

# Clinical Judgment in Diagnostic Errors: Let's Think About Thinking

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When you hear someone use the phrase, "it was a judgment call," you probably assume that the person made a decision based on the best available information. That is, the person assessed the situation, considered relevant data, and came to a conclusion based on factual information and his/her own opinion, knowledge, and experience.

The term "clinical judgment" refers to a similar process that healthcare providers use to assess and diagnose patients. A provider's clinical judgment is informed by information gathered from the patient, observation, and the provider's own personal experience,

knowledge, practice, and critical-thinking skills.<sup>1</sup>

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Because clinical judgment is a complex process that involves various cognitive functions, it's easy to understand why it is a driving force in diagnostic errors and diagnosis-related malpractice allegations."

driving force in diagnostic errors and diagnosis-related malpractice allegations. In fact, MedPro Group (MedPro) data show that clinical judgment is a contributing factor in 85 percent of diagnosis-related cases (Figure 1) - a rate more than double that of the next top contributing factor (communication).

The prevalence of clinical judgment issues is almost certainly tied to their complexity and the fact that they tend to be less amenable to straightforward fixes than other contributing factors are, such as system failures.

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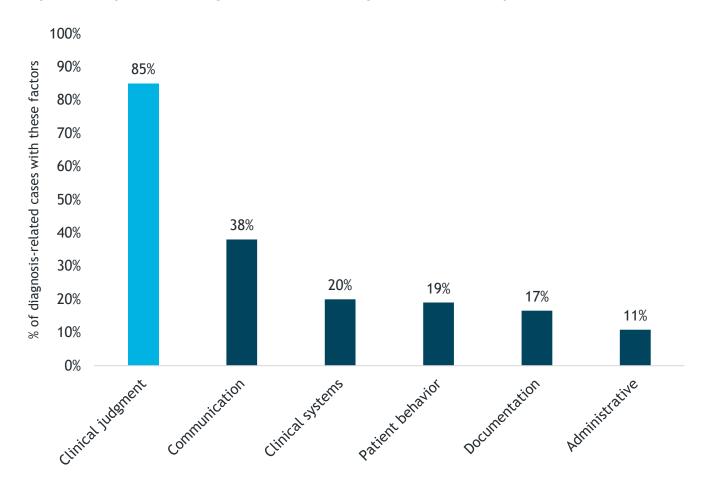


Figure 1. Top Contributing Risk Factors in Diagnosis-Related Malpractice Cases

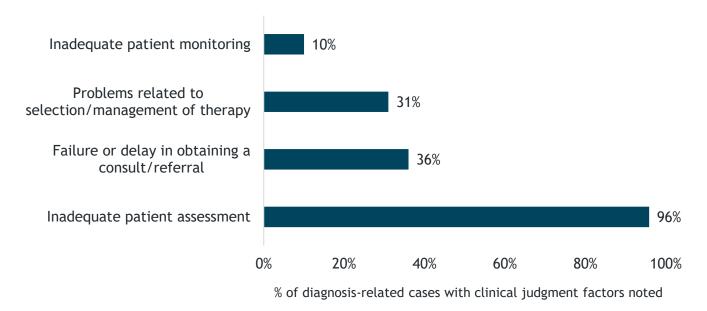
**Source:** MedPro Group closed diagnosis-related cases, 2010-2019. **Note:** Totals exceed 100 percent because generally more than one factor is associated with each case.

This article will (a) take a closer look at the various clinical judgment issues that contribute to diagnosis-related malpractice cases, (b) examine how cognition shapes clinical reasoning and decision-making, (c) discuss how cognitive errors in judgment can occur during the diagnostic process, and (d) explore proposed solutions and risk strategies for managing lapses in clinical judgment.

## **Clinical Judgment in the Context of Diagnosis-Related Malpractice Cases**

The concept of clinical judgment as a contributing factor in diagnosis-related malpractice cases can be difficult to grasp because of its enormity. Simply stated, clinical judgment is a broad category that includes the clinical areas shown in Figure 2.

Figure 2. Top Issues Associated With Clinical Judgment in Diagnosis-Related Malpractice Cases



**Source:** MedPro Group closed diagnosis-related cases, 2010-2019. **Note:** Totals exceed 100 percent because generally more than one factor is associated with each case.

