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Integrating artificial intelligence (AI) into game development to elevate diverse gameplay elements

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Abstract

This study examines the transformative potential of Artificial Intelligence (AI) in game development, aiming to address challenges faced by traditional game development methods and enhance player experiences. The historical evolution of AI in gaming and current trends is explored, highlighting the increasing integration of AI and its impact on gameplay. Key challenges are identified in traditional game development, including limitations in handcrafted content and static AI behavior. Various applications of AI in game development, such as character behavior modeling, opponent AI, procedural content generation, dynamic difficulty adjustment, and natural language processing, are examined. The implementation strategies section outlines technical considerations, development methodologies, and available tools and frameworks for integrating AI into game development pipelines. Case studies on successful games leveraging AI techniques across different aspects of gameplay are investigated, emphasizing their impact on player engagement and retention. This study concludes by summarizing key findings, reiterating the importance of AI in shaping the future of game development, and urging developers to embrace AI technologies to create innovative and immersive gaming experiences.

Keywords: artificial intelligence, game development, gameplay enhancement, opponent intelligence, procedural content generation, interactive experiences, gaming innovation

Introduction

The evolution of Artificial Intelligence (AI) in gaming has been a fascinating journey marked by significant advancements and innovations. Initially, AI in gaming primarily relied on simple rule-based systems, in which predefined algorithms governed the behavior of non-player characters (NPCs) and opponents (Buede, 2013). These early implementations provided basic functions such as enemy movement patterns or decision-making in strategic games. As computing power increased, developers began experimenting with more sophisticated techniques, including heuristic search algorithms like minimax for games such as chess and checkers.

The late 20th century witnessed a surge in interest regarding neural networks and machine learning, leading to the integration of AI techniques capable of learning from experience and adapting to player strategies. Subsequently, genetic algorithms and evolutionary computation found applications in evolving behaviors and strategies for NPCs (Bankhurst, 2023). In recent years, breakthroughs in deep learning and reinforcement learning have revolutionized AI in gaming, enabling complex behaviors, natural language

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processing for dialogue systems, and dynamic content generation. Today, AI-powered NPCs exhibit human-like intelligence, offering players immersive and challenging gaming experiences that continue to push the boundaries of interactive entertainment.

Current trends in game development underscore the increasing integration of AI and its profound impact on gameplay dynamics (French, 2023). With AI technology advancements, modern games incorporate sophisticated AI systems to enhance player immersion, challenge, and engagement. AI-driven NPCs exhibit lifelike behaviors and responses, contributing to more realistic and dynamic game worlds. Furthermore, AI algorithms are employed to create procedurally generated content, including levels, maps, and quests, ensuring that each playthrough offers unique experiences (Hendrikx, 2013).

Additionally, dynamic difficulty adjustment mechanisms powered by AI analyze player performance in real time, ensuring optimal challenge levels tailored to individual skill levels. Moreover, AI-driven player analytics are utilized to understand player behavior patterns, enabling personalized experiences and targeted content recommendations (Pardede, 2022; Morina, 2023). The increasing prevalence of AI in modern games could elevate gameplay experiences and set the stage for continued innovation and evolution in the gaming industry.

Additionally, as player expectations evolve with advancements in technology and storytelling techniques, there is a growing demand for more dynamic and personalized gameplay experiences that traditional game development struggles to fulfill. Addressing these challenges necessitates a paradigm shift towards leveraging innovative AI technologies to introduce greater dynamism, unpredictability, and player agency into game worlds, ultimately enhancing the overall quality and longevity of gaming experiences (French, 2023).

The paper aims to explore the potential of AI techniques in addressing these challenges and enhancing game development. AI techniques are poised to become essential for navigating games' increasing complexities and dynamics. As hardware evolves, new modes of interaction will emerge, demanding more sophisticated AI capabilities. AI holds the transformative power to revolutionize the video game industry, reshaping both development processes and player experiences. AI has the potential to unlock unprecedented realms in terms of scale, realism, interactivity, and more, potentially transforming the gaming landscape as we know it today.

Features of AI in Game Development

This section contains several suggestions for implementing AI features to improve Game Development and end-user experiences.

