

Perkins&Will

Machine Visions

Exploring the Potential of Text-to-Image and Image-to-Image AI Generation as a Tool in the Early Stages of Architectural Design

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**Innovation Incubator
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Abstract

This research delves into the impact of Artificial Intelligence (AI), particularly AI-generated images, on architectural design processes. Initially exploring the dynamic and iterative nature of architectural design, the study emphasizes the pivotal role of traditional and digital tools. Focusing on the application of AI, the research contends that when effectively employed, AI enhances creativity by swiftly providing diverse design possibilities. While AI supplements the creative process, the architect's intuition remains paramount, ensuring the originality of the final design. The research unfolds through bibliographical analysis, surveys, and in-office workshops at Perkins&Will Sao Paulo Studio, offering a comprehensive understanding of AI's potential in architectural design. The study proposes the integration of AI as a complementary design tool in architectural practices.

Keywords: Artificial Intelligence, Architectural Design, Design Process, Text-to-Image, Midjourney.

Resumo

Esta pesquisa investiga o impacto da Inteligência Artificial (IA), especialmente a geração de imagens, nos processos de design arquitetônico. Ao explorar inicialmente a natureza dinâmica e iterativa do design arquitetônico, o estudo destaca o papel crucial de ferramentas tradicionais e digitais. Concentrando-se na aplicação da IA, a pesquisa argumenta que, quando empregada de maneira eficaz, a IA aprimora a criatividade ao fornecer rapidamente diversas possibilidades de design. Enquanto a IA complementa o processo criativo, a intuição do arquiteto permanece primordial, garantindo a originalidade do design final. A pesquisa se desdobra por meio da análise bibliográfica, e com pesquisas e workshops no estúdio da Perkins&Will em São Paulo, proporcionando uma compreensão abrangente do potencial da IA no design arquitetônico. O estudo propõe a integração da IA como uma ferramenta de design complementar nas práticas arquitetônicas.

Keywords: Inteligência Artificial, Design Arquitetônico, Processo de Projeto, Texto-para-Imagem, Midjourney.

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Introduction

Relevance, Goals & Methods

Introduction

Architectural design is a highly dynamic and iterative process that involves self-correction through research and development to meet needs and resolve conflicts or issues that may arise during the design of a building. Initially, information is collected in a simple and embryonic way, and it is up to the architect to select, categorize and analyze data according to what was planned and parallel to what is relevant to the accomplishment of the proposed design concept. The production of many artifacts, such as sketches, rendering images, 3D models, is vastly necessary for the design and development of a design, making the process highly dynamic and demanding clear and well-founded decisions (Oxman & Oxman, 1992).

Digital tools, such as Parametric Modelling, Digital Fabrication and Artificial Intelligence (AI) are valuable resources that expand the architect's range of possibilities during the design process. With these tools, it is possible to explore new shapes, perform simulations and swiftly evaluate innovative design solutions.

AI systems can analyze and learn from data, identify patterns, and make predictions or recommendations based on that analysis. In recent years, AI has become an increasingly powerful tool in the creative industry, including the fields of architecture and design. Despite concerns about whether AI will stifle human creativity and lead to a homogenization of design, this research suggests that when used effectively, this digital tool can enhance the creative process by providing architects with a range of possibilities and alternatives that can be quickly evaluated and tested. By leveraging

the power of computational intelligence alongside with human intuition and creativity, architects can explore innovative design possibilities and rapidly evaluate singular design solutions, while also ensuring that their creative output remains original, distinctive, and authentic.

Nevertheless, the architect's creativity remains paramount in this context, as they must be able to exploit the full potential of AI tools to create innovative and efficient solutions that meet the needs of the client and the design. While AI can help architects generate a variety of potential designs based on certain inputs and constraints, the final design should still reflect the architect's artistic vision, intuition, and originality.

In recent years, the application of AI as a generative design tool has gained significant interest in the field of architecture, particularly due to its potential to transform the creative process. The integration of computational algorithms, image-to-image and text-to-image prompts in AI can provide architects with new and innovative approaches to explore design possibilities and rapidly evaluate distinctive design solutions, while also ensuring that their creative output is original, distinctive, and authentic. Implementing AI in the design process can lead to more efficient and effective architectural design production, while enhancing the creativity and intuition of architects.

The current investigation's purpose is to analyze the viability of AI as a generative design tool in architecture. This method involves the utilization of text-to-image and image-to-image prompts to generate

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a diverse range of prospective designs, based on specified inputs and constraints. The integration of AI as a generative design tool can potentially revolutionize the design process by providing a new dimension of exploration for innovative design possibilities and rapidly evaluating distinctive design solutions. The addition of AI can significantly augment the design process, enabling more efficient and effective production of architectural designs, and potentially providing solutions to the challenges posed by traditional design methods. Therefore, it is imperative to further study the potential of AI in architecture and design, as it can enhance the creative output of architects while increasing efficiency and accuracy.

The proposed research was conducted using the Midjourney and Veras Software, which are widely used in the field of artificial intelligence and machine learning. These tools offer a range of functionalities that can be leveraged to generate high-quality AI-generated images from both image-to-image and text-to-image prompts, which can be used as a generative design tool in architecture. The use of these Software enabled this research to investigate the feasibility and effectiveness of using AI-generated images in architecture, as well as to identify the key factors that impact the effectiveness of this approach. Additionally, the use of these APIs allowed for a comprehensive understanding of the benefits, limitations, and challenges of using AI-generated images in architecture and

enable the development of best practices and guidelines for architects and designers to effectively integrate these tools into their workflows.

As a leading architecture firm committed to innovation, sustainability, and social responsibility, Perkins&Will is well-positioned to explore the possibilities of AI in architecture and design. The firm's commitment underscores its dedication to pushing boundaries and exploring innovative design possibilities. By integrating AI images as a generative design tool, Perkins&Will can unlock new creative potential, enabling architects to experiment with novel ideas and approaches. AI can help architects expand their creative horizons by generating designs that may not have been conceived through traditional design methods. Furthermore, Perkins&Will's expertise in sustainable design and building practices propels the potential of AI to create more energy-efficient and environmentally conscious designs. The firm's focus on social responsibility and community engagement also offers an opportunity to harness AI's creative potential to develop designs that are responsive to the unique needs and desires of different communities. By fostering a culture of creativity and innovation, Perkins&Will can continue to be at the forefront of the architecture and design field, shaping the future of the built environment through its exploration of the possibilities of AI.

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Goals

Within the field of architectural design, architects have at their disposal a wide array of design tools and methods. These tools are not replacements for architects but rather aids, assisting architects in the creative process and helping them find design solutions. They encompass a broad spectrum, including initial sketches, layout studies, detailed planning, physical models, and various forms of digital technologies, such as, parametric modeling, digital rendering, Building Information Modeling (BIM) and various types of simulation software.

Architects also draw inspiration from architectural literature, material catalogs, specialized publications, and during the engagement with other architects in design review sessions.

The goal of this research is to incorporate AI-generated images as another valuable design tool within architects at the Sao Paulo Perkins&Will Studio. AI-generated images have the potential to serve as a creative resource alongside these traditional tools, contributing to the architectural design process. The research aims to assess the potential, efficiency, and challenges associated with the use of AI-generated images to inspire, support conceptualization and communication, and facilitate the discovery of innovative design ideas. In essence, AI-generated images are introduced

as a complementary design tool, enhancing the architect's ability to envision and communicate architectural ideas effectively.

In addition to the main goal, this research targets to explore the relationship between AI-generated images and human creativity. One interesting aspect of images created with AI tools is the often ambiguity they present. Much like initial sketches, AI-generated images frequently possess a certain level of ambivalence, leaving room for interpretation and creative exploration. For the authors of this research, this characteristic has the potential to enhance human creativity substantially.

By incorporating AI-generated images into the architectural design process, architects are exposed to visuals that, while influenced by data and algorithms, retain an element of interpretive openness. This quality allows architects to view these images as creative stimuli, much in the same way that sketches, or abstract forms can inspire novel design directions. The ambiguity in AI-generated images invites architects to engage in a dialogue with the visual information presented, prompting them to extract meaningful insights and envision innovative design solutions.

Methodological Procedures

Bibliographical Analysis: The research commenced with a comprehensive bibliographical analysis, focusing on the concepts, theories, and applications of Artificial Intelligence (AI) within the context of architecture and design. This analysis involved an in-depth exploration of scholarly literature, academic journals, industry publications, and relevant case studies. The goal was to gain a thorough understanding of the theoretical foundations and practical implications of AI in architectural practice, enabling the research team to develop a solid conceptual framework for the subsequent stages of the study.

Survey Distribution: Following the bibliographical analysis, a survey was designed to assess the awareness and knowledge of AI among the architects at Perkins&Will Sao Paulo Studio. The survey was specifically tailored to address the research objectives and consisted of a series of questions aimed at gauging the level of familiarity, interest, and engagement with AI tools in the architectural design process. The survey was administered electronically, and all architects within the studio were invited to participate. By collecting responses from the architects, the research aimed to gather valuable insights into their perspectives and experiences related to AI in architecture.

In-Office Workshop: An in-office workshop was conducted with the architects of Perkins&Will Sao Paulo Studio. The workshop provided an interactive and collaborative setting where the architects could engage directly with AI tools and apply them to design projects of varying scales. Specifically, the workshop focused on three distinct project types commonly undertaken by the studio's CCC team: a single-family house, a condominium of houses, and a mixed-use building. These project types were selected to reflect the prevalent architectural practices within the studio and provide a meaningful context for exploring the potential of AI tools.

During the workshop, the architects were given hands-on access to a set of AI tools specifically chosen to align with their project types and objectives. The participants worked in teams, fostering interdisciplinary collaboration and knowledge exchange. They were encouraged to utilize the AI tools to enhance their design processes, generate alternative solutions, and explore innovative design possibilities. The workshop facilitators provided technical guidance, support, and resources to assist the architects in effectively utilizing the AI tools and maximizing their potential in the design projects.

The workshop sessions were designed to encourage critical thinking, creative problem-solving, and reflection on the integration of AI into architectural practice. The architects documented their experiences, challenges encountered, and insights gained throughout

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the workshop. The aim was to not only provide practical experience with AI tools but also to foster a deeper understanding of the benefits, drawbacks, and challenges associated with their implementation in architectural design.

By employing a combination of bibliographical analysis, survey distribution, and in-office workshop, this research aimed to comprehensively explore the awareness, engagement, and perspectives of the architects at Perkins&Will Sao Paulo Studio regarding the integration of AI tools in architectural design. The methodological procedures employed ensured a rigorous and systematic approach, generating valuable insights into the potential of AI in transforming architectural practice and informing future initiatives within the studio.



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Figure 01-02: Breno Veiga and Fernando Longhi (Authors) structuring the research.

Chapter I

Theoretical notes about Artificial Intelligence

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Theoretical notes about Artificial Intelligence

“So, the major question in architecture is to understand what one wants to do. This understanding is not individual but rather a societal knowledge. What do we desire? Then, the idea of the architectural model comes to mind. You have the idea about a certain issue, imagine it in its entirety, understand that it needs to be built, so you cast this idea to the model as an extension of your own mind.

For example, the computer. You have to use it, but later on, in another stage. It calculates issues precisely, such as the wind force on the structure, for example. Without the computer, we did everything with a brutal safety coefficient. But it wasn't the computer that said you have to calculate the wind force, right? It calculates what you tell it to calculate. And that's why this little model I'm going to make is so intriguing and indispensable.” (Rocha, 2007, p.30)

PAULO MENDES DA ROCHA (1928-2021)
BRAZILIAN ARCHITECT, 2006 PRITZKER LAUREATE



Figure 03: AI prompt for “a thumbnail for a research that analyses the implementation of AI image generation tools in architectural design”

Computer technologies as an innovation driver for architectural design

In recent decades, the relationship between architecture and computer technologies, as noted by Aish & Bredella (2017), has given rise to fresh design principles and methodologies that challenge established design and construction processes. Particularly, the increased adoption of parametric techniques and scripting has facilitated the development of modeling and fabrication methods.

While we can palpably experience the profound impact of these advanced tools in today's architectural landscape, it's essential to recognize that the development of these transformative technologies happened several decades ago. The roots of these innovations stretch back in time, with pioneers in the field laying the foundation for what we now consider integral to contemporary architectural practice. The enduring influence of these early visionaries has paved the way for the dynamic synergy between architecture and technology that we witness today, underscoring the enduring nature of innovation in the architectural domain.

Reflecting on the inception of Computer Aided Design (CAD) systems, like Sketchpad introduced in 1963 by Ivan Sutherland at MIT (Massachusetts Institute of Technology), it's remarkable to consider that these technologies have

been an integral part of architectural production for approximately six decades. From those pioneering CAD platforms to the contemporary realm of Building Information Modeling (BIM) software, architecture has traversed a remarkable path on its journey towards digital transformation. (Sutherland, 2003).

As observed by Veiga (2016), several contemporary Computer-Aided Design (CAD) tools employed in architecture were originally adapted from other knowledge domains. These technologies, emerging from diverse backgrounds such as cinematic arts (Maya), industrial design (Rhinceros), and aerospace engineering (CATIA), represent a convergence of expertise from various domains. The cross-pollination of ideas and methodologies from these distinct fields has contributed to the rich tapestry of tools available to architects today, highlighting the interdisciplinary nature of technological progress in architecture. This confluence of knowledge and innovation continues to drive architectural design innovation forward.

