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Polynomials and
Random Matrices:
A Riemann-Hilbert
Approach

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To Rebecca and Abby
for your patience and support

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Contents

Preface	ix
Chapter 1. Riemann-Hilbert Problems	1
1.1. What Is a Riemann-Hilbert Problem?	1
1.2. Examples	4
Chapter 2. Jacobi Operators	13
2.1. Jacobi Matrices	13
2.2. The Spectrum of Jacobi Matrices	23
2.3. The Toda Flow	25
2.4. Unbounded Jacobi Operators	26
2.5. Appendix: Support of a Measure	35
Chapter 3. Orthogonal Polynomials	37
3.1. Construction of Orthogonal Polynomials	37
3.2. A Riemann-Hilbert Problem	43
3.3. Some Symmetry Considerations	49
3.4. Zeros of Orthogonal Polynomials	52
Chapter 4. Continued Fractions	57
4.1. Continued Fraction Expansion of a Number	57
4.2. Measure Theory and Ergodic Theory	64
4.3. Application to Jacobi Operators	76
4.4. Remarks on the Continued Fraction Expansion of a Number	85
Chapter 5. Random Matrix Theory	89
5.1. Introduction	89
5.2. Unitary Ensembles	91
5.3. Spectral Variables for Hermitian Matrices	94
5.4. Distribution of Eigenvalues	101
5.5. Distribution of Spacings of Eigenvalues	113
5.6. Further Remarks on the Nearest-Neighbor Spacing Distribution and Universality	120
Chapter 6. Equilibrium Measures	129
6.1. Scaling	129
6.2. Existence of the Equilibrium Measure μ^V	134
6.3. Convergence of λ_{x^*}	145

6.4.	Convergence of $\frac{1}{n} \mathcal{R}_1(x_1) dx_1$	149
6.5.	Convergence of η_{x^*}	159
6.6.	Variational Problem for the Equilibrium Measure	167
6.7.	Equilibrium Measure for $V(x) = tx^{2m}$	169
6.8.	Appendix: The Transfinite Diameter and Fekete Sets	179
Chapter 7. Asymptotics for Orthogonal Polynomials		181
7.1.	Riemann-Hilbert Problem: The Precise Sense	181
7.2.	Riemann-Hilbert Problem for Orthogonal Polynomials	189
7.3.	Deformation of a Riemann-Hilbert Problem	191
7.4.	Asymptotics of Orthogonal Polynomials	201
7.5.	Some Analytic Considerations of Riemann-Hilbert Problems	208
7.6.	Construction of the Parametrix	213
7.7.	Asymptotics of Orthogonal Polynomials on the Real Axis	230
Chapter 8. Universality		237
8.1.	Universality	237
8.2.	Asymptotics of P_s	251
Bibliography		259

Preface

In the academic year 1996–1997, I gave a course at the Courant Institute on Riemann-Hilbert problems, orthogonal polynomials, and random matrix theory. The lectures for the course were taken down and organized into note form by Randall Pyke, John Podesta, José Ramírez, and Wen-qing Xu. Over the last year, Jinho Baik, Thomas Kriecherbauer, and Ken McLaughlin have helped me further to bring these notes into their present form. Without their help, these notes would never have been published, and I am truly thankful to all these people for their efforts.

I gave the course in 1996–1997 in an attempt to understand from a more rigorous mathematical point of view various results and formulae in Mehta’s wonderful book *Random Matrices* [43]. At the same time, I was stimulated and challenged by a set of questions from Peter Sarnak, who himself was trying to understand [43]. These notes are in many ways a response to his questions, and I deeply appreciate his clear insights and ready help.

The central question is the following: Why do very general ensembles of random $n \times n$ matrices exhibit universal behavior as $n \rightarrow \infty$?

My work and that of my collaborators Thomas Kriecherbauer, Ken McLaughlin, Stephanos Venakides, and Xin Zhou on this question is reported in [15, 16, 17]. Apart from certain additional preparatory material, these notes are a pedagogic illustration of the general methods and results in [15, 16, 17], in a special case (see Sections 7 and 8) in which the technical difficulties are at a minimum. I thank my colleagues for allowing me to reproduce these results here. Pioneering mathematical work on universality for random matrix ensembles was done by Pastur and Scherbina in [51], and Its and Bleher in [5].

In addition to the students and colleagues mentioned above, I would like to thank Daisy Calderon for her skill and patience in typing the final manuscript. Special thanks are also due to Melissa Macasieb for her expert copy-editing of the text, and to Melissa and Reeva Goldsmith for their care in correcting the \TeX file. The final figures were drawn by Daisy Calderon. The entire project of preparing the manuscript for publication was overseen by Paul Monsour, and many, many thanks are due to him for his great expertise and all his help.

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Orthogonal Polynomials and Random Matrices: A Riemann-Hilbert Approach

PERCY DEIFT

This volume expands on a set of lectures held at the Courant Institute on Riemann-Hilbert problems, orthogonal polynomials, and random matrix theory. The goal of the course was to prove universality for a variety of statistical quantities arising in the theory of random matrix models. The central question was the following: Why do very general ensembles of random $n \times n$ matrices exhibit universal behavior as $n \rightarrow \infty$? The main ingredient in the proof is the steepest descent method for oscillatory Riemann-Hilbert problems.



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