

Unveiling Knowledge Retention Strategies: VOS viewer Study on the Forgetting Curve

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ABSTRACT

This study investigates the challenge of knowledge retention in the ever-evolving IT and ITES sectors, focusing on the forgetting curve's impact on training effectiveness. Utilizing VOSviewer, the study identifies influential publications, authors, and research themes to inform knowledge retention strategies. Proposed methods include spaced repetition, multimedia learning, personalized training, social collaboration, and gamification, tailored to meet sector-specific needs. Emphasis is placed on maximizing ROI for training initiatives and nurturing a culture of continuous learning. Acknowledging limitations in secondary data analysis, future research avenues involve primary data collection and exploration of emerging technologies. This research aims to deepen understanding of knowledge retention strategies, benefiting organizations, employees, and the industry.

Keywords: *Forgetting curve, VOS viewer and Bibliometric analysis*

1. INTRODUCTION

In the rapidly evolving landscape of the Information Technology (IT) and Information Technology-Enabled Services (ITES) sectors, the ability to acquire and retain knowledge is of paramount importance. As these industries continuously grapple with technological advancements, evolving customer demands, and the ever-present need for upskilling, the concept of the forgetting curve becomes a critical consideration (Reddy & Singh, 2019). The forgetting curve, a well-established psychological phenomenon first introduced by Hermann Ebbinghaus in 1885, describes the gradual decline in memory retention over time (Murre & Dros, 2015). This phenomenon poses a significant challenge, as it can undermine the effectiveness of training programs and hinder the successful application of acquired knowledge in the workplace.

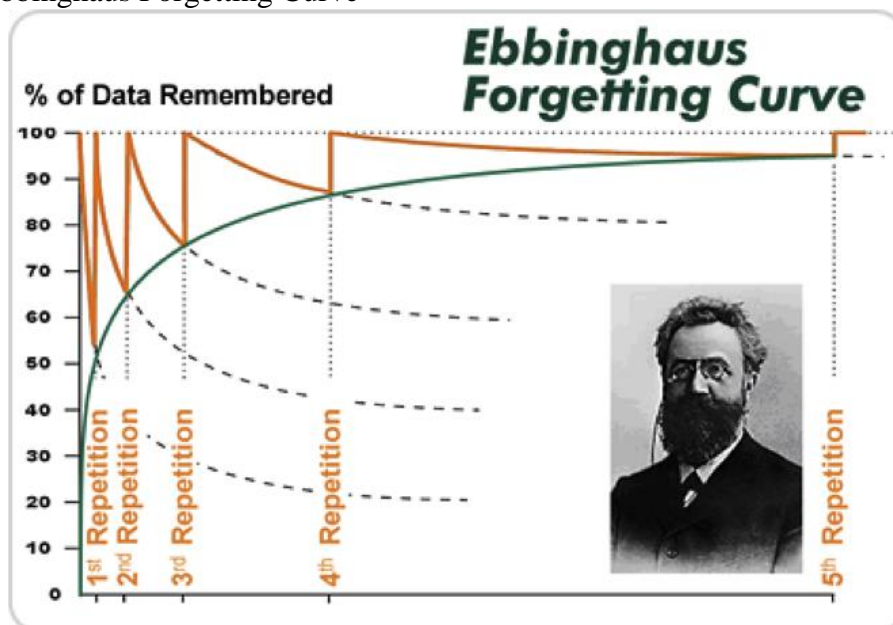
The forgetting curve is particularly relevant in the IT and ITES sectors due to the complex and rapidly changing nature of the knowledge and skills required. These industries demand continuous learning and adaptation, as new technologies, programming languages, software applications, and industry best practices are constantly emerging (Reddy & Singh, 2019). Employees in these sectors must not only acquire new knowledge but also retain and effectively apply it to deliver innovative solutions, enhance productivity, and maintain a competitive edge (Sarkar, 2016).

Failure to address the forgetting curve can have significant consequences for organizations operating in the IT and ITES sectors. If employees struggle to retain the knowledge and skills gained through training programs, it can lead to decreased productivity, suboptimal performance, and potential errors or quality issues in service delivery (Murre & Dros, 2015). Furthermore, the forgetting curve can hinder the effective adoption of new

technologies, processes, or methodologies, ultimately impacting an organization's ability to remain competitive and meet customer expectations (Reddy & Singh, 2019). Recognizing the importance of addressing the forgetting curve, researchers have explored various factors that influence knowledge retention and proposed methods to enhance it (Sarkar, 2016). These factors can range from individual characteristics, such as cognitive abilities, learning styles, and motivation, to environmental factors, including training delivery methods, reinforcement strategies, and organizational support (Murre & Dros, 2015). Additionally, researchers have investigated the role of technology-enabled learning solutions, such as e-learning platforms, gamification, and virtual reality simulations, in enhancing knowledge retention (Reddy & Singh, 2019).

