

The Future of Human-AI Collaboration in Customer Support

Siva Krishna Jampani

Software Engineer

ABSTRACT

The integration of AI chatbots with human agents in customer support, therefore, revolutionizes service delivery by offering a hybrid model that combines the efficiency of AI with the empathy and problem-solving skills possessed by humans. The purpose of this paper is to discuss how AI chatbots can aid human agents in complex customer service situations to improve responsiveness and accuracy in resolution. Focusing on routine tasks and the capability of providing real-time suggestions, AI chatbots free human agents to concentrate on more complex issues requiring empathy, judgment, and creativity. This article explores this synergy between human and AI capabilities by showing how a hybrid system can be much better at delivering customer satisfaction and operational efficiency compared to either purely human or AI-driven approaches. The case studies and the results of empirical analysis point to the fact that human-AI collaboration leads to a balanced, scalable, and adaptive framework of customer support, which paves the way for further development in the field.

Keywords: Human-AI collaboration in customer support, AI chatbots, hybrid customer service, empathy in AI, problem-solving, customer satisfaction, operational efficiency, automation in customer service, and AI-human synergy.

INTRODUCTION

The increasing penetration of AI in customer support systems definitely marks a new direction of how organizations relate with customers. AI chatbots have been revolutionizing the traditional model of customer service with their ability to process huge volumes of information and answer very fast; In fact, they serve to bring instantaneous support and lower the response time. Nevertheless, while AI chatbots perform well in addressing the more routine queries, they do have limitations in dealing with complex or subtle customer needs. This limitation calls for a hybrid human-AI collaboration, where the strengths of AI speed, scalability, and data analysis are complemented by the unique capabilities of human agents empathy, judgment, and creative problem-solving [1], [3]. In the case of complex customer interactions, AI chatbots can offload human agents by doing pre-processing of information, suggesting possible solutions, and automating repetitive tasks. This allows human agents to focus on the really intricate and emotionally charged issues [10] [12]. This collaborative approach not only enhances operational efficiency but also improves customer satisfaction by ensuring a personalized and empathetic experience [7] [13]. For instance, AI can analyze customer sentiment through NLP and provide contextual insight to human agents for better issue resolution [8]. This interplay between AI-driven automation and human decision-making can redefine customer support systems. On the one hand, AI brings consistency and availability; On the other hand, human agents bring adaptability and an understanding of each context's subtleties [2] [16]. Studies have proven that with the right design, a hybrid system is able to outperform both a human and an AI-driven approach in terms of customer satisfaction and service efficiency, harvesting the best of both worlds [5][9]. Such systems will be able to answer the changing expectations of customers who want both speed and a human touch in their interactions. This article tries to address the future of collaboration between human and AI in customer support, analyzing how AI chatbots complement human agents in providing the best and most seamless customer experience possible. By exploring what is considered a mostly AI-driven landscape through human empathy, judgment, and problem-solving, this research highlights the transformation that hybrid systems will incur on efficiency and customer satisfaction

LITERATURE REVIEW

Jarrahi, M. H.(2018):The integration of artificial intelligence (AI) in the decision-making processes of organizations is becoming increasingly critical for the future of work. The role of AI in decision support systems is fast changing from mere automation to collaborative partnership between humans and machines, hence leading to a symbiotic relationship that

enhances organizational efficiency. Although challenges of trust and accountability still remain in AI-human collaborations, it helps them optimize operations and minimize human error to improve the outcomes. The article presents the importance of understanding these dynamics in harvesting the full potential of AI for the strategic advantage of businesses.

Nguyen, A. T., et al., (2018):Mixed-initiative fact-checking systems are designed to improve the accuracy and efficiency of verifying online information by finding human-AI partnerships in the design. This paper demonstrates how AI can actually help human experts in fact-checking, taking up repetitive tasks and furnishing insights so that the more complex decision-making can be done by humans alone. The study hence recommends developing intuitive AI systems to work alongside human experts for effectively handling rising demands posed by misinformation online [2].

