

Towards Automated Load Balancing via Spectrum Slicing for FEAST-like Solvers

The Hermitian Interior Eigenvalue Problem

- Let $H \in \mathbb{C}^{n \times n}$ be Hermitian
- Find all (λ, v) with $\lambda \in [a, b]$, such that

$$Hv = \lambda v$$

- All solvers are sensitive to the *spectrum* $\{\lambda \mid Hv = \lambda v\}$
- Knowledge about the spectrum may increase performance
- Today: Load balancing for FEAST-like eigensolvers

Our goal is to combine

- 1 The ability to design filters with specific properties
- 2 Cheaply available information on the spectrum

In order to achieve good parallel performance on FEAST-like solvers.

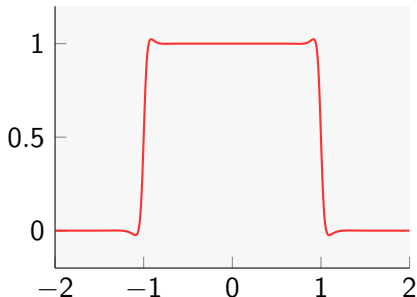
FEAST: A Rationally Filtered Interior Eigensolver

FEAST(Matrix A , Approx Y)

```

while  $\|Y^*AY - \Lambda\| < \text{tol}$  do
   $U \leftarrow f(A)Y$ 
   $U \leftarrow QR(U)$ 
   $B \leftarrow U^*AU$ 
  Solve:  $\Lambda = W^*BW$ 
   $Y \leftarrow UW$ 
return  $(\Lambda, Y)$ 
  
```

$$f(A) = \sum_{i=1}^p \alpha_i (Iz_i - A)^{-1}$$



Levels of Parallelism in FEAST

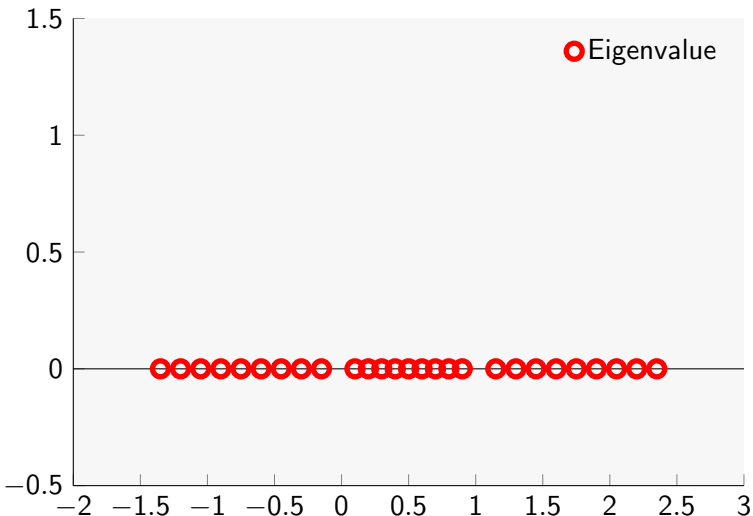
- 1 Partition the search interval into multiple, independent intervals
- 2 p Linear System Solves per iteration