Within clinical judgment, patient assessment issues surface as the top concern. Common examples of patient assessment issues are:

- Failing to order diagnostic testing or delaying diagnostic testing
- Failing to establish a differential diagnosis
- Maintaining a narrow diagnostic focus
- Failing to gather adequate information related to patient history
- Failing to perform an adequate physical exam
- Failing to rule out or act on abnormal findings
- Misinterpreting diagnostic test results

The other top issues in clinical judgment, as noted in Figure 2, are failure or delay in obtaining a consult/referral, problems related to selection/management of therapy, and inadequate patient monitoring. This first of these issues is self-explanatory. Issues related to

selection/management of therapy are heavily associated with choosing an appropriate plan of care, including procedural care. This category also includes issues with ordering medications appropriate for the patient's condition. Allegations of inadequate patient monitoring mainly involve monitoring a patient's response to a treatment plan.

The breakdown of these issues helps define the ways in which clinical judgment errors contribute to malpractice claims, but it doesn't explain why these circumstances



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happen. What causes these missteps and lapses in judgment? Understanding the clinical reasoning and decision-making processes can help explain why clinical judgment so frequently contributes to diagnostic errors.

## **Clinical Reasoning and Decision-Making**

The Institute of Medicine's (IOM's) influential report *Improving Diagnosis in Health Care* explains that "Clinical reasoning occurs within clinicians' minds . . . and involves judgment under uncertainty, with a consideration of possible diagnoses that might explain symptoms and signs, the harms and benefits of diagnostic testing and treatment for each of those diagnoses, and patient preferences and values."<sup>2</sup>

Much of the literature focusing on diagnostic errors and clinical reasoning recognizes the dual decision-making model, which consists of two reasoning systems as the basis for clinicians' diagnostic process (see table). In System 1, the clinician arranges patient data into a pattern and arrives at a

Dual Decision-Making Model	
System 1	System 2
Automatic	<ul> <li>Analytic</li> </ul>
<ul> <li>Intuitive</li> </ul>	<ul><li>Slow</li></ul>
<ul> <li>Reflexive</li> </ul>	<ul> <li>Reflective</li> </ul>
<ul> <li>Nonanalytic</li> </ul>	<ul> <li>Deliberate</li> </ul>

working diagnosis based on past experience, knowledge, and/or intuition. System 2 thinking

often is associated with cases that are complex or novel, and this type of thinking involves more cognitive workload and resources.<sup>3</sup>

System 1 and System 2 are not mutually exclusive, and clinicians tend to use both, depending on the circumstances. These systems also may occur in tandem and intervene with or override each other as situations evolve.<sup>4</sup>

Research suggests that most clinical work involves System 1 reasoning, particularly as clinicians gain more experience and knowledge - however, both systems of reasoning are vulnerable to cognitive errors.  $^{5}$ 

## **Cognitive Errors**

Many types of cognitive errors can occur during the diagnostic process. Describing each is beyond the scope of this article; however, errors in clinical reasoning can arise from several sources, including knowledge deficits, faulty heuristics, and affective biases/influences or situativity.<sup>6</sup>

#### **Knowledge Deficits**

Gaps in knowledge and clinician inexperience might seem like a logical cause of diagnostic errors. Thus, it might follow that younger, less experienced healthcare providers would be at greater risk of diagnostic pitfalls than experienced clinicians. Sometimes this is true, and it can show how System 2 clinical reasoning is susceptible to cognitive errors. Even with a slow, analytic thought process, "clinicians with an inadequate knowledge base may not have the information necessary to make a correct decision."

However, inexperience aside, most cognitive errors are not related to knowledge deficits; rather, they are the result of errors in data collection, data integration, and data verification, with "data" referring to clinical information obtained during the provider-patient encounter.<sup>8</sup>

Further, many diagnostic errors are associated with common diseases and conditions, suggesting that other problems with clinical reasoning — such as faulty heuristics, cognitive biases, and affective biases/influences — are the likely culprit (as opposed to an inadequate knowledge base).

#### **Faulty Heuristics and Cognitive Biases**

The term "heuristics" refers to mental shortcuts in the thought process that help conserve time and effort. These shortcuts are an essential part of thinking, but they also are prone to errors. Cognitive biases occur when heuristics lead to faulty decision-making. Some common biases included anchoring, availability, and overconfidence.