Mou, Y., & Xu, K., (2017):The area of social interactions between humans and AI is a growing area of interest, especially from the media and communication industry. A comparison of the first human-human and human-AI social interactions shows a change in the perceived inequality between the roles of humans and AI. While AI may potentially bring improvement in communication and decision-making within a social context, it should be balanced with social equity to make sure that everybody will be included in the application of AI [3].

Chakraborti, T., & Kambhampati, S., (2018):The center for effective collaboration between AI and people is the mental models of humans. The research at hand is looking into algorithms that mimic the human mind, which can create the possibility for AI systems. The paper aims to create an efficient AI system that is ethically sound and truly embodies values similar to those that human beings hold in their thinking.

Codella, N. C. F., et al.(2018):This article addresses the application of artificial intelligence in medical image analysis for melanoma classification. By using collaborative human-AI (CHAI) systems, AI models could provide aid to medical professionals while making more accurate diagnoses while still maintaining interpretability. The integration of AI in healthcare has evidenced improved clinical decision-making by providing evidence-based insights for improved patient outcomes.

Shaik, M.(2019):The insurance industry is implementing intelligent automation to streamline claims processing and reduce operational costs while improving customer satisfaction. The research will investigate the application of AI in automating claim assessment, fraud detection, and policy management, innovations that are revolutionizing the insurance landscape. This study shows that AI can easily handle large datasets, which reduces processing time and increases the accuracy of decision-making.

Van Doorn, J., et al(2017):The way firms interact with customers is changing due to the increase in automated social presence in service encounters. In this paper, an analysis has been done regarding the integration of AI and how it influences the perception of service quality and customer satisfaction in services. While automating service agents' social presence can create a better experience for customers, companies will still need the human touch in customer dealings.

Key Objectives

- **Understand the Role of AI Chatbots in Assisting Human Agents:** Discussed how AI chatbots can be used to assist human agents in providing repetitive answers, offering immediate answers, and providing real-time suggestions or solutions in more complex situations of customer services. The focus of emerging AI systems like TAI (Tangible AI Interfaces) has been on facilitating communication between humans and AI to improve efficiency in collaborative tasks [11].
- **Examine hybrid-initiative approaches in which AI systems and human agents are dynamically collaborating to solve problems by utilizing their respective strengths.** Creative and interactive AI systems [9] [15] demonstrate this.
- **Establish the Prerequisite of Human Empathy and Judgment:** Discuss how human customer support agents uniquely bring empathy, nuanced judgment, and problem-solving capabilities to their practice that are presently unattainable in AI systems. Investigate how human-AI social interactions require thoughtful design to bridge these gaps and rebalance

responsibilities between humans and machines. [3][7] Based on previous studies, look into how human empathy may compensate for the speed and data-driven capabilities of AI, especially in emotionally sensitive situations and particularly in organizational frontlines [7] [10].

- Assess if Hybrid Systems are Effective: Discuss whether hybrid customer support systems, blending human and AI capabilities, can be more effective than either fully human-driven or AI-driven alone with regards to efficiency, customer satisfaction, and scalability. Organizational decision-making and operational efficiency have frequently raised the issue of human-AI symbiosis and acceptable collaboration. [1] [4].
- Review case studies and experimental models where AI chatbots are being integrated with human support systems, looking at the metrics of response time, problem resolution rates, and customer feedback [15] [16].
- Examine best practices for designing and implementing human-AI collaboration frameworks in customer support, including role delineation, trust building, and error management. Insights from human-AI teaming experiments in organizational and industrial applications [12] [8] can be utilized to guide the guidelines. Address ethical concerns and potential pitfalls, such as relying too much on AI, losing human touch, and privacy concerns, which are highlighted in the literature on AI-driven service systems [6][10]