In the context of the IT and ITES sectors in the Mumbai region, understanding the factors affecting the forgetting curve and proposing effective methods to enhance knowledge retention is of particular significance. Mumbai, a major metropolitan city and a hub for the IT and ITES industries in India, is home to numerous multinational corporations, startups, and service providers (NASSCOM, 2021). These organizations face the constant challenge of equipping their workforce with the necessary skills and knowledge to remain competitive in a rapidly changing business landscape. By conducting a comprehensive study to identify the factors influencing the forgetting curve and proposing tailored methods to enhance knowledge retention, this research aims to provide valuable insights and practical strategies for organizations operating in the IT and ITES sectors in the Mumbai region. Ultimately, this study endeavors to contribute to the development of an effective and sustainable workforce, capable of retaining and applying knowledge effectively, thereby driving innovation, productivity, and growth within these critical industries.

Figure 1: Ebbinghaus Forgetting Curve



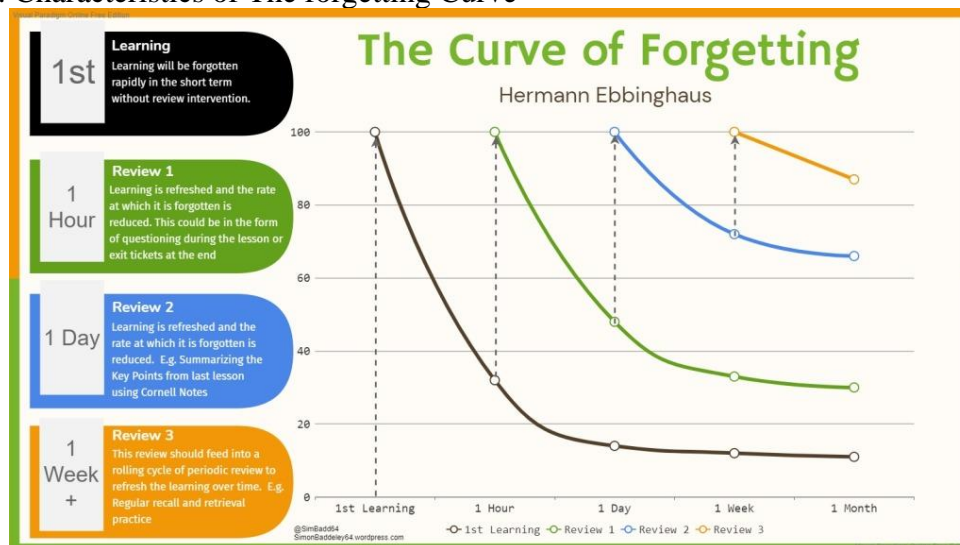
Highlighting the importance of understanding factors affecting the forgetting curve and proposing effective methods to enhance knowledge retention is crucial for several reasons. First and foremost, it directly impacts the return on investment (ROI) for organizations that invest substantial resources in training and development initiatives (Reddy & Singh, 2019). When employees struggle to retain the knowledge and skills acquired through training programs, the intended benefits of such investments are not fully realized, leading to

suboptimal performance and productivity (Sarkar, 2016). Furthermore, in the dynamic IT and ITES sectors, where technological advancements and industry best practices are constantly evolving, the ability to retain and apply knowledge effectively is a key competitive advantage (Murre & Dros, 2015). Organizations that can effectively mitigate the impact of the forgetting curve are better positioned to adapt to changing market demands, adopt new technologies, and deliver innovative solutions to their clients (Reddy & Singh, 2019).

Moreover, understanding the factors influencing the forgetting curve and implementing strategies to enhance knowledge retention can contribute to employee satisfaction, motivation, and overall well-being (Sarkar, 2016). When employees feel supported in their learning and development journey, and are equipped with effective tools and techniques to retain knowledge, they are more likely to experience a sense of accomplishment, confidence, and job satisfaction, which can lead to increased productivity and reduced turnover (Murre & Dros, 2015).

By identifying the specific factors that influence the forgetting curve within the IT and ITES sectors in the Mumbai region, this research aims to provide valuable insights that can inform the development of customized and effective knowledge retention strategies (NASSCOM, 2021). These strategies may include incorporating proven techniques such as spaced repetition, active recall, and multimodal learning approaches, as well as leveraging technology-enabled solutions like e-learning platforms, gamification, and virtual reality simulations (Reddy & Singh, 2019).

