

# Performance-Oriented Parametric Design Method for Early-Stage Residential Design in Northern China

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**Abstract:** This paper proposes a performance-oriented parametric design method for early-stage residential design in Northern China, addressing the critical need for residence energy efficiency in cold climates. By integrating energy simulation goals with parametric design techniques, this study develops a framework that leverages digital tools and artificial intelligence to optimize residential schemes. The methodology emphasizes data-driven design processes, enabling architects to explore multiple design possibilities while ensuring alignment with energy-saving targets. The paper outlines the theoretical foundations, workflow, and validation of the proposed methodology through case studies, demonstrating its potential to enhance energy performance in residential architecture.

**Keywords:** Parametric design, Residential building design, Energy-efficient residence.

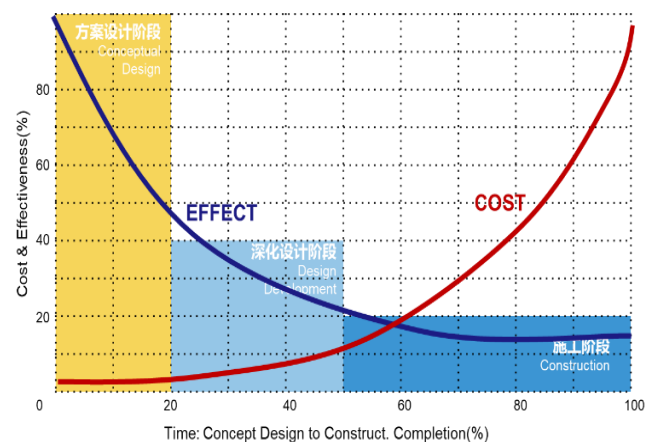
## 1. Introduction

The building industry is undergoing a technological revolution driven by digital technology and artificial intelligence (AI). Energy-efficient buildings have become a priority in response to resource scarcity and environmental challenges. Northern China, with its severe cold climate, faces significant energy demands for residential heating in winter, making energy efficiency a critical concern in residential design. This study focuses on the early design stages of residential buildings, where design decisions have the most significant impact on building performance. Conventional design processes often rely on subjective experience of architects, lacking quantitative evaluation mechanisms, which can lead to discrepancies between design goals and actual performance outcomes. This paper proposes a performance-oriented parametric design method that integrates building performance with digital design tools to enhance energy efficiency in residential design.

### 1.1 Research Background

The rapid development of digital technology has transformed various sectors, including architecture. The concept of intelligent buildings has emerged as a significant research direction. In Northern China, residential heating energy consumption accounts for a substantial portion of total building energy use. According to statistics, building energy consumption in China has increased fivefold since 1995, with heating in northern regions contributing approximately 74% of the total energy demand [1]. This highlights the urgency of improving energy efficiency in residential design. As shown in Figure 1, multiple studies at home and abroad have shown that in the early stage of architectural design, design decisions have the greatest impact on building energy efficiency and physical performance. As the design process progresses, the actual effect of energy-saving measures gradually decreases, while the cost increase brought by green design measures continues to increase with the design process. According to existing research, over 40% of the energy-saving potential comes from the initial stage of the plan. Current green building standards, such as the "Code for Energy Efficiency

Design of Residential Buildings in Cold and Severe Cold Regions" (JGJ26-2010), have set progressively higher energy-saving targets [2]. However, achieving these targets through conventional design methods has proven challenging, necessitating the adoption of performance-oriented parametric design methodologies.



**Figure 1:** Energy saving effect and cost increase in each stage of architectural design

### 1.2 Research Objectives and Significance

The primary objective of this research is to develop a performance-oriented parametric design methodology for residential buildings in Northern China. This methodology aims to bridge the gap between design intentions and actual performance outcomes by leveraging digital tools and artificial intelligence. The significance of this study lies in its potential to:

- 1) Provide a systematic framework for integrating green building performance goals into the early design stages.
- 2) Enhance design efficiency and accuracy through automated parametric design processes.
- 3) Reduce energy consumption in residential buildings, contributing to sustainable development.

### 1.3 Research Methodology

This study employs a mixed-methods approach, combining theoretical analysis, case studies, and algorithm development. The methodology involves: (1) Literature Review: Analyzing existing research on parametric design, performance-oriented design, and green building technologies. (2) Case Studies: Examining successful examples of performance-oriented design in residential projects to identify best practices. (3) Algorithm Development: Creating parametric design algorithms using Grasshopper and Python to automate the generation and optimization of residential floor plans. (4) Validation: Applying the developed methodology to a real-world residential project in Beijing to assess its effectiveness.