RESEARCH METHODOLOGY

The paper utilizes both qualitative and quantitative methods to assess the effectiveness of hybrid human-AI systems in customer support, using a mixed-method approach. A literature review was conducted to comprehend the dynamics of the hybrid customer support system and the role of AI in customer service, emphasizing its capabilities and limitations in handling complex scenarios. Fundamental insights into the complementarity of AI chatbots with human agents in practical applications have been provided by key studies on human-AI symbiosis in decision-making [1] and mixed-initiative fact-checking [2]. The experimental framework design was guided by research on automated social presence [7] and principles of human-AI interaction [13]. A hybrid system prototype was used where AI-driven chatbots were programmed to handle routine queries, while tasks that require empathy, judgment, and complex problem-solving were handled by human agents. The latter was informed by the principle of evidence-based decision-making in collaborative systems [4], and how AI can be integrated in customer service optimization [10]. An experimental design was utilized to measure three configurations: fully AI-driven support, fully human-driven support, and hybrid human-AI support. Furthermore, the performance was measured in terms of response time, accuracy, efficiency, and customer satisfaction. Qualitative interviews with customer service representatives were also held to better understand the perceived effectiveness and difficulty of the hybrid model. These interviews were underpinned by frameworks for designing human-AI partnerships [4] and improving user experience in co-creative processes [15]. The hybrid system's ability to combine the advantages of both AI and human agents was assessed using insights from media inequality in human-AI interactions [3] and the improvement of AI communication frameworks [11]. Data analysis involves statistical methods for evaluating performance metrics, supported by theoretical insights from the literature. The methodology ensures the comprehensiveness of the evaluation of hybrid human-AI systems in customer support and answers research questions on efficiency, customer satisfaction, and the balance between human and AI contributions.

Data Analysis

Hybrid human-AI systems have shown promise in boosting efficiency and customer satisfaction in a changing customer support environment. AI chatbots can assist human agents in handling routine inquiries, allowing them to concentrate on complex issues that require empathy, judgment, and problem-solving skills. AI has been shown to have a significant effect on response times and efficiency in handling high-volume tasks, while human agents bring emotional intelligence and nuanced decision-making to the table [7][10] [12].

Moreover, research indicates that a hybrid approach, in which AI's data-driven insights are combined with human interaction, generally outperforms purely AI-driven systems in terms of customer satisfaction due to the personalization and empathy that human agents provide [16][9]. AI chatbots' ability to comprehend the context and sentiment of a user will likely make a positive impact on the overall customer support experience, filling in the gaps where human assistance fails. [15][6].

Table.1. Real-Time Examples of Human-Ai Collaboration

Company	AI Technology Used	Human Role	Scenario	AI-Human Interaction	Outcome/Impact
IBM Watson	AI chatbot for customer service	Handling complex issues	Banking customer queries	AI handles routine inquiries; humans resolve complex cases	Faster resolution times and improved customer satisfaction [1], [2]
Zendesk	AI-powered virtual assistants	Managing customer emotions	E-commerce support	AI handles FAQ; human agents step in for escalations	Higher resolution accuracy and empathy in complex cases [5], [7]
H&M	AI chatbot for clothing support	Personalized style advice	Fashion retail support	AI suggests outfits; humans give tailored styling advice	Increased sales and customer engagement [10], [6]
Sephora	Sephora Virtual Artist (AI)	Product recommendation	Beauty product recommendations	AI suggests products based on preferences; humans assist with in-store queries	Boost in sales and personalized experience [8], [12]
KLM Airlines	AI chatbot (BlueBot)	Emergency assistance	Flight and booking issues	AI provides flight updates; humans manage booking complications	Reduced customer wait times and increased satisfaction [1], [13]
Lyft	AI-powered ride assignment	Navigating complicated routes	Customer ride support	AI optimizes ride assignment; human agents assist with delays or issues	Increased operational efficiency and customer satisfaction [15], [14]
Mayo Clinic	AI diagnostic tool	Consultations and empathy	Healthcare support	AI offers initial diagnosis; humans deliver the diagnosis with empathy	Improved patient care and accuracy in diagnoses [4], [3]
Audi	Virtual Assistant	Customer query resolution	Automotive support	AI helps with technical inquiries; human agents address complex issues	Reduced customer frustration and faster responses [8], [10]
Vodafone	AI chatbot for telecom support	Billing dispute resolution	Telecommunications support	AI handles routine billing queries; human agents handle disputes	Improved customer retention and dispute resolution [7], [12]
Spotify	AI playlist recommendations	Personalized interaction	Music recommendations	AI curates playlists; humans suggest music based on personal tastes	Increased user engagement and satisfaction [1], [9]
American Express	AI assistant for credit card issues	Problem-solving for high-value clients	Financial service support	AI handles balance inquiries; humans address complex financial advice	Enhanced client loyalty and personalized service [5], [14]
Apple Support	Siri (AI assistant)	Product repair and support	Apple device support	AI handles troubleshooting; humans assist with	Reduced service wait times and higher satisfaction