Figure 2: Characteristics of The forgetting Curve



Ultimately, by enhancing knowledge retention, organizations can foster a culture of continuous learning, innovation, and adaptability, enabling their workforce to stay ahead of the curve in the rapidly evolving IT and ITES landscape (Sarkar, 2016). This not only benefits individual employees but also contributes to the overall competitiveness and growth of the industries, positioning the Mumbai region as a hub for skilled and knowledgeable professionals capable of driving technological advancements and delivering exceptional services (NASSCOM, 2021).

RESEARCH OBJECTIVES:

1. To identify and analyze the key factors that contribute to the forgetting curve

2. To investigate the impact of the forgetting curve on knowledge retention and job performance

3. To propose effective methods and strategies to enhance knowledge retention and minimize the effect of the forgetting curve among employees in the IT and ITES sectors.

SCOPE OF THE STUDY:

The study will encompass various aspects of the forgetting curve, including individual factors (such as cognitive abilities, learning styles, motivation), organizational factors (training delivery methods, reinforcement strategies, organizational support), and technological factors (e-learning platforms, gamification, virtual reality simulations).

2. LITERATURE REVIEW

VOSviewer is a freely available computer program designed for constructing and visualizing bibliometric networks, enabling researchers to explore the intellectual structure and evolution of scientific literature (Van Eck & Waltman, 2010). Its user-friendly interface and robust analytical capabilities, including co-citation analysis, co-occurrence analysis, and bibliographic coupling analysis, have contributed to its widespread adoption across various research domains (Perianes-Rodriguez et al., 2016). Co-citation analysis examines the frequency with which publications or authors are cited together, revealing influential works and authors that have shaped the discourse in a particular field (Small, 1973). By constructing co-citation networks, VOSviewer allows researchers to identify seminal publications, examine the intellectual bases of their field, and position their work within the broader context of existing literature (Van Eck & Waltman, 2010). Co-occurrence analysis, on the other hand, explores the co-occurrence of keywords or terms within a body of literature, highlighting the main themes and research areas (He, 1999). This analysis can be useful for identifying emerging trends, gaps, and potential areas for future research within a field.

VOSviewer's bibliographic coupling analysis examines the similarities between publications based on the references they share (Kessler, 1963), enabling researchers to trace the development of specific research topics or methodologies over time. VOSviewer offers a range of visualization options, allowing researchers to effectively communicate their findings through intuitive and visually appealing network maps, which can be customized in terms of layout, color schemes, and labeling (Van Eck & Waltman, 2010).

While VOSviewer has proven to be a powerful tool for bibliometric analysis, it is crucial to interpret its results with caution and in conjunction with domain expertise. The quality and completeness of the input data, as well as the specific parameters and settings used in the analysis, can influence the output (Van Eck & Waltman, 2014). The effectiveness and versatility of VOSviewer have been demonstrated in numerous studies across various disciplines, such as corporate social responsibility (Moral-Muñoz et al., 2020) and blockchain technology (Xu et al., 2020), where researchers have employed VOSviewer's analytical techniques to gain valuable insights into their respective fields of study.

VOSviewer is a versatile and widely adopted software tool that offers researchers a range of analytical techniques and visualization options to explore the intellectual structure and evolution of scientific literature. By leveraging VOSviewer's capabilities, researchers can identify influential works and authors, uncover emerging trends, and position their research within the broader scientific discourse, ultimately contributing to the advancement of knowledge in their respective fields.

3. RESEARCH METHODOLOGY

This study employed a comprehensive secondary research approach, utilizing bibliometric analysis techniques. The research methodology centered around the application of the VOSviewer software tool for conducting in-depth bibliometric analyses.

Data Collection An extensive literature search was conducted to gather a comprehensive dataset of relevant publications from academic databases such as Web of Science, Scopus, and Google Scholar. The search criteria included keywords and phrases related to "forgetting curve," "knowledge retention," "learning retention," "training effectiveness," and "corporate training." Both theoretical and empirical studies in the domains of educational psychology, cognitive science, and organizational learning were considered. The collected dataset included citation information, abstracts, keywords, and full-text content (when available) of the identified publications. This dataset served as the foundation for the subsequent bibliometric analyses performed using VOSviewer.