While initially not conceived for architectural design like the aforementioned tools, Artificial Intelligence (AI) has the potential to redefine and reshape the practices of architects and designers, revolutionizing the creative process in unforeseen ways. According to Bernal, Haymaker & Eastman (2015), the progression of computer-aided design research has shifted its emphasis from solely computer-assisted drafting and modeling to the concept that computers can enhance these tasks by manipulating abstract symbolic structures akin to those generated by the human intellect:

“Along with observing increased computational power, we have witnessed the development of several computational approaches addressing the entire cycle of the generation, evaluation, and selection of design alternatives. Such approaches range from simply assisting to fully automating or even augmenting the actions of designers and impact the efficiency and effectiveness of design exploration” (p. 164).

A parallel approach is evident in Aish (2013), where the author asserts that the conventional act of directly modeling a building has evolved. Instead, designers now craft a graphical representation or script, the execution of which generates the architectural model. This transformative shift enables the creation of an entirely new genre of architecture. Moreover, the design process undergoes a significant transformation. Even a seemingly minor modification to the graphical representation or script can wield a profound influence on the resulting building, thus opening the door to the exploration of an extensive range of design alternatives.

As Scheurer (2010) points out, the capacity to distill information from thousands of drawings into a well-defined algorithm, and subsequently generate thousands of configurations from just a few parameters, exemplifies the profound impact of scripting and digital tools on architectural design. This transformative capability underscores the role of these tools in streamlining and optimizing the architectural design process, enabling architects to work more efficiently and explore a multitude of design possibilities with remarkable precision and agility.

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Furthermore, according to Burry (2011), digital design has shifted from being an aspirational skill to an integral component of contemporary design practice. Architects and designers have made a profound transition from novice users to proficient creators of digital tools. This transformation marks the complete assimilation of digital technology into the architectural design process, much like the earlier discussions concerning CAD tools. This ongoing integration of digital tools underscores a fundamental change in the design process itself, as architects now wield these tools as extensions of their creative vision, enabling more agile and innovative design exploration.

In this rapidly evolving landscape of architectural design, the integration of technology has been a driving force behind transformative changes. From the pioneering days of computer-aided design to the advent of parametric design and scripting, architects and designers have continuously harnessed technology's power to enhance their creative endeavors. However, as we look toward the future, the emergence of Artificial Intelligence (AI) promises a paradigm shift of unprecedented proportions.

AI has the potential to challenge conventional design methodologies and inspire novel approaches. It represents not just another tool in the architect's toolbox but a dynamic partner capable of analyzing vast datasets, generating innovative design ideas, and augmenting the design process in ways we are only beginning to comprehend. As we delve deeper into the realm of AI, we stand on the precipice of yet another monumental transformation in architectural practice,

one that will further amplify the efficiency and creativity of designers, while pushing the boundaries of what is achievable in architectural design.

What is Artificial Intelligence?

Artificial Intelligence is everywhere, as stated by Smith (2001) in an article published in The New York Times. It integrates into our daily lives, even though it may go unnoticed. Beyond making our everyday tasks more convenient and enhancing our social interactions, AI has become a pivotal component in the functioning of critical infrastructures, such as airports and subway systems. The far-reaching implications of AI on both society and industry are profound and still not entirely comprehensible. This transformative force in the technological landscape mirrors the impact that Building Information Modeling (BIM), parametric modelling and scripting had in previous decades in architecture underlining the ever-evolving nature of innovation in the field of technology and design.

To discuss AI and architecture, however, it is needed first to understand some basic concepts. AI is often defined as the aspiration to empower computers to carry out tasks akin to the abilities of the human mind, such as perception, association, prediction, planning and motor control, as Boden (2016) observes. Nonetheless, AI possesses the capacity to accomplish tasks well beyond the scope of human capabilities. AI can be defined in various ways, and it is recognized that there exist multiple variations that can be categorized into several sub-divisions, such as

Machine Learning and Deep Learning.

The discussion on artificial intelligence is marked by Alan Turing's groundbreaking work, "Computing Machinery and Intelligence" (Turing, 1950). Frequently hailed as the "founder of computer science", Turing posed the fundamental question "Can machines think?", setting room for research and development of the field. Shortly after this publication, another pioneer in this field, John McCarthy, introduced the term 'Artificial Intelligence' in the Dartmouth Conference in 1956 alongside several other researchers, and defined AI as "the science and engineering of making intelligent machines, especially intelligent computer programs. It is related to the similar task focusing computers to understand human intelligence, but AI does not have to confine itself to methods that are biologically observable" (p. 2).

Russell & Norvig (1995) also made a significant contribution to the field of AI by authoring the widely acclaimed textbook: "Artificial Intelligence: A Modern Approach" in 1995. Within its pages, the authors delve into four distinct goals or definitions of AI, each shedding light on the differentiation between computer systems in terms of their capacity for rationality and the nature of their interaction with the world. The first perspective, the "Human approach," envisions AI systems that either emulate human thinking processes or mimic human actions. In contrast, the "Ideal approach" seeks AI systems that engage in rational thinking and exhibit rational behavior. Alan Turing's AI concept aligns with the former, emphasizing systems that imitate human actions.

At its core, AI is a multidisciplinary field that

marries computer science with the power of robust datasets to enable problem-solving. This fusion of disciplines also encompasses subfields such as machine learning and deep learning, often mentioned hand in hand with artificial intelligence. These specialized domains comprise a rich array of AI algorithms designed to construct expert systems capable of making predictions or classifications based on input data. In essence, AI leverages technology to replicate and augment human-like cognitive processes, advancing our ability to tackle complex challenges in a data-driven world.

AI Onion Layers: Machine Learning and Deep Learning

Over the past few years, there has been a notable surge in the utilization of AI as a generative design tool within the realm of architecture. This growing interest primarily stems from AI's capability to revolutionize the creative aspects of architectural work. By incorporating computational algorithms and harnessing AI's image generation capabilities, architects can now access novel and imaginative methods for investigating design potentials in tools such as Midjourney, Dalle, and Veras, which provide a diverse set of tools for producing high-quality AI-generated images based on both image-to-image and text-to-image prompts.

To effectively harness the capabilities of these APIs (Application Programming Interfaces), architects must have a notion of both machine learning and deep learning that underlie these tools. This understanding is pivotal for architects to employ these

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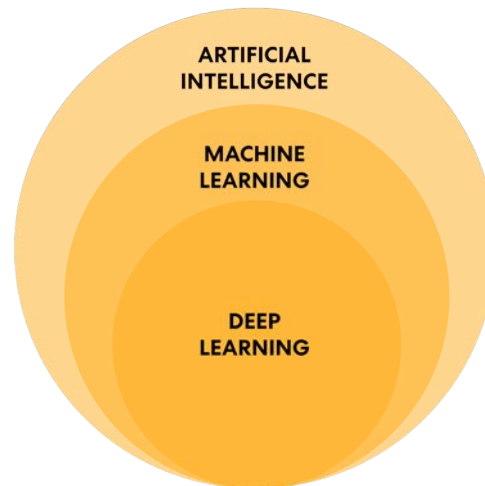
applications judiciously and evaluate their utility critically.

In "Architecture in the Age of Artificial Intelligence", Leach (2022) comments on what is generally recognized as 'Classical AI': "early versions of AI referred to machines that had to be programmed to process a set of data", which in other words tells that machines were not capable of learning and only perform what they were programmed to do. AI has much evolved since Classical AI emerged, giving room to machines that can learn and program themselves.

Deep learning and machine learning are integral components within the broader field of AI (Figure 02). Machine learning focuses on the development of algorithms that enable computers to learn from vast quantities of data and make predictions or decisions. It encompasses various techniques, including supervised learning, unsupervised learning, and reinforcement learning, to address a wide range of tasks such as image recognition, natural language processing, and recommendation systems.

Deep learning, on the other hand, is a subset of machine learning that specifically deals with neural networks composed of multiple layers, known as deep neural networks. These deep networks excel at capturing intricate patterns and representations from complex data, making them exceptionally powerful in tasks like image and speech recognition. Their ability to automatically extract hierarchical features has led to groundbreaking advancements in AI applications, from self-driving cars to medical diagnosis.

Machine learning forms the backbone of AI,



Graph 01: Venn diagram of the relationship between artificial intelligence, machine

while deep learning represents a cutting-edge subfield within machine learning that has significantly expanded the horizons of what AI systems can accomplish, enabling them to tackle increasingly complex and nuanced tasks. Together, they play a pivotal role in the advancement of artificial intelligence.

Text-to-image generation foundations

Text-to-image generation models, like Dall-e and Midjourney, typically work using deep learning techniques, particularly built upon Neural Networks and utilize them to achieve their generative and discriminative tasks.

Named after the neurons in the human brain, Leach (2022) states that these networks are composed of 'neurons', which are the information processing units, and 'synapses', the connections that control the flow of

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information between these units. Having distinct weight and directions, these connection points have effective impacts on how the information is processed. Leach (2022) describes that these models “need to be trained by being fed a series of input-output pairs as training examples. “The system ‘learns’ over a period of time and tries to find the optimal weighting for each connection, so that when feeding an input, the output matches – as far as possible – the training examples” (p.22).

Text-to-image AI models are trained on large datasets containing pairs of text descriptions and corresponding images, as stated by Schuhmann, et al (2021). For instance, a dataset might include descriptions like “a white cat with blue eyes” paired with images of white cats and blue eyes. When given a text prompt or description, the model encodes it into a numerical format. This encoding often involves tokenization, where words are broken down into smaller units (tokens), and then these tokens are converted into numerical embeddings. These encoded representations serve as input to the generative neural network. (Ramesh, et al (2022).

The neural network, which is a crucial part of these models, learns to map the encoded text representations to corresponding image features. This involves training the network on a vast dataset of paired text-image examples, where the model learns to understand the relationships between words and visual elements. Over time, it becomes

proficient at generating images that align with the textual descriptions.

The generation process entails the model producing images that match the input text by combining and manipulating visual elements in a coherent manner. Depending on the specific architecture and training methodology, these models may incorporate more advanced structures to accomplish this task.

Midjourney utilizes advanced neural network models to process natural language and produce corresponding images. Accessible through the online communication platform Discord, Midjourney stands out for its user-friendly prompting process. A prompt is described by Midjourney Documentation as a “short text phrase” that will be interpreted by Midjourney Bot to produce an image.

To generate an image, users simply input their desired text that is executed by the “/imagine” command, offering four resulting images. Below these images there are two rows. At the top row, you’ll find four buttons labeled U1, U2, U3, and U4, which serve the purpose of upscaling the selected image. Upscaling effectively enlarges the image, resulting in additional details by default. In the bottom row, you’ll encounter buttons labeled V1, V2, V3, and V4, which enable the creation of variations of the chosen image. Generating variants produces four new images that share similarities with the selected image in terms of style and layout.

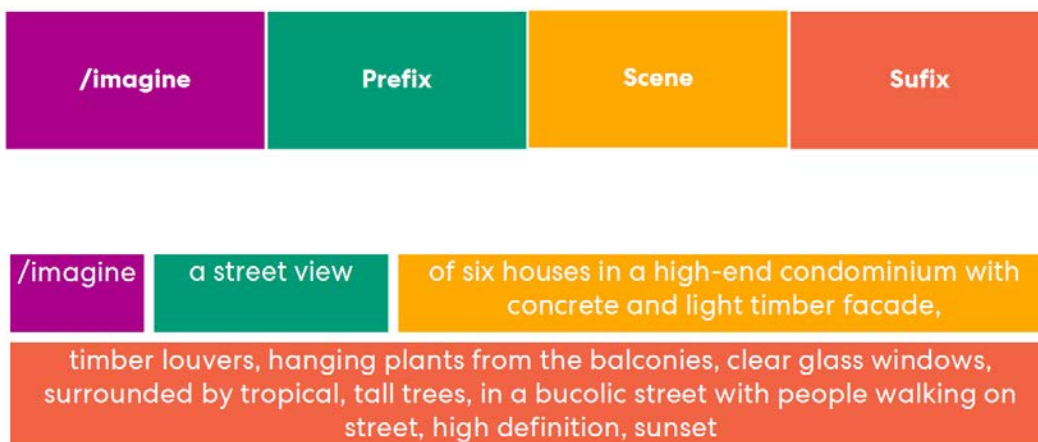


Figure 02: Diagram of a generic prompt structure for Midjourney.

Prompt engineering

Midjourney Documentation (Midjourney, n.d.) provides insights into how users can effectively create prompts for generating images. It also includes guidelines on crafting descriptive and context-rich prompts, using specific keywords or formatting techniques to elicit desired image outputs, and possibly examples illustrating successful prompt usage. Additionally, documentation covers best practices and tips for using Midjourney.

Prompt engineering significantly influences the quality and relevance of the generated image outputs in Midjourney. Crafting precise commands is key to obtaining desired results. **A well-crafted prompt not only guides the models but also ensures that the generated images align with the user’s creative vision.**

According to Midjourney Documentation, it’s best to keep prompts concise and straightforward, using simple, short sentences that clearly describe what you want to see. Well-constructed prompts that are descriptive and specific tend to yield the most impressive results. For more advanced prompts, you have the flexibility to include additional elements, such as one or more image URLs, multiple text phrases, and various parameters. Image URLs, when added at the beginning of a prompt, can influence the style and



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Figure 04: Image generated with Midjourney. Prompt “indoor long shot of a high-end house with timber ceiling, concrete facade, big windows with clear glass, hanging plants, tropical lush gardens on the outside, bucolic view with mountains, --ar 5:3”

←
Figure 05: Image generated with Midjourney. Prompt “Mobile acoustic performance shell by Canela Brazil canyon, Itaimbezinho, timber structure, inflatable skin, light - weight, transparent fabric, concert lights, a few musicians, few people watching outside, sustainable, zero carbon, retractable, cinematic photo, highly detailed, sunset sky, panoramic view”

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content of the final image, while the text description forms the core of your request.