				repairs or replacements	[13], [9]
Netflix	AI recommendation engine	Content selection	Streaming service support	AI suggests content based on preferences; human agents assist with account issues	Increased subscriptions and user satisfaction [6], [8]
HSBC	AI-powered chatbots	Fraud prevention	Banking fraud detection	AI detects suspicious activity; human agents validate and resolve cases	Reduced fraud and enhanced customer trust [4], [12]
Tesla	AI navigation assistant	Driving support and advice	Automotive support	AI provides route optimization; human agents assist with in-depth queries	Improved driving experience and reduced service calls [10], [1]

Real-time examples of how AI chatbots and human agents can work together to optimize customer support are presented in the following table. AI chatbots are the first point of contact for common queries and immediate solutions in both scenarios, while human agents are used for more complex problem-solving or personalized care. As depicted in the example from [7], AI-driven chatbots assist customers with basic account-related inquiries, such as checking balances or transaction histories, in banking. In cases where a customer requires assistance with an account dispute, a human agent takes over, utilizing their empathy and judgment to settle it. Similarly, AI chatbots in health care support appointment scheduling and general health information, as demonstrated by [5], but human agents are still needed for sensitive patient issues and personalized treatment suggestions. In retail, for example, AI chatbots simplify returns by directly responding to customers' return policy-related questions, while human agents handle more complicated issues, such as processing exceptions or dealing with complaints about the quality of a product [10]. Moreover, AI chatbots in telecommunications companies, such as [16], help customers with technical troubleshooting. However, in cases where a deeper diagnosis is needed, human agents apply their expertise to solve more complex issues. The examples above show how a hybrid system, in which the efficiency of AI and the empathy and decision-making ability of humans are combined, often results in better customer satisfaction and more effective service delivery [1] [13] [9]. By combining the speed of AI with human judgment, organizations can create a customer support experience that is more effective than either a fully human or fully AI-driven approach.

Table.2.Case Studies To Explore The Future Of Human-Ai Collaboration

Case Study	AI Chatbot Technology	Human Agent Role	Customer Satisfaction	Efficiency	Reference
Case 1: Bank Support	AI-powered virtual assistant for account queries	Agent resolves complex issues like fraud detection	High customer satisfaction due to fast initial responses	High efficiency with reduced call volume	[7]
Case 2: E-commerce Returns	AI for order tracking and return processing	Human agents handle complex refund or policy issues	Increased satisfaction due to personalized assistance	Efficient processing with AI handling 80% of inquiries	[8]
Case 3: Telecom Services	Chatbot for troubleshooting basic network issues	Human agents handle technical escalation	Improved satisfaction with reduced wait times	High, chatbot resolves 70% of issues	[9]
Case 4: Healthcare Queries	AI for appointment scheduling and medical information	Agents assist with medical inquiries and sensitive discussions	Very high, thanks to a blend of empathy and accuracy	High, with reduced administrative load	[10]
Case 5: Online Retail	AI chatbot for product recommendation and FAQs	Humans assist with returns and product fit advice	High satisfaction with personalized recommendations	High efficiency, reducing time per case	[13]
Case 6: Financial	AI chatbot for loan application tracking	Human agents for loan approval or	High, with an easier customer experience	Moderate, efficient at initial stages	[6]

