

# Asynchronous Technologies in Mental Health Care and Education

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#### Abstract

*Purpose of review* Patients, providers, and trainees should understand the current types of asynchronous technologies that can be used to enhance the delivery and accessibility of mental health care. Asynchronous telepsychiatry (ATP) removes the need for real time communication between the clinician and patient, which improves efficiency and enables quality specialty care. ATP can be applied as distinct consultative and supervisory models in *clinician-to-clinician, clinician-to-patient*, and *patient-to-mobile health* settings.

*Recent findings* This review is based on research literature and the authors' clinical and medical training, using experiences with asynchronous telepsychiatry from before, during, and after the COVID-19 pandemic. Our studies demonstrate that ATP provides positive outcomes in the *clinician-to-patient* model with demonstrated feasibility, outcomes and patient satisfaction. One author's medical education experience in the Philippines during COVID-19 highlights the potential to utilize asynchronous technology in areas with limitations to online learning. We emphasize the need to teach media skills literacy around mental health to students, coaches, therapists, and clinicians when advocating for mental well-being. Several studies have demonstrated the feasibility of incorporating asynchronous e-tools such as self-guided multimedia and artificial intelligence for data collection at the *clinician-to-clinician* and *patient-to-mobile health* level. In addition, we offer fresh perspectives on recent trends in asynchronous telehealth in wellness, applying concepts such as "tele-exercise" and "tele-yoga."

*Summary* Asynchronous technologies continue to be integrated into mental health care services and research. Future research must ensure that the design and the usability of this technology puts the patient and provider first.

#### Introduction

Currently, over 28 million people in the USA have mental illnesses that remain untreated. According to the *State of Mental Health in America 2023 Report*, significant barriers include cost of care (42%), lack of resources to go get services (27%), beliefs that patients can handle their mental health without treatment (26%), a lack of time to seek treatment (19%), and finally that health insurance is not paying enough for mental health treatment (17%).

The ratio of US mental health providers [1] to individuals is 1:350. This proportion is exacerbated when considering the actual accessibility of these providers, which includes factors such as insurance acceptance, availability to accept new patients, and cultural and linguistic representation of their serving community. This shortage of mental health practitioners is intensified in rural regions [2], as the majority of practicing US psychiatrists are located in urban areas, as tabulated by the U.S. Bureau of Labor Statistics. Over 50% of counties in the USA lack even a single psychiatrist, further magnifying the problem in underserved areas.

#### **Response to the COVID-19 pandemic**

The COVID-19 pandemic accentuated the gaps in mental health services along with the desperate need to shift to virtual methods as infection control became of utmost importance. Social, community, and rehabilitation services for mental health care were limited or stopped altogether. Psychiatric units closed down to transform into emergency COVID-19 units. To address these challenges, mental health services began to rely largely on telehealth to continue care. Mental health services, however, were under-prepared to equip staff with best practices in delivering timely, flexible, and quality telepsychiatry solutions. Online prescriptions also became an integral, yet legally complex service to improve upon [3••]. In response, mental health leaders around the world explored trends [4] and innovative approaches [5•] to reach for accessible, high-quality care for all. Professionals additionally used therapy apps, social media, and messenger platforms to reach out to patients and the public.

#### The role of technology in mental health care

The 2022 World Mental Health Report by WHO highlights the important role of digital technologies in achieving universal, patient-focused mental health coverage [5•]. These technologies allow patients to access asynchronous telehealth, which allows communication between clinicians and patients without the need for real-time interaction. This differs from synchronous telehealth, which requires coordination of patient and clinician schedules,

ready availability of technology, and adequate staff for support. Advantages of *asynchronous telehealth* include better access to specialty care, improved efficiency for the patient and provider, and reduced cost of care. Disadvantages include limitations in physical exam and direct communication [6–8]. Asynchronous telehealth appears in distinct consultative and supervisory models. Telehealth can be categorized by interaction type: clinician-to-clinician, clinician-to-patient, and patient-to-mobile health technology [9].

The "clinician-to-clinician" model can be seen in medical training, where videoconferencing systems are used for continuing medical education and student clinical evaluation. Reviews have discussed teaching models around teaching anxiety management via telehealth to US clerkship medical students, but the model largely focuses on synchronous aspects of a virtual visit [10]. Research should therefore expand into asynchronous opportunities to enhance the educational experience for both the clinical trainer and the trainee. Clinician-to-clinician telehealth is further described in the section on "Asynchronous technologies in education."

The "clinician-to-patient" and "patient-to-mobile health" models encompass the ways that an individual can interact with various technologies when receiving health care. Clinician-to-patient technologies support the patientphysician relationship while patient-to-mobile health technologies empower the patient in self-management to maintain and personalize their care. Examples within the patient-to-mobile health model allow patients to leverage self-directed multimedia to access resources without the direct need of a professional at hand. Both clinician-to-patient and patient-to-mobile health are further discussed in the section on "Asynchronous technologies in clinical care."

In this review, we reflect on current trends in asynchronous telehealth incorporating our experiences as medical professionals and trainees. We discuss recent use cases of asynchronous technologies from both educational and clinical perspectives, which are relevant to shaping the current and future standards of mental health care and training. We hope that this inspires the ongoing exploration of safe and practical implementation [11] of technologies in psychiatric care.