#### Anchoring

Anchoring refers to a tendency to "anchor" to, or rely too much on, a particular piece of information — often the initial information obtained, the first symptom, or the first lab abnormality. Anchoring is closely related to several other biases, including:

- Under-adjustment, which is the inability to revise a diagnosis based on additional clinical data
- Premature closure, which is the termination of the data-gathering process (e.g., patient history, family history, and medication list) before all of the information is known
- Primacy effect, which is the tendency to show bias toward primary or initial information
- Confirmation bias, which is the tendency to focus on information that confirms an initial diagnosis or to manipulate information to fit preconceptions

#### **Availability**

Availability bias can occur if a clinician considers a diagnosis more likely because it is forefront in his/her mind. Past experience and recent, frequent, or prominent cases can all play a role in availability bias.

For example, a clinician who has recently diagnosed an elderly patient with dementia might be more likely to make the same diagnosis in another elderly patient who has signs of confusion and memory loss — when, in fact, the patient's symptoms might be indicative of another problem, such as vitamin B12 deficiency.

#### Overconfidence

Overconfidence bias can occur if a clinician overestimates his/her own knowledge and ability, which can prevent the clinician from gathering and assessing ample information.

Overconfidence might result from a lack of feedback related to diagnostic accuracy, which in turn may lead to an overestimation of diagnostic precision. To this point, overconfidence might increase as a clinician's level of expertise and experience increases.<sup>10</sup>

#### Context Effect

Context effect can occur if a clinician misinterprets information or a situation based on the context in which it is presented. For example, if a patient presents with chest pain and has a known family history of heart disease, a clinician might interpret the pain as a likely symptom of a heart attack, when in fact the cause is a broken rib.

#### **Affective Biases/Influences and Situativity**

Whereas cognitive biases are lapses in thinking, the terms "affective biases" and "affective influences" refer to emotions and feelings that can sway clinical reasoning and decision-making. For example, preconceived notions and stereotypes about a patient might influence how a healthcare provider views the patient's complaints and symptoms. If the patient has a history of substance abuse, for instance, the provider might view complaints about pain as

drug-seeking behavior. Although this impulse might be accurate, the patient could potentially have a legitimate clinical issue.



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Additionally, negative feelings

about a patient can cause a provider to consciously or subconsciously blame the patient for his/her symptoms or condition — a bias called attribution error. For example, a patient's obesity might be attributed to laziness or general disregard for health and wellness. Similarly, a patient who does not adhere to his/her care plan might be viewed as difficult — in reality, though, the nonadherence might be related to financial issues or health literacy barriers.

Attribution error also is common in elderly patients because clinicians have a tendency to attribute these patients' symptoms to advancing age or chronic complaining, rather than exploring other potential causes.<sup>12</sup>

Positive feelings about patients also can affect diagnostic decisions. In outcome bias, for example, a provider may overlook certain clinical data in order to select a diagnosis with better outcomes. By doing so, the provider is placing more value on what he/she hopes will happen, rather than what might realistically happen.

In addition to positive and negative feelings about patients, clinician and patient characteristics — such as age, gender, socio-economic status, race, and ethnicity — also can affect the diagnostic process. Consider, for example, that research has shown that racial and ethnic minority patients are less likely than white patients to receive any pain treatment or adequate pain treatment. Similarly, women are less likely than men to be treated aggressively for pain and must wait longer to receive treatment for acute pain. (To learn more, read MedPro's article *Lurking Beneath the Surface: Bias in Pain Management.*)

Beyond negative and positive feelings and stereotypes, a variety of other affective biases also can influence a clinician's reasoning, such as high noise levels or interruptions; sleep deprivation, irritability, fatigue, stress, mood disorders/variations, and anxiety disorders. <sup>15</sup>

More recent research continues to expand the concepts of cognition and clinical reasoning by viewing it through the lens of situativity, an umbrella term used to describe a series of cognitive theories that examine clinical judgment and reasoning in the context of the situations in which they occur.

These theories move "beyond individual beliefs and knowledge construction to consider those present during the encounter (e.g. the patient and his/her family members, other health care workers, learners), the multiple environmental inputs (e.g. appointment length, artifacts such as electronic health record [EHR] functionality, culture), and their dynamic interactions." <sup>16</sup>

The complex interaction between cognitive biases, affective biases/influences, and clinical context can have a profound effect on clinical reasoning and decision-making, which in turn

can lead to various lapses in clinical judgment. The case studies on the following pages provide two examples of how cognitive errors can result in diagnostic missteps.