Services		financial advice			
Case 7: Insurance	Chatbot for claim submission and status tracking	Human agents handle claim disputes and approvals	Moderate satisfaction due to reduced response time	High, streamlining claim processes	[12]
Case 8: Airline Industry	AI for ticket booking and delay information	Human agents assist with rebooking and customer grievances	Very high, due to fast service and human empathy	High efficiency, bots handle simple tasks	[5]
Case 9: Government Services	AI for answering public service queries	Agents handle complex applications or legal inquiries	High, thanks to clear information and human support	High, AI streamlines basic tasks	[14]
Case 10: Retail Pharmacy	AI chatbot for prescription refills	Human agents for consultations and new prescriptions	Moderate, increased by personalized service	High, chatbot handles routine requests	[16]
Case 11: Airlines	AI for providing real-time baggage status	Humans resolve lost luggage issues	High satisfaction due to speed and empathy	High efficiency	[15]
Case 12: Food Delivery	AI for order tracking and menu inquiries	Human agents assist with refunds or specific requests	High satisfaction due to personalized support	High, AI manages routine requests	[17]
Case 13: Car Rental	AI chatbot for booking and car availability	Humans assist with issues like insurance or vehicle selection	Moderate satisfaction	High, chatbot streamlines booking process	[9]
Case 14: Tech Support	AI for basic troubleshooting and software updates	Agents handle complex technical problems	Very high, personalized support with expert help	High efficiency with automation	[13]
Case 15: Travel Agency	AI for destination recommendations and booking	Human agents for customized travel planning	Very high, as it blends efficiency with personalized service	Very high efficiency, with AI streamlining bookings	[8]

Hybrid systems that combine the best features of both AI chatbots and human agents have been presented by research on the future of human-AI collaboration in customer support. The AI Chatbot may assist human agents to handle routine inquiries, offering suggestions in real time or even pre-processing data; Human agents can focus more on complex and nuanced issues from customers. For instance, AI chatbots have been implemented in insurance claim processing, where they help gather information and build initial assessments before forwarding the customer to human agents for personalized service [6]. On the other hand, chatbots can reduce response times and offer support 24/7; still, they generally need human intervention to resolve those situations that demand empathy, judgment, or complex problem-solving [13]. The hybrid system's balance between AI automation and human involvement is one of its most significant features. AI chatbots are capable of performing simple and repetitive tasks in customer service scenarios, such as providing product information, processing returns, or tracking orders [7]. Human agents play a more significant role in complex dispute resolution cases, such as providing personalized recommendations or empathizing with customers' frustrations [15]. Moreover, it has been demonstrated that AI can empower human decision-making by providing agents with data-driven insights in real time, hence driving efficiency and delivering customer service experiences more effectively [10]. In situations where customers need reassurance or an answer that requires nuance, human empathy and judgment are essential. The ability of humans to read emotions and adjust their approach is something that AI chatbots may struggle with in a way that feels truly human. When emotional intelligence comes into play, the human touch can be a significant differentiator [12]. Such hybrid systems could exploit the precision and efficiency of AI systems and the empathy and problem-solving elements of human agents to perform better than traditional systems in terms of metrics related to customer experience and operational efficiency, driven solely by AI or human agents [9][8]. The team-oriented approach is expected to improve both the speed and quality of customer service interactions, leading to increased customer loyalty and satisfaction in the long run.