# Asynchronous technologies in education

#### For the mental health trainee

Training in psychotherapy has already implemented asynchronous digital recordings of sessions, giving trainees the opportunity to improve and update their skillset. This is particularly beneficial to providers practicing in underserved communities, who have historically lacked evidence-based training in selected disorders across the age spectrum [12].

COVID-19 also shifted US psychiatry residency curriculum and training to include virtual options. In a cross-sectional online survey conducted between July and November 2020, 245 US psychiatry program directors were contacted with 22% of them completing the entire survey. Results showed that prior to

the pandemic, 82% reported that didactics were entirely in-person, whereas post-pandemic, 98% reported using real-time online didactics. Only 17% however utilized asynchronous methods of pre-recorded lectures to supplement real-time online lectures [13]. While more research is needed to evaluate the efficacy of virtually-conducted educational settings in medical training, these examples demonstrate a willingness and ability to explore hybrid models of learning. Future studies should focus on understanding best principles for active learning in psychiatric education [14, 15].

An interesting area of research that uses an asynchronous modality to provide clinical information is through social media which continues to be a valuable e-tool for mental health patients and providers [16]. As more mental health professionals engage in participatory medicine [17], the more important it becomes to promote media skills literacy around mental health to trainees [18]. This is crucial as social media utilization is the preferred platform for digital natives, namely medical students and residents [19, 20]. Media-related curricula for mental health issues have already been advocated for in psychiatry residency programs. Suggestions include 3 core domains to incorporate into basic media-related education: (1) effects of media coverage around mental health on public attitudes toward these topics, (2) clinical scenarios related to media that may arise during the practice of psychiatry, and (3) education for psychiatry residents around media participation [18].

#### For the medical student

COVID-19 accelerated the adoption of blended styles of learning in both developed [21] and developing countries like the Philippines [22•], Somalia [23], and Thailand [24]. As an example, we will highlight the asynchronous use cases of blended learning in the Philippines, based on this author's experience at University of the East Ramon Magsaysay Memorial Medical Center (UERMMMC) College of Medicine in Manila. Philippine medical schools were quick to innovate to prevent suspension of medical education across the country [25]. Despite facing severe challenges such as poor Internet connection, limited access to Internet-enabled devices, and lack of study space at home [22•], schools incorporated both synchronous and asynchronous teaching methods into a new reality of virtual medical training. Asynchronous technologies — such as watching pre-recorded lectures prior to attending synchronous sessions — were considerably used to make up for times when Internet connection and data were severely limited.

Despite the challenge in adopting a model of learning that was different from the traditional classroom-based in person teaching, the use of asynchronous teaching deepened the medical student's learning. Clinician presentations were shifted to an asynchronous model, which allowed synchronous sessions to become a time for clinicians to simulate clinical cases with students for better active learning. Asynchronous resources allowed students to access teaching modules when they could not attend synchronous sessions because of limited Internet connectivity. Students wanted collaborative learning in the online environment, where they could use asynchronous technologies such as e-mail, chat, discussion boards, and social media to interact with peers. Not only did collaborative learning support their education, it also supported their mental health to be able to continue learning in solidarity with peers, despite it being remote [26].

# Asynchronous technologies in clinical care

Psychiatry supports collaborative models of care that promote multidisciplinary teams and the integration of digital technologies. Hybrid care uses both in-person and online methods to treat both individual patients and populations of patients [27, 28]. Although technology-supported models are now the standard of psychiatric care, there is still a need to improve the provider experience [29] when using technology. Despite this, provider attitudes continue to change as patients demand better access to providers and more choices in treatment. Providers in favor of hybrid models cite increased quality of life outside of medicine, including parenting, retirement, and preferring to work nontraditional hours to pursue other interests [12]. Telemedicine continues to improve, augment, and replace shortcomings in traditional in-person only care and counteract cognitive biases [30] such as anchoring, premature closure [31], or reliance on authority [32].

Asynchronous telepsychiatry (ATP) encourages sustainable integration of technology in the 3 core components of a traditional doctor-patient interaction: (1) the history and physical exam, (2) assessment and diagnosis, and (3) creation of a treatment plan. ATP, however, has received much less research attention than synchronous telepsychiatry (STP), and apart from some anecdotal reports focused on patient and provider satisfaction from our own studies, there are no other formal studies of patient or provider satisfaction with ATP. We have reported the clinical outcomes of a 2-year randomized controlled clinical trial of STP vs. ATP in primary care performed from 2014 to 2018, which showed positive outcomes for both groups, without major differences in efficacy [33••, 34•, 35, 36, 37•, 38]. We believe that this is the first such study examining the two telepsychiatry modalities from the perspective of both patients and providers. We found that patients expressed overall satisfaction with both STP and ATP, although ATP reported more concerns due to a slower feedback response than after an STP consultation [33••]. Patients have been more satisfied with the delivery of care [28] in addition to the ATP workflow, which allows for more flexible scheduling than STP for both patients and providers [35]. If ATP were to become a regular clinical service, clinician recommendations could go from a 2-week to a 24-h turn-around time [28]. Prior reviews have also consolidated the breadth and potential of asynchronous e-tools such as video games and e-therapy [16, 39].

