

**Flight Plan for Success**  
Adapting to Change and Building Healthy Workplaces

**AI FOR BEHAVIORAL HEALTHCARE:  
What is it? What's Possible? And  
What Should We Watch Out For?**




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**AI for behavioral healthcare: What is it, what's possible, and what should we watch out for?**

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University of Washington





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**Acknowledgements and Disclosure**

<p><b>Research support:</b></p> <p><b>AI/ML Development</b> R01 AA018673 R34 DA034860 K02 AA023814 R56 MH118550</p> <p><b>Clinical technologies</b> R44 AA028463 R44 DA046243 R42 MH123215 R42 MH128101 R44 MH133517 The Annie E. Casey Foundation</p>	<p><b>Disclosure:</b></p> <p>I am a co-founder with equity stake in Lyssn.io, Inc., a start-up focused on tools to support training, supervision, and quality assurance of psychotherapy and counseling.</p> <p>All opinions and content are my own and do not necessarily reflect views of NIH or AECF.</p>
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Overview



- A bit about me
- Where we are headed
  - What is AI?
  - Where is AI useful (or might be)?
  - What should we look for when considering AI solutions?




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"AI is not just about efficiency gains, it's about opening up new possibilities, unlocking human potential and **solving some of society's biggest challenges.**"  
Yoshua Bengio

"Artificial intelligence is extending what we can do with our abilities. In this way, it's letting us **become more human.**"  
Yann LeCun

### AI will make everything better!

"AI will be the **most transformative technology of the 21st century.** It will affect every industry and aspect of our lives."  
Jensen Huang




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"AI doesn't have to be evil to destroy humanity - if AI has a goal and humanity just happens in the way, **it will destroy humanity** as a matter of course without even thinking about it."  
Elon Musk

"The development of full artificial intelligence could spell the **end of the human race.**"  
Stephen Hawking

### AI will destroy everything!

"Mitigating the risk of **extinction from AI** should be a global priority alongside other societal-scale risks, such as pandemics and nuclear war."

Open letter on dangers of AI




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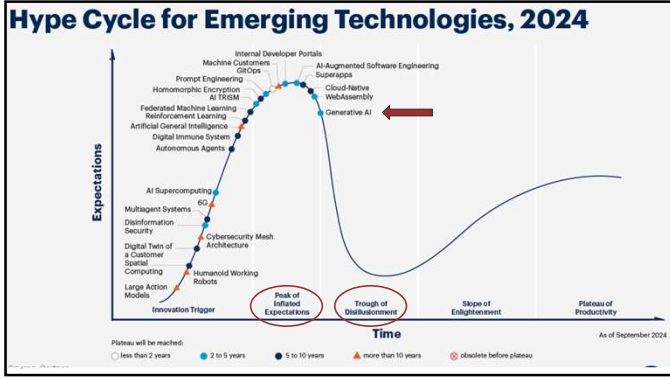
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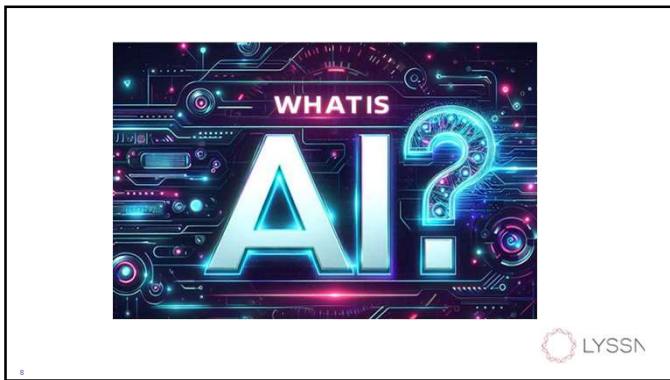
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### What AI is *not*... if-then rules

- Software is often built around 'if / then' rules
- AI is fundamentally different

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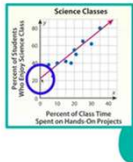
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### AI "learns from data" (aka, machine learning)

$y = mx + b$

- What is m?  
slope
- What is b?  
y-intercept
- How do we find the y-intercept for the graph?