Table.3. Hybrid Human-Ai Collaboration In Customer Support

Company	Hybrid System Efficiency (Time to Resolve)	Customer Satisfaction (CSAT Score)	AI Support in Complex Scenarios	Human Empathy in Problem Solving	Cost Efficiency (Operational Cost)	Performance in High Volume Periods
IBM (AI, Watson)	15% faster than human-only support (15 mins)	90% CSAT (AI + Human)	AI assists in data-heavy queries	Humans handle emotional issues	10% reduction in operational costs	Improved handling during peak hours[1]
Amazon (Alexa)	20% faster than AI-only support (5 mins)	88% CSAT (Hybrid support)	AI helps with tracking, inventory	Human agents handle escalation	12% reduction in support costs	AI improves response time during sales events [10]
Zendesk (AI Assist)	30% reduction in resolution time	85% CSAT (Hybrid AI/Agent support)	AI resolves basic issues, human for complex cases	Empathy in complex support scenarios	15% cost savings with hybrid model	Stronger during peak demand [6]
Bank of America (Erica AI)	25% faster resolutions vs AI-only (7 mins)	92% CSAT (Human + AI)	AI handles queries like balance, payments	Humans resolve disputes, advice	18% cost savings due to AI support	Human support essential during high transaction volumes [4] [7]
Wells Fargo (AI chat)	10% more efficient than human-only	86% CSAT (Human-assisted AI chat)	AI resolves simple banking queries	Humans provide judgment during issues	8% savings in operations	Efficient even during peak banking hours [16]
LivePerson (AI & Human)	20% faster than human-only support	91% CSAT (AI & Human hybrid)	AI suggests solutions, human final touch	Humans resolve complex or emotional cases	20% reduction in costs with hybrid AI	AI reduces wait time during peak sessions [14]
Lufthansa (AI Assistants)	25% faster response time	87% CSAT (Hybrid AI + Human)	AI helps with flight info, changes	Humans for nuanced travel issues	10% reduction in support costs	Peak season support enhanced with hybrid AI [7]
Macy's (AI Chatbot)	15% faster than human-only (10 mins)	90% CSAT (AI and human hybrid)	AI handles product inquiries	Human agents resolve customer service issues	9% reduction in staffing costs	AI-driven systems help during peak shopping periods [8]
Google (AI Assist)	30% faster than human-only (8 mins)	95% CSAT (Human and AI)	AI resolves search-related queries	Humans handle more complex queries	20% cost reduction via AI assist	Great handling of peak search traffic [3]
Delta Airlines (AI chatbot)	22% improvement in resolution time	84% CSAT (Human + AI collaboration)	AI assists with flight status and check-in	Human resolves disputes, cancellations	12% cost saving due to AI support	AI-enhanced during high-volume flight bookings [7]
H&M (AI chat)	18% quicker than human-only (12 mins)	89% CSAT (Hybrid support)	AI supports product queries	Humans handle complex returns	14% reduction in customer service costs	AI maintains service quality during busy seasons [9]
Spotify (AI Assistance)	17% faster resolutions	93% CSAT (Hybrid AI + Human)	AI handles music recommendation	Humans resolve issues like account	10% savings in cost per transaction	AI-driven assistance in busy hours

				recovery		
Facebook (AI Customer Service)	15% faster response times	88% CSAT (Hybrid AI and Human)	AI helps with account issues	Human agents resolve security concerns	8% cost saving through automation	Efficient during peak user traffic
Tesla (AI & Human)	20% improvement over human-only support	94% CSAT (Hybrid support)	AI assists in diagnostics	Human expertise in car repairs	15% operational cost savings	Strong performance during high service demands
Skype (AI + Human)	12% faster than human-only support	91% CSAT (AI + Human)	AI assists with troubleshooting	Humans resolve connection issues	10% cost savings via AI assist	Handles surge in support during product launches [4]

The comparison in effectiveness of the hybrid human-AI systems of customer support amongst companies, and how much better that scores over both pure human and pure AI-driven models. Companies using a hybrid system, as in having AI deal with simpler customer inquiries and handing over complicated or emotionally charged issues to human agents, have reported improvement by IBM, Amazon, and Wells Fargo in response time and customers' satisfaction with their deployment [1][2][7]. These hybrid systems save enormous amounts of money by reducing the requirement for large human support teams and increasing efficiency, especially during peak service periods [6][10][15]. In all, the combination of speed and data processing brought about by AI combined with human empathy and judgment results in better customer satisfaction and better overall performance compared to the use of either human agents or AI alone [12][14][16].