Bibliometric Analysis Using VOSviewer The bibliometric analysis was conducted using the VOSviewer software (Van Eck & Waltman, 2010), which is specifically designed for constructing and visualizing bibliometric networks. The following analyses were performed:

- **Co-citation Analysis:** A co-citation analysis was carried out to identify the most influential publications and authors in the field of forgetting curves and knowledge retention. This analysis revealed the seminal works that have shaped the discourse and intellectual foundations of the research domain.
- **Co-occurrence Analysis:** A co-occurrence analysis of keywords was performed to uncover the main themes, topics, and research areas prevalent in the existing literature. This analysis provided insights into the conceptual structure of the field and helped identify potential gaps or emerging trends.
- **Bibliographic Coupling:** Bibliographic coupling analysis was employed to examine the similarities between publications based on the references they share. This analysis aided in tracing the development of specific research topics or methodologies over time.

4. RESULTS AND DISCUSSION

Figure 3. Co-Authorship Analysis

The co-authorship network visualizes collaborations between authors in the studied field. Larger node sizes represent authors with more co-authored publications. Well-connected authors forming clusters indicate frequent collaborations and potential research groups or institutions working together. The analysis reveals the influential authors driving research in this domain based on their co-authorship patterns and collaborations.

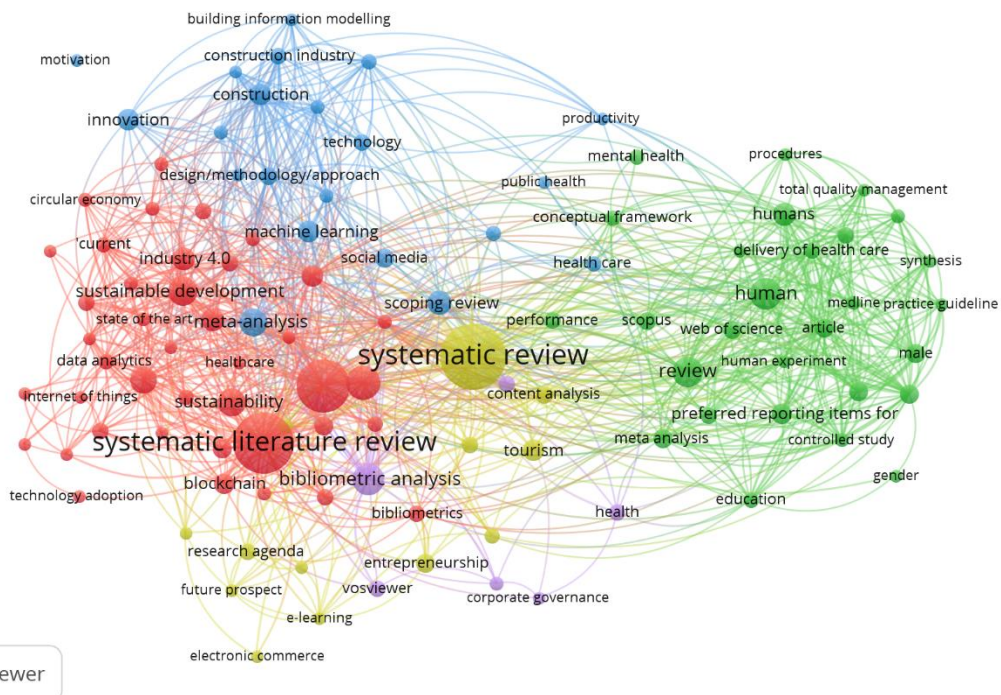
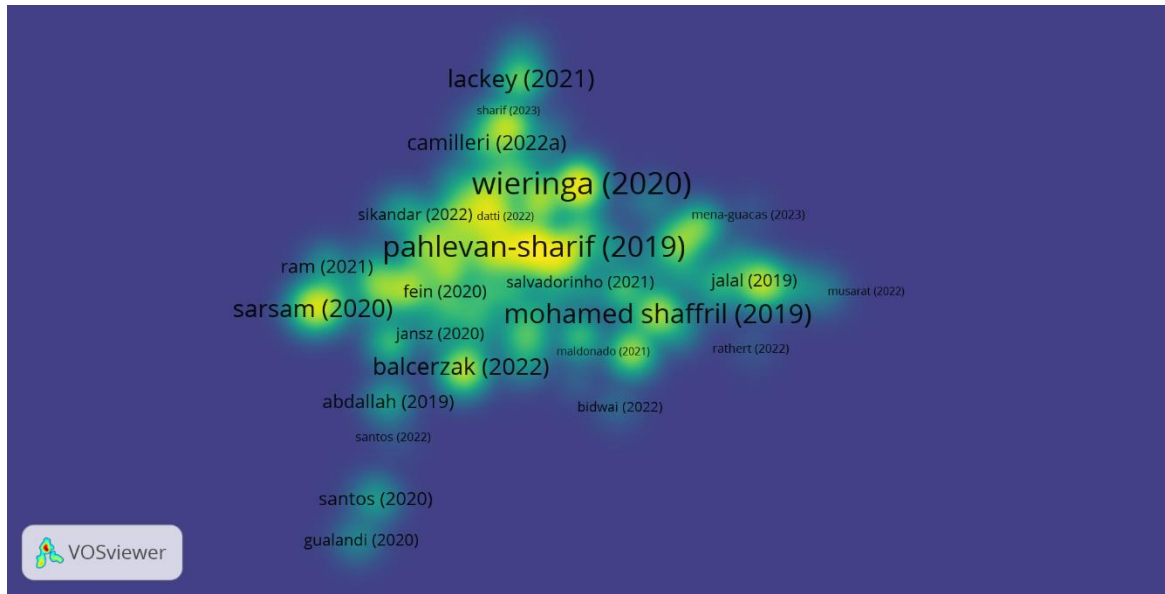