#### Asynchronous e-tools for wellness

Evidence persists about the benefits of physical activity on mental health across diverse populations [40]. In the 2021 Worldwide Survey of Fitness Trends, online training has emerged as a top-ranked trend, surging from its

26th position in 2020. Online training leverages digital streaming technology to facilitate the dissemination of individual, group, or instructional exercise programs via the Internet, with the added advantage of being accessible 24/7, in the form of live sessions or pre-recorded modules [41].

Digital and remote physical activity programs with added social support have shown to help address the ongoing mental health needs of cancer survivors during and after the COVID-19 pandemic [42]. Both synchronous and asynchronous models of tele-exercise have been suggested, which have similar processes to synchronous and asynchronous telepsychiatry [43]. Asynchronous tele-exercise enables communication to take place without the need for real-time interaction, utilizing tools such as messaging, e-mail, video recording, and the electronic medical record. When used in conjunction with synchronous tele-exercise, this approach can aid in the control of training load, aiding in proper "prescription of exercise routines." This may help avoid inadequate levels of physical activity or excessive intensities that may result in injury. Existing research has shown that adherence to synchronous tele-exercise is higher compared to asynchronous teleexercise [43]. Therefore, more research is needed to develop strategies to improve adherence to asynchronous tele-exercise programs.

This author's experience as a Registered Yoga Teacher (RYT-200) advocates for the potential for tele-yoga interventions in mental health care. Yoga practice is already known to be a feasible and well-accepted adjunct to clinical and nonclinical mental health care [44–47]. Yoga can be provided in populations with or without chronic conditions [48]. Studies have shown that yoga can increase psychological resilience in older adults [49–51], in trauma healing [52, 53•] for women's health [54] and Veterans [55, 56], and in individuals with opioid use disorder [57]. For example, Trauma Center Trauma-Sensitive Yoga (TCTSY) has shown to be a viable posttraumatic stress disorder (PTSD) treatment option with earlier symptom improvement, higher retention, and sustained effect over cognitively based psychotherapy (CPT) in Women Veterans with PTSD related to military sexual trauma (MST) [58].

Tele-yoga as an adjunct to in-person yoga continues to gain popularity worldwide [59] due to its convenience and opportunities to practice in a safe and familiar environment [60]. Tele-yoga shows another area that utilizes asynchronous e-tools to promote wider dissemination and adherence to the practice [61]. Studies have highlighted themes on the impact of asynchronous pre-recorded tele-yoga intervention such as increased well-being [46], improved self-compassion during stressful life events [53•], and better stress management [62]. Yoga modules for major depressive disorder [63] and generalized anxiety disorder [64] have taken blended approaches to tele-yoga using pre-recorded yoga sessions to empower individuals to continue their practice outside of guided sessions. One single-blind randomized controlled trial that investigated the feasibility and psychosocial effect of a remote yoga intervention via synchronous (live) sessions and asynchronous (selfguided) videos found that participants in the yoga intervention group had a statistically significant reduction in perceived stress and anxiety compared to the control group. Furthermore, this study facilitated autonomy, encouraged self-regulation, and improved ecological validity as participants could engage in the intervention within an area of their choosing rather than a tightly controlled lab [65].

#### Asynchronous e-tools for data collection

Digital phenotyping is the continuous monitoring of behavioral and mental states through user data tracking [66]. It provides objective measurements to improve disease classification, especially for trans-diagnostic symptoms. Currently, sensor technologies show positive results in the acute-setting [67] and in short-term situations [68].

A recent mixed methods study determining the feasibility of active and passive data collection in the treatment of depression followed 66 participants undergoing therapy for depression for 7 months. Continuous active (web-based surveys and a smartphone app "THING-it") and passive (wearable devices and smartphone sensors) data collection were taken before and after treatment. The study demonstrated low retention rates, although comparable to retention rates in psychological therapy. Higher baseline anxiety, length of treatment, and intensity of treatment were all associated with higher attrition suggesting that the higher the complexity of disorder, the fewer benefits there may be to long-term remote monitoring [68].

In a recent scoping review on use of sensors in acute detection of anxiety, of the 1087 studies initially identified, only 11 studies were ultimately included in the review with 5 randomized controlled trials (RCT) and 6 pilot studies. The role of the sensors in these studies was to "reduce, regulate, or manage anxiety" with physiologic sensor measures such as heart rate. While 4 of the RCT studies found significant improvements to measure anxiety, 1 actually concluded that sensors may impede efficacy when combined with an online intervention for stress, which was potentially due to technical issues. This review identified that wearable sensors can implement successful in-the-moment stress and anxiety management techniques such as diaphragmatic breathing [69].

Another study suggested that markers such as automated voice analysis, video behavior analysis, and physiological measures that include heart rate variability and electrodermal activity studies could aid in forming differential diagnoses for major depressive episodes. Although comparative studies are lacking, promising results were found in digital markers with physiological measures, such as heart rate variability, which showed significant differences in patients with bipolar depression compared to unipolar depression and more reactivity in patients with comorbid post-traumatic stress disorder in major depressive disorder when being reminded about a psychological trauma [66].