Parameters are another essential aspect of prompt engineering, as they can modify how an image generates, including features like aspect ratios, models, upscales, and more. Parameters are placed at the end of the prompt to fine-tune the output according to your preferences.

It's important to note that the Midjourney Bot doesn't comprehend grammar, sentence structure, or words in the same way humans do. Word choice matters and using more specific synonyms often leads to better outcomes. Additionally, clarity is key, and it's advisable to describe what you want rather than what you don't want, as leaving out details may result in unexpected variations.

When crafting prompts, consider including relevant context and details, such as the subject, medium, environment, lighting, color, mood, and composition, to guide the bot in generating images that align with your vision.

Also, using specific numbers and collective nouns in place of plural words can enhance the precision of your prompts, reducing randomness and increasing the likelihood of obtaining desired results.

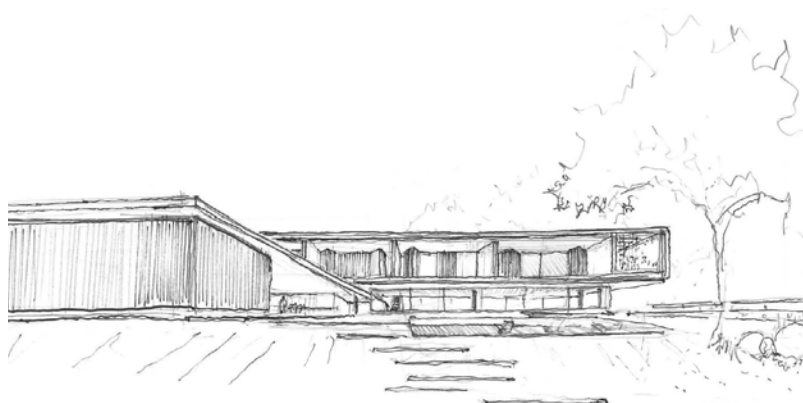
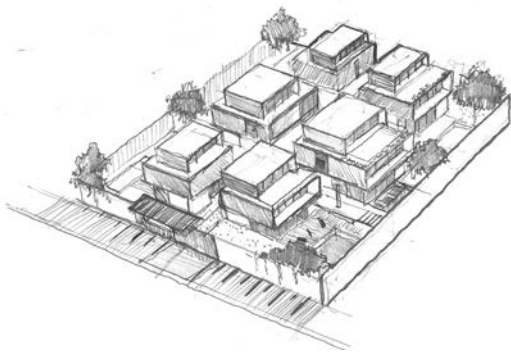
Prompt engineering in Midjourney empowers users to shape their creative vision into tangible visual outcomes. Whether crafting simple, concise prompts or delving into advanced requests with image URLs and parameters, the quality of generated images hinges on the clarity and specificity of these prompts. By following best practices, being



Figures 06-09: Images generated with Midjourney demonstrating its various ways to help with the design process by recreating layouts, furniture, textures and even graphic resources for drawings.

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descriptive, and considering context, users can unlock Midjourney’s full potential and revel in the endless possibilities it offers for image generation. In this dynamic interplay between human creativity and AI capabilities, prompt engineering emerges as the key to transforming imaginative concepts into remarkable architectural ideas.



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Figures 10-11: Image generated with Midjourney and Giovanni Campari’s sketch. Prompt “a 3d realistic, high-definition image of a condominium of 6 houses with timber and concrete facades, timber louvers in a bucolic neighbourhood surrounded by tropical lush trees, green gardens, plants in the balconies, blue sky, cinematic, --ar 3:2”

←
Figures 12-13: Image generated with Midjourney and Giovanni Campari’s sketch. Prompt “a two floors high end house with timber and concrete facade, timber ceiling and louvers, concrete structure, bucolic surroundings with tropical gardens, blue sky 5:3”

Veras, Integrating AI-Powered Visualization with Architectural Software

Veras is an AI-powered visualization application designed to generate images through the utilization of 3D model geometry as its substrate. This software is compatible with industry-standard design software including Sketchup, Revit, and Rhinoceros. At its core, Veras employs an AI-based ideation and rendering engine, offering users optional prompt-based guidance. Although we couldn't find any public information regarding Veras AI operation, we believe it's very similar to Midjourney Bot.

According to Veras online information (Evolve Lab, n.d.), a distinguishing feature of Veras is its capability to harness the three-dimensional nature of the input geometry, a challenging dimension to control in current image-based AI tools, such as Midjourney, Dall-e and Stable Diffusion. This attribute ensures that Veras does not dramatically alter the fundamental shape or volume of architectural structures. Instead, it excels in rapid transformations of material compositions, environmental conditions, and even the time of day, all while preserving the structural integrity of the building. Optimal results are achieved when using a perspective view in conjunction with specific graphical settings in the hosting software (Revit, Sketchup, etc.), such as edge display and shadow casting.

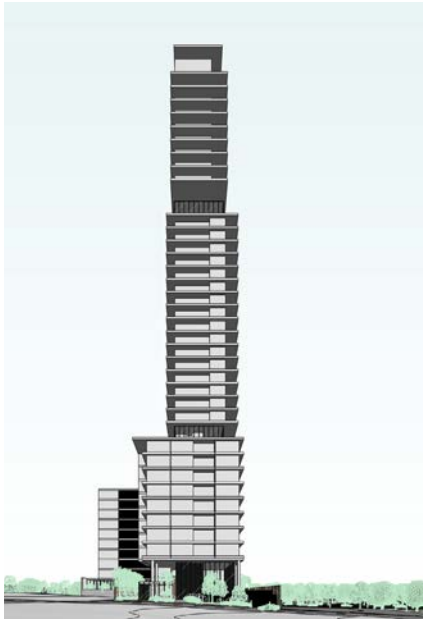
The application interface offers users adjustable sliders for 'Creativity Strength' and 'Style Strength', alongside the flexibility to fine-tune resolution and rendering iterations. The strength settings dictate the extent to which the AI replaces existing elements within the Revit model, while Style Strength

controls adherence to textual prompts. Users can also specify the context of their design, whether it is an interior or exterior setting, and incorporate elements of nature, atmosphere (e.g., fog), or aerial viewpoints. Manipulating the perspective view in Revit and updating the Veras window for instance facilitates precise control over the visual composition.

Veras accommodates user input in the form of a text prompt, permitting the specification of a wide array of design parameters. Users can describe their desired outcome, stipulate materials, glazing types, environmental conditions, architectural styles (e.g., timber cabin, modern concrete, residential/office), and additional factors such as nighttime settings or specific surface materials. With a single text prompt, users have the capacity to experiment with the strength and style sliders, yielding diverse outcomes that are typically characterized by their realism and simplicity, thus streamlining the creative process for users.

In this research endeavor, we initially aimed to integrate the Veras software into our work. However, we encountered several obstacles that impeded the tool's effective application during subsequent research.

The primary obstacles we faced were twofold. Firstly, we found it infeasible to employ the tool in group workshops in order to assess the software. This was primarily due to logistical reasons: (a) it needed the preparation of 3D files for each user group, a time-consuming task that couldn't be accommodated within the workshop's timeframe, and (b) the availability of licenses was insufficient to meet the desired demand. Secondly, when we applied the tool to our architectural projects,



Figures 14-21: The first image shows the original mass from Revit 3D view, the following images were generated with Veras software. General prompt used: "residential tower, [material] structure, large windows, balconies with planters, stores on ground floor"

we discovered that it exhibited limited compatibility with the 3D models we tested.

The generated images often failed to accurately represent the loaded models, even for seemingly straightforward tasks like altering floor materials or wall coverings, as suggested by developers. Furthermore, in the study of façades, we observed that the tool struggled to differentiate between the project and its surrounding context, at times introducing elements from neighboring buildings into the architecture in question. It became evident that prompts were crucial for developing new visual alternatives, and we found that the same best practices associated with the Midjourney software could be applied to Veras prompt engineering.

In response to the encountered challenges, we made a strategic choice to discontinue the utilization of the Veras software and shifted our research focus towards the Midjourney tool. It is important to note that both software applications are still actively evolving, holding significant promise for prospective applications within the field. However, it is essential to acknowledge the inherent limitations within the scope of our present research endeavor. Specifically, we recognized the impracticality of undertaking a comprehensive exploration of the intricate and advanced functionalities embedded within the Veras software at this juncture.

Despite these challenges and our strategic shift, we remain aware of the compelling attributes that Veras exhibits, particularly in its seamless integration with the software routinely employed by architects. Veras's user-friendly and intuitive interface, coupled with its near real-time visualization capabilities

for evolving three-dimensional models, constitutes a potent resource poised to expedite the architectural design process and facilitate the materialization of concept ideas. Consequently, we acknowledge the value of conducting a more comprehensive, structured study of the Veras software in the future, recognizing its potential contributions to the architectural domain.

Conclusion

The evolution of computer technologies has profoundly impacted architectural design, ushering in fresh principles and methodologies that challenge established practices. The journey from early pioneers like Ivan Sutherland's Sketchpad to contemporary Building Information Modeling (BIM) software illustrates the enduring influence of technology on architecture. Today's architects harness the power of parametric techniques, scripting, and digital tools to streamline and enhance the design process.

Yet, a significant transformation lies ahead with Artificial Intelligence (AI). AI has the potential to revolutionize architectural design by automating tasks, boost innovative design ideas, and augment the creative process. **Architects now stand at the cusp of another monumental shift, where AI becomes a dynamic partner.** Understanding AI is crucial, with its roots in the aspiration to empower computers to enhance human cognitive abilities. Machine learning and deep learning, integral components of AI, enable computers to learn from data and extract complex patterns, fueling advancements in image recognition and other fields.

Chapter I: Theoretical notes about Artificial Intelligence

The fusion of natural language processing and computer vision techniques has birthed a set of remarkable tools such as Midjourney, Veras, Dall-e, Stable Diffusion, etc. that can generate images, enabling architects to bridge the gap between abstract ideas, textual descriptions, and vivid visualizations.

Midjourney's user-friendly interface for instance simplifies the process, making it accessible for architects to generate images from their own text descriptions seamlessly.

Text-to-image generation models like Midjourney employ deep learning techniques, specifically neural networks, to transform textual descriptions into visual representations. These models are trained on vast datasets of text-image pairs, allowing them to understand the relationships between words and visual elements. Prompt engineering in Midjourney plays an important role in achieving desired image outputs. Crafting precise, context-rich prompts empowers architects to shape their creative vision into tangible visuals.

The potential applications of text-to-image generation in architecture are diverse and transformative. It offers architects the ability to swiftly translate their design concepts into visual representations during the early design phase, aiding in quick experimentation and concept communication. Moreover, it can revolutionize the visualization of building plans and layouts, as well as the creation of intricate 3D models at early design stages.

However, it's important to acknowledge that challenges lie ahead. The accuracy of this technology relies on natural language, which according to Thomas & Thompson (2023) is inherently prone to imprecision, possibly

resulting in misinterpretations of architects' descriptions and the creation of inaccurate images. Moreover, the images produced may exhibit bias due to potential biases in the training data, user inputs, and employed algorithms, unintentionally propagating existing prejudices, preferences, and exclusion within the generated content.

As the field continues to evolve and improve, text-to-image generation holds the promise of becoming an indispensable tool for architects, enabling them to experiment with diverse design concepts and create compelling visual representations of their ideas. AI-generated images are evolving the way architects conceptualize and communicate their design ideas almost like a virtual sketchbook created by words. The future holds a more efficient architectural design process with AI-generated images and similar innovations at the forefront. As architects delve deeper into the realm of AI, they are poised to harness its transformative potential, pushing the boundaries of architectural design and efficiency.

Chapter II

**Assessing
awareness,
engagement, and
perspectives
among
Perkins&Will Sao
Paulo Studio**

Chapter II

Assessing awareness, engagement, and perspectives among Perkins&Will Sao Paulo Studio



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Figure 22: Stephanie Luna (Arch I), Daniel Falcão (Project Architect), Mariana Lisboa (Arch II) and Cláudia Lessa (Project Architect) during the AI Workshop.

This research conducted an activity involving all architects in Perkins&Will's Sao Paulo Studio designed to assess the knowledge and level of engagement with AI tools in architectural design, particularly focusing on the early stages of the design process. It aimed to gather valuable insights by measuring and understanding awareness, knowledge, fears, and thoughts among the studio's employees regarding the incorporation of AI tools into the design workflow.

To achieve this, a comprehensive questionnaire was designed and distributed among all architects in the studio. The survey aimed to explore the architects' perspectives on AI in architecture, specifically focusing on their awareness of AI tools, their willingness to participate in activities involving AI implementation, and their opinions on the advantages, disadvantages, and challenges associated with AI integration in architectural design.

The form consisted of four questions, each designed to provide meaningful insights into the architects' attitudes and experiences with AI tools:

The first question, **“Are you acquainted with or interested in utilizing Artificial Intelligence during the initial phases of an architectural project?”** focused on evaluating the architects' existing knowledge and interest in employing AI tools during the preliminary stages of architectural projects. This inquiry aimed to gauge their current engagement with AI and assess their potential openness to incorporating these tools into their design processes.