Figure 4: Bibliographic Coupling

Bibliographic coupling shows relationships between publications based on the references they share. Strongly connected publications in clusters suggest closely related or similar research topics/methodologies. This analysis can trace how specific research themes evolved over time by examining the connections and positioning of publications within the network.

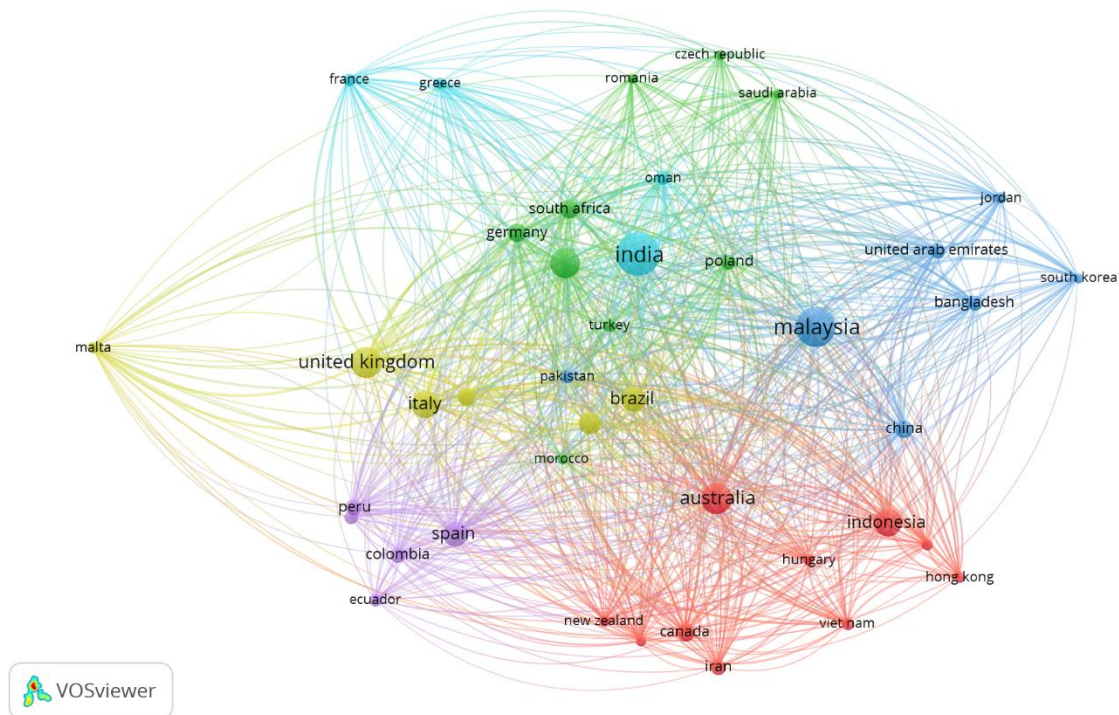


Figure 5: Overlay Co-Authorship Analysis

This visualization overlays bibliographic data (e.g., publication years) onto the co-authorship network. The coloring likely represents different time periods, allowing you to see the evolution of collaborations and identify emerging or declining collaborative patterns among authors over time.

