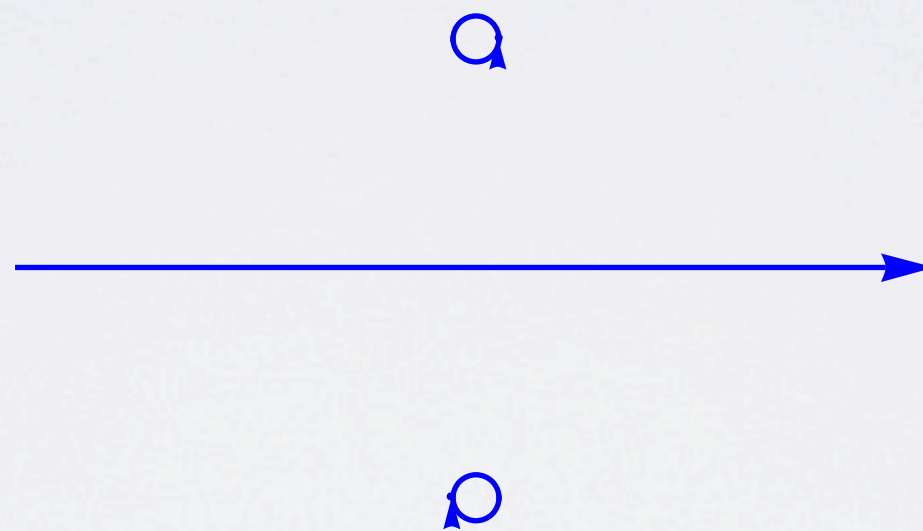
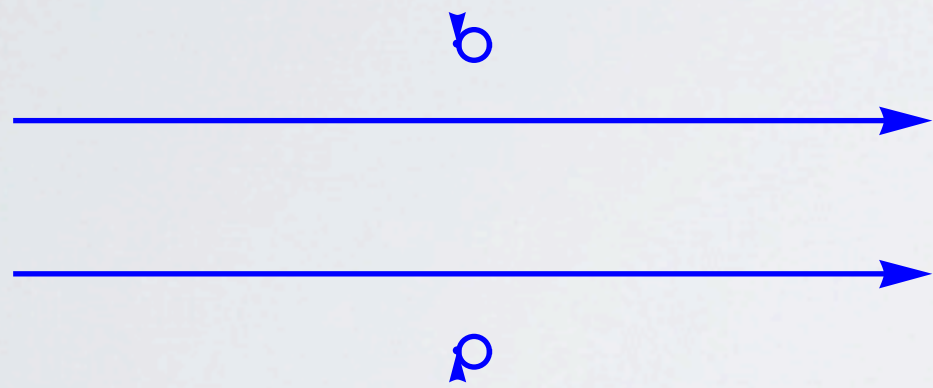