## 2. Literature Review

### 2.1 Parametric Design in Architecture

Parametric design has evolved significantly since its inception in the mid-20th century. Luigi Moretti first introduced the concept in the 1940s, emphasizing the relationship between design parameters and architectural form [3]. The development of computer-aided design (CAD) tools, such as Sketchpad in the 1960s, marked a significant milestone in parametric design [4]. Modern parametric design tools, like Grasshopper and Dynamo, have further democratized access to these technologies, enabling architects to explore complex design problems systematically.

Parametric design is not merely a tool for generating forms but a methodology that quantifies design elements and their relationships. It allows designers to manipulate parameters to achieve optimal solutions, making it particularly suitable for performance-driven design. In recent years, parametric design has been widely applied in various architectural domains, from urban planning to complex building geometries [5].

### 2.2 Performance-Oriented Design Methods



**Figure 2:** Indicator-Based Method: Green Design Standards and Guidelines

Performance-oriented design focuses on achieving specific performance goals, such as energy efficiency, through iterative design and simulation processes. Several methods have been proposed in the literature, each with distinct advantages and limitations:

1) **Indicator-Based Methods:** These methods follow established design standards and guidelines to ensure performance compliance. While easy to implement, they lack specificity [6].

2) **Simulation-Driven Design:** This approach uses performance simulation tools to guide design decisions. Although highly accurate, it is time-consuming and requires repeated adjustments [7].

3) **Benchmarking:** This method compares building performance against established databases. It is effective for evaluating performance but requires substantial data support.

4) **Sensitivity Analysis:** This method identifies key design parameters affecting performance, allowing targeted optimizations. It provides specific actionable insights but cannot account for interactions between multiple parameters.

5) **Parametric Optimization:** This method uses optimization algorithms to search for the best design solutions based on performance criteria. It offers the most significant potential for performance improvement but is limited to parameterized models.

### 2.3 Integration of Parametric Design and Performance Optimization

The integration of parametric design with performance optimization has shown promise in enhancing building performance. Genetic algorithms (GAs) and other optimization techniques have been successfully applied to architectural design problems, such as optimizing building form for energy efficiency [8-9]. These methods enable designers to explore a vast design space efficiently, identifying optimal solutions that balance multiple performance criteria.

### 2.4 Case Studies in Performance-Oriented Design

Several case studies demonstrate the effectiveness of performance-oriented design in residential architecture. For example, the optimization of building form to minimize wind pressure and reduce energy load has been successfully implemented using parametric design and GAs [10]. Similarly, studies on optimizing window-to-wall ratios and envelope performance have shown significant energy savings potential [11]. These examples highlight the potential of parametric design and optimization algorithms in achieving energy-efficient residential designs.

### 2.5 Research Gaps and Contributions

While existing research has made significant strides in parametric design and performance optimization, several gaps remain. Most studies focus on isolated design parameters or specific performance aspects, lacking a comprehensive

framework for integrating multiple performance goals. Additionally, few studies address the specific challenges of residential design in cold climates. This research contributes to the field by proposing a performance-oriented parametric design methodology tailored to Northern China's climatic conditions, supported by a robust algorithmic framework and validated through real-world applications.

### 3. Performance-Oriented Parametric Design Method

#### 3.1 Theoretical Framework

The performance-oriented parametric design methodology proposed in this study is grounded in the integration of parametric design principles with performance simulation and optimization techniques. This methodology represents a shift from conventional design approaches, which often rely on subjective experience and lack quantitative evaluation mechanisms, to a data-driven, performance-oriented workflow. The theoretical framework is built upon three core components: parametric design, performance simulation, and optimization algorithms.

Parametric design is a process where design elements and their relationships are quantified, allowing for systematic exploration and manipulation of design variables. Performance simulation provides the means to evaluate the energy efficiency and other performance metrics of design schemes, while optimization algorithms automate the search for optimal solutions within a defined design space. Together, these components form a robust framework for enhancing the energy performance of residential designs in Northern China's cold climate.

#### 3.2 Workflow Development

The workflow for the performance-oriented parametric design methodology is structured into three interconnected phases: parameterization, simulation, and optimization. Each phase is detailed below.

##### 3.2.1 Parameterization

Parameterization involves defining the design parameters and establishing relationships between these parameters and performance outcomes. Design parameters are categorized into three types:

- 1) **Conditional Parameters:** These are boundary conditions defined by design requirements, such as climate data, user functional demands, and building codes.
- 2) **Variable Parameters:** These are parameters that can be adjusted within a defined range to explore design possibilities, such as room dimensions, window-to-wall ratios, and envelope performance.
- 3) **Dependent Parameters:** These parameters are derived from conditional and variable parameters and are determined through logical relationships within the design model.