#### **Case Study 1: Medical**

A 34-year-old male presented to his primary care doctor with sternal pain after lifting a boat in his backyard. The pain increased when the patient raised his arms. An ECG was ordered, and the results were negative. The patient was not referred for cardiac enzyme testing because the doctor decided that muscle strain was the cause of the patient's symptoms. The doctor cleared the patient to go on vacation. Two days into his vacation, the patient died from a heart attack.

**Discussion:** This case offers a good example of anchoring bias. Knowing that the patient had recently lifted a boat, the doctor honed in on muscle strain as the likely cause of the patient's pain. The negative results from the ECG reinforced the narrow diagnostic focus. As a result, the doctor failed to order further testing and prematurely terminated the data-gathering process.

Further investigation of the patient's history would have revealed that the patient was a heavy smoker and drinker. He also had a family history of cardiovascular disease, and both his father and grandfather died in their early forties. An affective bias might have been at play in this case as well; the doctor might have considered a cardiac condition less likely based on the patient's young age.

## **Case Study 2: Dental**

A patient who had undergone radiation therapy for cancer of the soft palate presented to his general dentist for routine care. Because of severe xerostomia, the dentist and patient were unable to control the patient's caries. After multiple attempts to restore the severely compromised teeth, the dentist decided to remove the remaining mandibular teeth and insert a complete lower denture; however, he did not suggest any precautionary measures, such as hyperbaric oxygen, prior to the extractions.

# Case Study 2: Dental (continued)

After a series of denture adjustments, the soft tissue on both the right and left mandibular ridges did not heal, and the patient would periodically remove small pieces of bone. The patient returned to the general dentist at least seven times to complain about the discomfort, bone spicules, a foul odor in his mouth, and episodes of swelling.

After approximately 1 year, the general dentist referred the patient to an oral and maxillofacial surgeon (OMS). The surgeon developed a plan of care for the patient that included hyperbaric oxygen treatments and removal of the remaining maxillary teeth, as well as repair of the mandibular defects.

During the course of treatment, the OMS noted that the mandible was fractured. External fixation and a bone graft were required to stabilize the fracture.

**Discussion:** A number of clinical judgment lapses complicated this case and ultimately led to a malpractice lawsuit against the general dentist. The first was the issue of selecting and managing the patient's therapy. Prior to removing the mandibular teeth, the dentist did not recommend a hyperbaric oxygen protocol or other precautionary measures, despite the patient's medical history.

Following the procedure, the patient presented on multiple occasions with complaints, but the dentist failed to identify the underlying issue or recommend treatment. Finally, the delay in referring the patient to an OMS was alleged to have contributed to the patient's poor outcome.

A knowledge deficit also may have contributed to this case, as the dentist had limited experience with cases of this level of severity. Additionally, overconfidence might have been a factor in the dentist choosing to manage the case himself instead of providing an immediate referral.

# **Proposed Solutions**

Although cognitive processes are well-studied, further research is needed to determine how best to prevent the flaws in clinical judgment that can lead to diagnostic errors. A number of potential solutions have been proposed, including implementing strategies to improve

teamwork, adjusting processes and workflows, using diagnostic aids, and exploring debiasing techniques.

The IOM's top recommendation in *Improving Diagnosis in Health Care* is facilitating better teamwork to strengthen the diagnostic process. This recommendation includes supporting an environment that is conducive to collaboration, providing technology that assists with communication, establishing measurable processes and feedback mechanisms, and engaging patients and their families in the diagnostic process.

The IOM's recommendation represents a major conceptual shift because it distributes diagnostic responsibility across "the diagnostic team" rather than placing responsibility solely on the treating clinician. As a result, the diagnostic team must have the knowledge, skills, resources, and competencies to support the diagnostic process.

#### The Diagnostic Team

To learn more about the concept of the diagnostic team, see MedPro's article Safety in Numbers: Improving Diagnosis Through Teamwork.

To this end, the IOM also recommends an increased emphasis on clinical reasoning and decision-making in medical education, including a strong focus on heuristics and biases.