1.76 trillion parameters

Rumors claim that GPT-4 has 1.76 trillion parameters, which was first estimated by the speed it was running and by George Hotz.

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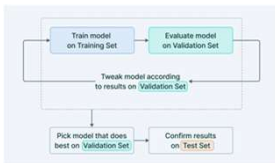
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### AI Development example: Suicide risk assessment

**AI workflow**

- Human eval: 471 crisis calls
- AI model development



**Train** AI models on 183,735 unique utterances...

**Test** AI models on 23,295 utterances not included in development

**Answering the question:**

*How close is the AI to an expert human evaluator?*




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### Challenges with models built from data

Example: *Framingham cardiovascular risk score*




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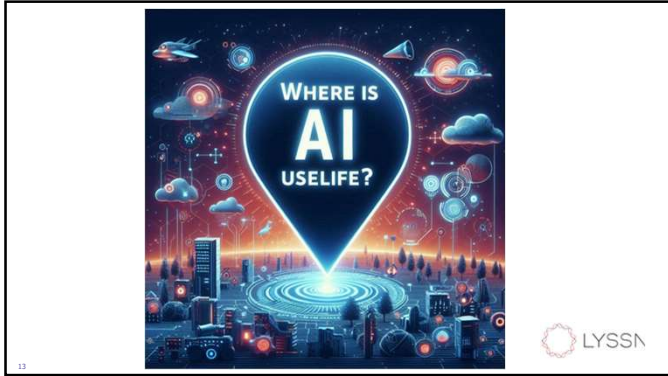
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**Brief clinical story**

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*How a suicidal client... and Marsha Linehan... shaped my thinking about AI*

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**Where is AI useful?**

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**Dave's BH rule of thumb:** Where an expert (trained) human can do the task, and the AI has access to the same information as our expert human.

- Examples... what do we think?
  - Fidelity coding of therapy quality (with a standardized assessment)
  - Current depression diagnosis
  - Future likelihood of suicidality

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## AI example: Quality assurance and supervision




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Psychology of Addictive Behaviors  
2015, Vol. 51, No. 3, 316–318
© 2015 American Psychological Association  
1076-898X/15/\$12.00 DOI: 10.1037/xap0000019


### BRIEF REPORT

## Is Low Therapist Empathy Toxic?

Theresa B. Moyers and William R. Miller  
The University of New Mexico

One of the largest determinants of client outcomes is the counselor who provides treatment. Therapists often vary widely in effectiveness, even when delivering standardized manual-guided treatment. In particular, the therapeutic skill of accurate empathy originally described by Carl Rogers has been found to account for a meaningful proportion of variance in therapeutic alliance and in addiction treatment outcomes. High-empathy counselors appear to have higher success rates regardless of theoretical orientation. Low-empathy and confrontational counseling, in contrast, has been associated with higher dropout and relapse rates, weaker therapeutic alliance, and less client change. The authors propose emphasis on empathic listening skills as an evidence-based practice in the hiring and training of counselors to improve outcomes and prevent harm in addiction treatment.

Keywords: empathy, therapist effects, listening skills, training




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### We know how to measure provider empathy

Empathy				
Low				High
1	2	3	4	5
Clinician has no apparent interest in client's worldview. Gives little or no attention to the client's perspective.	Clinician makes sporadic efforts to explore the client's perspective. Clinicians' understanding may be inaccurate or may detract from the client's true meaning.	Clinician is actively trying to understand the client's perspective, with modest success.	Clinician shows evidence of accurate understanding of client's worldview. Makes active and repeated efforts to understand client's point of view. Understanding mostly limited to explicit content.	Clinician shows evidence of deep understanding of client's point of view, not just for what has been explicitly stated but what the client means but has not yet said.

Moyers et al., *Motivational Interviewing Treatment Integrity system manual*, v3.1




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### We know how to reliably identify empathic communication

**CLIENT** Yeah. I think I'm sad that I haven't seen my kids in a couple days. Like I really miss them and I'm pretty pissed that my neighbor like called the cops. I mean I was only gone for 10 minutes. Like I'm not I'm not a bad mom. Like I'm not one of those moms that like leaves her kids at home all day while she goes to work or like. Doesn't. Like I care about my kids a lot and I love them. And I just like I'm not a bad mom.