Character Behavior

Behavioral patterns in AI could create more realistic and dynamic NPCs patterns. Character behavior could involve pathfinding algorithms for navigation, decision-making algorithms for interacting with the environment or other characters, and emotional modeling for more lifelike responses. Leveraging these AI techniques can help developers craft immersive and engaging worlds that respond intelligently to player actions. These AI techniques not only enhance the overall gaming experience but also provide a deeper sense of immersion and realism.

Pathfinding algorithms play a crucial role in creating more realistic and dynamic non-player character (NPC) behaviors in games (Pardede, 2022; Morina, 2023). These algorithms enable NPCs to navigate their

environments efficiently and naturally, finding optimal paths from one point to another while avoiding obstacles and adapting to changes in the terrain. Implementing advanced pathfinding techniques such as A* (A-star), Dijkstra's algorithm, or more sophisticated methods like navigation meshes and flow fields, developers can ensure that NPCs move in a lifelike manner, enhancing the overall immersion of the game (Wayahdi, 2021). Effective pathfinding improves the realism of NPC movements and contributes to more engaging and believable interactions within the game world.

Decision-making and behavior trees enhance the complexity and authenticity of NPCs behaviors in games (Uludagli, 2023; Sekhavat, 2017). These AI techniques allow NPCs to make intelligent, context-aware decisions by breaking down behaviors into manageable, hierarchical structures. Behavior trees enable developers to design intricate sequences of actions and responses, ensuring that NPCs can react dynamically to a wide range of in-game situations (Hendrikx et al., 2013). This approach can allow for creating more sophisticated and believable character behaviors, as NPCs can evaluate their environment, prioritize tasks, and execute actions based on predefined conditions and rules. According to Togelius (2019), by utilizing decision-making algorithms and behavior trees, game developers could craft NPCs that exhibit lifelike autonomy and adaptability, significantly enhancing player immersion and the overall gaming experience.

Analyzing player behavior and involving engagement metrics can be used to optimize game design and marketing strategies. This could involve predicting player churn, identifying engagement patterns, and tailoring game experiences to maximize player retention and satisfaction. Data-driven insights can help developers understand which features resonate most with players, guiding future updates and content creation. Additionally, personalized marketing campaigns can be crafted based on player preferences and behaviors, leading to more effective user acquisition and retention strategies.

Emotional modeling is a powerful technique for creating NPCs with lifelike responses, adding depth and realism to their interactions (Uludagli, 2023). By simulating emotions, NPCs can exhibit a range of behaviors and reactions that mirror human emotional responses, making them appear more relatable and engaging to players. This involves implementing systems that track various emotional states, such as happiness, fear, anger, or sadness, and adjusting NPC behavior accordingly (Zhu, 2019). For example, an NPC might show fear and flee from danger, express joy upon receiving good news, or display anger when provoked. Emotional modeling enhances the believability of NPCs, as their actions and dialogues are influenced by their emotional states, leading to richer, more dynamic interactions and a more immersive gaming experience (Wehbe et al., 2019).

Opponent AI

Adaptive AI algorithms can be used to create challenging opponents in games such as strategy games, firstperson shooters, or fighting games (Xiong, 2019). These algorithms could learn from player behavior or use techniques like decision trees, finite state machines, or neural networks to make decisions. Adaptive AI algorithms that learn from a player's behavior represent a significant advancement in game development, offering a dynamic and personalized gaming experience (Tomai, 2014). This approach can ensure that the difficulty level remains appropriate and engaging, keeping players invested and continually challenged.

Machine learning techniques can analyze and interpret player actions, strategies, and patterns over time, adjusting their own behavior to provide an appropriate level of challenge. These techniques allow players to improve and change their tactics while at the same time the AI opponents can also evolve, preventing the gameplay from becoming predictable or stale. Such adaptability ensures that the game remains engaging, requiring players to continually refine their skills and strategies to succeed against increasingly sophisticated AI opponents.

Decision-making techniques like decision trees, finite state machines, and neural networks are fundamental tools in developing intelligent AI for games (Sekhavat, 2017). Decision trees can provide a structured way to model complex decision-making processes, allowing AI to choose actions based on a hierarchy of conditions. Finite state machines manage state transitions, enabling AI characters to switch between different behaviors based on specific triggers (Cerny et al., 2016). On the other hand, neural networks offer more advanced capabilities, allowing AI to learn and make decisions based on patterns identified in large datasets (Janiesch, 2021). These techniques can collectively enable the creation of nuanced and responsive AI behaviors, contributing to more immersive and challenging gameplay experiences.