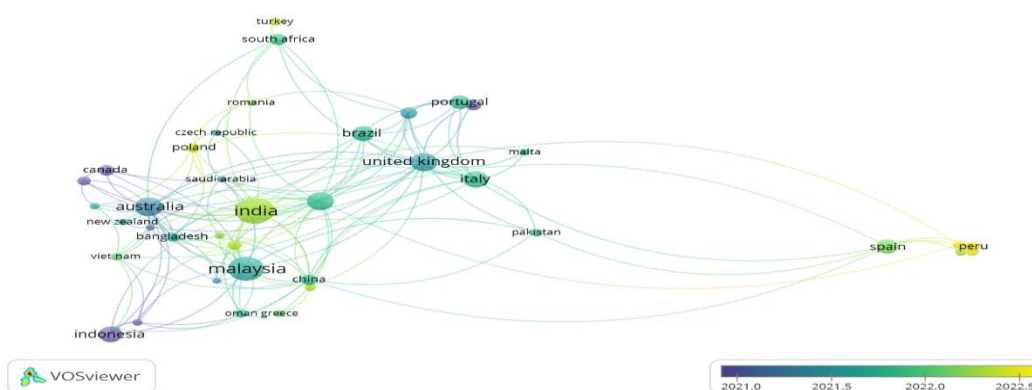


Figure 6: Most Cited Analysis

This analysis highlights the most highly cited publications within the dataset. The larger nodes represent publications with a higher number of citations, indicating their influential status and impact in shaping the research field. Examining these highly cited works can provide insights into seminal theories, methodologies, or findings that significantly contributed to the domain.

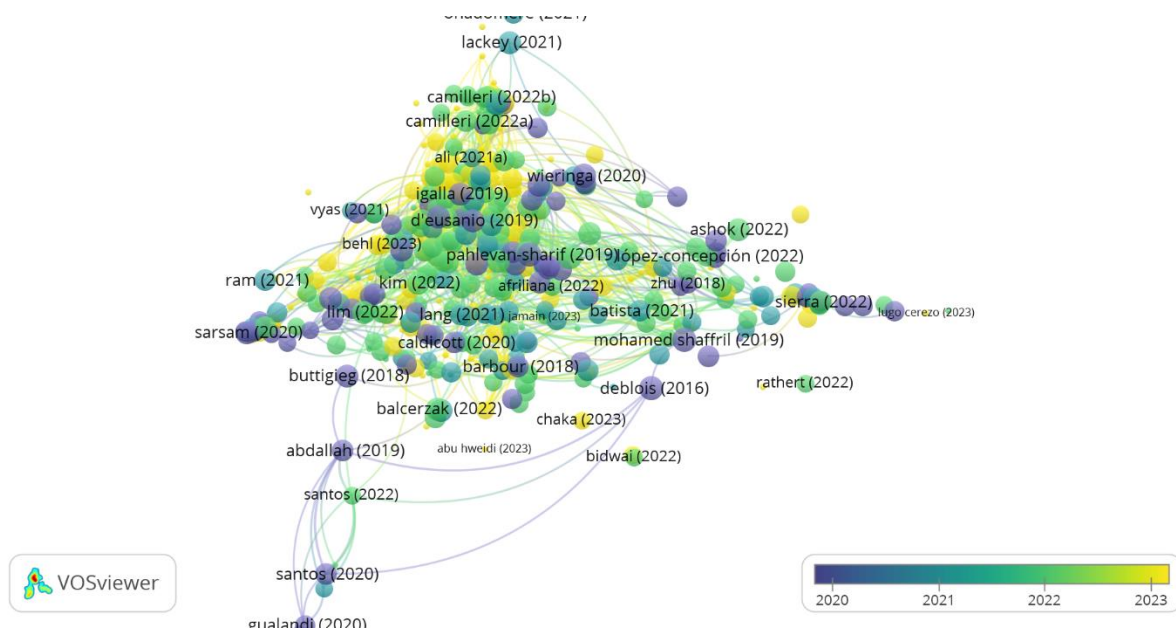


Figure 7: Co-Citation Author Analysis

Co-citation analysis examines authors based on how frequently they are cited together in other publications. Closely positioned and well-connected nodes represent authors whose works are often co-cited, suggesting their influential and related contributions to the research area. This analysis reveals the key authors and schools of thought that have shaped the intellectual foundations of the field.