**PROVIDER** Mm hmm (affirmative). Yeah. It sounds like you've got some conflicting emotions going on. **EMPATHIC** you're sad that they're not around but you're also frustrated that this would even happen in the first place. **EMPATHIC**

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### Okay, so what's the problem? Scale

**Crisis Hotline Has Answered 10 Million Calls, Texts and Chats**

Mental health experts have said that the 988 hotline for mental health emergencies is still a work in progress, in need of more funding, coordination and awareness.




Training

Hiring

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QA

System Outcomes




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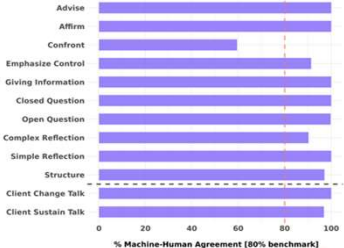
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### Fundamental question: Can an AI/ML technology replicate expert humans?

**AI predictions relative to human experts**

Atkins et al. 2014  
Can et al. 2015  
Cao et al., 2019  
Pace et al. 2017  
Tanana et al. 2016  
Xiao et al. 2016; 2018



Task	% Machine-Human Agreement (80% benchmark)
Advise	~95
Affirm	~95
Confront	~60
Emphasize Control	~90
Giving Information	~95
Closed Question	~95
Open Question	~95
Complex Reflection	~90
Simple Reflection	~95
Structure	~95
Client Change Talk	~95
Client Sustain Talk	~95




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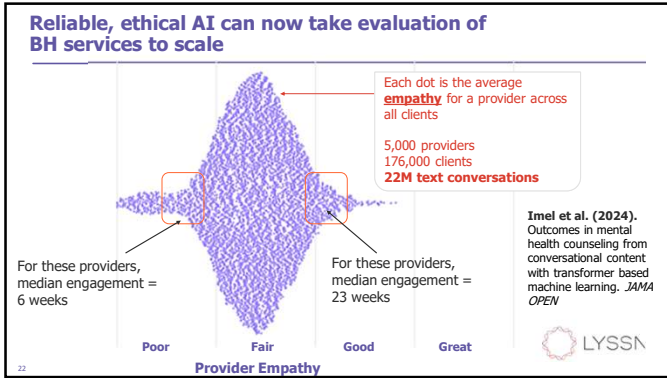
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### Typical online provider education emphasizes access to content

Slides and written content

Watch lectures and role play examples

CME quiz

**Outcomes:**

1. What content was offered
2. How many providers accessed content
3. Demonstration of knowledge via quiz

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### How we train *other* skills



1. Practice (lots)
2. Feedback
3. Practice small components

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### Training where practice is the focus

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**Skill Module 2: Existing Motivation and Exploring Questions**



**Learn** | **Practice**

would like to be respectful to other people when he grows up and that starts with me right now. I'm not doing him any favors by letting him grow up to be a loud mouthed brat.

Client


Tell me a little bit more about what you want for your son when he grows up.

Provider

**Practice with your clients.**

So there is your second best. Exploring Questions that dig in to the client's own motivation for change. Now it's your turn to try!

Gabriella about



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### Trainees get to practice with immediate and specific feedback on their practice

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Listen to your response

0:00 0:15

So when you drink a lot it impairs how your brain works. it makes your prefrontal cortex that part of your brain in the front of your head work less effectively. so you end up making really impulsive decisions like getting into fights when you don't want to. [View explanation](#)

Looks like you gave some information. You might try asking a question that begins with a how, what, or even something like ... tell me more about... can be a great place to start. Exploring Questions are a great way to increase motivation.