Procedural Content Generation

Procedural content generation can play a pivotal role in creating diverse and expansive game worlds. Hendrikx et al. (2013) explored several AI techniques that can be used to generate game content procedurally, such as levels, maps, textures, and even quests. Procedural content generation can help keep the game fresh and engaging for players by providing unique experiences each time they play. Using AI algorithms, developers can automatically generate intricate levels, maps, textures, and quests, ensuring vast content without requiring exhaustive manual design (Tassi, 2023). This approach allows for the creation of unique and varied environments, enhancing players' sense of exploration and discovery. Procedurally generated quests can also introduce dynamic storytelling elements, offering different challenges and narratives tailored to each playthrough. This saves development time and enriches the game with endless possibilities and combinations, making each player's journey distinctive (Liu, 2021).

Keeping a game fresh and engaging is essential for sustaining player interest and longevity, and procedural content generation excels in this regard. Procedural content generation prevents gameplay from becoming monotonous, as players consistently face new challenges and environments to explore. Additionally, AI-driven procedural content generation can adapt to player preferences and behaviors, further personalizing the experience. This perpetual novelty ensures that players remain captivated and motivated to return, enhancing overall engagement and replayability.

Dynamic Difficulty Adjustment

Charles (2004) investigated how AI systems could be implemented to adjust the game's difficulty dynamically based on player performance. This can help ensure that players are appropriately challenged without becoming frustrated or bored. Charles (2004) indicated that AI systems designed to adjust difficulty based on player performance can create a balanced and engaging gaming experience. Charles (2004) results indicated that these AI systems can continuously monitor various metrics of a player's performance, such as skill level, progress, and response times, to dynamically alter the game's difficulty. For instance, if a player is consistently excelling, the AI might introduce tougher enemies, more complex puzzles, or reduce resources to increase the challenge. Conversely, if a player struggles, the AI can scale back the difficulty by simplifying tasks or providing additional assistance.

Zohaib (2018) researched how balancing challenges and frustration is crucial for optimizing the player experience, and that dynamic difficulty adjustment (DDA) systems excel in this area. Zohaib (2018) discussed how finely tuning the game's difficulty in response to a player's performance, these AI systems maintain an optimal level of challenge that keeps players engaged without leading to excessive frustration or boredom. Zohaib (2018) found that a well-balanced game ensures that players feel a sense of accomplishment and progress, motivating them to continue playing. Zohaib (2018) concluded that dynamic adjustments prevent scenarios where the game becomes too easy and uninteresting or too difficult and

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discouraging, thereby enhancing overall satisfaction and retention. This balance is key to creating a rewarding and enjoyable gaming experience that adapts to individual player needs.

Natural Language Processing (NLP)

Andrus (2020) explored that NLP algorithms can be integrated to enable natural language interactions between players and NPCs. This could involve implementing chatbots or dialogue systems that can understand and respond to player input more humanistically. Andrus (2020) suggested that integrating NLP algorithms into games allows for seamless and intuitive interactions between players and NPCs. This technology could enable NPCs to understand and respond to player inputs using natural language, creating more fluid and human-like conversations. By parsing and interpreting player dialogue, NLP systems can generate appropriate responses that fit the context and tone of the interaction, making NPCs appear more intelligent and relatable. Andrus (2020) results indicated that this capability enhances the realism of the game world, providing players with a more immersive and engaging experience as they communicate with NPCs in a manner that mirrors real-life conversations.

Occhinegro (2023) explored how implementing chatbots or advanced dialogue systems powered by NLP significantly enriches the storytelling aspect of games. These systems can manage complex interactions, remember past conversations, and adapt dialogue based on the player's previous choices, contributing to a more personalized narrative experience. By allowing players to engage in meaningful and varied dialogues with NPCs, these systems can create deeper emotional connections and more intricate storylines. Occhinegro (2023) found that interaction enhances the immersion and encourages players to explore different conversational paths and outcomes, thereby increasing the replay value and depth of the game.