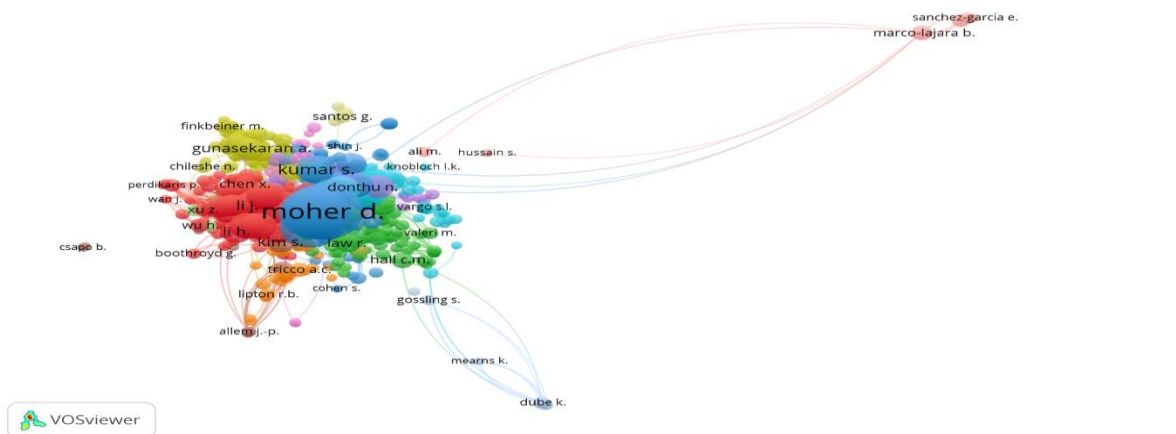
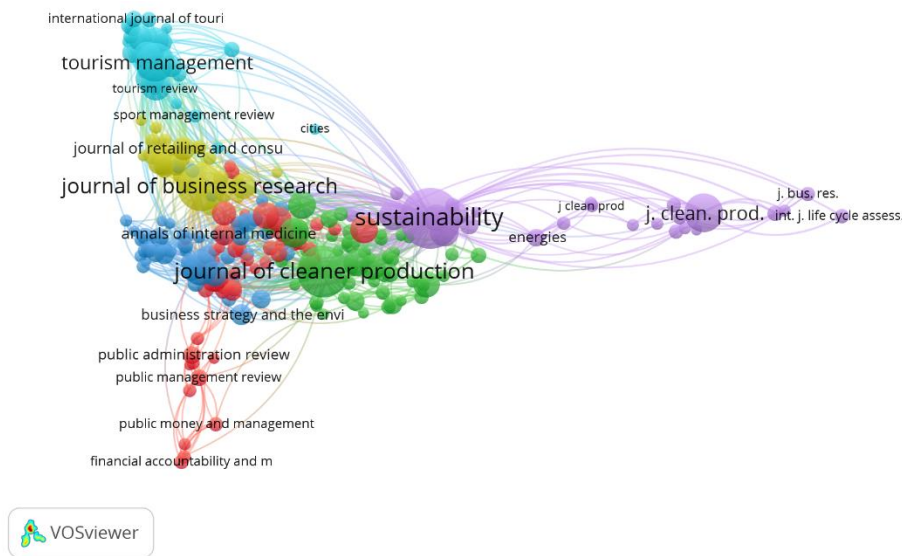


Figure 8: Co-Citation Analysis

Similar to the co-citation author analysis, this visualization depicts the co-citation patterns among publications. Highly co-cited publications clustered together indicate closely related or foundational works that have significantly influenced the research discourse. Examining these co-citation clusters can uncover the core literature and intellectual bases underlying the studied domain.



Overall, the VOSviewer analyses provide valuable bibliometric insights into the research landscape, influential authors, publications, collaborations, and conceptual structures within the studied field. By interpreting these visualizations in conjunction with a thorough literature review, you can better understand the intellectual foundations, emerging trends, and potential gaps, ultimately informing your research objectives and contributions.

5. PROPOSED METHODS

Based on the bibliometric analysis, literature review, and insights gained, here are some proposed methods and strategies to enhance knowledge retention and minimize the effect of the forgetting curve in the IT and ITES sector in the Mumbai region:

1. Spaced Repetition and Retrieval Practice:

Numerous studies have highlighted the effectiveness of spaced repetition and retrieval practice in enhancing long-term memory retention (Karpicke & Roediger, 2008; Weinstein et al., 2019). Implementing these techniques in training programs can significantly improve knowledge retention among learners.

Spaced repetition involves revisiting and reviewing the learned material at strategically spaced intervals, rather than in a single, massed session. This approach aligns with the spacing effect, which suggests that information is better retained when learning is distributed over time.

Retrieval practice involves actively recalling and retrieving information from memory, rather than simply re-reading or re-exposing learners to the material. This practice can be facilitated through quizzes, practice tests, or prompts that encourage learners to retrieve and apply the learned concepts.

2. Multimedia and Multimodal Learning:

Incorporating multimedia and multimodal learning strategies has been shown to enhance knowledge retention by engaging multiple senses and cognitive pathways (Mayer, 2009). This approach can be particularly effective in the IT and ITES sector, where concepts often involve technical information, diagrams, and visualizations.

Multimodal learning combines various modes of instruction, such as text, images, videos, simulations, and interactive exercises. By presenting information through multiple channels, learners can better understand, process, and retain the material.