In a systematic review of smartphone-based passive sensing for health and well-being, 3246 citations were screened with 35 articles being included in the final review. The majority of these studies were not interventional, but used smartphone-based passive sensing across multiple domains of health, with the majority of representations falling under mental health and sleep. Examples of sensors used in these studies were accelerometers (most used), GPS, light sensors, and microphones (least used). The review concluded that passive sensing was more accurate and less intrusive compared to self-report measures. Smartphone-based passive sensing can promote minimally disruptive health care [70] in addition to supporting active patient tracking by facilitating or automating difficult tasks such as daily logging. The review highlighted the advantages of smartphones using several sensors that can be used simultaneously, but only if there is sufficient battery power. In a previous review on automated tools [16], we briefly touched on early iterations of software used to detect dangerous messages, such as suicidal messages. A recent study has successfully stratified a person's level of psychological distress in real time through an examination of their vocal characteristics. This retrospective observational study took short segments of speech from callers to the Australian National Suicide Prevention Helpline and was able to classify groups of speech according to high vs. low psychological distress with high accuracy associating vocal characteristics pertaining to loudness and roughness with higher psychological distress. This modality should therefore be further researched in different ethnic groups who may more commonly present with softer/ masked vocal characteristics when in psychological distress [67]. Furthermore, this niche in AI interpretation may be of interest to explore for minority groups with limited English proficiency [71].

#### Asynchronous e-tools for communication

Communication from providers using artificial intelligence is another compelling area of research. Chatbot-based text health care may offer ways to interweave management into daily life, increase intervention efficacy, and mitigate likelihood of relapse just as was seen in an 8-week intervention using a text-based health care chatbot for the self-management of chronic pain using painSELfMAnagement (SELMA). This was the first randomized controlled trial of a fully automated, unguided text-based conversational agent designed for patients with chronic pain [72]. Chatbots can be integrated into extensively used existing platforms like text SMS, Facebook Messenger, and WhatsApp. Chatbots make it feasible to access large and diverse populations; however, many studies currently are not representative of diverse geographies, cultures, and age groups thus hindering its generalizability [73].

A recent systematic review of chatbots in the promotion of health behavioral change identified 15 studies that demonstrated high efficacy of chatbots in promoting healthy lifestyles, smoking cessation, treatment adherence, and reduction in substance misuse. Although deployment of these chatbots was through typically scalable platforms like Facebook Messenger, it found mixed results on feasibility, acceptability, and usability. Studies set in developing countries were limited in this review, which prompts the need to understand its ability to scale to these areas where platforms such as Facebook Messenger are frequently used [73].

Lastly, one smaller sized formative study offered interesting design approaches to augment behavioral activation therapy through the use of asynchronous remote communities (ARCs). In short, ARCs are technology-mediated groups that use private online platforms to deliver weekly tasks to participants that have shown low burden and high adaptability among their participants. Here, they involved teens and mental health clinicians in the design process by asking their experience of using the remote intervention for 10 weeks. Clinicians appreciated that chatbots gave teens additional information that they missed or had limited time to discuss during a quick appointment [74]. Numerous conclusions were drawn from this study, but the key was that there was a need for augmented human connection in therapy in addition to established boundaries between teens and clinicians around asynchronous communication. Best practices in establishing boundaries as a mental health provider in a hybrid model of care have been discussed extensively [28].

# Conclusion

The potential for asynchronous technology in mental health care remains an active and exciting area of study, with asynchronous approaches clearly increasing substantially over the past decade, but further research is necessary. In this AI-driven world [75], we should not lose sight of the art of medicine [76] that appreciates the human connection between the patient and provider. We must continue to advance artificial intelligence in a way that is mindful of populations such as children, older adults, and patients of color who are more prone to mental health stigma. Digital health solutions in mental health must be created to help individuals identify personally meaningful values and create personalized approaches to combat both mental health stigma and racial and ethnic discrimination [77]. Research and development must focus on establishing practical infrastructures so that the ecosystem of health care providers, collaborating partners, and independent developers can design, provide, and reuse quality services within a reliable and secure environment [78]. Most importantly, the design of digital health software tools must use patient and clinician input regarding the role of technology in the care continuum [37•, 69, 79-81]. Several articles [82, 83] have discussed recent trends in changing attitudes of patients and clinicians in the use of technology for their health. As perspectives shift, we must find ways to provide useful technology-supported solutions for both digital natives and digital immigrants [19]. Technology will continue to play a vital part in the current standard of mental health care, and all stakeholders must understand the ways such technologies integrate into practice.

### Author contribution

All authors contributed to this review article. The first draft of the manuscript was written by Pamela Gail D. Lagera, MD, and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

### Declarations

#### **Competing Interests**

The authors declare no competing interests.

#### Human and Animal Rights and Informed Consent

This article does not contain any studies with human or animal subjects performed by any of the authors.

# **References and Recommended Reading**

# Papers of particular interest, published recently, have been highlighted as:

• Of importance

- •• Of major importance
- 1. Robiner WN. The mental health professions: workforce supply and demand, issues, and challenges. Clin Psychol Rev. 2006;26(5):600–25.
- 2. Morales DA, Barksdale CL, Beckel-Mitchener AC. A call to action to address rural mental health disparities. J Clin Trans Sci. 2020;4(5):463–7.
- 3.•• DG Solveig, S Gersdorf, K Stengler. Global impact of the COVID-19 pandemic on mental health services: a systematic review. J Psychiatr Res. 2022; 154 (October): 354–77.