Implementation Strategies

Several key strategies should be considered to successfully implement AI in game development. The first technical considerations that could be crucial, are the hardware and software requirements necessary to integrate AI into game development pipelines. Ensuring compatibility and optimizing performance across various platforms is essential. The second consideration is adopting agile development methodologies that facilitate iterative AI implementation and testing, promoting flexibility and responsiveness to evolving project needs. This approach enables continuous improvement and refinement of AI functionalities. Last, leveraging the right tools and frameworks is vital; an overview of AI libraries and middleware suitable for game development can streamline the process, providing essential functionalities and enhancing efficiency. Together, these strategies can effectively form a comprehensive roadmap for integrating AI into game development.

Technical considerations

Incorporating AI into game development pipelines requires careful consideration of hardware and software requirements to ensure optimal performance and functionality. Regarding the hardware side of computers, developers should assess the computational resources necessary to execute AI algorithms efficiently during gameplay. This includes evaluating target platforms' processing power and memory capabilities, such as consoles, PCs, or mobile devices, to ensure compatibility and smooth operation. Additionally, considerations for parallel processing capabilities, particularly in the context of deep learning algorithms, may influence hardware choices. Regarding the software side of computers, developers should require robust AI development frameworks and libraries tailored to game development needs. These software tools could provide essential functionalities such as AI modeling, training, and integration into game engines.

Furthermore, compatibility with existing game development pipelines and tools, such as Unity or Unreal Engine, is crucial for seamless integration of AI components. Overall, navigating the technical landscape of AI integration in game development necessitates a comprehensive understanding of hardware specifications and software infrastructure to deliver immersive and engaging gaming experiences. For example, Unity Muse's AI is capable of complementing creativity and development (Singh, 2023).

Development methodologies

Development methodologies play a crucial role in the successful integration of AI into game development pipelines, with agile approaches offering distinct advantages for iterative AI implementation and testing. Agile methodologies, characterized by their iterative and incremental nature, provide flexibility and responsiveness to evolving project requirements, making them well-suited for the dynamic nature of AI development. AI implementation tasks can be broken down into smaller, manageable increments where developers can continuously iterate on AI algorithms, refine functionalities, and incorporate feedback from testing and player interactions. Agile methodologies could provide more collaboration and communication among cross-functional teams, fostering synergy between AI specialists, game designers, and developers throughout development. This collaborative environment facilitates rapid prototyping, experimentation, and validation of AI functionalities, enabling developers to identify and address issues early in the development cycle. Ultimately, agile approaches can empower game development teams to adapt to changing requirements and deliver high-quality AI-driven gaming experiences that meet player expectations.

Tools and frameworks

A plethora of tools and frameworks are available to game developers for integrating AI into their projects, offering diverse functionalities and capabilities tailored to specific development needs. One prominent category includes AI libraries and middleware designed specifically for game development, such as Unity ML-Agents, Unreal Engine's AI system, and CryEngine's AI capabilities. These platforms provide a wide range of functionalities, including pathfinding, behavior trees, decision-making algorithms, and machine learning capabilities, enabling developers to create sophisticated AI-driven gameplay experiences. Additionally, general-purpose AI libraries like TensorFlow, PyTorch, and OpenAI Gym offer flexibility and scalability for implementing custom AI solutions in games. These libraries provide advanced machine learning and reinforcement learning algorithms, empowering developers to create AI agents capable of learning from experience and adapting to player behaviors. Moreover, middleware solutions such as Behavior Designer and A* Pathfinding Project offers specialized tools for creating complex NPC behaviors and optimizing pathfinding in-game environments (Cerny, 2016). By leveraging these tools and frameworks, game developers can streamline AI development processes, accelerate iteration cycles, and deliver immersive and engaging gaming experiences powered by intelligent AI systems.

Case Studies

Integrating AI into gaming has profoundly impacted player engagement, retention, and the overall gaming experience. AI-driven gameplay mechanics, such as dynamic difficulty adjustment and procedural content generation, have contributed to heightened player immersion and enjoyment by tailoring the gaming experience to individual skill levels and preferences. Additionally, advanced opponent AI has elevated the challenge and depth of gameplay interactions, keeping players engaged and motivated to improve their skills. Furthermore, AI-powered player analytics have enabled developers to gain valuable insights into player behavior, allowing for the refinement of game mechanics and content to better align with player preferences. As a result, games that effectively leverage AI technologies have demonstrated increased

player retention and satisfaction, leading to longer play sessions and higher levels of player engagement. Overall, the strategic integration of AI enhances the gaming experience by creating more dynamic, personalized, and immersive gameplay environments that captivate players and foster long-term engagement.