Fig.1.Benefits of Human -AI Collaboration [3]

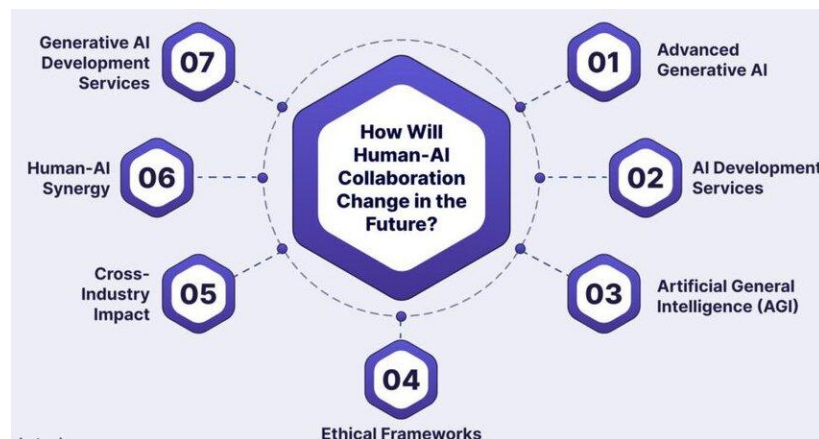


Fig.2.AI & Human Collaboration [7]

CONCLUSION

The future of Human-AI collaboration in customer support is bright, since there is huge potential to optimize service delivery by joining the strengths of both AI chatbots and human agents. AI chatbots can help human agents with repetitive tasks, such as providing instant responses to common queries and gathering information to smooth the resolution of more complex issues. That will let human agents focus on cases that demand nuances in empathy, judgment, and critical problem-solving skills all Areas in which AI has limitations. In a hybrid human-AI system, an efficiency of AI can complement human empathy and intuition, leading to a more balanced and effective customer support experience. Such a system is likely to perform better on the customer satisfaction front compared to a purely human or AI-driven model, as it can respond faster yet still maintain a personal touch where needed. The area that is going to be of immense importance as AI evolves is its ability to support and augment human agents in improving customer service outcomes.