Recording saved! **RE-RECORD** **CLOSE**



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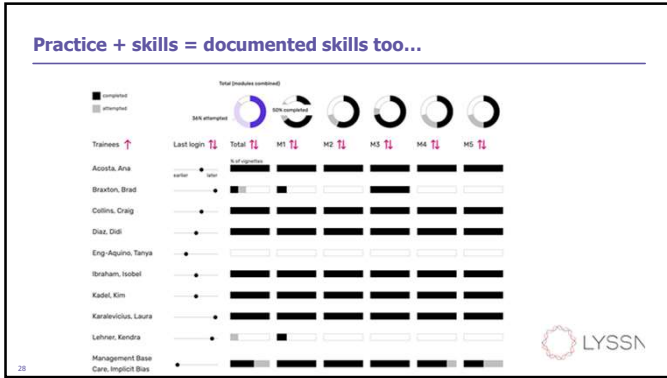
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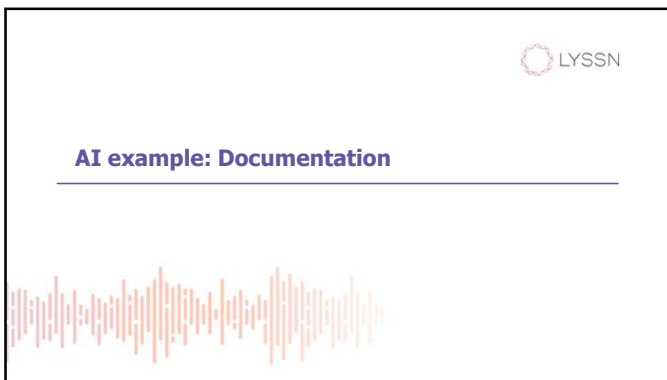
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### Clinical notes are time-consuming and painful

- On average, 5-10 minutes per note, or 3-5 hours per week for typical caseload
- Common for notes to be done after hours or later in 'catch up'
- More than 85% of providers feel that administrative burden contributes to provider burnout.

And... **critical** for clinical documentation

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### The single most active AI application in medicine

DeepScribe	Augmedix, Inc.	Suki AI
Ambience	Nabla Technologies	Ambie Abridge
Butterfly Network	Enlitic	Nuance Communications
Nuance DAX	Abstractive Health	Aidoc
Atomwise Inc.	DeepMind	Hank AI
MarianaAI	Crosby Health	Healthee

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### With rise of generative AI, automated documentation rapidly becoming a commodity

#### Lyssn genAI note

Client reports that she has been feeling down for a long time. She feels that she is doing well at work, but is feeling lonely and bored at home. She doesn't know what to do about it. She would like to change her meds and see if she can get back on her birth control pills. She is concerned that if she changes her medication, she will not be able to feel better. She also wants to see if there is a better way to manage her depression.

#### Features of AI scribe solutions

- Chief complaint
- History of present illness
- Assessment and Plan
- Medications
- PROs




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### Looking for an AI solution?

*What questions to ask... what things to consider*




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Skepticism is warranted... it's the wild west of AI right now



AI Psychotherapy (4+)

AI Mental Health Support

Infisecurity

Designed for iPad

★★★★ 3.9 • 9 Ratings

Free - Offers In-App Purchases

[View in Mac App Store](#)

At the core of AI Psychotherapy is its advanced AI system, developed to understand and adapt to your individual mental health needs. This app goes beyond simple mental health tracking; it delivers real-time, personalized support based on your conversations and emotional state, helping you feel heard and supported at all times.

Choose Your AI Therapist: Everyone's journey toward mental well-being is unique, which is why AI Psychotherapy offers a variety of AI therapists. Each AI therapist specializes in different areas of mental health, offering tailored approaches to managing stress, anxiety, depression, or emotional distress. Whether you need a calm, nurturing voice, a more structured approach, or a source of empowerment, you'll find the perfect AI therapist for your needs.

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A few thoughts on questions and considerations

- 1. Step 1: Develop an AI Governance Policy
- 1. Regulations
  - a. We do not have them in the US (yet)
  - b. Key principle: Transparency
- 1. Basic rubric for clinical applications
  - a. Valid
  - b. Reliable
  - c. Unbiased



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Thank you! What questions can we discuss?

Dave Atkins, PhD  
CEO / dave@lyssn.io



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**Flight Plan for Success**  
Adapting to Change and Building Healthy Workplaces

  
**CE REQUEST**

  
**EVALUATION**

  
**EVENT WEBSITE**

**TAMHO Annual Conference**  
and Awards and Recognition Ceremony

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