$$t = 0$$

$$x \leq 0$$

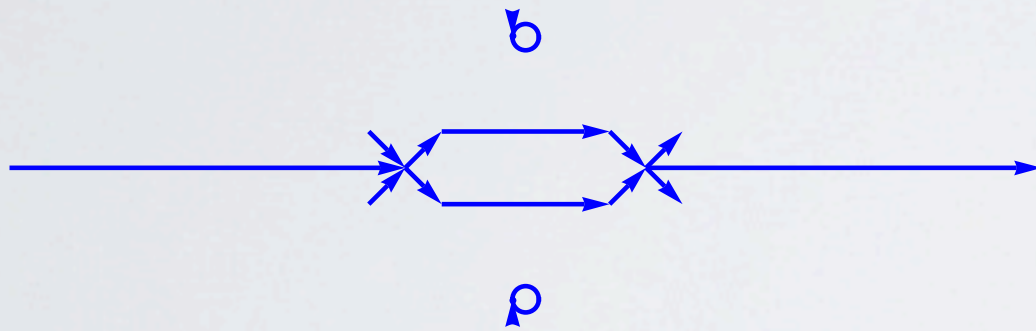
$$x = 0$$

$$0 \leq x$$

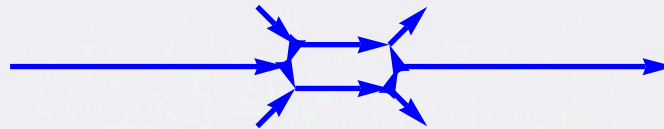


$$t > 0$$

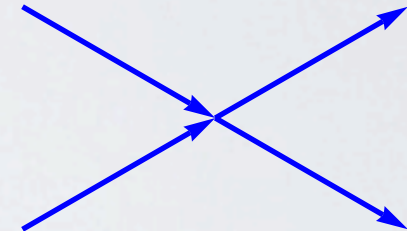
$$x < -t$$



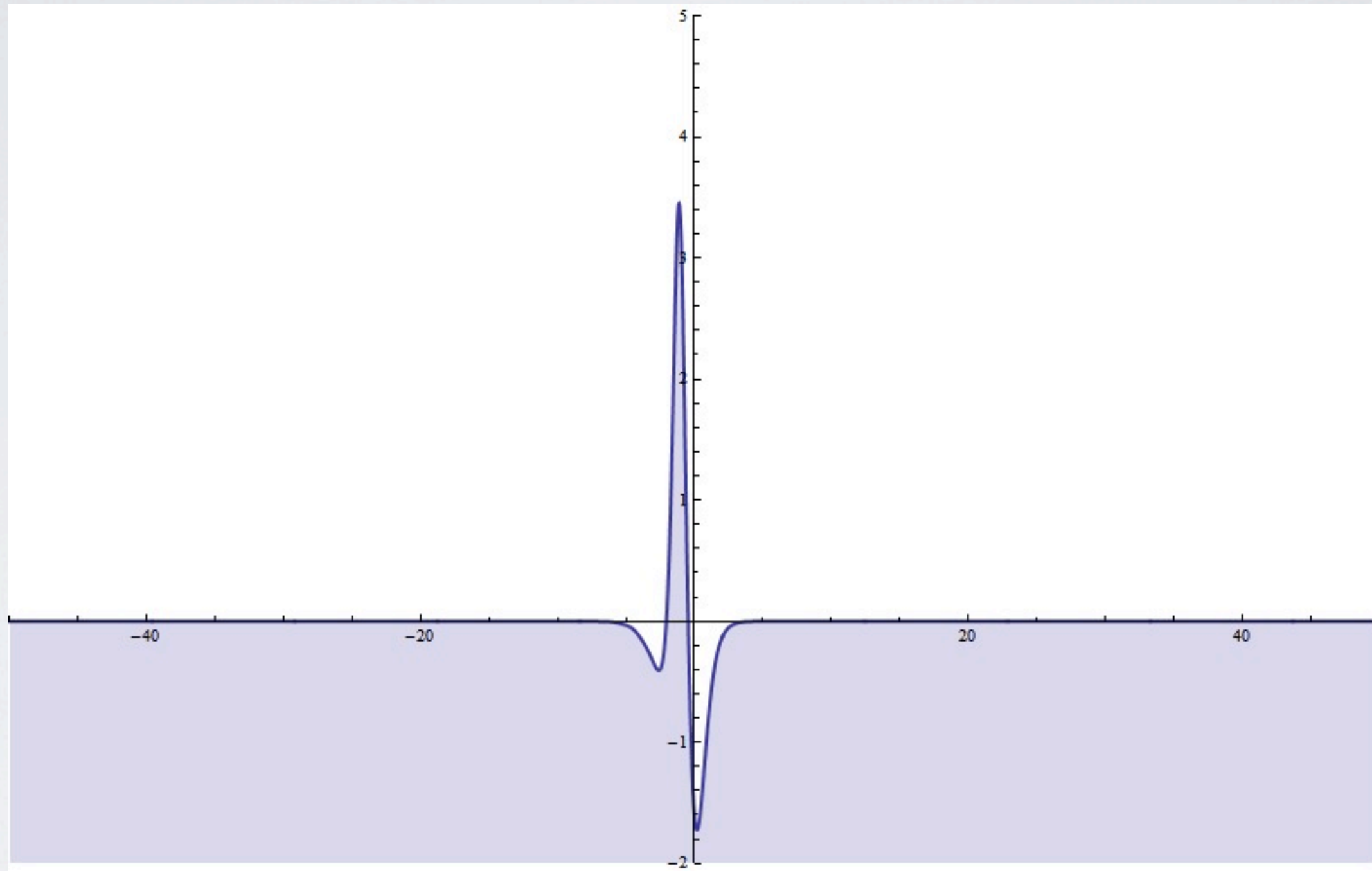
$$-t \leq x < 0$$



$$0 \leq x$$

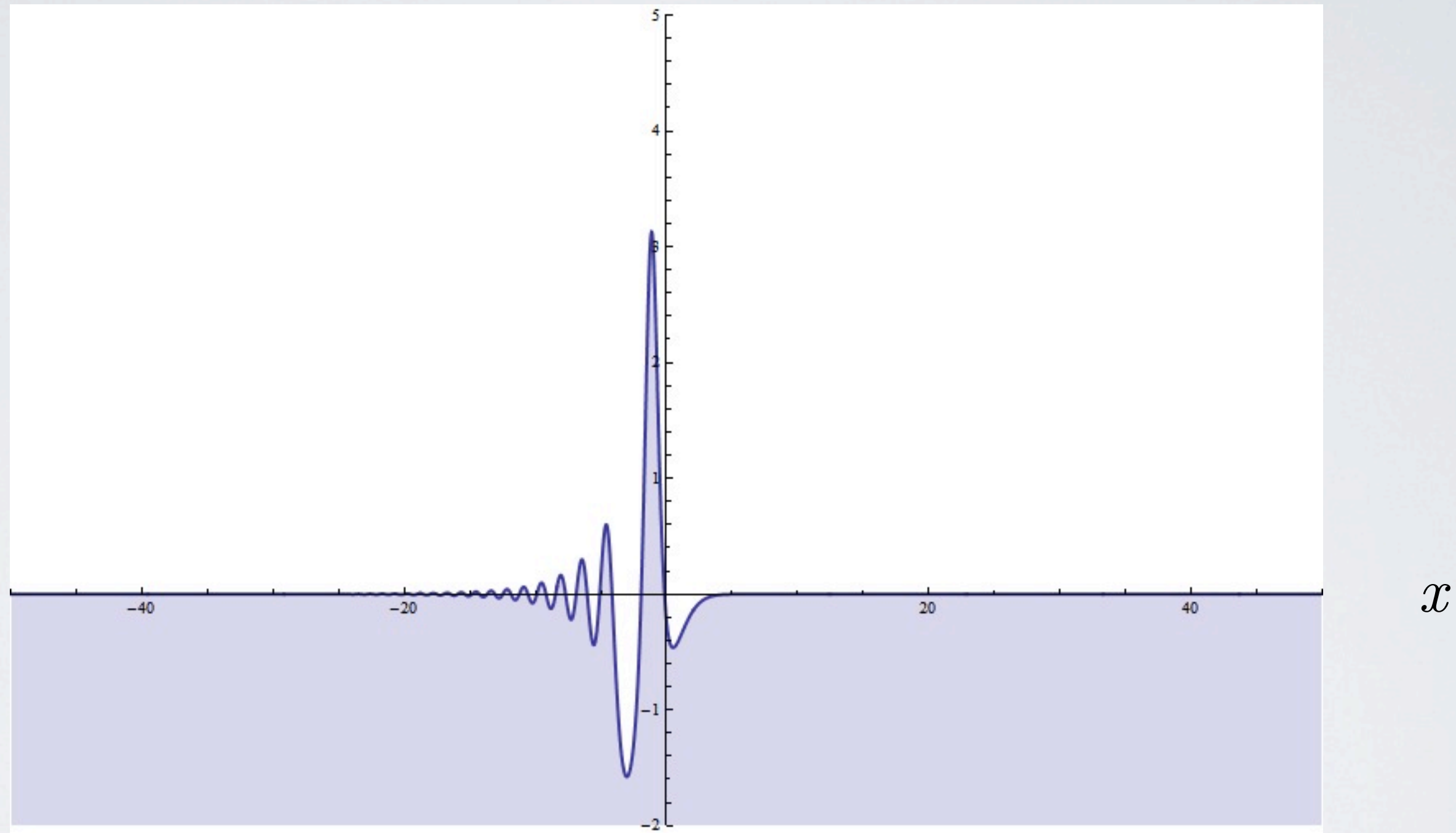


One soliton

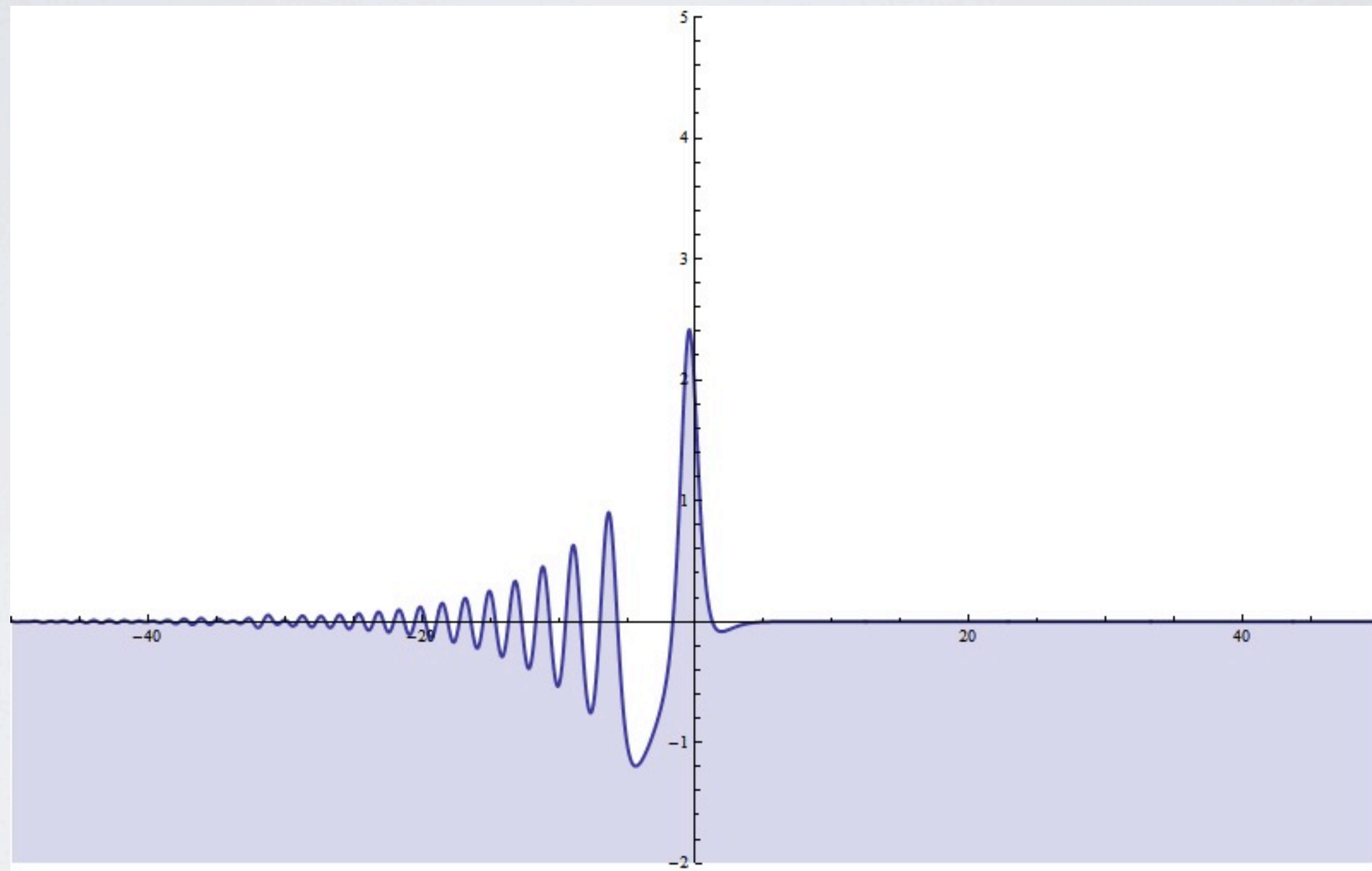