3. Personalized and Adaptive Learning:

Tailoring learning experiences to individual needs, preferences, and learning styles can significantly improve knowledge retention (Oxman & Wong, 2014). Adaptive learning systems and personalized training modules can be developed to cater to the diverse backgrounds and skill levels of learners in the IT and ITES sector.

These systems can employ techniques such as pre-assessments, learning analytics, and intelligent tutoring systems to identify each learner's strengths, weaknesses, and learning preferences. Based on this data, the training content and delivery methods can be customized, ensuring that learners receive instruction tailored to their needs and learning styles.

4. Social and Collaborative Learning:

Incorporating social and collaborative learning activities can enhance knowledge retention by facilitating active engagement, peer interaction, and the sharing of diverse perspectives (Slavich & Zimbardo, 2012). In the IT and ITES sector, where teamwork and collaboration are often integral, fostering such learning environments can be beneficial.

Strategies such as group discussions, problem-solving activities, peer-to-peer teaching, and collaborative projects can be implemented. These activities not only promote knowledge retention but also develop essential teamwork and communication skills required in the industry.

5. Gamification and Simulation-based Learning:

Gamification and simulation-based learning approaches can make the learning experience more engaging, interactive, and memorable (Landers, 2014; Vlachopoulos & Makri, 2017). By incorporating game-like elements, such as points, badges, leaderboards, and immersive simulations, learners can be motivated to actively participate and retain the acquired knowledge.

In the IT and ITES sector, simulations and virtual environments can be particularly useful for practicing real-world scenarios, troubleshooting exercises, and developing practical skills in a risk-free environment.

Potential Implementation and Implications:

Implementing these proposed methods may require a significant investment in training infrastructure, instructional design, and technological resources. However, the long-term benefits of enhanced knowledge retention and improved training effectiveness can outweigh the initial costs.

Organizations in the IT and ITES sector may need to:

- Allocate budgets for developing multimedia and interactive learning materials, adaptive learning systems, and gamification platforms.
- Provide training for instructors and facilitators to effectively utilize the proposed methods and technologies.
- Collaborate with educational institutions, instructional designers, and technology providers to implement personalized and adaptive learning solutions.
- Foster a learning culture that encourages active participation, collaboration, and continuous professional development.
- Evaluate and measure the effectiveness of the implemented strategies through assessments, performance metrics, and learner feedback.

By adopting these methods, organizations can expect improved knowledge retention among their workforce, leading to enhanced job performance, increased productivity, and better return on investment in training initiatives. Additionally, a highly skilled and knowledgeable workforce can contribute to the overall competitiveness and success of the IT and ITES sector in the Mumbai region.

6. CONCLUSION

This research aimed to investigate the factors affecting the forgetting curve in learners and propose effective methods to enhance knowledge retention post-training, with a specific focus on the IT and ITES sector in the Mumbai region. Through a comprehensive bibliometric analysis and an extensive review of the existing literature, several significant findings and contributions emerged.

KEY FINDINGS AND CONTRIBUTIONS:

1. The bibliometric analysis revealed the influential publications, authors, and research themes that have shaped the discourse on forgetting curves and knowledge retention strategies. This analysis provided a solid foundation for understanding the intellectual landscape and positioning the research within the broader context of the field.
2. The study identified several evidence-based methods and strategies that can potentially minimize the effect of the forgetting curve and enhance knowledge retention among learners in the IT and ITES sector. These include spaced repetition and retrieval practice, multimedia and multimodal learning, personalized and adaptive learning, social and collaborative learning, and gamification and simulation-based learning.
3. The proposed methods offer practical and innovative approaches to address the challenges of knowledge retention in corporate training environments. By incorporating these strategies, organizations in the IT and ITES sector can potentially improve the effectiveness of their training programs, leading to a more skilled and knowledgeable workforce, increased productivity, and better return on investment.
4. The research contributes to the growing body of literature on learning and memory retention, specifically in the context of corporate training and professional development. The findings and recommendations can inform instructional design practices and training policies within the IT and ITES industry.

LIMITATIONS AND FUTURE RESEARCH DIRECTIONS:

- The study primarily relied on secondary data and literature analysis. Future research could incorporate primary data collection through surveys, interviews, or experimental studies to validate the proposed methods and their effectiveness in the specific context of the IT and ITES sector in the Mumbai region.
- As technology continues to evolve, future research could explore the integration of emerging technologies, such as virtual reality, augmented reality, and artificial intelligence, into the proposed methods for enhancing knowledge retention and creating immersive learning experiences.

By addressing these limitations and pursuing further research in these directions, a more comprehensive understanding of knowledge retention strategies and their practical applications in corporate training can be achieved, ultimately benefiting organizations, learners, and the broader industry.

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