

# 18.338 Eigenvalues of Random Matrices

## Problem Set 3

Due Date: Mon March 28, 2016

### Reading and Notes

Read chapter 7 of the class notes. Please again give your feedback especially high level style and where things did not make sense, in addition to spelling or technical errors

### Homework

Do the first 3 exercises plus two out of the rest 5.

1. (M) The Christoffel-Darboux formula (also see equation (5.6) on page 78) states

$$\sum_{j=0}^n \pi_j(x)\pi_j(y) = \frac{k_n}{k_{n+1}} \frac{\begin{vmatrix} \pi_n(x) & \pi_n(y) \\ \pi_{n+1}(x) & \pi_{n+1}(y) \end{vmatrix}}{y-x},$$

where  $k_n$  is the lead coefficient of  $\pi_n$ . Let

$$\pi_j(x) = \frac{H_j(x)}{(\sqrt{\pi}j!2^j)^{1/2}}$$

for Hermite Polynomials, then  $k_n/k_{n+1} = \sqrt{n}$ .

Use the known asymptotics

$$\lim_{m \rightarrow \infty} (-1)^m m^{1/4} \pi_{2m}(x) e^{-x^2/2} = \frac{\cos(\xi)}{\sqrt{\pi}}$$
$$\lim_{m \rightarrow \infty} (-1)^m m^{1/4} \pi_{2m+1}(x) e^{-x^2/2} = \frac{\sin(\xi)}{\sqrt{\pi}}$$

where  $x = \xi/(2\sqrt{m})$  to prove

$$K_{2m}(x, y) = e^{-(x^2+y^2)} \sum_{j=0}^{2m-1} \pi_j(x)\pi_j(y) \tag{1}$$

converges to the sine kernel

$$2\sqrt{\pi}m \frac{\sin(x-y)}{x-y}.$$

2. (C) Do a numerical experiment to “see” the convergence in Problem 1. There are numerical issues on the diagonal and corners. Probably on the diagonal, Christoffel-Darboux needs to be replaced by a derivative approximation. See if you can make it better.
3. (C) Obtain the Airy Process limit by taking numerically

$$\frac{1}{\sqrt{2}n^{1/6}} K_n(\sqrt{2n} + \frac{x}{\sqrt{2}n^{1/6}}, \sqrt{2n} + \frac{y}{\sqrt{2}n^{1/6}}) \rightarrow \frac{Ai(x)Ai'(y) - Ai'(x)Ai(y)}{x-y},$$

where  $Ai(x)$  is the Airy function and  $K_n$  is defined in (1).

4. (C) On paper or by computer see if you can implement lanczos on the Hermite weight function, say, to derive the Hermite tridiagonal. By computer consider the process described here

<https://www.mathworks.com/examples/matlab/community/12733-orthogonal-polynomials-via-the-lanczos-process>

but use Julia. We recommend using the ApproxFun Package. (<https://github.com/ApproxFun/ApproxFun.jl>) For example, the following code describes how to do Lanczos using ApproxFun and an example of Hermite.

```
Pkg.checkout("ApproxFun", "development") # need the development branch

function lanczos(w,N)
    x = ApproxFun.identity_fun(space(w))

    f1=Fun(1./sqrt(sum(w)),space(x))

    P = Array{Fun,N + 1}
    β = Array{eltype(w),N}
    γ = Array{eltype(w),N}

    P[1] = f1

    v = x.*P[1]
    β[1] = sum(w.*v.*P[1])

    v = v - β[1]*P[1]
    γ[1] = sqrt(sum(w.*v.^2))

    P[2] = v/γ[1]

    for k = 2:N
        v = x.*P[k] - γ[k-1]*P[k-1]
        β[k] = sum(w.*v.*P[k])
        v = v - β[k]*P[k]
        γ[k] = sqrt(sum(w.*v.^2))
        P[k+1] = v/γ[k]
    end

    P,β,γ
end

w=Fun([1.],GaussWeight()) # exp(-x^2)
n=30
P, β,γ=lanczos(w,n)
norm(γ-sqrt((1:n)/2)) #1.59E-15
```

Also one could try doing it exactly in mathematica. Mathematica's success or failure will depend on the ability to do integrals.

5. (C) It would be of interest to see if one can use similar methods in Julia to evaluate the matrix kernels, say the sine kernel or the airy kernel. Plot these.
6. (M) Exercise 7.1 (p122)
7. (M) Exercise 7.2 (p122)
8. (M) Exercise 7.7 (p123)