x

One soliton

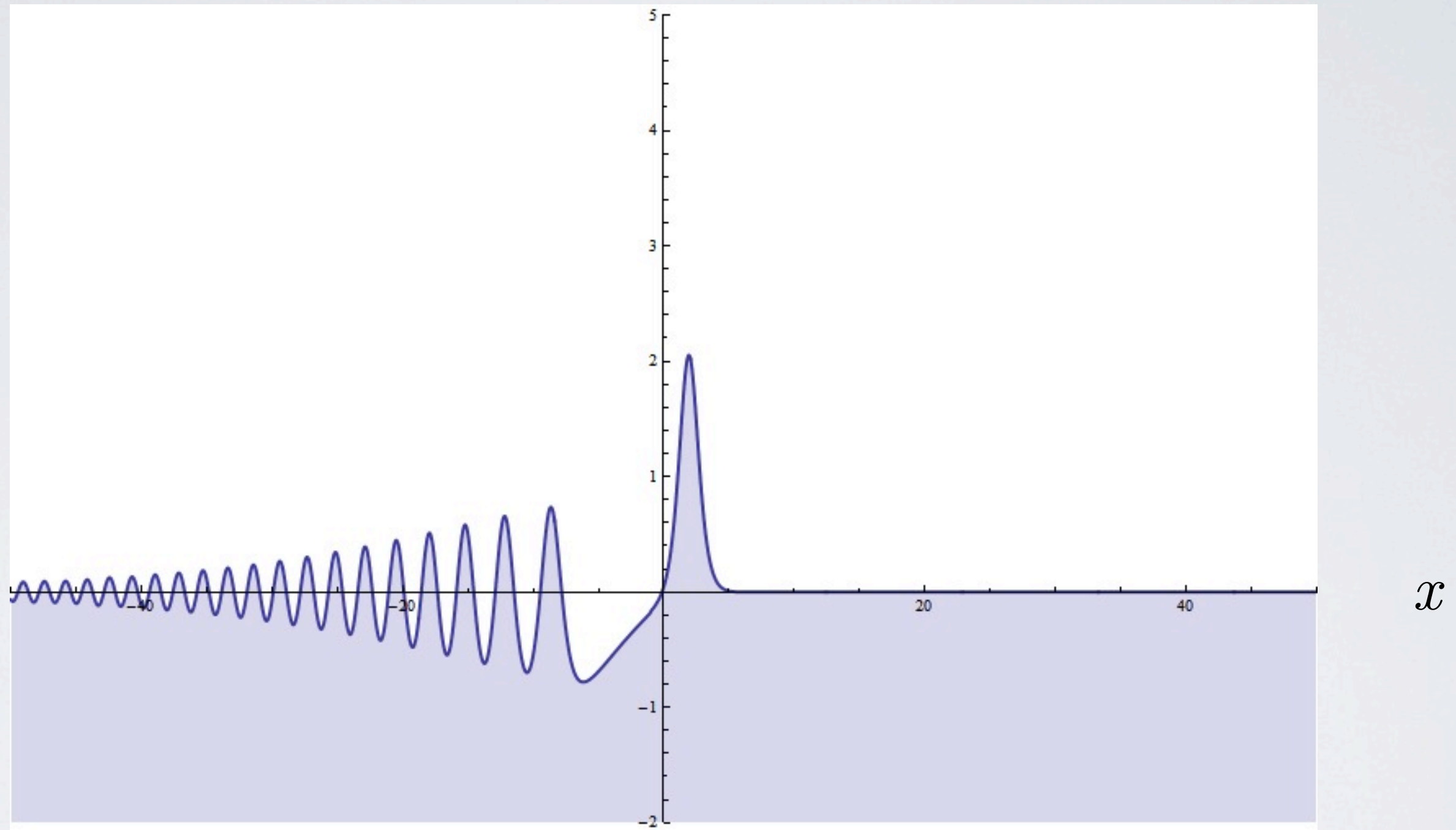


One soliton

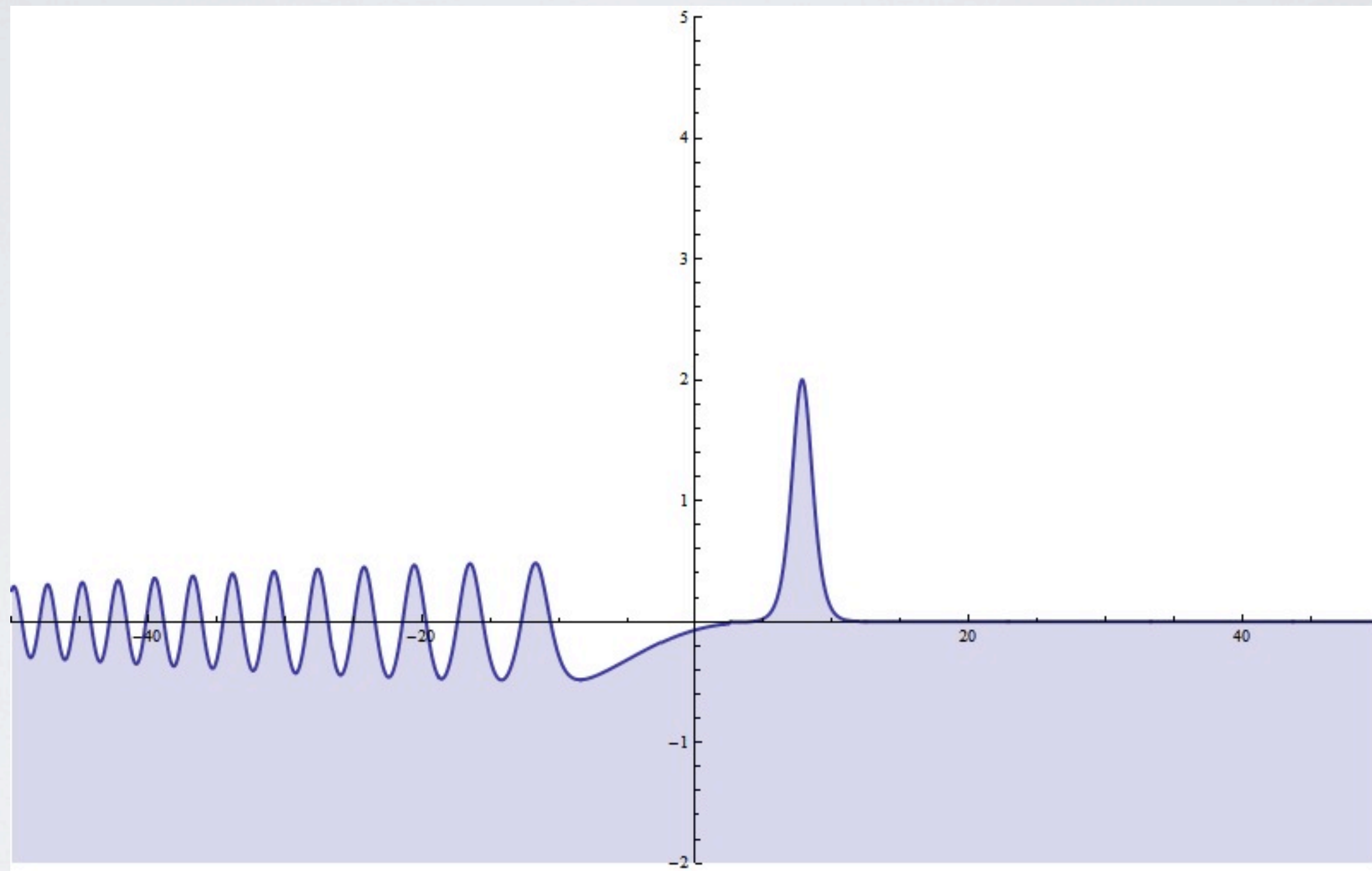


x

One soliton

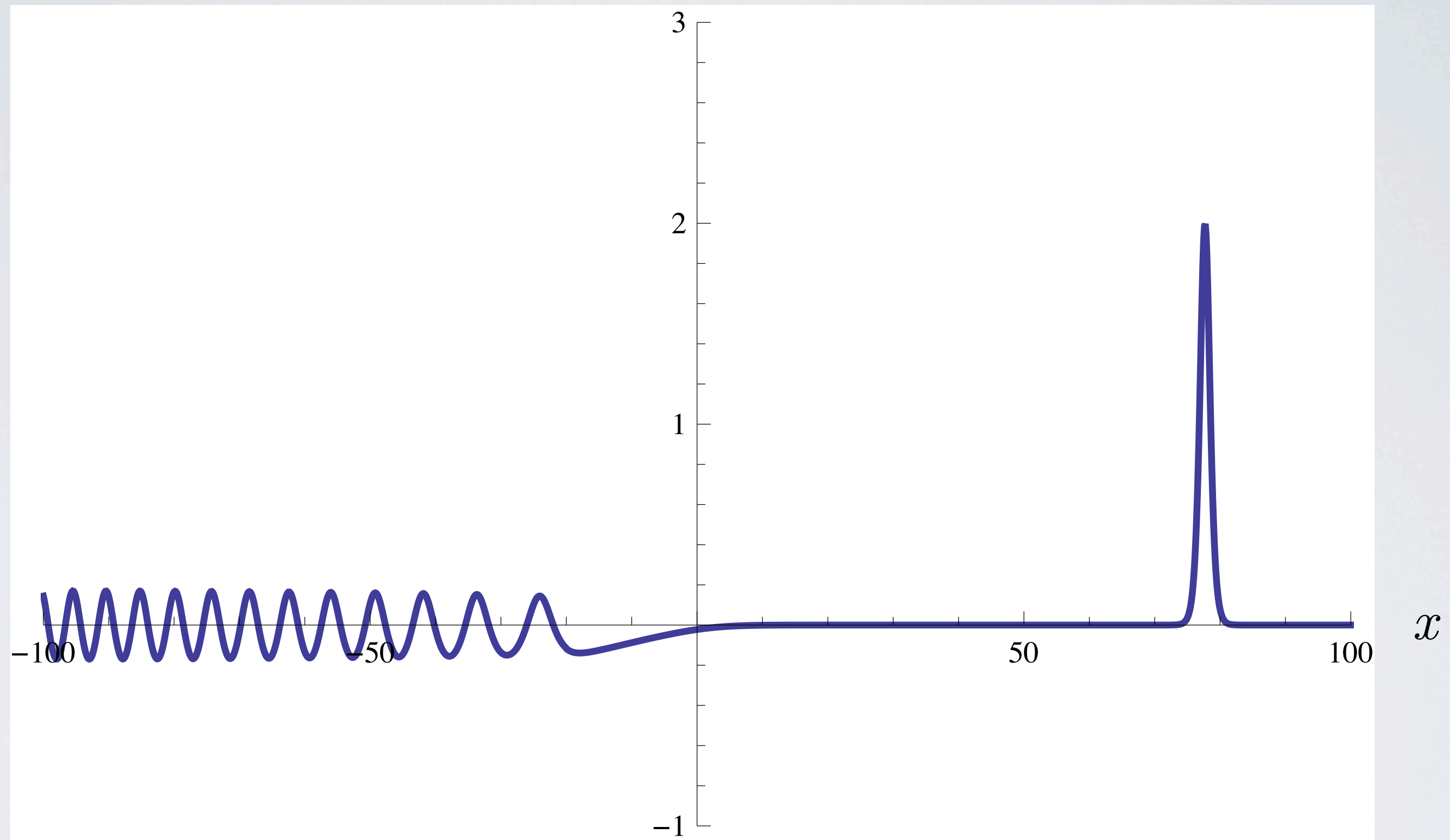


One soliton

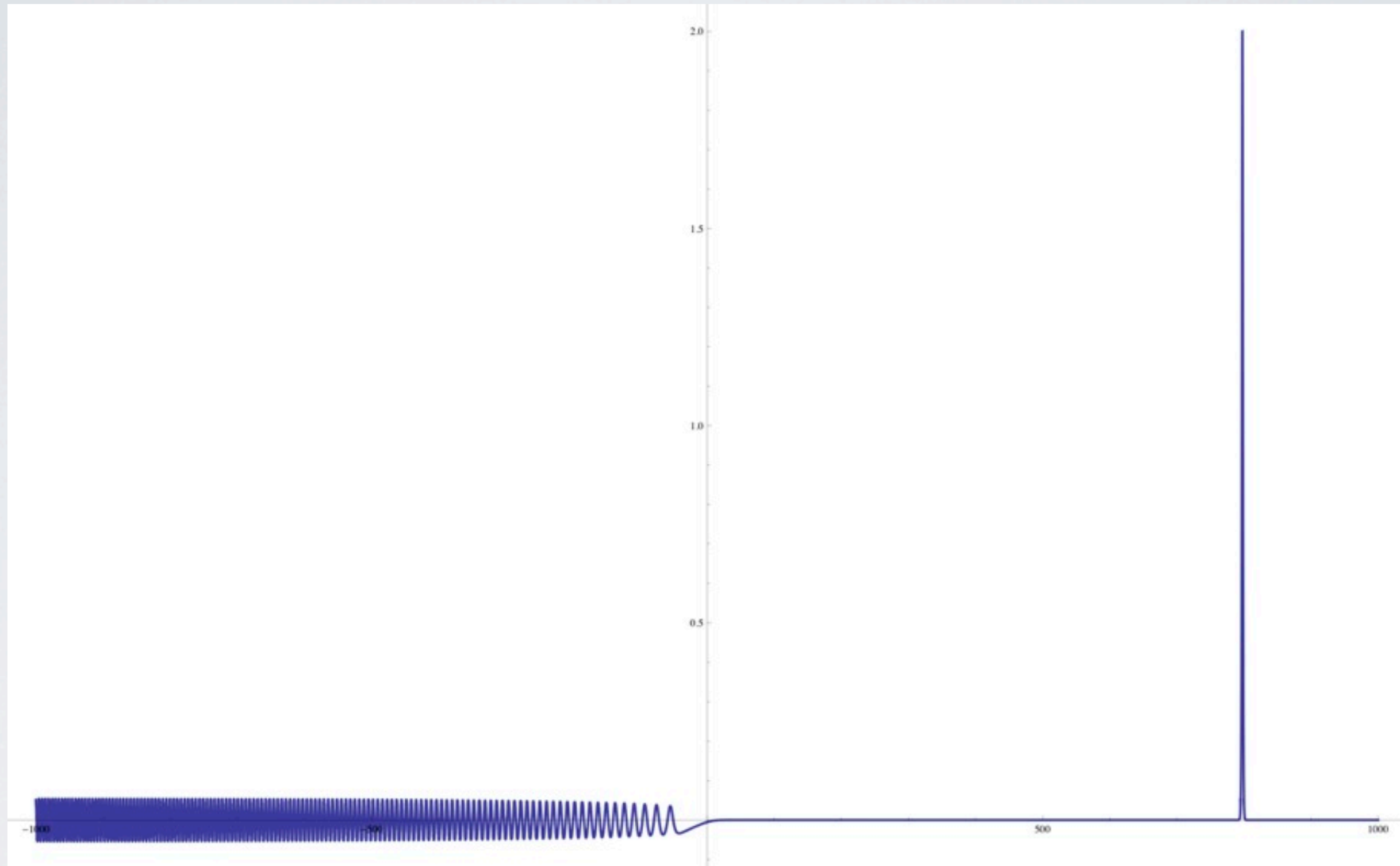


x

Plot for $t = 20$

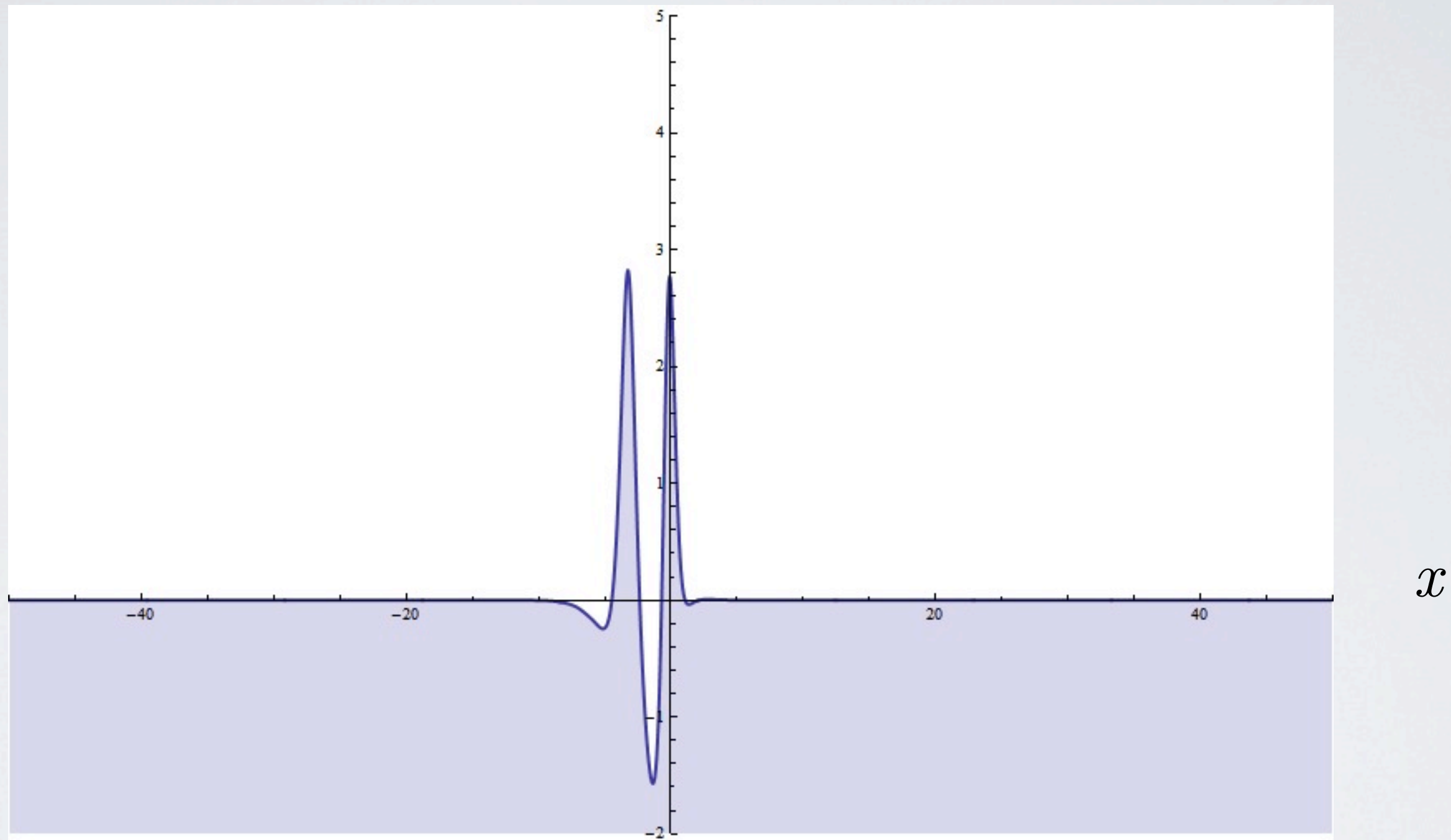


Plot for $t = 200$, $-1000 < x < 1000$

