

*IRMS July 17, 2025*

# **Navigating the Path from Diagnostic Errors to Diagnostic Excellence for Dangerous Vascular Diseases in the ED**

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# Diagnostic Excellence – Disclosures for Dr. Newman-Toker



## 1. Grant & Contract Support...

- ▶ **US Federal Grants & Contracts:** NIH (NIDCD U01 DC013778, NINDS U01 NS080824, NCATS U24 TR001609), AHRQ (R18 HS026640, R01 HS27614, EPC 503-4262, R18 HS029350)
- ▶ **US Foundation Grants & Contracts:** Gordon & Betty Moore Foundation, American Heart Association, Coverys Foundation, AARP, SIDM
- ▶ **US Industry Grants & Contracts:** Natus-Otometrics

## 2. Equipment Support (research video-oculography [VOG] devices)...

- ▶ Autronics-Interacoustics
- ▶ Natus-Otometrics (licensing JHU decision support technology, related research grant as principal investigator)

## 3. Inventor (diagnostic decision support tools)

- ▶ JHU decision support technology – algorithms to diagnose conditions using VOG
- ▶ JHU US patent for mobile phone-based diagnosis (US patent #12,266,109 on 4/1/2025)

## 4. Career focus on ‘Diagnosis’ (academic conflict of interest)...

- ▶ Past President / Former Board Member, Society to Improve Diagnosis in Medicine (SIDM) (unpaid)
- ▶ Director, Johns Hopkins Armstrong Institute Center for Diagnostic Excellence (salary support for effort)

**DISCUSSION INCLUDES OFF-LABEL USE OF VOG & MOBILE PHONES FOR STROKE DIAGNOSIS**

# Diagnostic Excellence – A Special Word of Thanks



## 1. Relevant Grant Support (2002-present)

- ▶ National Institutes of Health (NIDCD, NCRR/NCATS, NINDS)
- ▶ Agency for Healthcare Research & Quality
- ▶ Patient Centered Outcomes Research Institute
- ▶ Society to Improve Diagnosis in Medicine
- ▶ Kaiser Permanente / Johns Hopkins Medicine
- ▶ Gordon & Betty Moore Foundation
- ▶ Coverys Community Health Foundation, AARP, American Heart Association

## 2. Mentors, Trainees, & Collaborators (abridged list)

- ▶ David Zee, G.M. Halmagyi, Simmons Lessell, Dan Hanley, Justin McArthur, Steve Galetta, Marty Samuels, Barbara Vickrey, Fred Brancati, Lisa Heiser, Peter Pronovost, Allen Kachalia, David Hellman
- ▶ Shervin Badihian, Pouya Bastani, Adriana Batazzi, Paul Chang, Jorgos Mantokoudis, Ali Saber-Tehrani, Alex Tarnutzer, Seung-Han Lee, Vahid Eslami, Najlla Nassery, Ahmed Hassoon, Mehdi Fanai, Anand Bery, Kelly Gleason, Ava Liberman, Susie Peterson, Rodney Omron, Sus Kotwal, Brian Garibaldi, Max Parker, Nate Farrell, Jorge Otero-Millan
- ▶ Dan Gold, Jorge Kattah, Kevin Kerber, Joanna Jen, Rich Rothman, Yu-Hsiang Hsieh, Zheyu Wang, Daisy Zhu, Jonathan Edlow, Dana Siegal, Ketan Mane, Zack Berger, Kathy McDonald, Kathleen Sutcliffe, Elham Yousef, Matt Austin