The second question, **“Which Artificial Intelligence tools are you familiar with?”** aimed to gauge the architects' familiarity with various AI tools. By exploring their exposure to and knowledge of AI-based technologies and applications relevant to architectural design, the research aimed to gain a deeper understanding of their prior experiences and exposure to AI tools.

The third, **“Would you like to participate in an activity that involves the utilization of Artificial Intelligence in a project?”** delved into the architects' interest in participating in activities involving the use of AI tools in architectural projects. By gauging their willingness to engage with AI and actively contribute to initiatives related to its implementation, the research sought to identify potential avenues for collaboration and engagement.

Lastly, **“In your perspective, what are the benefits, drawbacks, and challenges associated with employing Artificial**

Intelligence in the field of architecture?”

provided an open-ended opportunity for the architects to share their perspectives on the advantages, disadvantages, and challenges associated with the utilization of AI tools in architecture. This open-ended response allowed the architects to freely express their thoughts and opinions, providing valuable insights into potential concerns, opportunities, and areas of focus for future implementation efforts.

The primary objective of this research activity was to gauge the level of receptiveness and enthusiasm among the architects towards incorporating AI tools into their design workflow. **By examining their attitudes and interests, the research aimed to identify opportunities and challenges associated with the integration of AI tools in a manner that aligns with the needs and aspirations of the architects at Perkins&Will's Sao Paulo Studio.**

The core of any transformative endeavor lies the recognition that people play a crucial role. Understanding this fundamental principle, the research recognized the significance of placing the architects themselves at the center of the investigation. By prioritizing their perspectives and experiences, the research sought to gather in-depth insights that would inform and guide future initiatives.

The gathered insights serve as a valuable resource, providing guidance for successful implementation and integration of AI tools within the studio. It emphasized the importance of understanding the architects' perspectives and aspirations to foster a collaborative and innovative design process that harnesses the potential of AI technology.

Chapter II: Assessing awareness, engagement, and perspectives among Perkins&Will Sao Paulo Studio

Sao Paulo Studio Statistics

Perkins&Will's Sao Paulo Studio houses a talented and diverse workforce of 89 individuals who play integral roles in the design of architectural projects. Within this environment, architects, designers, project architects, and project managers come together, totaling 81 professionals actively engaged in various design-related activities.

To gather insights, a form was distributed to all members of Perkins&Will's Sao Paulo Studio, encompassing architects, designers, project architects, and project managers. The research successfully obtained responses from 42 individuals, representing a noteworthy participation rate of approximately 51.9% of

the professionals directly engaged in design activities within the studio.

Furthermore, these 42 respondents constitute a substantial proportion of the total workforce, accounting for 47.2% of all individuals working at Perkins&Will's Sao Paulo Studio. This ensures that the collected data encompasses a diverse range of perspectives and experiences from a significant portion of the studio's design-oriented professionals. Such extensive participation strengthens the validity and reliability of the data, enabling a comprehensive analysis of the architects' and designers' awareness, engagement, and perspectives regarding the integration of AI tools in architectural design.

POSITION	REPLIES	SP STUDIO AS OF JUNE 23	%
Digital Practice Leader	1	1	100.0
Project Designer	3	4	75.0
Arch I	6	9	66.7
Designer II	2	3	66.7
Project Manager	4	7	57.1
Project Architect	11	20	55.0
Arch II	6	13	46.2
Arch III	7	17	41.2
Designer III	1	3	33.3
Intern	1	4	25.0
Directors	0	3	0.0
Finance	0	2	0.0
Marketing	0	2	0.0
Human Resources	0	1	0.0
TOTAL	42	89	47.2

Table 01: Workforce composition and respondents' statistics

Data Analysis

“Are you acquainted with or interested in utilizing Artificial Intelligence during the initial phases of an architectural project?”

Among the participants, a notable proportion of 34 individuals, accounting for 81.0% of the total respondents, affirmed their familiarity with certain AI tools and demonstrated a clear intention to incorporate them into their architectural projects. This response indicates a level of awareness and knowledge among these participants regarding the existence and potential benefits of AI tools in the context of architectural design.

Conversely, 7 participants, representing 16.7% of the total respondents, expressed a lack of acquaintance with AI tools. However, despite their limited knowledge in this area, these individuals demonstrated a strong interest in utilizing AI tools in their architectural projects. This subset of respondents highlights an intriguing dynamic within the survey, where participants recognize the potential benefits of AI tools, even without prior familiarity.

Interestingly, a single participant, constituting 2.4% of the total respondents, indicated both a lack of knowledge regarding AI tools and a lack of willingness to utilize them in an architectural project. This response stands as an outlier within the dataset, representing a unique perspective that contrasts with most participants who demonstrated either familiarity with AI tools or expressed an interest in utilizing them. The reasons underlying this individual's reluctance to embrace AI in their project remain undisclosed, potentially stemming

from personal preferences, concerns, or a different professional approach. The presence of such a perspective underscores the diversity of attitudes and opinions within the architectural community regarding the integration of AI tools, further emphasizing the importance of recognizing and accommodating varying viewpoints in discussions surrounding AI adoption in architectural design.

“Which Artificial Intelligence tools are you familiar with?”

In response to the second question, the participants identified a total of 18 AI tools. It is important to note that while all these tools fall under the category of Artificial Intelligence, not all of them are directly applicable to architectural design. Some of the mentioned tools, such as Galapagos and Grasshopper, are more design-oriented tools that could be used in conjunction with AI technologies.

Among the 18 AI tools mentioned, ChatGPT emerged as the most widely recognized tool, with 27 respondents indicating their previous utilization or awareness of it. ChatGPT is a language model developed by OpenAI. It enables conversational interactions and generates human-like responses based on textual inputs. It can be used to facilitate communication, idea generation, and exploration of design concepts through text-based interactions.

Following the mention of ChatGPT, it is worth noting that Midjourney and Dall-e, two text-to-image AI tools, were also recognized by a significant number of participants. Midjourney received 13 mentions, while

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Dall-e garnered 9 mentions. The inclusion of these tools in the participants' responses indicates their recognition and interest in utilizing AI technologies to generate visual representations from textual inputs. This highlights the growing importance of text-to-image AI tools in the field of architectural design and their potential to enhance the visualization and communication of design concepts.

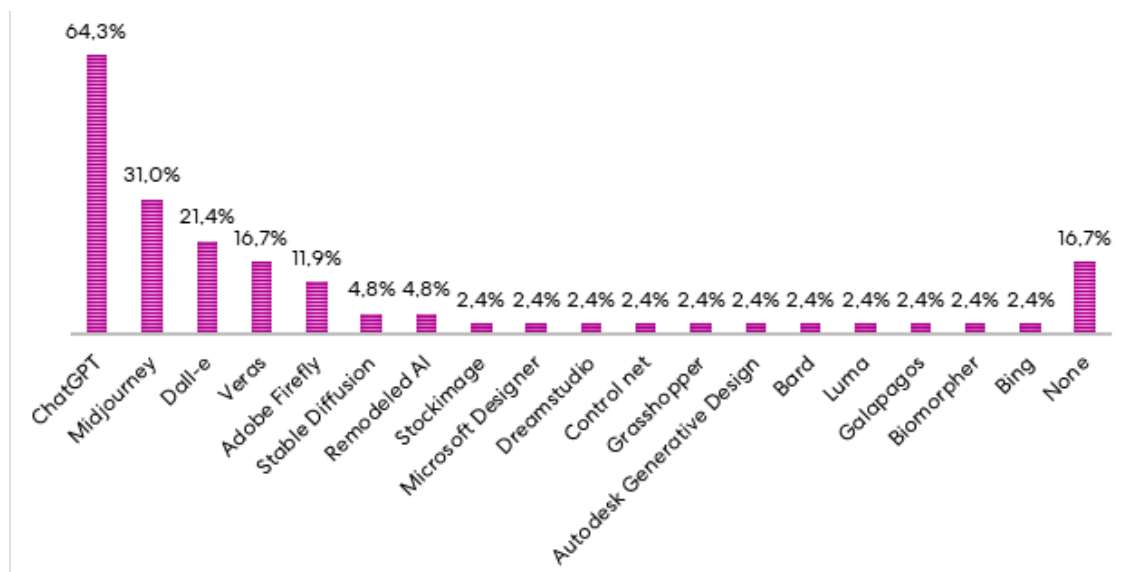
Veras, mentioned by 7 participants, is a tool that stands out for its compatibility with Revit and Rhino models. Architects can extract valuable insights from basic mass studies using Veras and use them as a foundation to generate new and innovative design ideas.

Other tools mentioned include Adobe Firefly (5 mentions), Stable Diffusion (2 mentions), Remodeled AI (2 mentions), and several tools with 1 mention each: Stockimage, Microsoft Designer, Dreamstudio, Control net, Grasshopper, Autodesk Generative

Design, Bard, Luma, Galapagos, Biomorpher, and Bing.

On the other hand, 7 participants explicitly mentioned that they had not yet utilized or come across any Artificial Intelligence tools.

Graph 1 illustrates the level of familiarity that respondents have with various AI tools. The data reflects the responses of the participants regarding their previous utilization or awareness of Artificial Intelligence tools. The graph showcases the percentage of respondents who indicated familiarity with each specific tool.



Graph 02: Familiarity with AI Tools among Respondents

“Would you like to participate in a workshop involving the use of Artificial Intelligence in a project?”

In response to the third question, which inquired about the participants' interest in participating in an activity involving the utilization of Artificial Intelligence (AI) in an in-office setting, the majority of respondents displayed a strong inclination towards engagement. Specifically, 38 individuals, comprising 90.5% of the participants, expressed their affirmative response, indicating their keenness to partake in a 1-hour workshop where they could actively use and observe how AI works. Conversely, a smaller subset of 4 respondents, accounting for 9.5% of the participants, expressed their lack of interest in participating in such an activity. These responses demonstrate a notable interest and openness among most participants to actively engage with AI technologies within a hands-on learning environment. The enthusiasm and willingness displayed by the majority further highlight the potential for fostering knowledge and skill development through interactive workshops that showcase the practical applications of AI in architectural design.

“In your perspective, what are the benefits, drawbacks, and challenges associated with employing Artificial Intelligence in the field of architecture?”

When asked about the benefits, drawbacks, and challenges associated with employing Artificial Intelligence (AI) in the field of architecture, the respondents provided insights that were categorized into several key topics.

Advantages

Speed: Respondents acknowledged that one of the significant advantages of employing AI in architecture is its ability to enhance the speed of various design processes.

AI-powered tools can automate tasks that traditionally required substantial time and effort, such as generating volumetric studies and producing high-quality renders.

Exploration of possibilities: Respondents recognized that AI systems can generate, and study different design ideas based on provided data. This capacity for exploration enables architects to consider a broader range of design alternatives, facilitating a more thorough and comprehensive design exploration process.

Aid to creativity: The integration of AI in architectural design can provide a supportive environment for architects to express their ideas and enhance their creativity. Participants noted that AI tools can assist architects, including those with limited experience in complex software, in effectively communicating their design concepts.

These tools offer intuitive interfaces and simplified workflows that enable architects to bring their ideas to life, visualize design concepts, and present them to clients and stakeholders. Additionally, AI can aid in the development of intricate design details and conceptual images, helping architects refine their creative vision and deliver compelling design proposals.

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Optimization and organization: AI's potential to optimize work processes was highlighted as another advantage. Architects often engage in repetitive and bureaucratic tasks that consume valuable time and energy. AI-powered tools can automate these tasks, ranging from generating tables and documentation to analyzing large datasets. By delegating such routine tasks to AI systems, architects can focus their efforts on higher-value activities, such as design thinking, problem-solving, and strategic decision-making. **The optimization and organization provided by AI can enhance efficiency, reduce errors, and contribute to a more streamlined architectural workflow.**

Disadvantages

Risk of excessive dependence: One notable concern raised by participants is the potential risk of over-reliance on AI, which may have consequences for human creativity and originality in architectural projects. **While AI can expedite certain processes and provide valuable insights, there is a danger of relying too heavily on AI-generated solutions, potentially leading to a homogenization of design outcomes.** It is essential for architects to maintain a balance between leveraging AI tools as aids and preserving their own unique creative perspectives, ensuring that human ingenuity continues to drive innovation in architectural design.

Threat to employability: The rapid advancement of AI technology raises

concerns about its impact on job opportunities within the field of architecture. Respondents expressed apprehensions about potential job reductions, particularly in tasks that can be automated or completed more efficiently by AI systems. **Architects may face challenges in adapting to the evolving landscape, requiring them to upskill and embrace new roles that leverage the capabilities of AI while complementing human expertise.**

Proper use of data: The respondents emphasized the importance of correctly applying the data provided by AI in decision-making processes. They recognized that misinterpreting or mishandling the AI-generated data could lead to flawed design outcomes. **The architects highlighted the need to consider their own sensitivity and experience while incorporating AI-generated insights into their design processes.** They stressed that AI should be viewed as a tool to complement and enhance their professional judgment rather than replace it. The respondents acknowledged that using AI data effectively requires a deep understanding of its limitations, biases, and context-specific considerations.

Guiding AI: The challenge of guiding AI systems in the design process was also acknowledged by the respondents. They recognized that teaching and guiding the machine to follow a line of thought and critical experiences, akin to human designers, is a complex task. The respondents expressed the need to develop methodologies and

techniques to effectively train AI systems to understand architectural design principles, aesthetics, and contextual factors. They highlighted the importance of defining clear parameters, constraints, and design criteria to guide AI systems towards desired outcomes.