$$U := f(A)Y = \sum_{i=1}^p \alpha_i (Iz_i - A)^{-1} Y$$

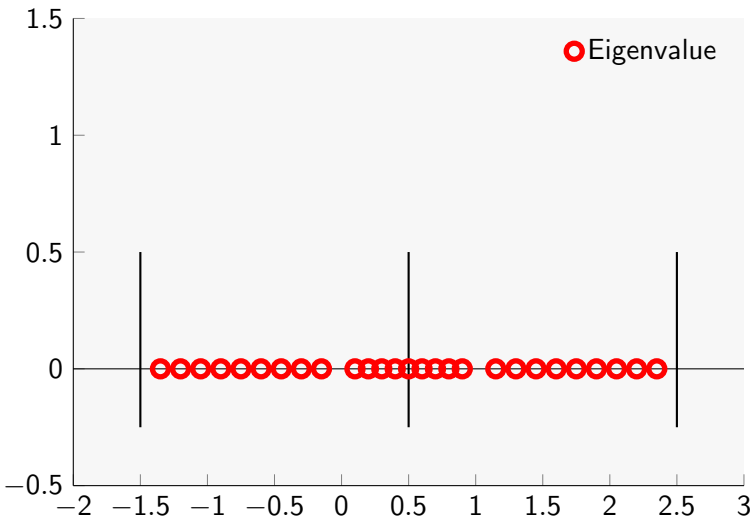
- 3 Linear System Solve

$$(A - Iz_i)U = \alpha_i Y$$

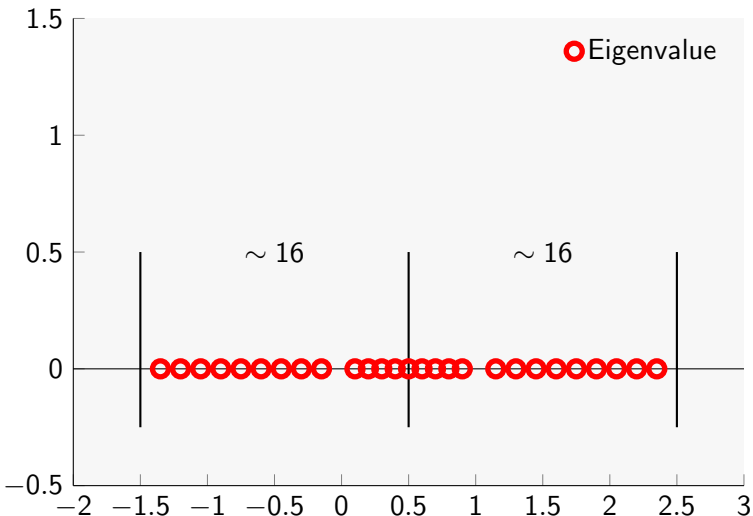
State of the Art: Approximate Eigenvalue Counts



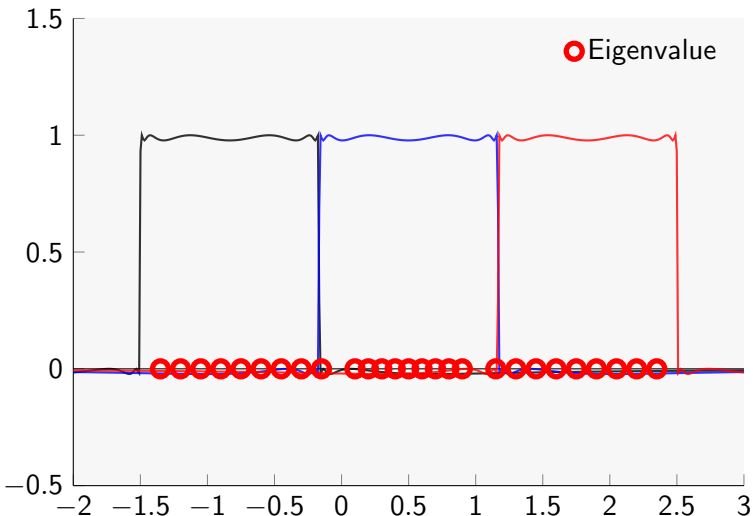
State of the Art: Approximate Eigenvalue Counts



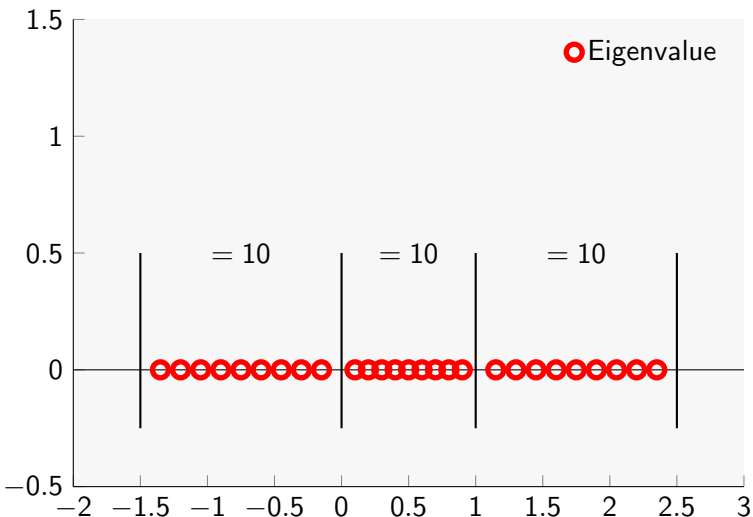
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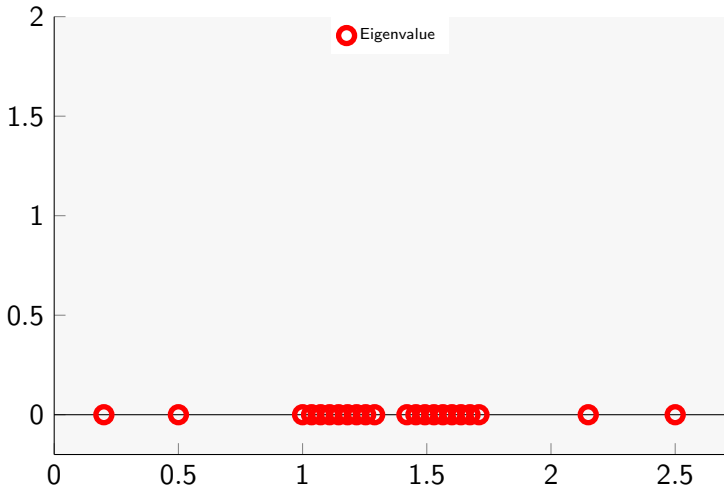
NLLS filters: Optimized filters for FEAST