# Our DX Center Team – Diverse & Inclusive







# Prologue: The Base Case

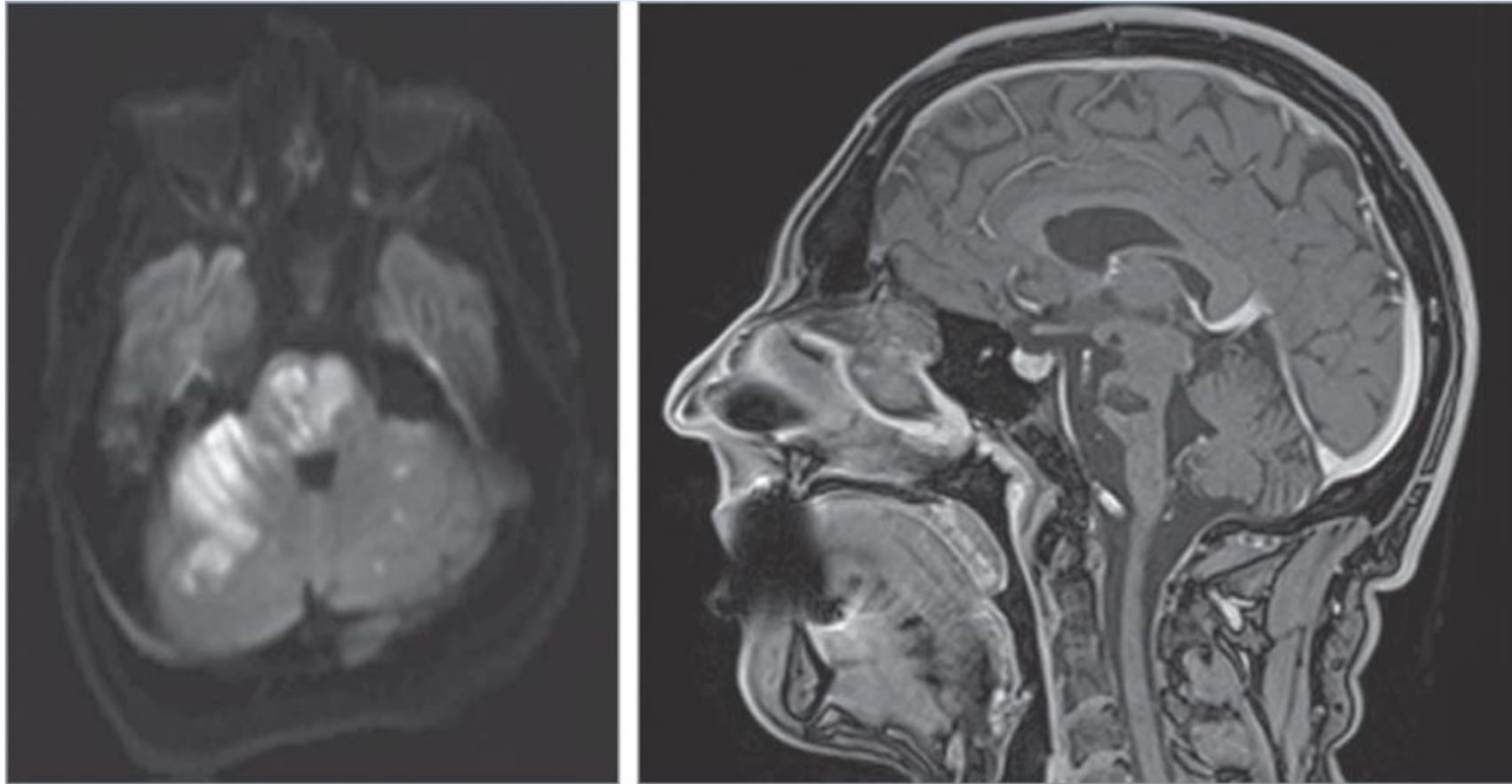
# The Tragic Story of John Michael Night's Misdiagnosis

## **BASE CASE**

- ▶ An 18-year-old star lacrosse player develops vertigo, vomiting, and unsteady walking two days after his final high school game.
- ▶ His parents are very worried (they note he is a highly trained athlete who is “never sick”) and take him to the emergency department.
- ▶ The doctors aren't listening to his parents who are sure this is something serious and are instead focused on “common” causes.
- ▶ The doctors have not considered a key dangerous cause and have not been trained to look for the subtle but telltale red flag signs of...