Table 1 displays successful games that have utilized AI techniques in different aspects of gameplay. Table 1 succinctly presents examples of games and the specific aspects of gameplay where AI techniques have been successfully implemented. These examples illustrate how AI techniques have been successfully integrated into various aspects of gameplay in popular games, enhancing player experiences and contributing to these titles' overall success and acclaim.

Game	Aspect	Game Description
The Witcher 3: Wild Hunt	NPC Behavior and Decision Making	A rich open world with dynamic NPCs exhibiting lifelike reactions and decision-making capabilities.
StarCraft II	Opponent AI and Strategy	Advanced opponent AI utilizing search algorithms and real-time decision-making.
F.E.A.R.	Dynamic Enemy Behavior	Enemy AI with realistic behaviors such as flanking, taking cover, and coordinating attacks.
Left 4 Dead	Dynamic Director AI	AI Director system that adjusts gameplay elements based on player performance.
Civilization VI	Procedural Content Generation	Utilizes procedural content generation algorithms to generate randomized maps, terrain features, and resource distributions.

Table 1: AI techniques in successful games

Future Directions and Challenges

Emerging AI trends are poised to revolutionize game development, bringing forth innovative applications that enhance player experiences. Technologies such as deep learning, reinforcement learning, and procedural content generation enable the creation of more complex, adaptive, and immersive game worlds. For instance, AI-driven storytelling can craft dynamic narratives that evolve based on player choices, while advanced NPC behavior modeling can produce characters with lifelike personalities and emotional responses. Additionally, AI can facilitate real-time procedural generation of game environments, ensuring that each playthrough offers a unique experience. As these trends continue to evolve, they hold the potential to redefine the boundaries of interactive entertainment and player engagement.

As AI becomes increasingly integrated into game development, ethical considerations must be at the forefront to ensure responsible implementation. One major concern is the potential for bias in AI algorithms, which can lead to unfair or discriminatory behavior in-game content and interactions. Developers must strive to create inclusive AI systems that represent diverse perspectives and experiences. Additionally, using AI raises significant privacy issues, particularly regarding collecting and analyzing player data. Ensuring that AI systems adhere to stringent data protection standards and providing transparency about data usage are crucial for maintaining player trust. Addressing these ethical challenges is essential for fostering a gaming industry that is both innovative and socially responsible.

Despite significant advancements, numerous challenges remain in the realm of AI for game development, necessitating ongoing research and development. One key area is the development of more sophisticated AI models that can understand and predict complex player behaviors, leading to more personalized and engaging experiences. Additionally, creating AI systems that can seamlessly integrate with existing game engines and development workflows continues to be a technical hurdle. Research is also needed to optimize AI algorithms to run efficiently on various gaming platforms, from high-end PCs to mobile devices. Furthermore, ethical and regulatory frameworks for AI in gaming must continually be updated to address emerging concerns. Continued investment in these areas will be crucial for harnessing the full potential of AI in future game development.

Conclusion

In conclusion, this study has highlighted the transformative impact of AI on game development, showcasing how AI techniques such as pathfinding algorithms, decision-making frameworks, emotional modeling, and procedural content generation are revolutionizing the industry. The integration of AI enables the creation of more dynamic, adaptive, and immersive gameplay experiences, enhancing player engagement and satisfaction. Additionally, AI-driven systems for dynamic difficulty adjustment and natural language processing further contribute to the creation of more personalized and interactive game worlds.

The importance of AI in shaping the future of game development cannot be overstated. As emerging trends in AI continue to evolve, they present unprecedented opportunities for innovation and creativity in gaming. AI enhances technical capabilities and enriches storytelling, character development, and overall player experience. By addressing ethical considerations such as bias and privacy, developers can ensure that AI is implemented responsibly and inclusively.

Therefore, it is crucial for game developers to explore and embrace AI technologies. By leveraging AI's potential, developers can push the boundaries of what is possible in gaming, crafting unique and compelling experiences that captivate players and set new standards for the industry. The future of game development lies in the thoughtful and innovative application of AI, and it is an exciting frontier that beckons creative exploration.

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