Non-Linear Least-Squares optimized filters:

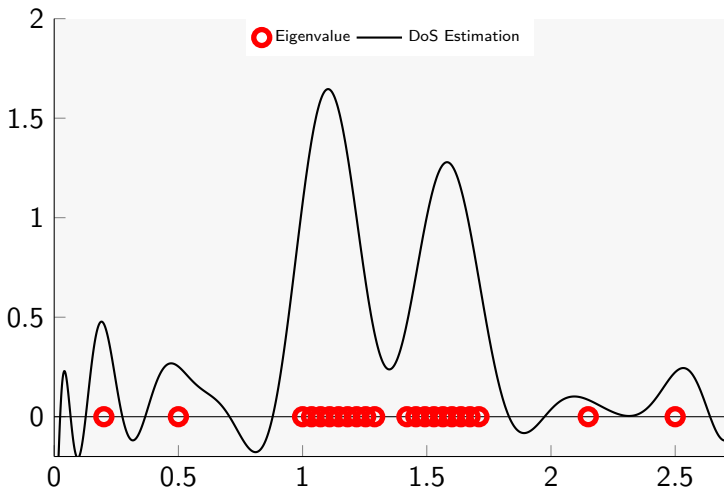
$$\min_{\alpha_i, z_i} \int_{-\infty}^{\infty} w(t) \left| h(t) - \sum_{i=1}^n \frac{\alpha_i}{t - z_i} \right|^2 dt$$

- Good results when compared to existing filters
- Ability to 'design' filters for special use-case
- Forthcoming publication in beginning of 2017

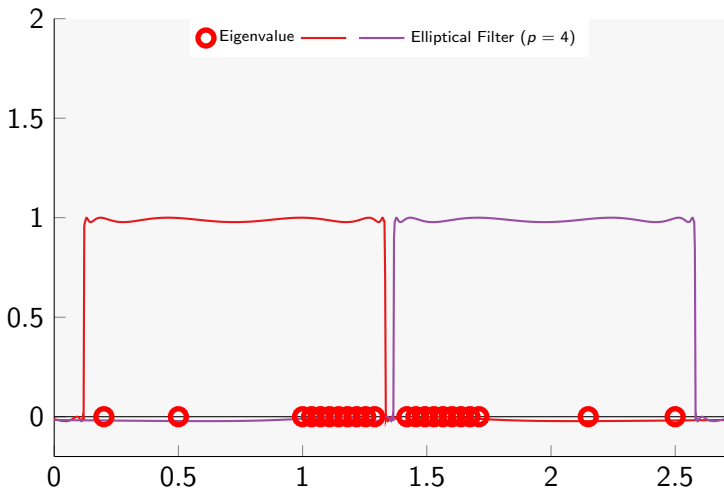
Future Work: Load Balancing with NNLS Filters and DoS