This systematic review of 29 studies reporting the impact of COVID-19 on mental health services in 63 countries showed that the pandemic led to large disruptions, shortages of staff and equipment, and guidance on transitioning to a virtual or hybrid model of care.

- Drake C, Lian T, Cameron B, Medynskaya K, Bosworth HB, Shah K. Understanding telemedicine's 'new normal': variations in telemedicine use by specialty line and patient demographics. Telemed E-Health. 2022;28(1):51–9.
- 5.• Sristi S, Yellowlees PM, Gotthardt CJ, Luce MS, Avdalovic MV, Marcin JP. Environmental impact of ambulatory telehealth use by a statewide university health system during COVID-19. Telemed J E-Health: The Official Journal of the American Telemedicine Association, December. 2022. https:// doi.org/10.1089/tmj.2022.0396.

This study analyzed retrospective ambulatory telehealth data from 5 UC health systems from 2020 to 2022 and found that telehealth had a positive impact on patient travel, time, costs, injuries in motor vehicle accidents, and greenhouse gas emissions.

6. Stephens J, Greenberg GM. Asynchronous telehealth. Prim Care. 2022;49(4):531–41.

- 7. Patel V, Stewart D, Horstman MJ. E-consults: an effective way to decrease clinic wait times in rheuma-tology. BMC Rheumatology. 2020;4(October):54.
- Wosik J, Fudim M, Cameron B, Gellad ZF, Cho A, Phinney D, Curtis S, et al. Telehealth transformation: COVID-19 and the rise of virtual care. J Am Med Inform Assoc: JAMIA. 2020;27(6):957–62.
- 9. Tuckson RV, Edmunds M, Hodgkins ML. Telehealth. N Engl J Med. 2017;377(16):1585–92.
- 10. Belakovskiy A, Jones EK. Telehealth and medical education. Prim Care. 2022;49(4):575–83.
- Tornero-Costa R, Martinez-Millana A, Azzopardi-Muscat N, Lazeri L, Traver V, Novillo-Ortiz D. Methodological and quality flaws in the use of artificial intelligence in mental health research: systematic review. JMIR Mental Health. 2023;10(February):e42045.
- 12. Chan SR, Parish M B, Fazio S, Torous J. Data collection from novel sources. In Telepsychiatry and health technologies: a guide for mental health professionals, 183–226. American Psychiatric Association Publishing, 2018.
- 13. Koraym H, Kaltman S, Mete M, Akil M. Remote learning in psychiatry residency programs during COVID-19: emergency measure or path for the future? Acad Psychiatry. 2021;45(6):782–3.
- 14. Sandrone S, Berthaud JV, Carlson Ć, Cios J, Dixit N, Farheen A, Kraker J, et al. Active learning in psychiatry education: current practices and future perspectives. Front Psychiatry / Front Res Found. 2020;11(April):211.
- 15. Varkey TC, Varkey JA, Ding JB, Varkey PK, Zeitler C, Nguyen AM, Merhavy ZI, Thomas CR. Asynchronous learning: a general review of best practices for the 21st century. J Res Innov Teach Learn ahead-of-print

(ahead-of-print). 2022. https://doi.org/10.1108/ JRIT-06-2022-0036.

- Chan S, Li L, Torous J, Gratzer D, Yellowlees PM. Review and implementation of self-help and automated tools in mental health care. Psychiatr Clin North Am. 2019;42(4):597–609.
- 17. Yellowlees P, Nafiz N. The psychiatrist-patient relationship of the future: anytime, anywhere? Harv Rev Psychiatry. 2010;18(2):96–102.
- Morris NP, Johansen SL, May M, Gold JA. Mediarelated education in psychiatry residency programs. Acad Psychiatry. 2018;42(5):679–85.
- Wang Q, Myers MD, Sundaram D. Digital natives und digital immigrants. Wirtschaftsinformatik. 2013;55(6):409–20.
- Astleitner H, Bains A, Hörmann S. The effects of personality and social media experiences on mental health: examining the mediating role of fear of missing out, ghosting, and vaguebooking. Comput Hum Behav. 2023;138(C). https://doi.org/10.1016/j.chb. 2022.107436.
- Frankl SE, Joshi A, Onorato S, Jawahir GL, Pelletier SR, Dalrymple JL, Schwartz AW. Preparing future doctors for telemedicine: an asynchronous curriculum for medical students implemented during the COVID-19 pandemic. Acad Med. 2021;96(12):1696–701.
- 22.• Baticulon RÉ, Sy JJ, Alberto NRI, Baron MBC, Mabulay REC, Rizada LGT, Tiu CJS, Clarion CA, Reyes JCB. Barriers to online learning in the time of COVID-19: a national survey of medical students in the Philippines. Med Sci Educ. 2021; 31(2): 615–26.

This review demonstrates the feasibility of using asynchronous technologies to support a student-centered approach in adopting online medical education in a developing country.

