

IOT-BASED ENERGY MANAGEMENT SYSTEM FOR COMMERCIAL BUILDINGS

वाणिज्यिक भवनों के लिए आईओटी-आधारित ऊर्जा प्रबंधन प्रणाली

**A
Thesis**

**Submitted for the Award of the Ph.D. degree of
PACIFIC ACADEMY OF HIGHER
EDUCATION AND RESEARCH UNIVERSITY**

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2024

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DATE: -

PATANKAR SUSHRUT MADHAV



DEDICATED TO
MY FAMILY, FRIENDS
AND WELL-WISHERS

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