# Brainstem/Cerebellar Stroke from Basilar Occlusion

**BASE CASE**

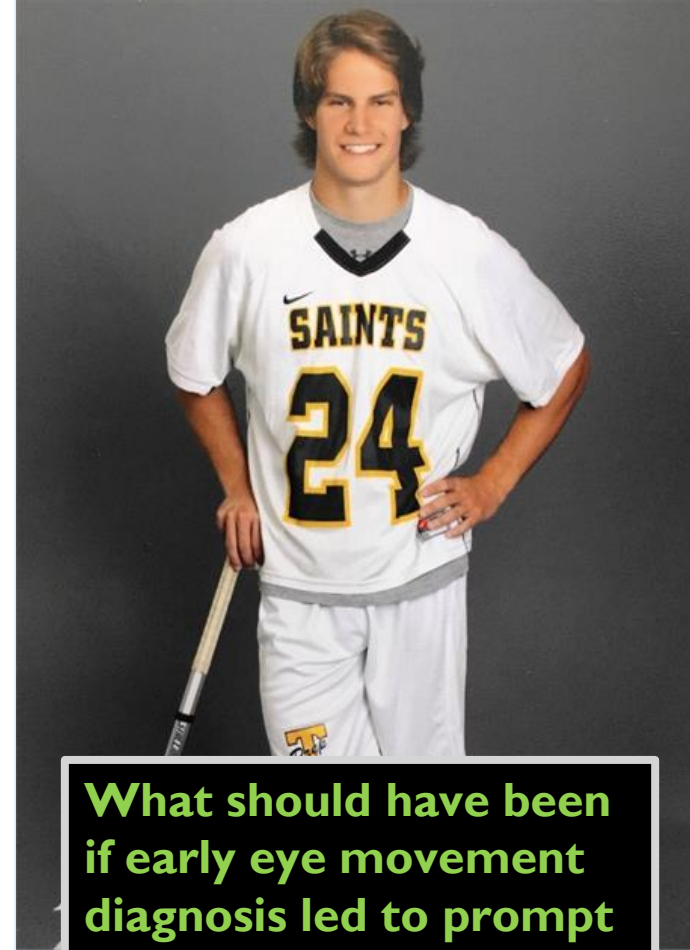


# Evolving Stroke Ending with Locked in Syndrome

**BASE CASE**



**What happened after an early diagnosis was missed and treatment windows had passed.**

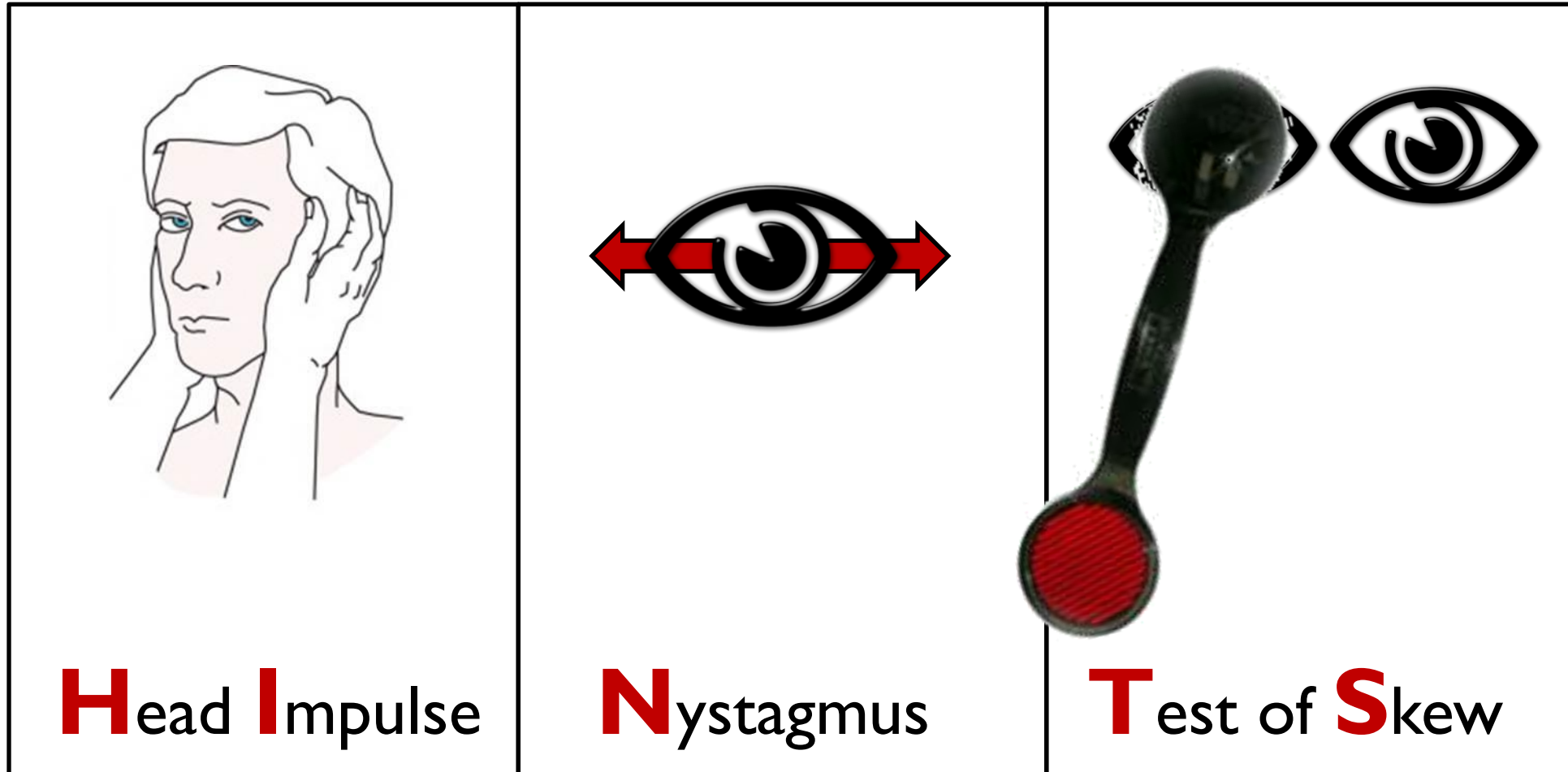


**What should have been if early eye movement diagnosis led to prompt clot-buster therapy.**



# Diagnostic Eye Findings – H.I.N.T.S.

**BASE CASE**





# Objectives & Outline

# Diagnostic Errors – Learning Objectives



1. Summarize public health burden & financial impact of diagnostic errors and misdiagnosis-related harms in the US.