The respondents emphasized the significance of striking a balance between allowing AI to offer innovative suggestions while maintaining human control and creative input throughout the design process.

Discussion

In conclusion, the participants' insights on the benefits, drawbacks, and challenges associated with employing Artificial Intelligence (AI) in the field of architecture reveal the complex landscape of integrating AI into architectural practice. The advantages of utilizing AI in architecture include enhanced speed in design processes, exploration of design possibilities, aid to creativity, and optimization of work processes. These advantages can lead to improved efficiency, greater design exploration, and enhanced presentation capabilities.

However, the respondents also identified potential drawbacks and challenges. The risk of excessive dependence on AI, with the potential for homogenization of design outcomes, raises concerns about preserving human creativity and originality in architectural projects. The threat to employability due to automation and the need for architects to adapt and upskill in the face of rapid technological advancements is a significant consideration. Proper use of data is crucial, requiring architects to interpret

and apply AI-generated insights accurately, considering their own sensitivity and experience. Guiding AI systems in the design process is a challenging task, necessitating the development of methodologies to train AI systems to understand architectural principles and critical experiences.

Overall, the integration of AI in architecture offers immense potential for enhancing design processes, increasing efficiency, and expanding design exploration. However, careful consideration of the challenges and potential drawbacks is necessary to ensure a balanced approach. Architects must strike a delicate balance between leveraging AI tools to augment their creative abilities while preserving their unique perspectives and design sensibilities. The responsible and thoughtful use of AI, guided by human expertise, can lead to innovative and sustainable architectural solutions.

As AI continues to evolve, it is essential for architects to stay informed, adapt to technological advancements, and embrace AI as a complementary tool in their practice. This requires ongoing training, collaboration, and a critical approach to AI's capabilities and limitations. By embracing AI's potential while maintaining a human-centered approach, architects can harness its power to drive innovation, enhance design outcomes, and create architecture that meets the evolving needs of society.

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In-Office AI Workshop

Following the assessment of awareness, interest, and perspectives regarding the utilization of Artificial Intelligence (AI) in architectural projects, a subsequent activity was conducted to provide participants with hands-on experience and foster collaboration within Perkins&Will Sao Paulo Studio Architects. This activity aimed to further explore the potential of AI tools and promote interdisciplinary engagement among architects from different sectors and job functions.

A total of 31 employees participated in this interactive workshop, which spanned over two Saturday mornings and one Monday afternoon in August 2023. The workshop content remained consistent across all three days, allowing participants the flexibility to choose the session that best aligned with their schedules and availability. This approach was intentionally designed to accommodate the diverse needs of our studio members and to encourage active engagement.

The workshop was thoughtfully structured into four key components to provide a comprehensive and engaging learning experience for participants:

Research Presentation: The workshop started with a research presentation by the authors, where the goals and research methods of this investigation were elucidated. This presentation served as a foundational introduction, setting the stage for participants to understand the workshop's objectives and the broader context of AI integration in architectural projects.

Introduction to AI Image Generation in Architecture and Design: In the second part, the authors offered a brief theoretical review that explored various approaches to AI image generation, notably focusing

on text-to-image, image-to-image, and mass study-to-image prompts. Participants were provided with valuable insights into the underlying principles of AI prompts, gaining a deeper understanding of how to structure these prompts in both AI platforms used in this research, Midjourney and Veras. This section equipped participants with the necessary knowledge to effectively engage with AI tools.

Hands-On AI Design Exploration: The third segment of the workshop provided participants with a hands-on experience using Midjourney and Veras. Participants were divided into groups of a maximum of six people, fostering a collaborative atmosphere that enhanced discussion and engagement. During this phase, each group engaged in creating design ideas for a project, collectively exploring diverse aspects such as moodboards, mass studies, and materials, harnessing AI's capabilities to generate a spectrum of design concepts. This practical exercise empowered participants to visualize and experiment with various design possibilities.

Group Discussion: To conclude the workshop, a group discussion was facilitated. This session encouraged participants to reflect on their AI-driven design experiences, share their insights, and exchange ideas. It fostered a collaborative atmosphere where architects from different backgrounds and perspectives could engage in a dynamic dialogue, exploring the potential implications and applications of AI in architectural practice.

The structured progression of the workshop, from research context to hands-on application, aimed to provide a holistic learning experience. Participants were not only exposed to the theoretical foundations of AI image generation but also actively engaged in creative design processes, ultimately promoting interdisciplinary collaboration, and enhancing their readiness to leverage AI tools effectively in their architectural work.

DAY ONE 11 Participants August 5th		DAY TWO 6 Participants August 7th		DAY THREE 14 Participants August 12th	
GROUP A	GROUP B	GROUP C	GROUP D	GROUP E	
Theme Bamboo Habitat	Theme Reimagining Pineiros River	Theme Univesity Building	Theme Care Center	Theme Corporate Interiors HQ	
Design Methods Textual Support Hand Sketches Photoshop	Design Methods Textual Support Internet Images	Design Methods Textual Support Hand Sketches	Design Methods Textual Support	Design Methods Textual Support Client's Mission, Values and Vision	

Table 02: Group compositions, explored themes and design methods.

Group Findings & Results

As previously mentioned, the workshop unfolded over the course of three separate days. each characterized by unique group compositions. On the initial day, participants were organized into two distinct groups, denoted as Groups A and B. During the second day, the participants formed a single group, Group C. Finally, on the last day of the workshop, the participants were grouped into two separate groups, designated as Groups D and E.

Notably, it is intriguing to observe that each of these groups independently exercised their autonomy in selecting diverse themes

and design methodologies to formulate their design concepts. It is pertinent to clarify that the authors of this research did not exert any influence on the participants' choice of design methods. Instead, the groups were granted complete freedom to determine both the thematic focus and design approach they wished to pursue.

Group A

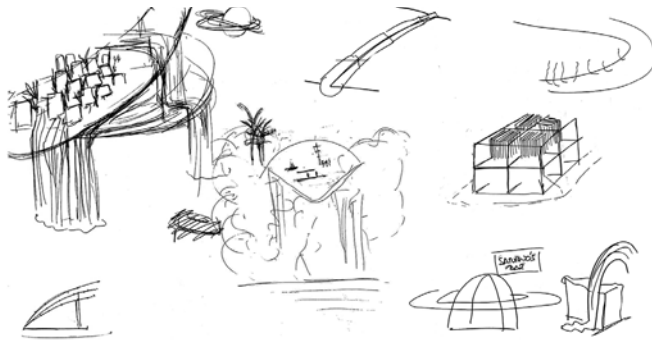
As thematic focus, Group A decided to go with a "Bamboo Habitat". Their decision to explore the incorporation of bamboo, known for its flexibility, sustainability, and unique aesthetic qualities, as a central construction material was both innovative and environmentally conscious. By opting for curvilinear forms,

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the group aimed to challenge conventional architectural norms, opting for an organic, flowing design language that harmonized with the natural world. The group's intent was not merely to design a building but to create a statement about the future of architecture, one that embraces nature as an integral part of the built environment.

The approach taken by this group parallels the methods commonly employed by architects, where data exploration is a non-linear process, where architects often utilize a variety of methods to discover ideas, avoiding rigid constraints. **The group started by defining keywords and key concepts that would guide their experiment, subsequently they created textual prompts in Midjourney that reflected their vision to the project. These textual prompts served as a bridge between their initial abstract concepts and tangible design possibilities, giving a imagistic dimension to the group's initial ideas.**

This initial phase served as a brainstorming session, where abstract concepts were transformed into design possibilities. Subsequently, they transitioned to sketching, introducing the analog element into AI. Architects typically express themselves more decisively through sketches and drawings, making this method an effective means of expressing their creative vision. This fusion of traditional and digital methods not only facilitated a more direct and expressive input process but also demonstrated the architects' adaptability in harnessing the capabilities of AI alongside their own creative instincts. Finally, they incorporated Photoshop to merge fragments of images generated by Midjourney, showcasing their ability to



Figures 23-26:
Drawings, post-its and AI-generated images created by Group A.

manipulate and refine AI-generated content to align with their vision.

In essence, Group A's journey through the "Bamboo Habitat" theme encapsulated the essence of contemporary architectural exploration—a dynamic interplay of tradition and innovation, sustainability and aesthetics, and the convergence of digital and analog techniques. Their process represented a thoughtful response to the evolving challenges and opportunities in architecture, promising fresh insights into the potential of bamboo as a construction material and the profound synergy between AI and architectural design.



Figure 27: AI-generated image created by Group B.

Group B

Under the theme "Reimagining Pinheiros River," Group B ventured to explore innovative possibilities for the utilization of this important watercourse in Sao Paulo. The Pinheiros River weaves through diverse neighborhoods, connecting regions characterized by varying population densities and urban attributes, spanning from the northern to the southern parts of the city. Historically, the mid-20th century witnessed a transformation in the river's morphology when extensive straightening measures were applied, facilitating urban expansion into its floodplains, and subsequently leading to the construction of the Marginal Pinheiros expressway—an indispensable transportation artery for the city. Regrettably, these engineering interventions, compounded by the prioritization of road infrastructure lining its banks, have engendered multifaceted challenges. These include severe water



Figure 28: AI-generated image created by Group B.

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pollution issues, as well as the gradual isolation of the population from the riverbanks, which possess the latent potential to serve as recreational and leisure spaces.

In response to this complex context, recent years have witnessed gradual shifts in urban planning and environmental initiatives aimed at revitalizing the Pinheiros River. These endeavors encompass enhanced sewage collection and treatment systems, coupled with the establishment of linear parks along the river's course. Despite these promising developments, the transformation remains in its initial stages. Against this backdrop, Group B sought to imagine what this potential future might hold.

Similar to Group A, Group B initially defined keywords to create prompts in Midjourney and develop their initial ideas and proposals. In a subsequent phase, they began searching for reference images on the internet depicting the current state of the Pinheiros River, characterized by murky waters due to extreme pollution and expressways running along its banks. **The group used these reference images as a starting point to envision a river integrated into the daily life of the population, with clean waters that could be used by the community for leisure or transportation.**

This distinctive design approach employed by the team exhibits a captivating fusion of textual prompts with existing visual references, thereby enhancing the creative potential of the text-to-image AI tools. It underscores the versatility of this digital technology as a catalyst for architectural ideation, demonstrating its capacity to synergize with diverse data sources and imagery in the service of design innovation.

Group C

Group C proposed the conceptualization of a university building. An intriguing facet of this group was the inclusion of a director who had previously been involved in a significant project for a prominent university and medical research center in São Paulo. While the project's parameters were collectively established, each architect brought their own unique experiences and perspectives to the table, enriched by their past involvement in diverse architectural ventures. Notably, Group C also boasted a contingent of senior architects, including individuals holding the roles of senior project designer and senior project manager. This dynamic composition significantly influenced the discourse surrounding the project's design concept and its fundamental determinants.

In line with the methods embraced by the initial two groups, Group C initiated their creative journey by constructing textual prompts, seamlessly integrating them into the Midjourney platform. As the initial ideas took form and substance, the group seamlessly transitioned into the realm of sketching, a time-honored medium in architectural exploration. Through sketches, they ventured deeper into the intricate exploration of the university building's interior spaces, aiming to capture the essence of their design aspirations within the digital canvas.

One intriguing observation arising from Groups A & C is the engagement with the Midjourney platform was the discernible divergence in outcomes when textual prompts were employed as opposed to the incorporation of images or sketches with the prompts. When relying solely on text-based

prompts, the generated images bore a closer resemblance to traditional 3D architectural renderings. These outputs exhibited a heightened degree of realism, aligning more closely with conventional architectural visualization techniques.

In contrast, when both groups employed the combined power of textual prompts and accompanying images or sketches, the generated images manifested a certain sketched quality. These outputs retained an element of artistic interpretation, offering a hint of fluidity and hand-drawn aesthetics within the digital domain. What set this approach apart was the initial input provided by sketches, which introduced a distinct layer of creativity and personal expression into the design process.

In practice, both types of generated images, the more realistic and the somewhat sketch-like, complemented each other effectively. They contributed to a more comprehensive discussion of the design concept. The advantage of the latter, which incorporated sketches, lay in its capacity to initiate the process with a more expressive and intuitive input, ultimately enriching the ensuing digital exploration with a unique touch of the architects' creative intent.



Figures 29-32: AI-generated images created by Group C.

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Group D

Group D attempted to conceive a “Care Center.” In contrast to their counterparts, this group chose to decline supplementary ideation methods, relying solely on Midjourney for the inception of their concepts. This approach had a discernible impact on the evolution of their ideas and subsequently influenced the results obtained. It’s essential to underline that the research’s primary aim did not encompass intervening or exerting influence over the design processes of the participating groups; its role remained nonintrusive.

The decision to rely solely on textual prompts for ideation within the Midjourney platform presented a considerable challenge. It became apparent that architects faced significant obstacles in understanding the complexities of Midjourney’s syntax and how the arrangement and significance of words could wield substantial influence over the outcomes. Additionally, the necessity to provide text inputs in English, a language not native to any of the participants, introduced an extra stratum of difficulty to the process.

It is of paramount importance to underscore that architects are inherently predisposed to conceive, deliberate upon, and elucidate ideas primarily through the medium of sketches and drawings. This natural inclination toward visual expression posed a contrasting dynamic to the primarily text-based approach, further emphasizing the complexity of the endeavor.