##### 3.2.2 Simulation

Performance simulation is integrated into the design process to evaluate the energy efficiency of generated schemes. Simulation tools such as EnergyPlus and Ladybug/Honeybee are employed to model heating and cooling loads, providing quantitative feedback on design performance. The simulation process involves:

- 1) **Model Setup:** Creating a digital model of the building design, including geometric details, material properties, and environmental conditions.
- 2) **Simulation Execution:** Running simulations to calculate energy performance metrics, such as total energy load, heating load, and cooling load.
- 3) **Result Analysis:** Interpreting simulation results to assess the energy efficiency of the design and identify areas for improvement.

##### 3.2.3 Optimization

Optimization is the final phase where the methodology iteratively refines design parameters to achieve performance objectives. Genetic algorithms (GAs) are employed due to their effectiveness in exploring complex design spaces and identifying optimal solutions. The optimization process includes:

- 1) **Parameter Selection:** Identifying key design parameters that significantly impact energy performance.
- 2) **Algorithm Setup:** Configuring the GA parameters, such as population size, mutation rate, and crossover rate.
- 3) **Iterative Search:** Running the optimization algorithm to explore the design space and converge towards optimal solutions.
- 4) **Result Validation:** Verifying the optimized design against performance targets and design constraints.

#### 3.3 Algorithm Development

The algorithm developed for this methodology leverages Grasshopper and Python to automate the generation and optimization of residential floor plans. The algorithm's workflow is detailed as follows:

##### 3.3.1 Feature Extraction

Design features are extracted from a database of residential prototypes to establish a parametric model. This involves analyzing common residential layouts and identifying key design elements and their relationships.

##### 3.3.2 Rule-Based Generation

Predefined design rules are applied to generate feasible floor plans. These rules ensure that generated schemes comply with functional requirements and building codes, such as room adjacency, circulation paths, and structural constraints.

##### 3.3.3 Performance Evaluation

As shown in Figure 3, each generated scheme is evaluated for energy performance using simulation tools. The simulation results provide quantitative data on energy consumption, which is used to guide the optimization process.

3.3.4 Iterative Optimization

GAs are employed to iteratively refine design parameters. The algorithm uses performance data from simulations to evaluate the fitness of each design iteration and directs the search towards optimal solutions.