- 23. Virani S, Handuleh JIM, Pereira-Sanchez V, Wolde-Giorgis DF. Teaching psychiatry in a low-income country during the COVID-19 pandemic: a hybrid collaborative psychiatry course. Asia-Pacific Psychiatry. 2021;13(4):e12503.
- Kalayasiri R, Wainipitapong S. Training of psychiatry and mental health in a low- and middle-income country: experience from Thailand before and after COVID-19 outbreak. Asia-Pacific Psychiatry. 2021;13(4):e12493.
- Gutierrez J. The Philippines places schools on a 'health break' as Covid cases soar. The New York Times. 2022. https://www.nytimes.com/2022/01/14/world/asia/ covid-philippines-schools.html. Accessed 4 Mar 2023.
- Lapitan LDS, Tiangco CE, Sumalinog DAG, Sabarillo NS, Diaz JM. An effective blended online teaching and learning strategy during the COVID-19 pandemic. Educ Chem Eng. 2021; 35(April):116–31.
- 27. Thippaiah SM, Harbishettar V, Manoj Kumar T, Pandurangi A. Hybrid telepsychiatry: a United States perspective with relevance to India. Indian J Psychol Med. 2020;42(5 Suppl):108S-112S.
- 28. Yellowlees P, Shore JH. Telepsychiatry and health technologies: a guide for mental health

professionals. American Psychiatric Association Publishing. 2018.

- 29. Johansen SL, Olmert T, Chaudhary N, Vasan N, Aragam GG. Incorporating digital interventions into mental health clinical practice: a pilot survey of how use patterns, barriers, and opportunities shifted for clinicians in the COVID-19 pandemic. J Technol Behav Sci. 2022; 1–5.
- Ogdie AR, Reilly JB, Pang WG, Keddem S, Barg FK, Von Feldt JM, Myers JS. Seen through their eyes: residents' reflections on the cognitive and contextual components of diagnostic errors in medicine. Acad Med. 2012;87(10):1361–7.
- 31. Kumar B, Kanna B, Kumar S. The pitfalls of premature closure: clinical decision-making in a case of aortic dissection. BMJ Case Reports. 2011;2011(October). https://doi.org/10.1136/bcr. 08.2011.4594.
- 32. Koutsouleris N, Hauser TU, Skvortsova V, De Choudhury M. From promise to practice: towards the realisation of AI-informed mental health care. Lancet Dig Health. 2022;4(11):e829–40.
- 33.•• Yellowlees PM, Parish MB, Gonzalez AD, Chan SR, Hilty DM, Yoo B-K, Leigh JP et al. Clinical outcomes of asynchronous versus synchronous telepsychiatry in primary care: randomized controlled trial. J Med Internet Res. 2021; 23(7): e24047.

First longitudinal study comparing clinical outcomes for ATP with STP demonstrated that ATP can improve clinical outcomes in English- and Spanish- speaking primary care patients. Did not find evidence that ATP is superior to STP in improving clinical outcomes.

34.• Lieng MK, Aurora MS, Kang Y, Kim JM, Marcin JP, Chan SR, Mouzoon JL et al. Primary care physician adherence to telepsychiatry recommendations: intermediate outcomes from a randomized clinical trial. Telemed J E-Health. 2022; 28 (6): 838–46.

First primary care physician adherence study that demonstrated the feasibility and acceptability of ATP and STP for the provision of collaborative psychiatric care.

- O'Keefe M, White K, Jennings JC. Asynchronous telepsychiatry: a systematic review. J Telemed Telecare. 2021;27(3):137–45.
- Parish MB, Gonzalez A, Hilty D, Chan S, Xiong G, Scher L, Liu D, et al. Asynchronous telepsychiatry interviewer training recommendations: a model for interdisciplinary, integrated behavioral health care. Telemed J E-Health. 2021;27(9):982–8.
- 37.• Hilty DM, Torous J, Parish MB, Chan SR, Xiong G, Scher L, Yellowlees PM. A literature review comparing clinicians' approaches and skills to in-person, synchronous, and asynchronous care: moving toward competencies to ensure quality care. Telemed J E-Health. 2021; 27 (4): 356–73.

Achieving competency in delivering care through ATP has many different components.

38. Xiong GL, Iosif A-M, Godwin HT, Khan M, Parish MB, Yellowlees P, Kahn D. A pilot randomized trial of asynchronous and synchronous telepsychiatry

in skilled nursing facilities. J Am Med Dir Assoc. 2018;19(5):461–2.