The experience made by this group shed light on the need for architects to acquire an understanding of how to effectively communicate with AI tools. Just as spoken



Figures 33-35: AI-generated images created by Group D.



languages have their unique sets of rules and syntax that speakers must comprehend to convey their ideas effectively, programming languages, and more specifically, AI tools, possess their own set of rules and structures. These rules must be comprehended to establish a seamless dialogue with computers and harness the technology to one's advantage in the architectural design process. Mastery of this digital language is increasingly becoming an essential skill for architects, enabling them to bridge the gap between their creative vision and the capabilities of AI-driven platforms.

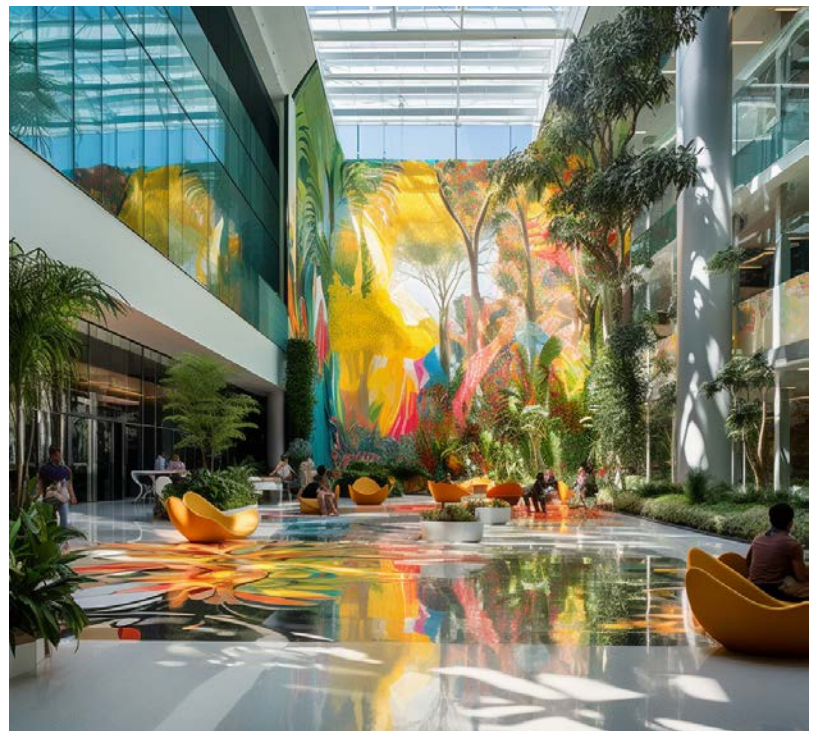
Group E

Group E adopted a distinct approach compared to the other groups. Their objective centered on conceptualizing the headquarters of a cosmetics company, which also happened to be a client of the São Paulo studio. Rather than starting the process with a predetermined set of architectural precepts or stylistic preferences, they explored into the foundational principles of the client's mission, values, and visionary pursuits.

By examining the client's mission statement, core values, and long-term aspirations, the architects sought to establish a profound alignment between the architectural narrative and the client's corporate identity.

This exercise sought to encapsulate a full comprehension of the client's operational principles, cultural values, and spatial requirements. Consequently, the textual prompts generated were infused with an intrinsic understanding of the client's distinctive identity. These prompts did not

**Company Values:
creative and
innovative, joyful and
happy, enthusiastic,
diverse and full of
people, trustworthy,
sincere, satisfaction,
beautiful, inclusive,
collectivity and
teamwork**



Figures 36 : Key-words and AI-generated images created by Group E.

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merely delineate architectural elements but encapsulated a nuanced comprehension of the client's aspirations and organizational culture.

Moreover, the composition of Group E, comprising architects of the Corporate Interiors sector, added an additional layer of depth to this exercise. This validation by architects specializing in this architectural typology engendered a notable dimension of intrigue, affording compelling insights into the tool's efficacy and its potential ramifications.

In sum, Group E's approach to architectural ideation transcended traditional paradigms, forging a dynamic interplay between corporate ethos, architectural form, and the innovative potential of AI-driven design. This atypical exploration exemplified the capacity of AI tools to engage in a meaningful dialogue with the multifaceted dimensions of contemporary architectural practice.

Chapter Discussion

The groups' endeavors into architectural design, augmented by the integration of AI, have illuminated a range of opportunities within the architectural landscape. These explorations displayed the multifaceted roles that AI can play in shaping contemporary architectural practice.

Group A's synthesis of natural materials with digital ideation showcases how AI can serve as a catalyst for sustainable, nature-inspired architectural innovation. In parallel, Group B's embrace of textual prompts and visual references highlights AI's potential in addressing complex urban and environmental challenges. The diverse themes and methodologies adopted by these groups underscore the adaptability

and versatility of AI tools as enablers of architectural creativity.

Group C's venture into university building design shows the capacity of AI to foster interdisciplinary discourse. By seamlessly integrating textual prompts with sketches, this group unveiled a harmonious convergence of traditional and digital approaches.

Group D's exploration, centered exclusively on textual prompts, underscores the need for architects to master the language of AI. The challenges encountered by this group emphasize the imperative of AI literacy within the architectural profession. AI's role as a digital collaborator, akin to mastering a distinct language for design communication, holds transformative potential for architectural practice.

Lastly, Group E's engagement with corporate identity elucidates AI's role in forging a profound alignment between architectural concepts and organizational values. By infusing AI-generated textual prompts with nuanced understanding, architects can craft designs that resonate with the essence of a client's mission and vision. The validation of AI-generated concepts by architectural experts reaffirms the potential of AI to harmonize architectural ideation with real-world requirements.

In sum, the groups' findings collectively exemplify the multifaceted collaboration between architects and AI. **The architectural profession stands at a transformative juncture, where AI serves as a versatile collaborator across diverse domains.** Architects can harness AI's capabilities to propel sustainable design, address urban challenges, facilitate interdisciplinary discourse, and align architectural narratives with corporate identities.

Final on-line form for participants

Following to the workshop, a comprehensive online questionnaire was administered to the participants, soliciting their reflections and insights. This post-workshop survey sought to gauge any perceptible shifts in participants' perspectives concerning Artificial Intelligence tools in architectural design.

Furthermore, it aimed to identify the primary challenges encountered during the workshop, emphasizing the critical areas where participants faced hurdles when interfacing with AI-powered design platforms. Participants were also encouraged to share their thoughts on the extent to which they were able to guide the AI tools toward achieving their intended design outcomes.

The survey inquired about participants' viewpoints regarding the most feasible stages within the architectural design process for the application of the AI tools featured in the workshop. Additionally, participants were asked to articulate their post-workshop impressions, delineating the advantages, obstacles, and overarching challenges they perceived in the integration of Artificial Intelligence within the architectural design process.

The collective responses to these inquiries serve as a valuable supplementary dimension to the findings of this study, offering a more comprehensive understanding of the participants' evolving perceptions and informed conjectures concerning AI's role in architecture.

After your participation in the workshop, did your perception of Artificial Intelligence tools change?

A common thread among participants was their surprise at AI's image generation capabilities. The AI's ability to create sophisticated architectural visuals was viewed as impressive and enlightening. This newfound knowledge fueled curiosity and prompted participants to consider applications they hadn't previously contemplated. They acknowledged AI's capacity to assist in generating design concepts and providing visual representations of architectural ideas, though they recognized the need for refining techniques for optimal effectiveness.

However, this enthusiasm was coupled with an acknowledgment of the challenges inherent in working with AI tools. Several participants highlighted the difficulty of creating text prompts that the AI could consistently and accurately interpret. They identified the necessity of delving deeper into AI syntax and language processing, understanding that realizing AI's full potential demanded a nuanced grasp of word usage, phrases, and context within these digital systems.

For some, the workshop didn't fundamentally alter their perception of AI, as they already possessed prior knowledge of the technology. Nevertheless, their participation provided a valuable opportunity to explore AI's architectural applications in a hands-on manner. They recognized that AI, while promising, was still in its infancy within

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architecture. However, the workshop offered valuable insights into its potential roles, including as a tool for reference and design exploration.

A recurring consensus was evident among participants: the belief that AI could serve as a supplementary tool, enhancing the efficiency and creativity of architectural work. It was seen as a means to streamline routine tasks, freeing architects to concentrate on higher-level design thinking. Furthermore, participants regarded AI as a catalyst for idea generation, capable of providing fresh insights and solutions when used as part of a collaborative, two-way relationship between

the user and the AI tool.

While some participants expressed astonishment at the quality of AI-generated images, they also recognized certain limitations, such as the need for more precise input and the ongoing evolution of AI capabilities. Nevertheless, the workshop left them with a sense of optimism, understanding that this technology had the potential to be an invaluable ally in the architectural process. Continued exploration, experimentation, and adaptation to evolving AI capabilities were seen as key to harnessing its potential effectively.

OBSERVATIONS	RECOMMENDATIONS
Participants expressed surprise at AI's image generation capabilities, finding them impressive and enlightening.	Explore and leverage AI's image generation capabilities in design processes to enhance visual representation and conceptualization.
Participants acknowledged AI's capacity to assist in generating design concepts but highlighted the need for refining techniques for optimal effectiveness.	Invest in training programs to enhance participants' proficiency in using AI tools and refining techniques for better integration into the design process.
Challenges were acknowledged in creating text prompts that AI could consistently and accurately interpret.	Provide additional training on AI syntax and language processing to improve participants' ability to formulate precise text prompts.
Some participants, despite prior knowledge, found value in exploring AI's architectural applications in a hands-on manner.	Encourage ongoing hands-on exploration and experimentation with AI tools to foster deeper understanding and uncover potential applications.
Participants believed AI could serve as a supplementary tool, enhancing efficiency and creativity in architectural work.	Develop guidelines for integrating AI as a supplementary tool in architectural workflows, emphasizing efficiency and creativity.
AI was seen as a catalyst for idea generation in a collaborative relationship between the user and the AI tool.	Promote collaborative approaches where architects actively engage with AI tools for idea generation, fostering a two-way relationship.

Table 03: Observations and Recommendations for Question #01.

Do you believe you were able to guide the Artificial Intelligence tool to achieve the expected results?

The participants’ experiences in directing AI tools to meet their expectations were characterized by a sense of both accomplishment and complexity. Several participants acknowledged that they were partially successful in guiding AI tools towards their intended outcomes. However, they noted that when they attempted to refine and attain more precise results, the AI’s responses often deviated from their original objectives. This deviation sometimes led them to unexpected places, although they were pleasantly surprised by the AI’s capabilities. It became apparent that the AI often interpreted prompts quite

literally, highlighting the need for a more nuanced approach.

Others expressed a more affirmative stance, affirming that they were able to direct the AI tools to achieve the expected results, although after several attempts and refinements. These participants mentioned that their groups ultimately achieved outcomes that aligned with their initial expectations, demonstrating a learning curve in effectively communicating with the AI.

There were also participants who described their experience as “partially successful,” indicating that while some results met their expectations, others required better direction when structuring prompts. They recognized that achieving the desired outcome often depended on the effectiveness of the

OBSERVATIONS	RECOMMENDATIONS
Participants noted challenges when attempting to refine results, highlighting the literal interpretation of prompts.	Participants noted challenges when attempting to refine results, highlighting the literal interpretation of prompts. Provide guidance on formulating nuanced prompts, emphasizing the importance of a nuanced approach in communicating with AI to achieve desired outcomes.
Some participants found success in specific scenarios but faced challenges in more complex situations.	Offer specialized training on handling complex design scenarios, providing participants with tools and strategies to address variations in AI responses.
Success in directing AI was seen as contingent on user or team direction, not solely on AI capabilities.	Emphasize the collaborative relationship between users or teams and AI tools, highlighting the role of effective direction in achieving successful outcomes.
Some participants acknowledged the limitations of AI in handling highly abstract or imaginative concepts.	Foster realistic expectations by acknowledging AI limitations and provide alternative approaches for handling abstract or imaginative design concepts.

Table 04: Observations and Recommendations for Question #02.

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prompt's formulation.

Some participants began with affirmative responses, noting that initially, the AI tools delivered highly satisfactory results aligned with their project goals. However, as they expanded their scope to more complex scenarios, such as designing a complex space they encountered significant variations in the AI's responses.

A common thread across participants' responses was the acknowledgment that while directing AI was possible, it often required close attention and a focused approach to achieve results closely aligned with their initial ideas. Participants recognized that success wasn't solely contingent on AI tool capabilities but also hinged on the direction provided by the user or team.

Many participants reflected on the initial difficulties they encountered in their attempts to guide the AI. They described the challenges of working with highly complex and imaginative ideas, emphasizing that AI often responded more effectively to text prompts than to blends of two AI-generated images. Over time, participants developed a better

understanding of how the AI interpreted words and commands, allowing them to fine-tune their instructions more precisely. In some instances, participants had to acknowledge the limitations of AI, especially in handling highly abstract or imaginative concepts, leading them to redirect their efforts.

While a few participants indicated that they still needed to gain a better understanding of how to use AI effectively, others expressed confidence in their ability to work with these tools. They viewed the workshop as a valuable starting point for further exploration and experimentation with AI tools, particularly in the context of architectural design development.

In conclusion, participants' responses highlighted a spectrum of experiences in directing AI tools to achieve expected outcomes. Their reflections underscored the need for nuanced communication with AI, recognizing that success often required iterations, adjustments, and an evolving understanding of the tools' capabilities.

In which stages of the design process do you think it is feasible to apply the Artificial Intelligence Image Generation tools shown in the workshop?