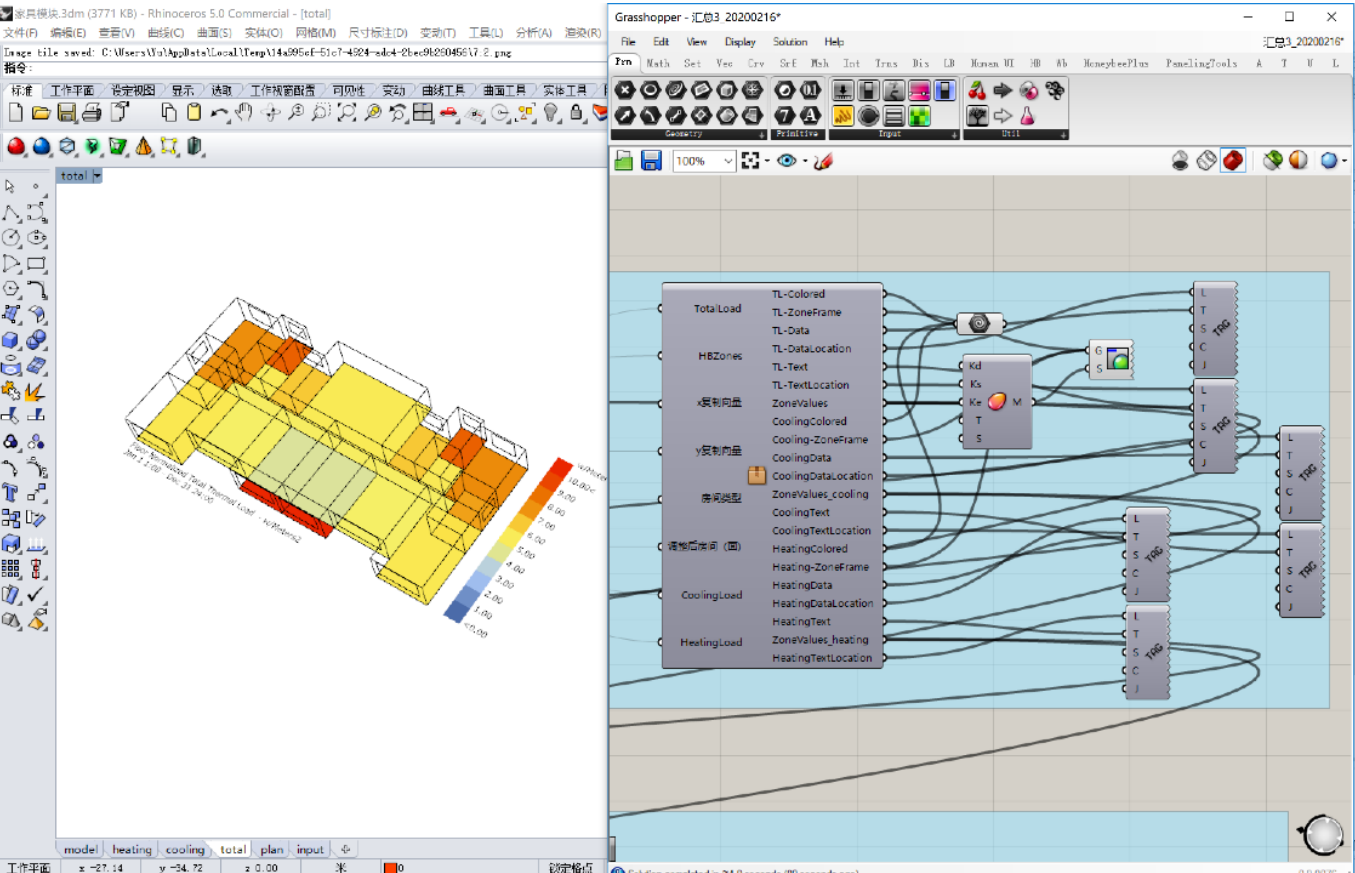


Figure 3: Performance evaluation process in Grasshopper

4. Case Study Application

The methodology was applied to a residential project in Beijing, focusing on optimizing the energy performance of residential floor plans. The project involved the design of a 25-story residential building with a one-ladder-two-household layout, aiming to reduce energy consumption while maintaining functional and aesthetic requirements.

4.2.1 Parameter Setting

Design parameters were defined based on project requirements, including room dimensions, window-to-wall ratios, and envelope performance. These parameters were categorized into conditional, variable, and dependent parameters to structure the design process.