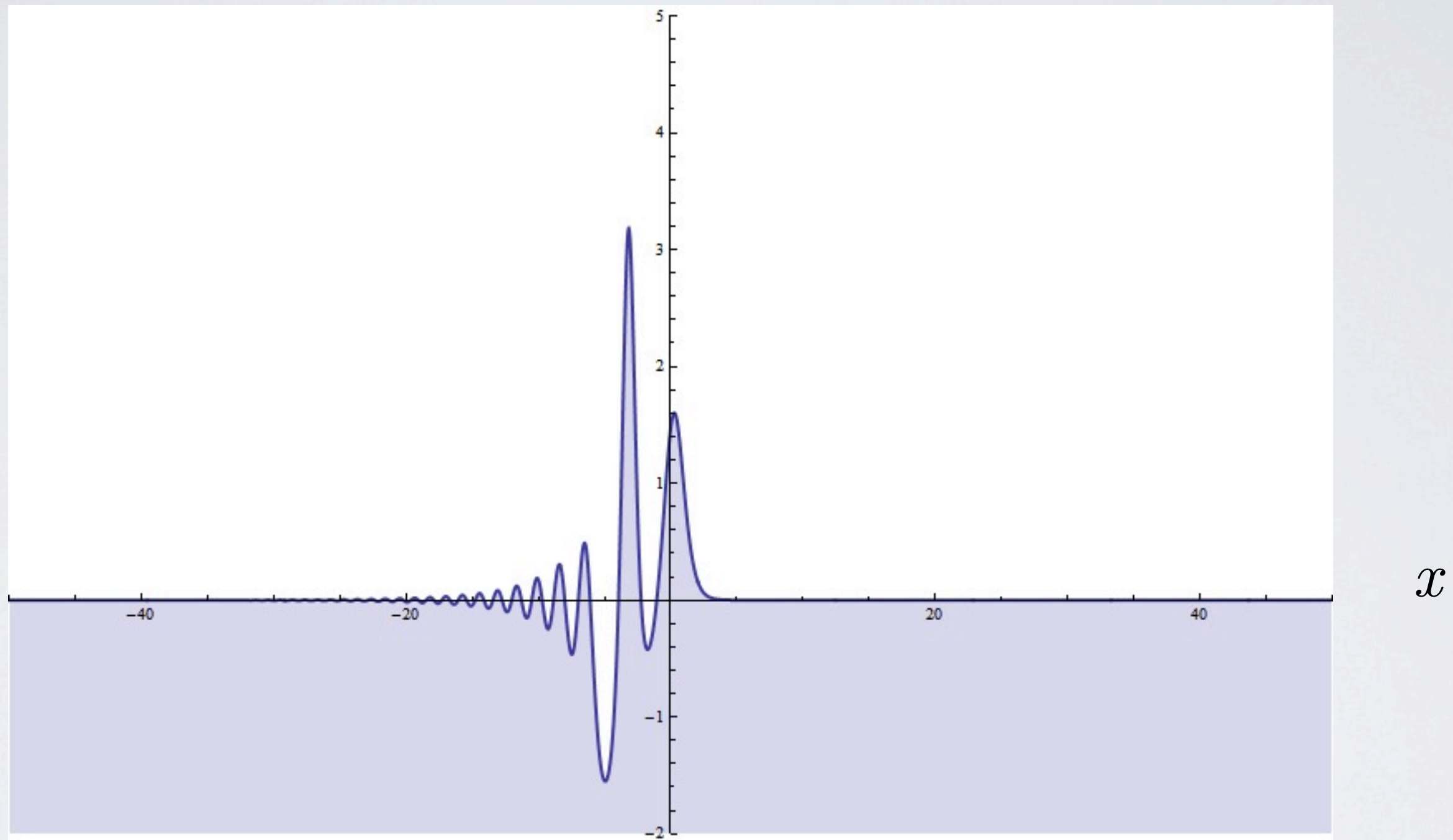


x

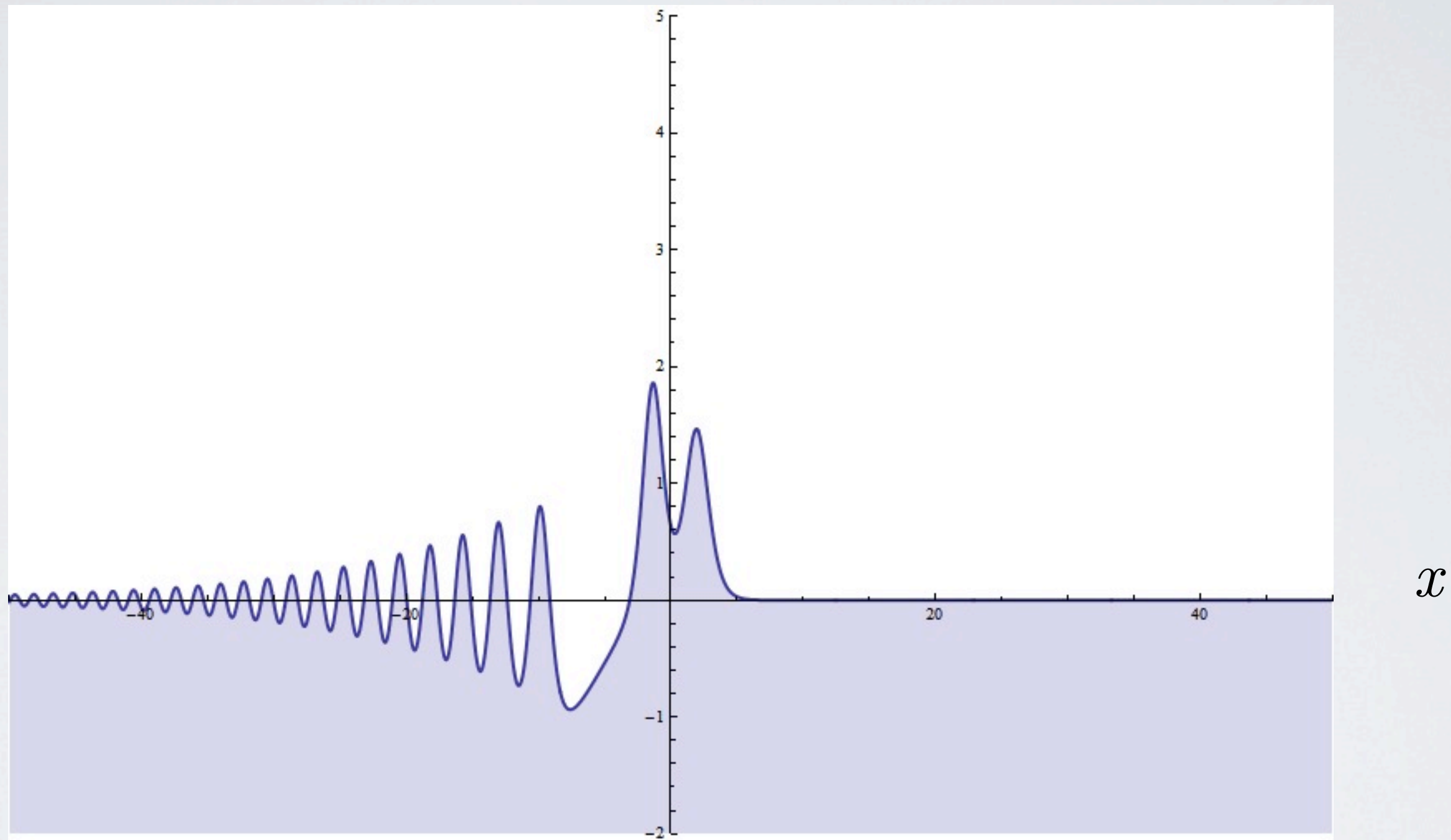
Two solitons



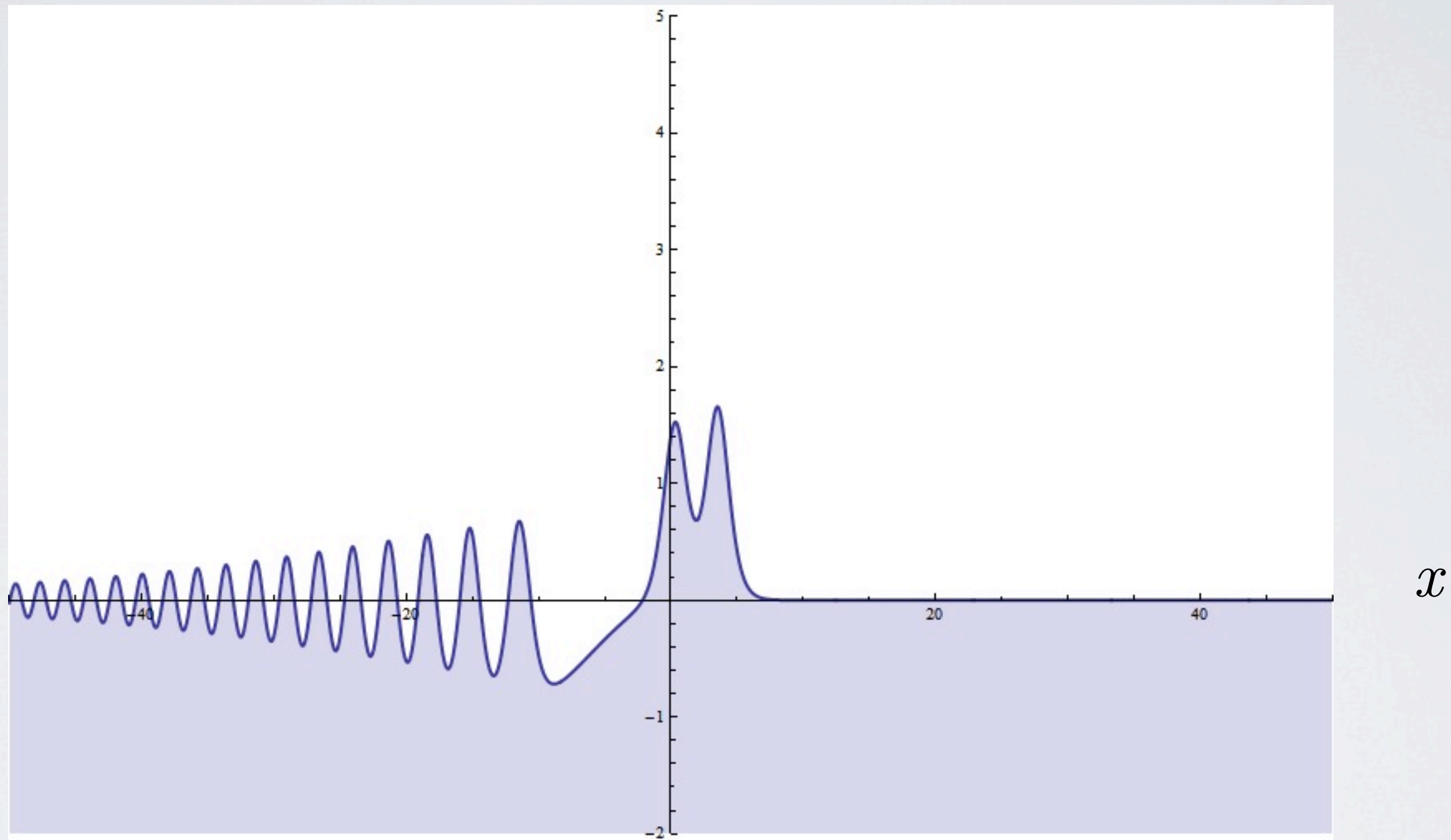
Two solitons



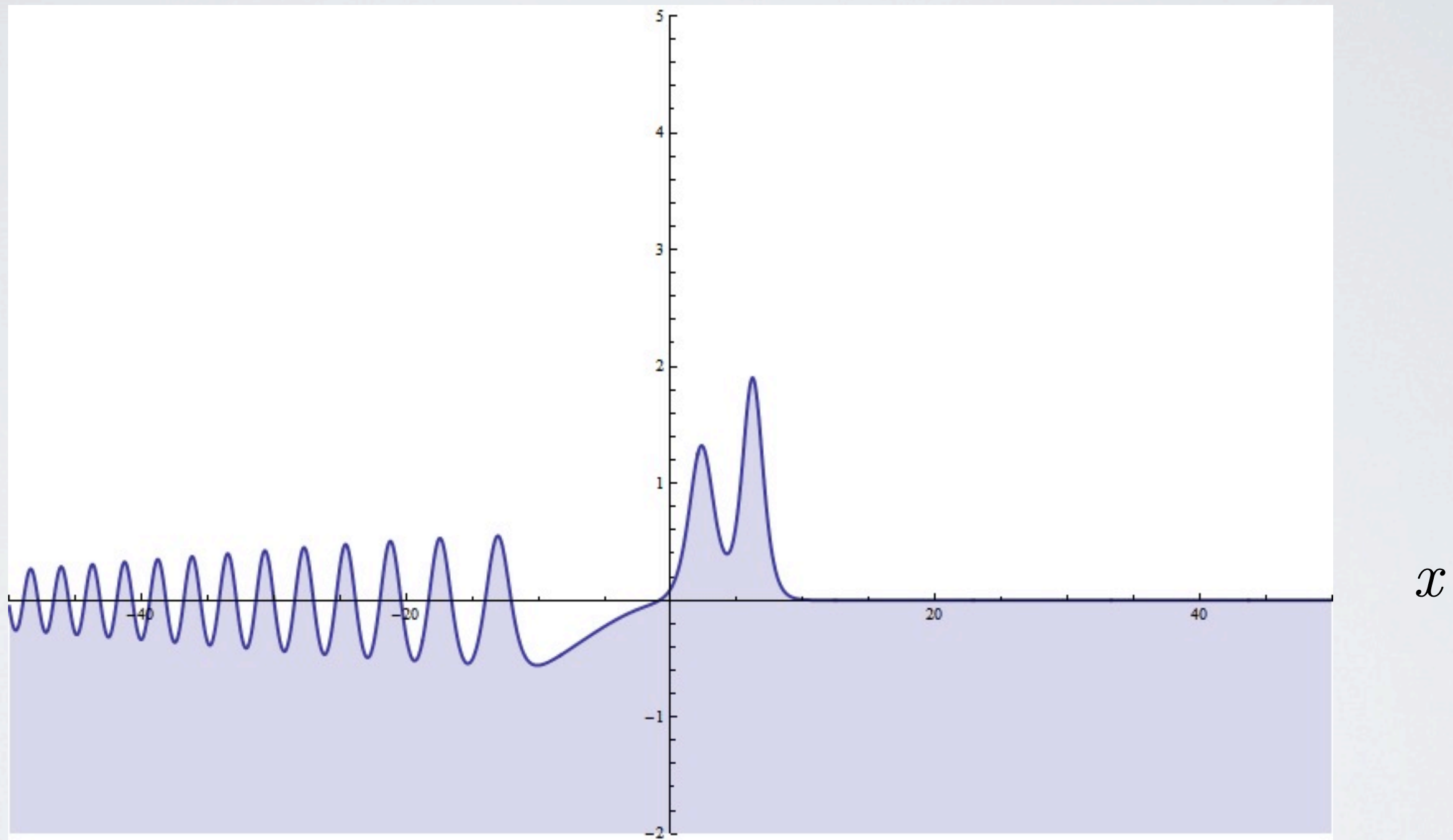
Two solitons



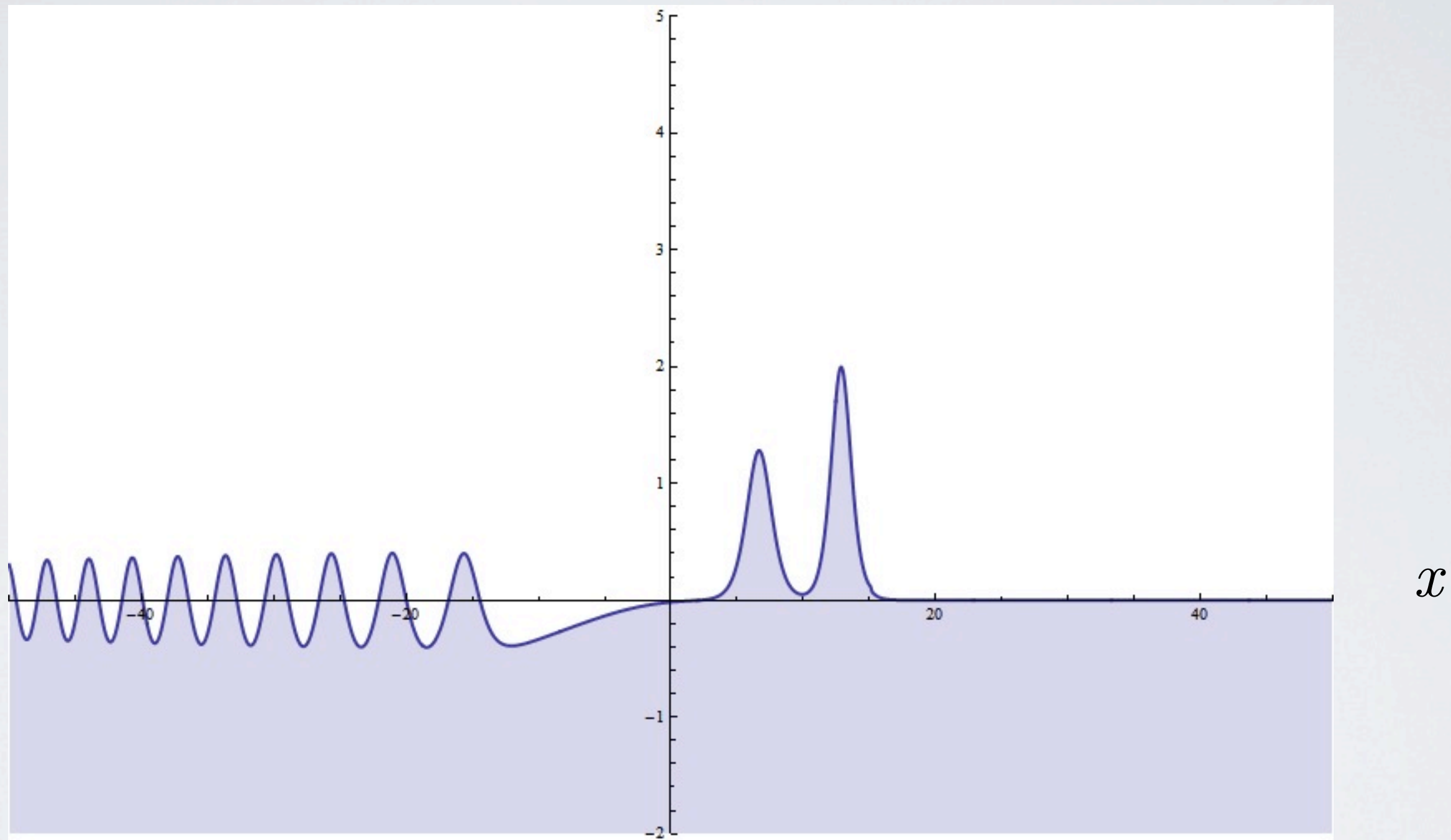
Two solitons



Two solitons



Two solitons



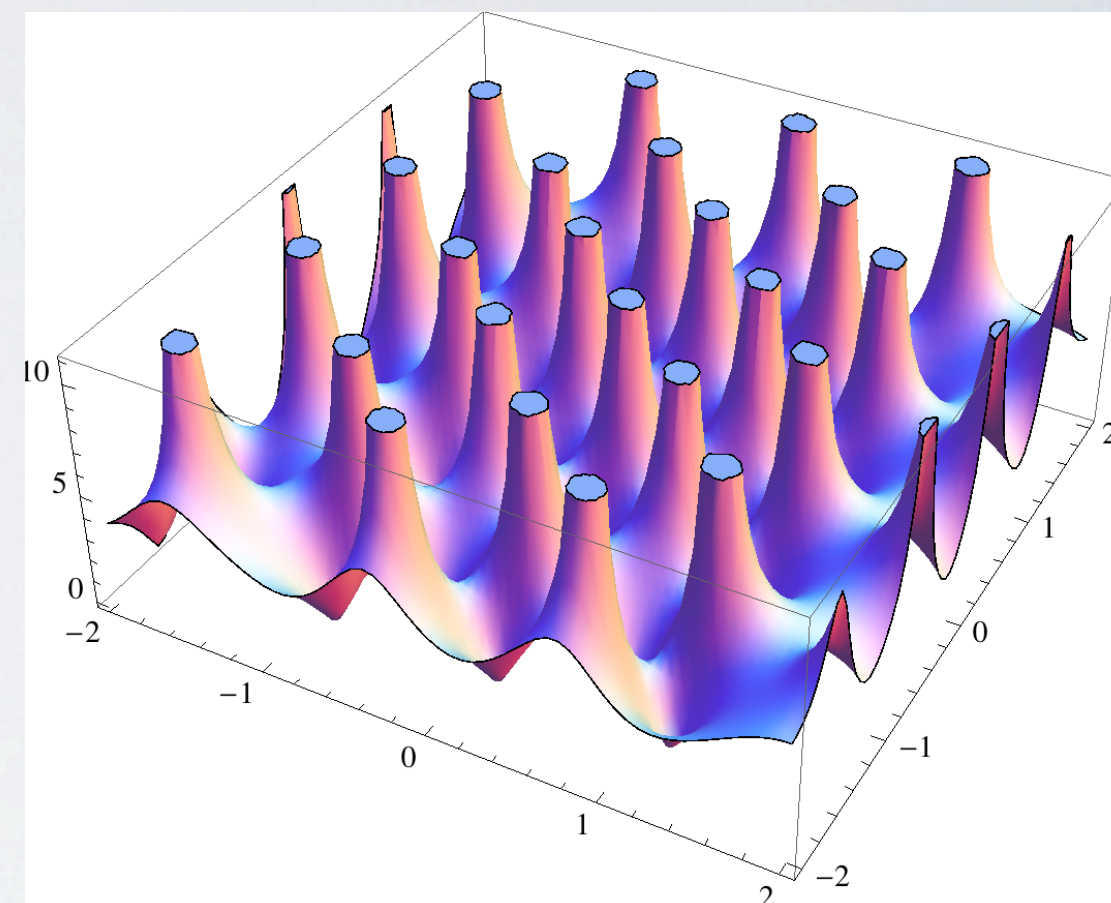
Benefits of an RH numerical approach