2. List common causes and prioritize targets for diagnostic error reduction and quality improvement initiatives in the ED.
3. Discuss solutions at provider, organizational, and system levels that can contribute to diagnostic excellence in the ED.

# Diagnostic Excellence – Lecture Outline



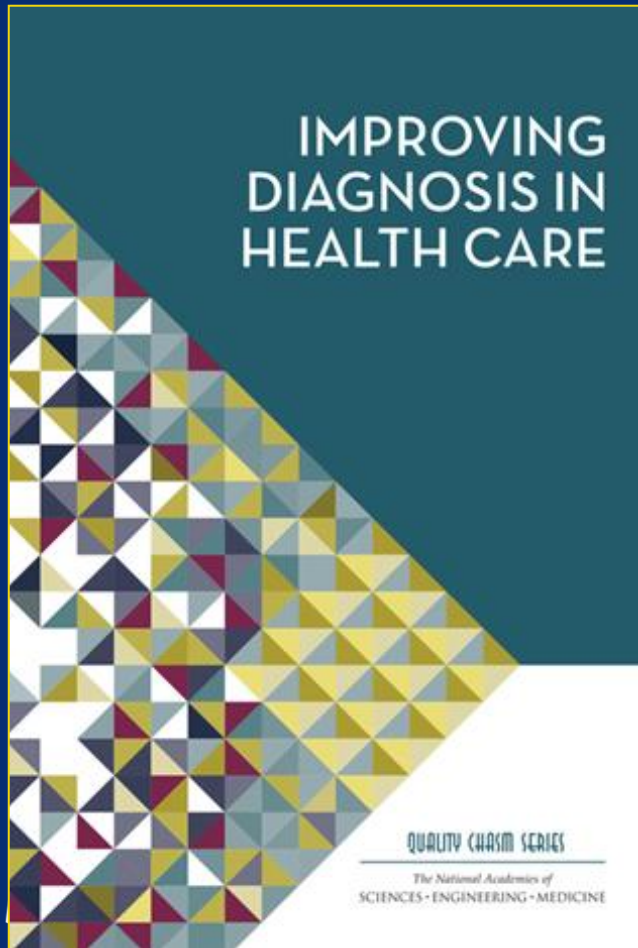
1. Burden & Impact
2. Core Definitions
3. Common Causes
4. Cognitive Errors
5. Work System
6. Systems Solutions
7. Key Takeaways
8. Questions & Answers





# Burden & Impact

# Improving Diagnosis in Healthcare



“The delivery of healthcare has proceeded for decades with a blind spot: Diagnostic errors...”