Participants widely agreed that AI Image Generation tools find the most meaningful application in the initial stages of design, particularly during project conceptualization. AI was perceived as a valuable resource for quickly generating references, conducting simulations of facades and materials, and creating visual and graphic explorations of design concepts. These tools were seen as instrumental in producing initial design ideas, facilitating communication with clients, and streamlining the early phases of design.

Participants highlighted AI's utility in

generating keywords and mood boards to validate design directions with clients, particularly during the often-unpaid phases of study and prospecting. By reducing the time required to create these visual representations, AI supported architects in the initial ideation and communication process.

The consensus was that AI tools were especially helpful in the conception and presentation of proposals for both building and interior design. They aided in generating design concepts, referencing images, and inspiring creativity.

Generative AI tools like those explored in the workshop were deemed suitable for preliminary studies and concept creation. They were seen as conducive to

OBSERVATIONS	RECOMMENDATIONS
Using AI to expand creative thinking and refine initial ideas was widely accepted.	Encourage architects to utilize AI as a tool for broadening design possibilities and improving the quality of early-stage design work.
AI was perceived as an enabler for architectural creativity	Foster a culture that embraces AI as a catalyst for creativity, encouraging architects to explore new design possibilities and think beyond conventional constraints.
Participants recognized diverse applicability of AI tools across multiple stages of the architectural design process.	Facilitate forums for knowledge-sharing among architects, promoting the exchange of insights and experiences in applying AI across various design stages.
AI tools were seen as suitable for preliminary studies and concept creation, fostering unconventional design possibilities.	Encourage architects to explore unconventional design possibilities using AI, emphasizing the tools' capacity to push beyond initial imagination.
AI tools were deemed especially helpful in the conception and presentation of proposals for building and interior design.	Provide targeted training on AI applications for proposal generation, emphasizing design concepts, image referencing, and creativity inspiration.

Table 05: Observations and Recommendations for Question #03.

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“thinking outside the box” and exploring unconventional design possibilities, even beyond the architects’ initial imagination.

The potential applications of AI were noted from the inception of the project to the development of concepts and ideas. Participants expressed enthusiasm for AI’s ability to assist in creating unique patterns and textures for images and renders, a practice they believed should be more prevalent in the field. Additionally, AI was viewed as a means to translate clients’ sometimes vague descriptions into tangible design concepts.

The early phases of design, such as feasibility studies, were identified as an ideal stage for AI utilization. AI’s capacity to provide references and aid in the generation of design ideas was particularly valuable during this phase.

Participants suggested that, with greater mastery of AI tools, they could be applied in various design stages, including interiors and detailing. The consensus was that AI could potentially benefit all phases of architectural work, provided architects become more proficient in these tools.

The idea of using AI to expand creative thinking and refine initial ideas in the form of sketches or collages was widely accepted. AI was perceived as a tool for broadening the spectrum of design possibilities and improving the quality of early-stage design work.

Participants emphasized AI’s role in exploring new design possibilities, expanding references, and thinking beyond conventional design constraints. AI was regarded as an enabler for architectural creativity, pushing the boundaries of design concepts.

In conclusion, participants recognized the diverse applicability of AI tools across multiple stages of the architectural design process. Their insights revealed a collective perception of AI as a valuable resource for enhancing creativity, streamlining communication with clients, and facilitating the early stages of design. This consensus underscores the potential of AI to transform architectural practice by empowering architects with innovative tools and approaches.

After your participation in the workshop, what are the advantages, difficulties, and challenges of using Artificial Intelligence Image Generation in the architectural design process?

Advantages of AI Integration:

One of the most prominent advantages highlighted by participants is the agility and vast range of references that AI tools offer. They noted that AI allows for rapid generation of design references and facilitates concept development, streamlining the initial stages of project ideation. This prompt workflow

enables architects to quickly explore design alternatives and generate new ideas.

Moreover, AI’s ability to provide an almost infinite and novel repertoire of design images and concepts was emphasized. Participants recognized that AI-generated images are inherently diverse and continually evolving, offering architects access to an array of creative inspiration.

The speed at which AI can generate images emerged as a significant advantage, enabling architects to visualize their design ideas swiftly. This accelerated image generation process aids in concept materialization

OBSERVATIONS	RECOMMENDATIONS
Technical competence in navigating AI tools is identified as an obstacle.	Provide skill development programs to enhance architects' technical proficiency in effectively using AI tools, ensuring they can articulate design concepts within the AI framework.
Overcoming resistance among traditional architectural professionals is a significant challenge.	Implement awareness programs within the studio to foster acceptance and adoption of AI in architectural practice.
Data security concerns and responsible usage of sensitive project data are challenges.	Develop clear guidelines and protocols for data security within AI platforms, ensuring architects have confidence in the responsible usage and protection of project data.
Maintaining diversity in design solutions and avoiding overreliance on AI-generated ideas is a challenge.	Encourage architects to balance AI-generated ideas with human creativity, preserving a diverse range of design solutions.
Ensuring the quality and contextual relevance of AI-generated results is a complex challenge.	Implement validation processes and oversight mechanisms to ensure the quality and contextual relevance of AI-generated outputs, especially in local and cultural contexts.

Table 06: Observations and Recommendations for Question #04.

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and the effective communication of design proposals.

AI was also perceived as a means of enhancing creativity. Participants noted that it fosters fresh insights and proposals that architects may not have arrived at independently or that would have taken significantly more time to develop. Additionally, AI was seen as a valuable tool for improving client collaboration by creating visual representations that facilitate client understanding and feedback.

Difficulties Encountered:

Despite its advantages, participants acknowledged several difficulties associated with AI integration. Understanding how AI comprehends and interprets architectural language and instructions posed a common challenge. Participants found it challenging to formulate accurate descriptions and commands that would yield the desired results.

Technical competence was another obstacle. Participants recognized the need to develop expertise in effectively navigating AI tools and its host platforms. This entails acquiring the skills to articulate design concepts within the AI framework, a skill set crucial for maximizing AI's potential.

Participants also acknowledged that AI tools are still in the developmental stage, occasionally leading to imperfect outputs. They noted the importance of understanding AI's capabilities and limitations, actively participating in its refinement, and not solely relying on its results.

Challenges Faced:

In addition to difficulties, participants identified broader challenges related to AI integration in architectural design. Overcoming resistance and prejudice among more traditional architectural professionals was recognized as a significant challenge. Encouraging widespread acceptance and usage of AI in architectural practice necessitates cultural shifts within the industry.

Concerns surrounding data security and the handling of data within AI platforms were highlighted as pertinent challenges. Architects seek assurances regarding the responsible usage and protection of sensitive project data.

Maintaining diversity in design solutions and avoiding overreliance on AI-generated ideas to prevent conventional and biased outcomes was another challenge discussed. Participants emphasized the importance of preserving human creativity and ingenuity in the design process.

Professional adaptation to the rapidly evolving landscape of AI tools was also identified as a challenge. Architects need to continually update their skills and stay informed about AI's development and integration into practice.

Ensuring the quality and contextual relevance of AI-generated results, particularly concerning local and cultural contexts, was recognized as a complex challenge. This entails meticulous oversight and validation of AI-generated outputs.

Do you think Artificial Intelligence will change our profession? How?

On Collaboration:

Many participants expressed optimism about AI’s potential to become a valuable ally in architectural design. They envisioned AI as a tool that could assist in the creation of new architectural projects and, more notably, automate manual aspects of the design process. This automation, they believed, would allow architects to allocate more time and focus toward studying and developing superior solutions.

Furthermore, participants recognized AI’s capacity to optimize various processes within architecture and present technical solutions. However, they emphasized that AI should be seen as a complement rather than a replacement for the sensitivity and expertise

of skilled architects. In this view, AI would revolutionize the industry but not supplant its human professionals.

On Transforming Processes:

The consensus among participants was that AI’s impact on architecture would manifest in two phases. In the short term, AI would accelerate processes, enhancing efficiency and aiding in tasks like image generation. However, participants envisioned a more profound transformation in the long term, where AI could potentially replace entire processes, from creative ideation to repetitive tasks, such as design documentation and detailing.

They saw AI as a tool for initial project development, generating variations and improved versions of initial concepts. Additionally, AI could streamline tasks related to project feasibility and legislative compliance. This shift might enable

OBSERVATIONS	RECOMMENDATIONS
AI is seen as a complement, not a replacement for skilled architects.	Implement awareness programs emphasizing the collaborative nature of AI and its role as a complement to human expertise, ensuring architects embrace AI as a supportive tool.
AI could streamline tasks related to project feasibility and legislative compliance.	Provide specialized training on AI applications in project feasibility and legislative compliance, enabling architects to leverage AI for these specific tasks while maintaining decision-making control.
AI is anticipated to impact the evolution of architectural design styles.	Foster a balance between AI-driven innovation and human creativity by promoting a collaborative mindset, acknowledging AI’s potential while preserving the essence of human creative input.

Table 07: Observations and Recommendations for Question #05.

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architects to dedicate more time to informed decision-making.

Nonetheless, participants recognized that these changes would likely affect work hours and the distribution of responsibilities within architectural firms. They raised questions about how the industry would adapt to these shifts and the role of human professionals in decision-making processes.

On Human-Computer Interaction:

Several participants emphasized the collaborative aspect of AI integration. They believed that architects would need to actively contribute to and guide AI systems, feeding them with knowledge, technical expertise, legal regulations, and architectural principles. In this vision, architects would become stewards of AI, harnessing its capabilities for more efficient and innovative architectural solutions.

On Design Evolution:

Participants also anticipated that AI would impact the evolution of architectural design styles. They speculated that AI could contribute to the emergence of new architectural movements, characterized by digital fabrication and innovative design approaches. Simultaneously, they foresaw a counter-culture movement in Academia and among some architects, preserving the human creative essence in contrast to AI-aided designs.

In conclusion, participants' perspectives on the influence of AI on the architectural profession are diverse and multifaceted. While many foresee AI as a powerful tool that can enhance architectural processes, they also underscore the irreplaceable role of human architects in creative decision-making and design. The trajectory of AI's integration into architecture remains a subject of ongoing exploration, offering both opportunities and challenges for professionals in the field.

Chapter III

Guidelines for the implementation of AI Image Generation tools in the Design Process

Chapter II

Guidelines for the implementation of AI Image Generation tools in the Design Process

“AI makes smart people faster, it doesn’t make people smarter.”

SHRESHT NAGPAL, VICE PRESIDENT AT INTROBA

Digital Practice Core eXchange - Our Use of AI at Perkins&Will, July 18th 2023

In the realm of architectural design, the incorporation of state-of-the-art technologies stands out as a crucial determinant in molding the future trajectory of the industry. Illustrating this profound shift, the present research takes cues from the implementation strategy utilized by Veiga (2021), who successfully integrated daylight simulation tools into the design process of a prominent architectural design firm in Brazil.

This systematic methodology breaks down the implementation process into four interdependent areas: **Technology, Process, People** and **Management**. In the Technology phase, the focus is on selecting digital tools for the company’s design process, considering objectives, complexity, cost, and the team’s skills. Subsequently, in the Process phase, steps are developed to seamlessly integrate this chosen technology into the company’s design process. This involves defining stages, establishing data exchanges, and clarifying responsibilities. The People aspect follows, where the process is structured to empower company employees to adeptly operate the technology based on their existing knowledge and skills. Supporting documents and training are provided to ensure a smooth transition. The final phase, Management,

involves a comprehensive analysis of implementation results against predefined objectives. This evaluation considers project quality, stakeholder value perception, and competitive advantage. The method underscores the interdependence among these areas, emphasizing the importance of a systematic diagnosis at each phase.

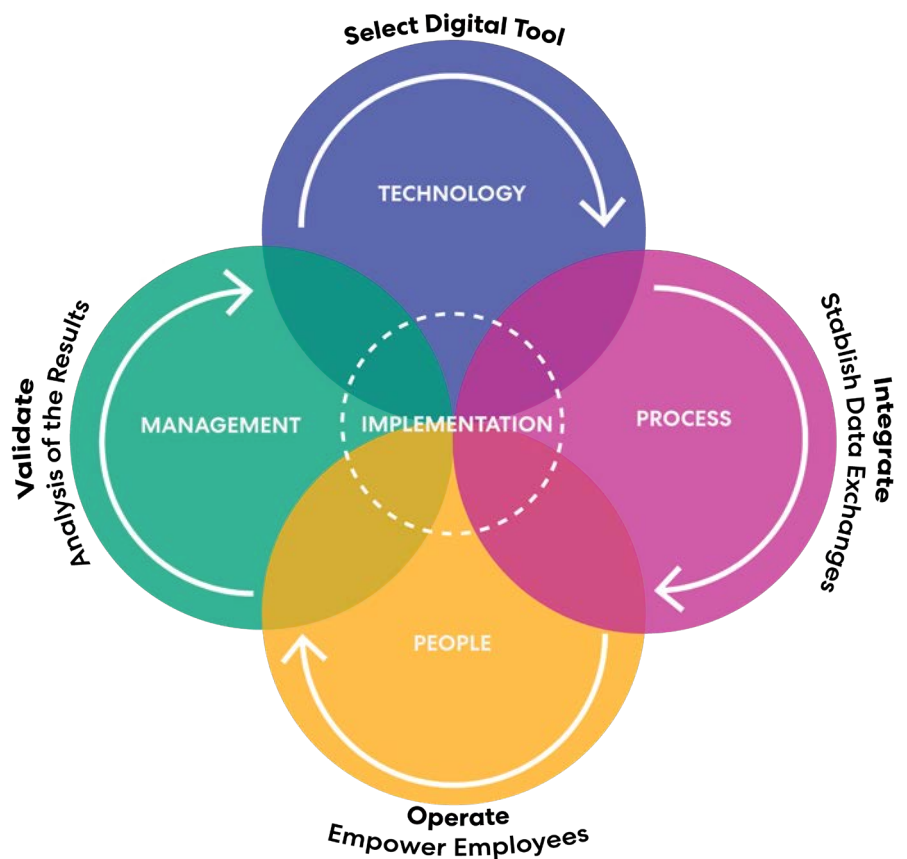
As AI technologies offer exceptional capabilities in architectural visualization and concept development, architects and design professionals must meticulously evaluate the best-suited technologies. The selection of AI tools should be informed by a deep understanding of their potential applications at various stages of the design process. This involves not only identifying the most suitable AI platforms but also assessing how these tools can seamlessly integrate into the architectural workflow. The technology chosen should align with the requirements and goals of the architecture studio, ensuring that it complements the existing design processes rather than disrupts them.