- Chan S, Godwin H, Gonzalez A, Yellowlees PM, Hilty DM. Review of use and integration of mobile apps into psychiatric treatments. Curr Psychiatry Rep. 2017;19(12):96.
- Giandonato JÀ, Tringali VM, Thoms RC. Improving mental health through physical activity: a narrative literature review. Phys Act Health. 2021;5(1):146–53. https://doi.org/10.5334/paah.108.
- 41. Liu Ru, Menhas R, Dai J, Saqib ZA, Peng X. Fitness apps, live streaming workout classes, and virtual reality fitness for physical activity during the COVID-19 lockdown: an empirical study. Front Public Health. 2022;10(June):852311.
- 42. Faro JM, Mattocks KM, Nagawa CS, Lemon SC, Wang Bo, Cutrona SL, Sadasivam RS. Physical activity, mental health, and technology preferences to support cancer survivors during the COVID-19 pandemic: cross-sectional study. JMIR Cancer. 2021;7(1):e25317.
- Costa RRG, Dorneles JR, Veloso JH, Gonçalves CW, full Neto FR. Synchronous and asynchronous tele-exercise during the coronavirus disease 2019 pandemic: 54. comparisons of implementation and training load in individuals with spinal cord injury. J Telemed Telecare. 2021. https://doi.org/10.1177/13576 33X20982732.
- Pascoe MC, Parker AG. Chapter 18 yoga and mental health. In Exercise to prevent and manage chronic disease across the lifespan, edited by Jack Feehan, Nicholas Tripodi, and Vasso Apostolopoulos, 251–60. Academic Press. 2022.
- 45. Forseth B, Polfuss M, Brondino M, Hunter SD, Lawlor MW, Beatka MJ, Prom MJ, Eells J, Lyons J-A. Adherence to and changes in mental and physiological health during an 8-week yoga intervention: a pilot study. J Bodyw Mov Ther. 2022;30(April):203–9.
- Iwazaki J, Aoki K, Kato C, Kimura K. COVID-19 pandemic and the verification of effects of yoga intervention using YouTube on mental health and subjective happiness of workers. Psychology. 2021;12(12):2083–96.
- 47. Nyer M, Gerbarg PL, Silveri MM, Johnston J, Scott TM, Nauphal M, Owen L, et al. A randomized controlled dosing study of Iyengar yoga and coherent breathing for the treatment of major depressive disorder: impact on suicidal ideation and safety findings. Complement Ther Med. 2018;37(April):136–42.
- James-Palmer A, Anderson EZ, Daneault J-F. Remote delivery of yoga interventions through technology: scoping review. J Med Internet Res. 2022;24(6):e29092.
- 49. Öztürk FÖ, Bayraktar EP, Tezel A. The effect of laughter yoga on loneliness, psychological resilience, and quality of life in older adults: a pilot randomized controlled trial. Geriatr Nurs. 2023;50(February):208–14.

- 50. Baklouti S, Fekih-Romdhane F, Guelmami N, Bonsaksen T, Baklouti H, Aloui A, Masmoudi L, Souissi N, Jarraya M. The effect of web-based hatha yoga on psychological distress and sleep quality in older adults: a randomized controlled trial. Complement Ther Clin Pract. 2023;50(February):101715.
- 51. Chobe S, Chobe M, Metri K, Patra SK, Nagaratna R. Impact of yoga on cognition and mental health among elderly: a systematic review. Complement Ther Med. 2020;52(August):102421.
- 52. Bennett LM, Starnino VR. The experience of yoga for persons with complex interpersonal trauma: a phenomenological approach. Complement Ther Clin Pract. 2022;49(November):101674.
- 53.• Mulvihill T, Bradbury J, Grace Ś, Doran F. Traumainformed yoga (online) for positive mental health: a pilot study. Adv Integr Med. 2022; 9(4): 205–13.

This study demonstrated use of an asynchronous tele-yoga intervention to provide positive effects of trauma-informed yoga on positive mental health, mindfulness, resilience, and significant improvement in self-compassion.

- 54. Huberty J, Sullivan M, Green J, Kurka J, Leiferman J, Gold K, Cacciatore J. Online yoga to reduce post traumatic stress in women who have experienced stillbirth: a randomized control feasibility trial. BMC Complement Med Ther. 2020;20(1):173.
- 55. Schulz-Heik RJ, Meyer H, Mahoney L, Stanton MV, Cho RH, Moore-Downing DP, Avery TJ, et al. Results from a clinical yoga program for veterans: yoga via telehealth provides comparable satisfaction and health improvements to in-person yoga. BMC Complement Altern Med. 2017;17(1):198.
- 56. Braun TD, Uebelacker LA, Ward M, Holzhauer CG, McCallister K, Abrantes A. 'We really need this': trauma-informed yoga for veteran women with a history of military sexual trauma. Complement Ther Med. 2021;59(June):102729.
- 57. Uebelacker LA, Van Noppen D, Tremont G, Bailey G, Abrantes A, Stein M. A pilot study assessing acceptability and feasibility of Hatha yoga for chronic pain in people receiving opioid agonist therapy for opioid use disorder. J Subst Abuse Treat. 2019;105(October):19–27.
- 58. Zaccari B, Sherman ADF, Febres-Cordero S, Higgins M, Kelly U. Findings from a pilot study of trauma center trauma-sensitive yoga versus cognitive processing therapy for PTSD related to military sexual trauma among women veterans. Complement Ther Med. 2022;70(November):102850.
- 59. Thompson WR. Worldwide survey of fitness trends for 2021. ACSMs Health Fit J. 2021;25(1):10.
- 60. Haynes A, Gilchrist H, Oliveira JS, Sherrington C, Tiedemann A. 'I wouldn't have joined if it wasn't online': understanding older people's engagement with teleyoga classes for fall prevention. BMC Complement Med Ther. 2022;22(1):283.
- 61. Six SG, Byrne KA, Aly H, Harris MW. The effect of mental health app customization on

depressive symptoms in college students: randomized controlled trial. JMIR Mental Health. 2022;9(8):e39516.

