

Nonparametric Density Estimation

Sections 17.1-17.8 of Hansen (2022)

Yasuyuki Matsumura (Kyoto University)

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<https://yasu0704xx.github.io>

Yasuyuki Matsumura

Graduate School of Economics, Kyoto University

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About Me



I am a second-year master's student in [Graduate School of Economics, Kyoto University](#).

Under the guidance of [Yoshihiko Nishiyama](#) and [Takahide Yanagi](#), my research focuses on Econometric Theory and Statistics.

Contact: matsumura.yasuyuki.w85 [at] kyoto-u.jp

Address: Yoshida Honmachi, Sakyo, Kyoto 606-8501, Japan

Other Links: [Linktree](#)

Introduction

- As a general rule, density functions can take any shape. They are inherently **nonparametric** and cannot be described by a finite set of parameters.
- That is, functional and/or distributional specifications relied on when estimating density functions may be incorrect.
- If we assume that such specifications are “true,” we might obtain incorrect empirical conclusions.
- Thus, it would be desirable if we develop estimation procedures without requiring functional and/or distributional specifications.
- **Nonparametric kernel methods** achieve such a goal.

- Here we review Sections 17.1-17.8 of Hansen (2022) [1].
- We proceed with a discussion of how to estimate the probability density function (PDF) of a real-valued random variable X for which we have n IID observations X_1, \dots, X_n .
- We assume that X has a continuous density $f(x)$.
- The goal is to estimate $f(x)$ either at a single point x or a set of points in the interior of the support of X .

References

- Excellent textbooks on nonparametric density estimation include Silverman (1986) [5] and Scott (1992) [4].
- The following textbooks are often referred:
 - Silverman (1986) [5],
 - Scott (1992) [4],
 - van der Vaart (1998, Chapter 24) [6],
 - Pagan and Ullah (1999, Chapter 2) [3], and
 - Li and Racine (2007, Chapter 1) [2].
- 日本語の文献：
 - 西山・人見 (2023, 第 1 章) [3]
 - 末石 (2015, 第 9 章) [2]
 - 清水 (2023, 第 5 章) [1]

Histogram

Kernel Density Estimator

Bias

Variance

Variance Estimation and Standard Errors

Integrated Mean Squared Error (IMSE)

Optimal Kernel

Refernces

Histogram

Kernel Density Estimator

Bias






Variance

Variance Estimation and Standard Errors

Integrated Mean Squared Error (IMSE)




Optimal Kernel

Refernces

-  Hansen, B. E. (2022). *Probability and Statistics for Economists*. Princeton.
-  Li, Q. and J. S. Racine (2007). *Nonparametric Econometrics: Theory and Practice*. Princeton.
-  Pagan, A. and A. Ullah (1999). *Nonparametric Econometrics*. Cambridge.
-  Scott, D. W. (1992). *Multivariate Density Estimation: Theory, Practice, and Visualization*. Wiley.
-  Silverman, B. W. (1986). *Density Estimation for Statistics and Data Analysis*. Chapman and Hall.



van der Vaart, A. W. (1998). *Asymptotic Statistics*.
Cambridge.

-  清水泰隆 (2023) 『統計学への漸近論, その先は』 内田老鶴圃.
-  末石直也 (2015) 『計量経済学: ミクロデータ分析へのいざない』 日本評論社.
-  西山慶彦, 人見光太郎 (2023) 『ノン・セミパラメトリック統計解析』 共立出版.