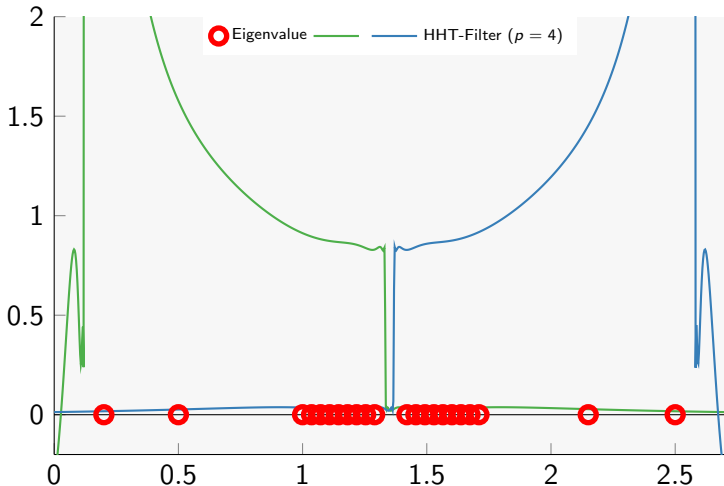
Future Work: Load Balancing with NNLS Filters and DoS



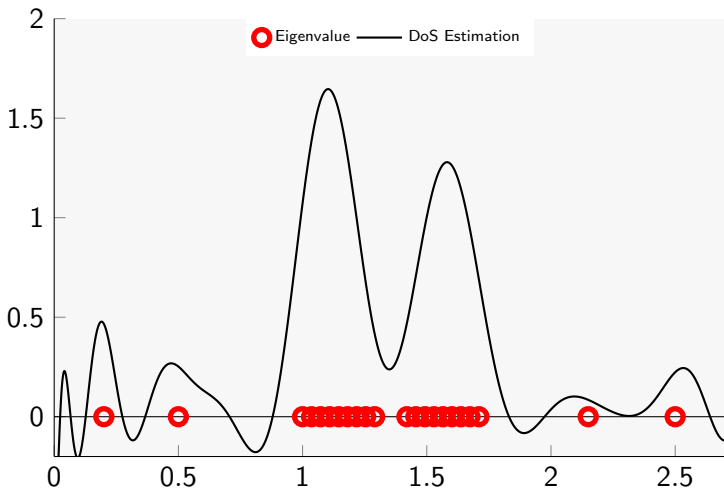
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Opportunities for Collaboration

Cheap Information on the Spectrum

- Given Matrix A , sparse/dense, (non-)Hermitian
- Obtain information on the spectrum of A around $[a, b]$
- As cheaply as possible (Trace estimation, Lanczos)

Eigenproblems with Difficulties in Load Balancing

- Preferably Hermitian problems
- Suspected potential for better Load Balancing
- Ideally with FEAST-like solvers

The End

Thank you for your attention
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Future Work: Load Balancing with Krylov-Solvers

The Linear System Solve:

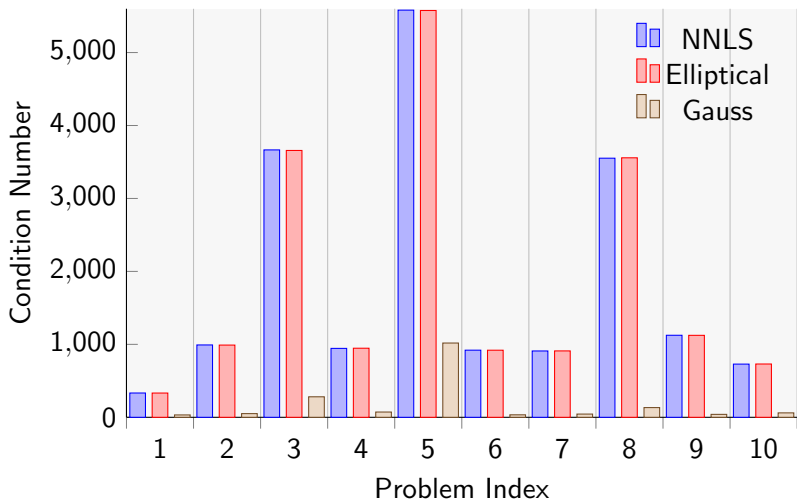
$$(A - I z_i) U = \alpha_i Y \quad \forall 1 \leq i \leq p$$

- For large p $\min_{1 \leq i \leq p} |\Im(z_i)|$ becomes very small
- Then $(A - I z_i)$ may become nearly singular
- Workload imbalance with Krylov-based solvers

Another aspect of load balancing

- We can influence the imaginary part of z_i
- Reduces Load Imbalance (at cost of convergence speed)

Condition Number of $(A - I z_i)$



Performance Profile