Other studies on diagnostic errors and clinical judgment suggest using evidence-based decision support systems, clinical guidelines, checklists, and clinical pathways to support the reasoning and decision-making processes. However, they note that although these tools can be useful, "unless they are well integrated in the workflow, they tend to be underused." <sup>17</sup>

Similarly, health information technology (IT) and artificial intelligence (AI) show promise in supporting diagnostic decision-making and potentially reducing errors; yet, many experts in healthcare and technology agree that health IT and AI have flaws, carry risks, and have not yet reached their full potential.<sup>18</sup>

A variety of debiasing techniques also have been proposed as a way to address clinical judgment issues. Examples of these techniques include situational awareness and metacognition, which can help healthcare providers think critically about their own thought processes and how biases might affect them.

Cognitive forcing functions also might be helpful; these strategies are designed to assist clinicians in self-monitoring decisions and avoiding potential diagnostic pitfalls. 19 Other methods — such as perspective-taking, emotional regulation, and partnership-building - also can help reduce bias and promote empathy, positive feelings, and patientcentered care.

Although many of these techniques show

**Clinical Reasoning Toolkit** 

The Society to Improve Diagnosis in Medicine's Clinical Reasoning Toolkit supports awareness and better understanding of diagnostic reasoning, cognitive psychology, and diagnostic errors. The toolkit includes resources for clinicians, educators, researchers, and patients.

promise, more research is needed to evaluate their efficacy and to determine the feasibility of introducing them into busy clinical environments.

## **Risk Management Strategies**

As researchers continue to explore long-term solutions to errors in clinical judgment, healthcare providers can proactively implement strategies to help mitigate risks associated with clinical reasoning, cognition, and decision-making. The following list offers suggestions for managing these risks within various practice settings:

- Update and review patients' medical histories, problem lists, medication lists, and allergy information at each visit. Make sure patients' health records reflect their most recent information.
- Consider using a checklist or template to guide taking each patient's medical history and performing a thorough physical exam. In a busy healthcare environment, these tools can help ensure consistency in approach and prevent oversights.
- Perform complete patient assessments, including establishing differential diagnoses, considering appropriate diagnostic testing, and carefully reviewing test results.
- Engage patients and their families in the diagnostic process through education, access to health records, and opportunities to provide feedback. Encourage patients and families to be part of the diagnostic team.

- Work with healthcare leaders and providers in the organization to evaluate the benefit
  of using clinical pathways to standardize processes and support high-quality care.
   Determine how best to implement care pathways into workflow patterns.
- Consider using supportive health IT systems such as clinical decision support, trigger algorithms, and EHR alerts — that can support the diagnostic process and improve collaboration among members of the diagnostic team.
- Incorporate a diagnostic review process into the workflow pattern. The review might include timeouts to (a) reflect on working diagnoses, (b) seek consultations, and/or
   (c) facilitate group decision-making to support clinical reasoning.
- Develop a written policy that outlines how disagreements in diagnosis and care among the diagnostic team will be managed, including the appropriate chain of command for escalating conflicts.
- Formalize procedures for over-reads of diagnostic tests and imaging, peer review and quality improvement, use of diagnostic guidelines, handoffs of patient information both within and outside of the organization, and better access to patients' records.
- Be aware of common cognitive and affective biases and how they might negatively
  affect clinical judgment. Learn about various techniques to address biases, such as
  situational awareness, metacognition, perspective-taking, emotional regulation, and
  partnership-building.
- Consider using structured tools or approaches to identify the types of diagnostic errors
  occurring in the practice and the root cause of the errors. Use this information to
  educate the clinical team and develop countermeasures to improve quality of care.
- Consider group educational opportunities that allow members of the diagnostic team to explore cognitive biases and develop solutions together.

# **In Summary**

Although diagnostic errors have a number of root causes, MedPro claims data show that clinical judgment is the most common contributing factor. The complex nature of clinical reasoning and decision-making makes it vulnerable to various cognitive errors, including

knowledge deficits, faulty heuristics, affective biases/influences, and situativity. These errors can subconsciously lead to lapses in judgment, which in turn can cause diagnostic mistakes.

More studies are needed to determine effective approaches for addressing cognitive errors. However, a number of strategies — such as improving teamwork, increasing cognitive awareness, and using clinical decision support systems, clinical pathways, checklists, and debiasing techniques — show promise. By considering how these strategies can be implemented in everyday clinical activities, healthcare providers can take proactive steps toward managing diagnostic risks.

### **Endnotes**

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