# Fast Cauchy Sum Algorithms for Polynomial Zeros and Matrix Eigenvalues 

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## Polynomial Root-Finding

Given coefficients $p_{0}, p_{1}, \ldots, p_{d}$, approximate the roots $x_{1}, x_{2}, \ldots, x_{d}$ :
$p(x)=p_{d} \prod_{j=1}^{d}\left(x-x_{j}\right)=p_{0}+p_{1} x+\ldots+p_{d} x^{d}=0, p_{d} \neq 0$.

Central question for math and computational math for $\approx 4000$ years, well into the 19th century
Intensive study in the 1980s and 1990s
Pan (STOC 1995): divide-and-conquer algorithm approximating all $d$ roots within $\epsilon=2^{-b}\|p\|$ in nearly optimal Boolean complexity $\tilde{O}\left((b+d) d^{2}\right)$

## What's Next?

Two points of consideration:

1. The algorithm is quite involved and has not been implemented
2. Performs under the classical model involving coefficients

## Black Box Polynomial

Polynomials given with an oracle for their evaluations
Examples
Shifted sparse

$$
p(x)=t(x-c)
$$

Sum of shifted monomials

$$
p(x):=\alpha(x-a)^{d}+\beta(x-b)^{d}+\gamma(x-c)^{d}
$$

Recursively defined, e.g., Mandelbrot's

$$
p_{0}(x):=1, p_{1}(x):=x, p_{i+1}(x):=x p_{i}(x)^{2}+1, i=0,1, \ldots
$$

## Goal

We want to devise an algorithm that

1. can work with black box polynomial
2. is both optimal and easy to implement

## Subdivision Iterations (Exclusion-Inclusion Test)

Weyl 1924, Henrici 1974, Renegar 1987, Pan 2000


Our root-finder accelerates the classical subdivision approach, based on proposing novel exclusion-inclusion (e-i) tests

## Subdivision Iterations

Centers of all suspect squares together approximate all roots within half diagonal, decreasing by twice in every iteration
$\Rightarrow$ error decreases by a factor of $2^{b}$ after $b$ iterations

A root can lie in up to 4 suspect squares
$\Rightarrow \leq 4 d b$ tests overall to approximate $d$ roots within $R / 2^{b}$,
$R=$ half diagonal of the initial suspect square.

## Challenges in E-I Testing

1. Known techniques are efficient for discs, not squares
2. We compute numerically; how can we be certain if a root is inside or outside the square?

## Solution: Firm Exclusion, Soft Inclusion



Exclusion: If no roots in the minimal covering disc, discard Inclusion: If roots exist in a slightly larger disc, subdivide

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## Firm Exclusion, Soft Inclusion

Both tests can be satisfied at the same time!


Headache? No. Just take either one of the decisions.
Soft test can be applied to any disc or square containing a fixed number of roots.

See [arXiv 1805.12042] for more.

## Isolation ( $\theta$ )



## Cauchy Integral

Use Cauchy integrals with subdivision
Approximate the power sums of all $m$ roots, $x_{1}, \ldots, x_{m}$, in a disc $D$ with boundary circle $\Gamma$ by

$$
s_{h}:=\sum_{x_{j} \in \mathcal{D}} x_{j}^{h}=\frac{1}{2 \pi \sqrt{-1}} \int_{\Gamma} \frac{p^{\prime}(x)}{p(x)} x^{h} d x, h=0,1, \ldots
$$

$s_{0}=$ the number of roots in the disc.

## Approximating Cauchy Integral

For $D=D(0,1)=\{x:|x| \leq 1\}$, approximate the integral by

$$
\begin{gathered}
s_{h, q}:=\frac{1}{q} \sum_{g=0}^{q-1} \zeta^{(h+1) g} \frac{p^{\prime}\left(\zeta^{g}\right)}{p\left(\zeta^{g}\right)}, \\
q>1, \quad h=0,1, \ldots, q-1, \quad \zeta=\exp \left(\frac{2 \pi \sqrt{-1}}{q}\right)
\end{gathered}
$$

Goal: Obtain $s_{0}=m$ by approximating it within $<1 / 2$ and rounding to the nearest integer while using minimal $q$

## Recap

Exclusion:
If $\bar{s}_{0}=0$ on the superscribing disc, discard square

Inclusion:
If $\bar{s}_{0}>0$ slightly larger disc, continue subdivision

We want this with $q$ large enough but also minimal.