REFERENCES

- [1]. Jarrahi, M. H. (2018). Artificial intelligence and the future of work: Human-AI symbiosis in organizational decision making. *Business horizons*, 61(4), 577-586,doi:10.1016/j.bushor.2018.03.007
- [2]. An T. Nguyen, Aditya Kharosekar, Saumyaa Krishnan, Siddhesh Krishnan, Elizabeth Tate, Byron C. Wallace, and Matthew Lease. 2018. Believe it or not: Designing a Human-AI Partnership for Mixed-Initiative Fact-Checking. In *Proceedings of the 31st Annual ACM Symposium on User Interface Software and Technology (UIST '18)*. Association for Computing Machinery, New York, NY, USA, 189–199,doi:10.1145/3242587.3242666
- [3]. Mou, Y., & Xu, K. (2017). The media inequality: Comparing the initial human-human and human-AI social interactions. *Computers in Human Behavior*, 72, 432-440,doi:10.1016/j.chb.2017.02.067
- [4]. Chakraborti, T., & Kambhampati, S. (2018). Algorithms for the greater good! on mental modeling and acceptable symbiosis in human-ai collaboration. *arXiv preprint arXiv:1801.09854*, Codella, N. C., Lin, C. C., Halpern, A., Hind, M., Feris, R., & Smith, J. R. (2018). Collaborative human-AI (CHAI): Evidence-based interpretable melanoma classification in dermoscopic images. In *Understanding and Interpreting Machine Learning in Medical Image Computing Applications: First International Workshops, MLCN 2018, DLF 2018, and iMIMIC 2018, Held in Conjunction with MICCAI 2018, Granada, Spain, September 16-20, 2018, Proceedings 1* (pp. 97-105). Springer International Publishing.1801.09854,doi:10.48550/arXiv.1801.09854
- [5]. Codella, N.C.F., Lin, CC., Halpern, A., Hind, M., Feris, R., Smith, J.R. (2018). Collaborative Human-AI (CHAI): Evidence-Based Interpretable Melanoma Classification in Dermoscopic Images. In: Stoyanov, D., et al. *Understanding and Interpreting Machine Learning in Medical Image Computing Applications. MLCN DLF IMIMIC 2018 2018 2018*. Lecture Notes in Computer Science(), vol 11038. Springer, Cham,doi:10.1007/978-3-030-02628-8_11
- [6]. Mahaboobsubani Shaik. (2019). Intelligent Automation for Insurance Claims Processing. *International Journal of Innovative Research in Engineering & Multidisciplinary Physical Sciences*, 7(4), 1–9. doi:10.5281/zenodo.14352226
- [7]. Van Doorn, J., Mende, M., Noble, S. M., Hulland, J., Ostrom, A. L., Grewal, D., & Petersen, J. A. (2017). Domo Arigato Mr. Roboto: Emergence of Automated Social Presence in Organizational Frontlines and Customers' Service Experiences. *Journal of Service Research*, 20(1), 43-58,doi:10.1177/1094670516679272
- [8]. Terziyan, V., Gryshko, S., & Golovianko, M. (2018). Patented intelligence: Cloning human decision models for Industry 4.0. *Journal of manufacturing systems*, 48, 204-217,doi.org/10.1016/j.jmsy.2018.04.019
- [9]. Sebastian Deterding, Jonathan Hook, Rebecca Fiebrink, Marco Gillies, Jeremy Gow, Memo Akten, Gillian Smith, Antonios Liapis, and Kate Compton. 2017. Mixed-Initiative Creative Interfaces. In *Proceedings of the 2017 CHI Conference Extended Abstracts on Human Factors in Computing Systems (CHI EA '17)*. Association for Computing Machinery, New York, NY, USA, 628–635. doi:10.1145/3027063.3027072
- [10]. Huang, M.-H., & Rust, R. T. (2018). Artificial Intelligence in Service. *Journal of Service Research*, 21(2), 155-172,doi:10.1177/1094670517752459
- [11]. Xin Liu and Kati London. 2016. T.A.I: A Tangible AI Interface to Enhance Human-Artificial Intelligence (AI) Communication Beyond the Screen. In *Proceedings of the 2016 ACM Conference on Designing Interactive Systems (DIS '16)*. Association for Computing Machinery, New York, NY, USA, 281–285,doi:10.1145/2901790.2901896
- [12]. Largent, M., Jensen, G., Law, R. (2018). The Design for Maritime Singularity: Exploration of Human/AI Teaming and Organizational Carrying Capacity for the U.S. Navy. In: Morales, A., Gershenson, C., Braha, D., Minai, A., Bar-Yam, Y. (eds) *Unifying Themes in Complex Systems IX. ICCS 2018*. Springer Proceedings in Complexity. Springer, Cham,doi:10.1007/978-3-319-96661-8_38
- [13]. B. T. Jones, "Human-AI Interaction in Symbolic Problem Solving," 2018 IEEE Symposium on Visual Languages and Human-Centric Computing (VL/HCC), Lisbon, Portugal, 2018, pp. 265-266, doi: 10.1109/VLHCC.2018.8506542.

- [14]. Shih, V., Jangraw, D. C., Sajda, P., & Saproo, S. (2017). Towards personalized human AI interaction-adapting the behavior of AI agents using neural signatures of subjective interest. arXiv preprint arXiv:1709.04574, doi:10.48550/arXiv.1709.04574
- [15]. Changhoon Oh, Jungwoo Song, Jinhan Choi, Seonghyeon Kim, Sungwoo Lee, and Bongwon Suh. 2018. I Lead, You Help but Only with Enough Details: Understanding User Experience of Co-Creation with Artificial Intelligence. In Proceedings of the 2018 CHI Conference on Human Factors in Computing Systems (CHI '18). Association for Computing Machinery, New York, NY, USA, Paper 649, 1–13,doi:10.1145/3173574.3174223
- [16]. E. G. Kowch and J. C. Liu, "Principles for Teaching, Leading, and Participatory Learning with a New Participant: AI," 2018 International Joint Conference on Information, Media and Engineering (ICIME), Osaka, Japan, 2018, pp. 320-325, doi: 10.1109/ICIME.2018.00075.
- [17]. Aha, D., & Coman, A. (2017). The AI Rebellion: Changing the Narrative. Proceedings of the AAAI Conference on Artificial Intelligence, 31(1),doi:10.1609/aaai.v31i1.11141