# Distribution of Eigenvalues of Weighted, Structured Matrix Ensembles 

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## Random Matrices and their Limiting Spectral Measure

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Applications:

- Nuclear Physics
- Number Theory


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Semicircle [Wigner, 1955]

Toeplitz


Almost Gaussian
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Palindromic Toeplitz


Gaussian
[MMS, '07]

## Our Ensemble: Signed Toeplitz and Palindromic Toeplitz Matrices

Multiply each entry of a (Palindromic) Toeplitz matrix by
$\epsilon_{i j}=\epsilon_{j i}=\left\{\begin{array}{ll}1 & \text { with prob. p } \\ -1 & \text { with prob. 1-p }\end{array}\right.$ so $a_{i j}=a_{j i}=\epsilon_{i j} \boldsymbol{b}_{|i-j|}$

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What is the eigenvalue distribution of these signed ensembles?

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- By putting a unit point mass $\delta\left(x-x_{0}\right)$ at $x_{0}$ so $\int f(x) \delta\left(x-x_{0}\right) d x=f\left(x_{0}\right)$, we have:

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\mu_{A, N}(x)=\frac{1}{N} \sum_{i=1}^{N} \delta\left(x-\frac{\lambda_{i}(A)}{2 \sqrt{N}}\right)
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\int x^{k} \mu_{A, N}(x) d x=\frac{1}{N} \sum_{i=1}^{N} \frac{\lambda_{i}(A)^{k}}{(2 \sqrt{N})^{k}}=\frac{\operatorname{Trace}\left(A^{k}\right)}{2^{k} N^{\frac{k}{2}+1}}
$$

The average $k^{\text {th }}$ moment, $M_{k}(N)=\mathbb{E}\left[M_{N, k}\left(A_{N}\right)\right]$ is thus:

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\frac{1}{N^{\frac{\kappa}{2}+1}} \sum_{1 \leq i_{1}, \ldots, i_{k} \leq N} \mathbb{E}\left(\epsilon_{i_{1} i_{2}} b_{\left|i_{1}-i_{2}\right|} \epsilon_{i_{2} i_{3}} b_{\left|i_{2}-i_{3}\right|} \ldots \epsilon_{i_{k i} i_{1}} b_{\left|\left.\right|_{k}-i_{1}\right|}\right)
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## Preliminary Result:

The b's must be matched in pairs to contribute in the limit.

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- For the even moments $M_{2 k}$ we can represent each contributing term as a pairing of $2 k$ vertices on a circle as follows:



## Weighted Contributions

## Theorem:

Each configuration contributes its unsigned case contribution weighted by $(2 p-1)^{2 m}$, where $2 m$ is the number of vertices involved in at least one "crossing."

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Example:


Semicircle: Only non-crossing configurations contribute 1 Gaussian: All configurations contribute 1

## Counting Crossing Configurations

Problem: Out of the $(2 k-1)$ !! ways to pair $2 k$ vertices, how many will have $2 m$ vertices crossing $\left(\operatorname{Cross}_{2 k, 2 m}\right)$ ?

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What about for higher $m$ ?

## Counting Crossing Configurations: Non-Crossing Regions

## Theorem:

Suppose $2 m$ vertices are already paired in some configuration. The number of ways to pair and place the remaining $2 k-2 m$ vertices such that none of them are involved in a crossing is $\binom{2 k}{k-m}$.

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Proof: $\sum_{s_{1}+\cdots+s_{2 m}=2 k-2 m} C_{s_{1}} C_{s_{2}} \cdots C_{s_{2} m}=\binom{2 k}{k-m}$.

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We solved for small $m$, then applying our Non-Crossing Regions Theorem gives:

- Cross $_{2 k, 4}=\binom{2 k}{k-2}$
- Cross $_{2 k, 6}=4\binom{2 k}{k-3}$
- $\operatorname{Cross}_{2 k, 8}=31\binom{2 k}{k-4}+\frac{1}{2} \sum_{i=0}^{k-5}\binom{2 k}{i}(2 k-2 i)$
- $\operatorname{Cross}_{2 k, 10}=288\binom{2 k}{k-5}+4 \sum_{i=0}^{k-6}\binom{2 k}{i}(2 k-2 i)$


## Summary of Results

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- Formulas for the number of configurations with $2 m$ vertices crossing for small $m$
- Limiting behavior of the mean and variance of the moments, giving bounds for the moments


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