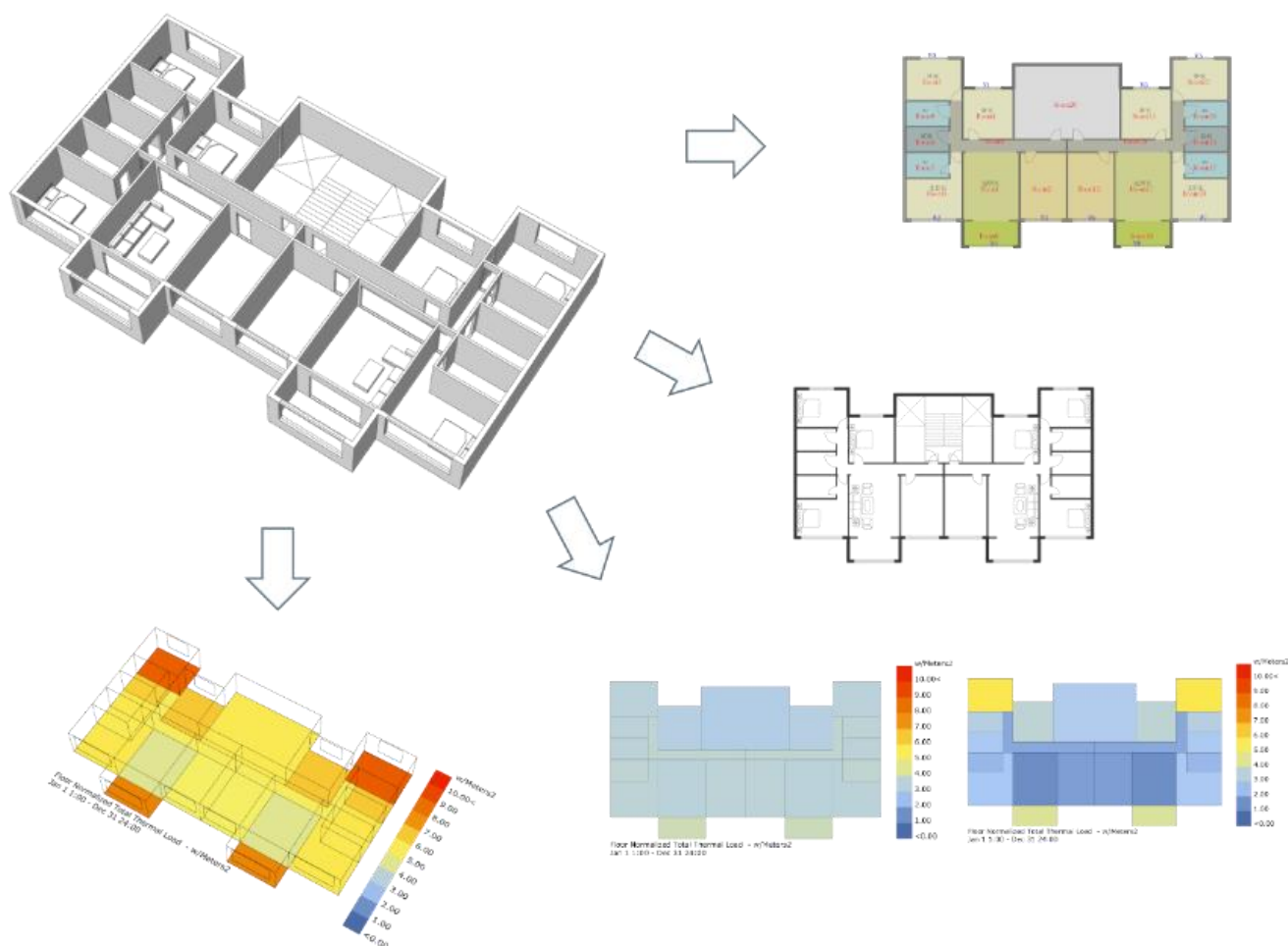
4.2.2 Algorithm Execution

The parametric design algorithm was executed to generate multiple design schemes. Each scheme was evaluated for energy performance using simulation tools, providing quantitative feedback on design outcomes.

4.2.3 Optimization Process

GAs were employed to optimize design parameters, identifying schemes with the lowest energy consumption. The optimization process involved iterative adjustments to design parameters, guided by performance data from simulations. Figure 4 shows the visualization information of schemes.





**Figure 4:** Visualization Information of Schemes

### 4.3 Discussion

The application of the methodology resulted in significant energy savings. The optimized scheme demonstrated an 18.1% reduction in total energy load compared to the original design, highlighting the effectiveness of the proposed methodology. Sensitivity analysis revealed that parameters such as room dimensions and window-to-wall ratios had a substantial impact on energy performance, providing actionable insights for future designs.

#### 4.3.1 Energy Performance Analysis

Detailed analysis of the optimized scheme's energy performance showed reductions in both heating and cooling loads. The optimization process effectively balanced these loads, resulting in a more energy-efficient design.

#### 4.3.2 Sensitivity Analysis

Sensitivity analysis identified key design parameters that significantly influenced energy performance. Parameters such as room depth, window-to-wall ratio, and envelope insulation were found to have the most substantial impact on energy consumption.

#### 4.3.3 Design Implications

The results provided actionable insights for architects,

emphasizing the importance of optimizing room dimensions and window-to-wall ratios to enhance energy efficiency. The methodology demonstrated how performance data can guide design decisions, leading to more sustainable outcomes.

## 5. Results

The study demonstrates that performance-oriented parametric design methodologies can significantly enhance energy efficiency in residential design. By automating the design and optimization processes, the methodology reduces manual effort and enhances design accuracy, aligning design outcomes with performance goals.

The developed methodology and algorithm provide architects with a robust tool for exploring design possibilities while ensuring energy efficiency. The integration of digital tools and artificial intelligence transforms conventional design practices, enabling data-driven decision-making. This approach is particularly valuable in cold climates where energy consumption is a critical concern.

Future research could extend the methodology to multi-objective optimization, incorporating additional performance criteria such as daylighting and indoor air quality. Expanding the algorithm to support more complex residential typologies and urban planning scenarios would enhance its applicability. The potential for integrating machine learning techniques to predict and optimize design performance also

presents an exciting avenue for further exploration.

This paper presents a comprehensive performance-oriented parametric design methodology for early-stage residential design in Northern China. Through theoretical development, algorithm implementation, and case study validation, the methodology demonstrates its effectiveness in enhancing energy efficiency in residential architecture. By leveraging digital tools and artificial intelligence, the approach offers a transformative solution for sustainable design in cold climates. Future research will continue to expand the methodology's capabilities, addressing broader performance criteria and more complex design scenarios.

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