- Of course, there are many other numerical methods for such PDEs, however, an approach based on the RH formulation has many benefits, including:
 - x and t are reduced to **parameters**, therefore we do not need to integrate the solution at a sequence of time steps to compute it for large t
 - Computational cost is **bounded** for *all* t and x
 - We achieve **spectral accuracy** and **avoid boundary truncation effects**
 - The KP and DS equations have **two spacial dimensions**, making standard numerical methods inefficient
 - y is also simply a **parameter** in the RH formulation
 - Benjamin–Ono equation has a **singular-integral term**

Conclusions

- Riemann–Hilbert problems can be numerically solved, efficiently and accurately
- We can now reliably compute solutions to **KdV** and **Painlevé II**
 - This could form the building block of a **toolbox** for computing Painlevé transcendents
 - A first step is the routine **PainleveII[{s1,s2,s3},x]** included in **RHPackage** and reliable for all real x
- Same ideas are applicable to computing other Painlevé transcendents, integrable systems, orthogonal polynomials and random matrix theory distributions

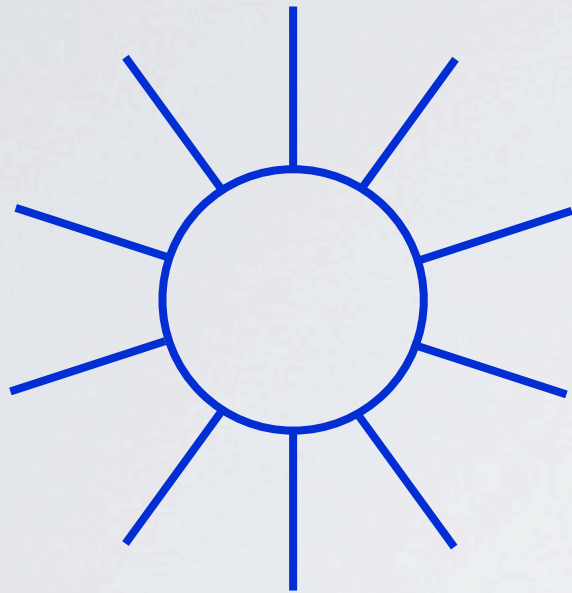
A solution to Painlevé IV



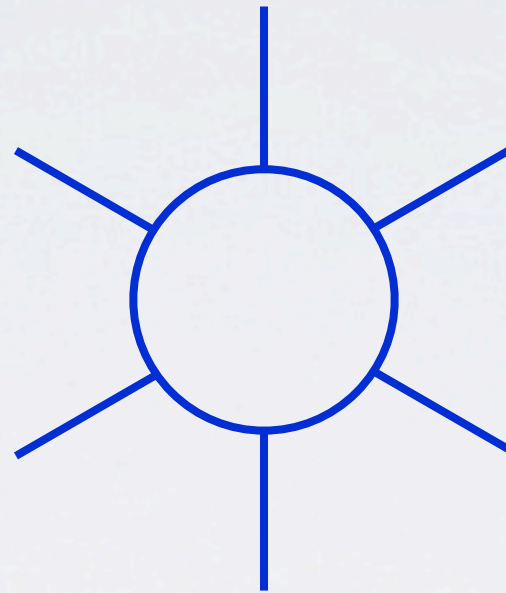
(Mathematica package RHPackage
available on my website)

OTHER PAINLEVÉ RH PROBLEMS

I



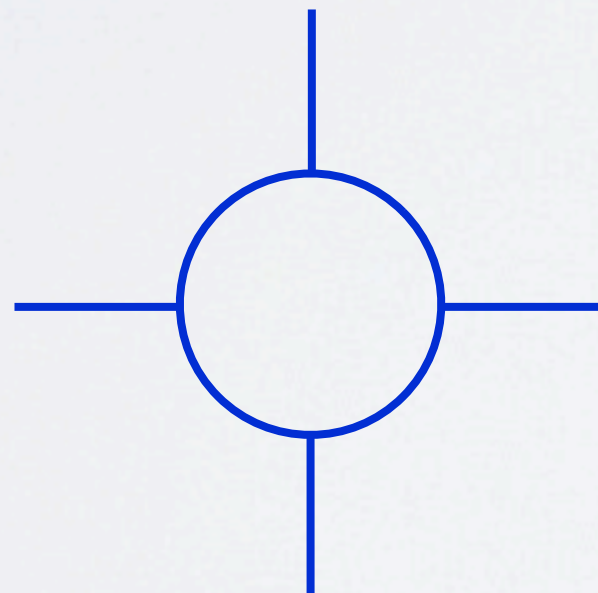
II



III



IV



V