Furthermore, it is paramount to discern how these technologies can be effectively applied at various junctures of the design management process. Education and training emerge as critical components here.

Architects and staff within architectural firms should receive comprehensive training in AI image generation, encompassing not only the technical aspects but also the creative and conceptual dimensions, as well as how to critically consume these tools. This equips them with the skills and insights needed to leverage AI as a powerful ally in the design process, enhancing creativity, efficiency, and innovation.

Additionally, adept management of this implementation, considering both its immediate and long-term implications, is central to its overall success. Architects and design managers must be cognizant of the challenges and opportunities that AI integration presents. A clear and adaptable management strategy should be in place, addressing issues such as data security, quality control, and the evolving landscape of AI capabilities. It's essential to strike a balance between embracing the potential of AI and maintaining the essential human touch in architectural design.

The following guidelines have been formulated based on the feedback from participants who actively engaged in the workshop discussions, as well as insights gleaned from the review of literature review. By synergizing the practical experiences and reflections of workshop participants with the insights drawn from the broader architectural discourse, these guidelines encompass a thorough range of considerations. They aim to empower architecture studios to navigate the terrain of AI implementation, considering both the experiential and theoretical dimensions of this technology.



Graph 03: Proposed Method of Implementation based on Veiga (2021).

Chapter III: Guidelines for the implementation of AI Image Generation tools in the Design Process

Technology

Architectural firms should assess the potential of AI tools, considering their image generation capabilities and compatibility with existing software. The seamless integration of these tools into the studio's technological framework is of paramount importance, with a particular emphasis on aligning them with architectural software and data formats. Expanding beyond the realm of tools, the section on Data Management and Quality Control emphasizes the critical role of curating high-quality architectural data. A well-organized and clean dataset is identified as a crucial element for effectively training AI models, enabling them to produce accurate and contextually relevant design images. Concurrently, the necessity for robust data security measures is underscored to safeguard the confidentiality of sensitive architectural information. Within the domain of Training and Skill Development, architects are urged to foster technical proficiency in utilizing AI tools. Strategic investments in training programs are deemed essential to equip architects with the necessary skills for seamless interaction with AI systems. Moreover, an intricate understanding of AI syntax and language processing is deemed indispensable, facilitating the crafting of precise text prompts that yield desired outcomes.

1. AI Tool Selection and Integration

1.1. Evaluate AI Tools Carefully: Architectural studios should conduct thorough assessments of available AI tools to identify those most suited to their specific needs. Paramount among these considerations is an in-depth exploration of the AI tool's image generation capabilities. The ability to create sophisticated and relevant architectural visuals is a critical aspect, as it directly influences the tool's efficacy in contributing to the design process. Compatibility with existing software within the architectural studio's technological ecosystem is another pivotal factor to analyze. Ensuring that the selected AI tool seamlessly integrates with the established software infrastructure is essential for cohesive and efficient workflow integration. Furthermore, the ease of integration itself is a key determinant, as a user-friendly and straightforward integration process can significantly impact the adoption and effectiveness of the AI tool.

1.2. Integrate AI Seamlessly: Ensure that selected AI tools can be seamlessly integrated into the existing technological infrastructure of the architecture studio. This integration demands meticulous attention to compatibility, ensuring that the chosen AI tools harmonize effortlessly with the established architectural software in use.

2. Data Management and Quality Control

2.1. Curate High-Quality Data: Prioritize the collection and curation of high-quality architectural data, like relevant sketches, keywords, plans, textures and materials. Clean, well-structured data is essential for training AI models to produce accurate and relevant design images. The quality of the input data profoundly influences the efficacy of AI models, shaping their ability to comprehend architectural nuances, trends, and design principles.

Moreover, this emphasis on data quality serves as a proactive measure in mitigating biases and inaccuracies that could potentially arise during AI model training. It establishes a robust framework wherein AI becomes a reliable and informed collaborator in the architectural design process. Thus, the deliberate curation of high-quality data emerges not only as a preparatory step but as an enduring commitment to fostering the synergy between AI capabilities and architectural creativity.

2.2. Data Security Measures: Implement robust data security measures to protect sensitive architectural information. A crucial aspect of data security within the architectural landscape is the careful consideration of materials that are fed into AI applications. Notably, certain materials, such as renders for ongoing projects, plans, and other sensitive content, should be treated with maximum caution, and excluded from the purview of AI processes. This discerning approach is essential to prevent inadvertent exposure of confidential information and uphold the integrity of ongoing

architectural projects.

Architectural professionals and companies bear the responsibility of developing and implementing policies governing the usage of AI within studios. It's noteworthy that, across the architectural landscape globally, policies for AI applications are still in the developmental stage in many firms. In the context of AI, the sharing of sensitive architectural material raises significant concerns. Given the dynamic nature of digital information and the lack of control over its subsequent storage and access, architectural studios are advised against sharing sensitive material without rigorous scrutiny. The absence of control over where the material is stored and who gains access to it poses inherent risks to the confidentiality and security of architectural data.

3. Training and Skill Development

3.1. Technical Proficiency: The emphasis on technical proficiency extends beyond a mere acknowledgment of AI's existence within the architectural landscape; it calls for a proactive approach in cultivating expertise among architectural professionals. These training initiatives should be crafted to offer hands-on experiences, enabling architects to navigate AI tools with confidence and efficacy. By delving into practical applications, architects can develop a profound understanding of how AI interfaces with the intricacies of architectural design. The goal is to foster a level of expertise that transcends theoretical knowledge, enabling architects to leverage AI tools as dynamic collaborators in the creative process.

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Investing in such training programs becomes pivotal for architectural studios aspiring to harness the full potential of AI. These initiatives should cover not only the technical aspects of AI tool usage but also the broader implications for design thinking processes. Architects need to comprehend not just the functionalities of AI tools but also how these tools can augment their creative insights, streamline workflows, and contribute to innovative design solutions.

3.2. AI Syntax and Language: AI Syntax and Language pose a distinctive challenge and opportunity. Developing a nuanced understanding involves more than a surface-level comprehension of how AI interprets language; it necessitates a profound grasp of the underlying mechanism that drive language processing. Architects need to comprehend the details of how AI translates textual inputs into actionable design outputs, navigating the particulars of syntax, semantics, context, and the significance assigned to words in a prompt.

The art of crafting prompts extends beyond conventional language use, demanding a sensitivity to the specific syntax preferences of AI models. Architects must become adept in tailoring their instructions to align seamlessly with the linguistic patterns that AI tools comprehend.

Design Process

At the intersection of architecture and AI, architects are confronted with the imperative of redefining their approach to design processes. In this section, the focus sharpens on the dynamic nuances of Collaborative Design Integration, transcending the conventional perception of AI as a mere tool to position it as an integral creative partner. Architects are encouraged to adopt a two-way interaction model, fostering collaboration that iteratively refines designs under the guidance of human expertise. The exploration extends beyond static methodologies to delve into Continuous Learning and Adaptation, underscoring the need for flexible workflows that adapt to the ever-evolving landscape of AI capabilities.

4. Collaborative Design Integration

4.1. AI as a Creative Partner: Encourage architects to view AI as a creative partner in the design process. Cultivate an atmosphere conducive to collaboration, fostering a dynamic synergy between architects and AI tools. Highlight the profound potential that emerges when human ingenuity intertwines with the computational capabilities of AI, emphasizing the transformative impact on the overall creative output of architectural endeavors. This paradigm shift encourages architects to not only harness AI for its technical prowess but to integrate it seamlessly into the collaborative fabric of the design process, thereby unlocking novel dimensions of creativity.

5. Continuous Learning and Adaptation

5.1. Experimentation Culture: Nurture an Experimentation Culture within the studio, fostering an environment where architects actively engage in experimentation and exploration. Encourage architects to delve into the creative possibilities offered by AI-generated concepts, providing them with the freedom to explore new possibilities. Emphasize the importance of experimentation as a catalyst for creativity and innovation, allowing architects to push boundaries and discover novel ways in which AI can enhance the design process.

People

The focal point rests on providing architects not just theoretical knowledge but, more importantly, hands-on experience. Educational initiatives are strategically poised to extend opportunities for architects to actively immerse themselves in the intricate realm of architectural design, engaging with AI applications. Acknowledging that well-informed professionals are better equipped to unlock the profound potential of AI, there emerges a strategic imperative for initiatives to ensure architects are not merely acquainted but deeply familiar with the

expansive capabilities and possibilities that AI introduces to the realm of architectural creativity.

6. Education and Training Initiatives

6.1. Hands-On Experience: Facilitate an immersive educational experience for architects by providing them with practical, hands-on exposure to AI tools. Educational initiatives should extend beyond theoretical knowledge, offering architects tangible and practical encounters with AI applications in the domain of architectural design. Emphasize the significance of practical exposure, enabling architects to actively engage with AI tools, fostering a deeper understanding of their functionalities and potential within the architectural creative process.

6.2. AI Familiarity: Promote a comprehensive understanding of AI among architects to ensure their familiarity with its capabilities and potential in the realm of design. It is imperative that architects possess knowledge that goes beyond mere awareness, enabling them to comprehend the intricacies of AI applications. Well-informed professionals are better equipped to harness the full spectrum of AI capabilities effectively within the architectural domain.

Chapter III: Guidelines for the implementation of AI Image Generation tools in the Design Process

Management

The focus converges on the imperative of Impact Assessment, urging the implementation of robust mechanisms to monitor the influence of AI on design processes. Regular evaluations become paramount, facilitating a nuanced understanding of AI's effectiveness, and allowing for agile adjustments where necessary. Recognizing the profound shifts that AI integration may necessitate, the discourse unfolds into Change Management. Architectural studios are prompted to acknowledge that the introduction of AI can reshape project management and design processes, necessitating a strategic implementation of change management strategies for a seamless transition. As the exploration evolves, the spotlight shifts to the realm of Innovation Support, emphasizing the creation of an environment that not only accommodates but actively encourages innovation through AI.

7. Strategy Development

7.1. Strategic Implementation: Strategic Implementation involves the meticulous development of a comprehensive plan for the seamless integration of AI into architectural design, encompassing both project and design management aspects. Architects and Managers are encouraged to define clear objectives, identifying specific use cases where AI can bring substantial value. This

entails a detailed articulation of guidelines governing AI usage, establishing a framework that outlines the goals to be achieved, the associated costs of implementation, and methods for evaluating the effectiveness of the AI implementation.

8. Monitoring and Evaluation

8.1. Impact Assessment: Implement mechanisms for monitoring the impact of AI on design processes. Regular evaluations should be conducted to measure the impact on efficiency, creativity, and overall project outcomes. The iterative nature of this assessment process allows architectural teams to make informed adjustments as necessary, ensuring that AI continues to align with evolving project requirements and contributes positively to the design processes.

9. Innovation Support

9.1. Encourage Innovation: Creating an environment that actively encourages innovation involves providing comprehensive support to architects as they explore novel applications of AI in their design endeavors. Emphasizing a mindset that embraces unconventional thinking and problem-solving becomes pivotal, encouraging architects to challenge traditional design paradigms through the creative integration of AI. Additionally, this support should extend to initiatives that specifically target design process innovation, ensuring architects have the resources and encouragement to reimagine workflows and methodologies.

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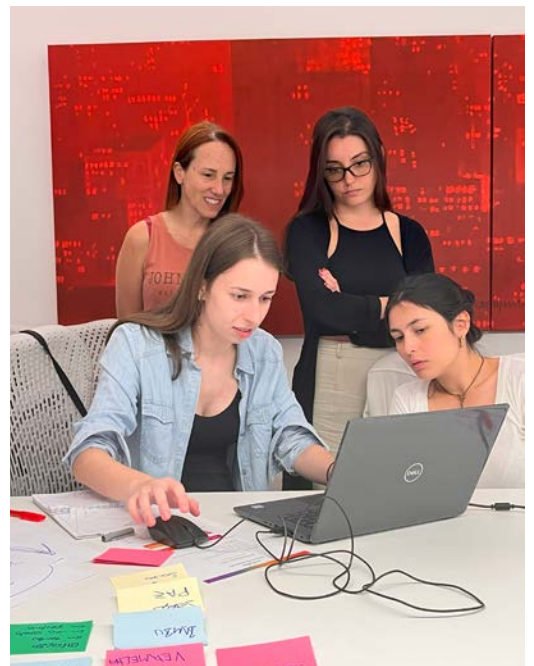
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Figures 37-43: Participants interacting during the AI Workshops.



Figures 44-46: Participants interacting during the AI Workshops.



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