## Choosing $q$

## Theorem (Schönhage 1982)

Let the unit disc $D(0,1)$ be $\theta$-isolated. Then

$$
\begin{equation*}
\left|s_{h, q}-s_{h}\right| \leq \frac{d \theta^{h}}{\theta^{q}-1} \text { for } h=0,1, \ldots, q-1 . \tag{1}
\end{equation*}
$$

$\Rightarrow$ Error decreases exponentially in $q$

## Generalization

Extend to any disc using linear map

$$
x \mapsto \frac{x-c}{\rho} ; D(c, \rho) \mapsto D(0,1) ; p(x) \mapsto t(x)=p\left(\frac{x-c}{\rho}\right)
$$

This mapping does not change the isolation

## Refinement using Randomization

Can't be sure of the isolation of the fixed initial square
$\Rightarrow$ Use randomization to modify the softness of our tests
New plan:
Randomly choose a radius of the initial circle from the range [ $2^{0.2}, 2^{0.4}$ ] and test as before
$q=\left\lfloor 10 m \gamma \log _{2}(4 d+2)\right\rfloor$ sufficient for output error $<1 / 2$ with probability at least $1-1 / \gamma, \gamma \geq 1, ; q=q(m, d)=\tilde{O}(m)$

Error decreases by the same factor as $q$ increases

## Refinement using Randomization

## Strengthen via repetition:

Repeat $\nu$ times to reduce the error probability to $\leq 1 / \gamma^{\nu}$ at the cost of $q \nu=\left\lfloor 10 m \gamma \log _{2}(4 d+2)\right\rfloor \nu$ evaluations.

Pick some constant $\gamma$, e.g., $\gamma=2$
Also choose a constant $\nu$ sufficiently large, or even something $O(\log (d))$; still $q(m, d)=\tilde{O}(m)$

## Why is this going to work?

We only need randomization for the exclusion test.
(Inclusion is deterministic.)


## Overall Complexity

Precision of computing is bounded by $\log (d)$, assuming precise polynomial evaluation (Louis and Vempala, FOCS 2016)
Evaluation with error $\in 1 / d^{O(1)}$ still enables precision $\in O(\log (d))$
Total number of evaluations is $\tilde{O}(q(m, d) m b)$
Boolean complexity bound:

$$
\mathbb{B}_{\mathrm{roots}}=\tilde{O}\left(\mathbb{B}_{d} m q(m, d) b\right)=\tilde{O}\left(\mathbb{B}_{d} m^{2} b\right)
$$

$\mathbb{B}_{\mathrm{d}}:=$ Boolean complexity of degree $d$ polynomial evaluation
Can be decreased to near OPTIMAL $\tilde{O}((b+d) q(m) m)=\tilde{O}\left((b+d) m^{2}\right)$ with additional techniques (See arXiv 1805.12042)

## Correctness

Possible, though unlikely, some roots are lost during the subdivisions. But we check the number of roots as we output to detect this.

We can only get error by deleting suspect square with roots.
Cost of detecting errors using Las Vegas randomization is dominated by the cost of computations.
$\Rightarrow$ Don't need additional complexity increase

## Deterministic E/I Test (Can we do it?)

Only need to worry about exclusion: could be wrong if there are roots near the boundary

Repeat the test $2 m+1$ times using concentric circles and use majority vote
$m$ roots can only impact $m$ of the tests
Requires a factor of $2 m+1$ additional increase in the number of tests

## Summary

We accelerate classical subdivision algorithm to root-finding in near optimal Boolean time even for general $p(x)$ given with coefficients;

Faster if $p(x)$ can be evaluated fast, e.g., is shifted sparse, Mandelbrot's etc.

## Thank you!

## arXiv 1805.12042