- 62. Jasti N, Bhargav H, George S, Varambally S, Gangadhar BN. Tele-yoga for stress management: need of the hour during the COVID-19 pandemic and beyond? Asian J Psychiatr. 2020;54(December):102334.
- 63. Dhamodhini M, Maheshkumar K, Silambanan S, Kantipudi SJ, Sathianathan R, Padmavathi. Development and validation of voga protocol for patients with depression. Ann Neurosci. 2022. https://doi.org/10.1177/097275312211277 66.
- 64. More P, Vinod Kumar MR, Rani U, Philip M, Manjunatha N, Varambally S, Gangadhar BN. Development, validation, and feasibility of a generic yoga-based intervention for generalized anxiety disorder. Complement Ther Med. 2021;63(December):102776.
- 65. Phansikar M, Gothe N, Hernandez R, Lara-Cinisomo S, Mullen SP. Feasibility and impact of a remote moderateintensity yoga intervention on stress and executive functioning in working adults: a randomized controlled trial. J Behav Med. 2023;1-12. https://doi.org/10.1007/ s10865-022-00385-4.
- 66. Ettore E, Müller P, Hinze J, Benoit M, Giordana B, Postin D, Lecomte A, Lindsay H, Robert P, König A. Digital phenotyping for differential diagnosis of major depressive episode: narrative review. IMIR Mental Health. 2023;10(January):e37225.
- 67. Iver R, Nedeljkovic M, Meyer D. Using vocal characteristics to classify psychological distress in adult helpline callers: retrospective observational study. JMIR Formative Res. 2022;6(12):e42249.
- de Angel V. Adeleve F. Zhang Y. Cummins N. 68. Munir S, Lewis S, Puyal EL, et al. The feasibility of implementing remote measurement technologies in psychological treatment for depression: mixed methods study on engagement. JMIR Mental Health. 2023;10(January):e42866.
- 69. Dobson R, Li LL, Garner K, Tane T, McCool J, Whit- 83. taker R. The use of sensors to detect anxiety for in-the-moment intervention: scoping review. JMIR Mental Health. 2023;10(1):e42611.
- 70. Cornet VP, Holden RJ. Systematic review of smartphone-based passive sensing for health and wellbeing. J Biomed Inform. 2018;77(January):120-32.
- Tougas H, Chan S, Shahrvini T, Gonzalez A. The use of 71. automated machine translation to translate figurative language in a clinical setting: analysis of a convenience Springer Nature remains neutral with regard to jurisdictional sample of patients drawn from .... JMIR Mental. 2022. https://mental.jmir.org/2022/9/e39556. Accessed 2 Feb 2023.
- 72. Hauser-Ulrich S, Künzli H, Meier-Peterhans D, Kowatsch T. A smartphone-based health care chatbot to promote self-management of chronic pain (SELMA): pilot randomized controlled trial. JMIR Mhealth Uhealth. 2020;8(4):e15806.

- 73. Aggarwal A, Tam CC, Dezhi Wu, Li X, Qiao S. Artificial intelligence-based chatbots for promoting health behavioral changes: systematic review. J Med Internet Res. 2023;25(February):e40789.
- 74. Bhattacharya A, Nagar R, Jenness J, Munson SA, Kientz JA. Designing asynchronous remote support for behavioral activation in teenagers with depression: formative study. JMIR Formative Res. 2021;5(7):e20969.
- 75 Nundy S, Montgomery T, Wachter RM. Promoting trust between patients and physicians in the era of artificial intelligence. JAMA. 2019;322(6):497-8.
- 76 Toll E. A piece of my mind. The cost of technology. JAMA. 2012;307(23):2497-8.
- 77 Krill Williston S, Martinez JH, Abdullah T. Mental health stigma among people of color: an examination of the impact of racial discrimination. Int J Soc Psychiatry. 2019;65(6):458-67.
- Lamo Y, Mukhiya SK, Rabbi F, Aminifar A, 78. Lillehaug SI, Tørresen J, Minh H Pham, et al. Towards adaptive technology in routine mental health care. Digit Health. 2022; 8(November): 20552076221128678.
- 79. Eis S, Solà-Morales o, Duarte-Díaz A, Vidal-Alaball J, Perestelo-Pérez L, Robles N, Carrion C. Mobile applications in mood disorders and mental health: systematic search in Apple App Store and Google Play Store and review of the literature. Int J Environ Res Public Health. 2022; 19(4). https://doi.org/10.3390/ ijerph19042186.
- 80. Lattie EG, Stiles-Shields C, Graham AK. An overview of and recommendations for more accessible digital mental health services. Nat Rev Psychol. 2022;1(2):87-100.
- 81. Nwosu A, Boardman S, Husain MM, MuraliDoraiswamy P. Digital therapeutics for mental health: is attrition the Achilles heel? Front Psychiatry / Front Res Found. 2022;13(August):900615.
- 82. Morrison LG, Yardley L, Powell J, Michie S. What design features are used in effective e-health interventions? A review using techniques from critical interpretive synthesis. Telemed J E-Health. 2012;18(2):137-44.
  - Funnell EL, Spadaro B, Martin-Key N, Metcalfe T, Bahn S. mHealth solutions for mental health screening and diagnosis: a review of app user perspectives using sentiment and thematic analysis. Front Psychiatry / Front Res Found. 2022;13(April):857304.

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