“...most people will experience at least one diagnostic error in their lifetime, sometimes with devastating consequences.”

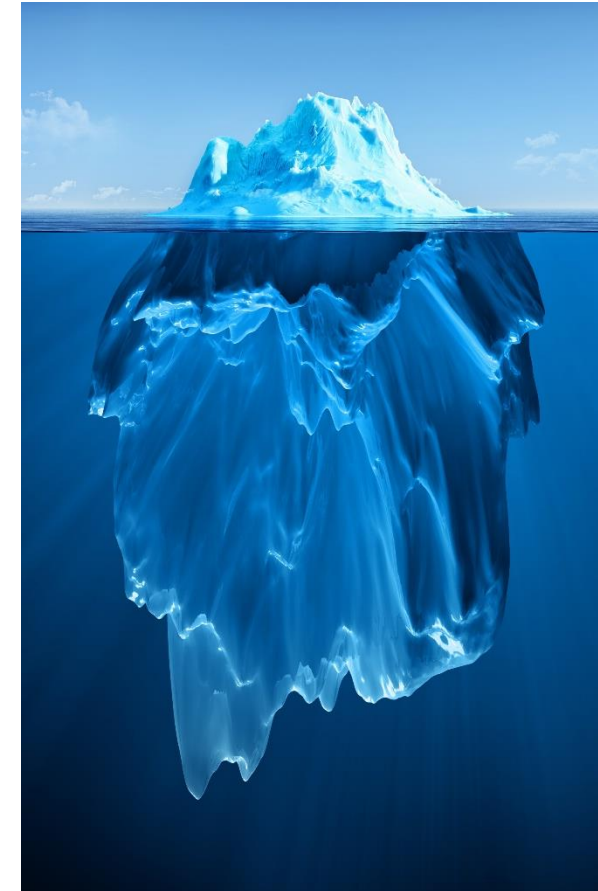
“Improving the diagnostic process is not only possible, but it also represents a moral, professional, and public health imperative.”

# Diagnostic Errors – Public Health Imperative



**Most Common**  
**Most Catastrophic**  
**Most Costly**

**All Other Errors Combined**





# Aggregate Diagnostic Error and Harm Estimates

**Table 1** Estimated diagnostic errors and serious misdiagnosis-related harms by clinical setting in the USA annually\*

Clinical setting	Visits (n)†	Diagnostic errors (n)‡	Serious harms (n)‡
Inpatient	34 million	~2.4 million (95% CI 1.6M to 3.3M) <sup>9</sup>	~376 000 (95% CI 185K to 566K) <sup>9</sup> §
Emergency department	140 million	~7.2 million (95% CI 5.0M to 11.2M) <sup>11</sup>	~433 000 (95% CI 266K to 1062K) <sup>11</sup>
Primary care clinics	521 million	~32.8 million (95% CI 31.9M to 33.7M) <sup>13</sup>	~231 000 (speculative) <sup>2</sup>
Specialty care clinics	515 million	~10–30 million (speculative)	~114 000 (speculative) <sup>2</sup>
All visits combined	1.2 billion	~50–100+ million (speculative)¶	~909 000 (PR 684K to 1 170K)**

## Annual US Diagnostic Errors

**All Settings: ~50–100 million**

**EDs: ~7.2 million (95% CI 5.0–11.2)**

## Annual Misdiagnosis-related Harms

**All Settings: ~0.9 million (PR 0.7–1.2)**

**EDs: ~0.4 million (95% CI 0.3–1.1)**



# Diagnostic Errors – “Big Three” Causes of Serious Harm



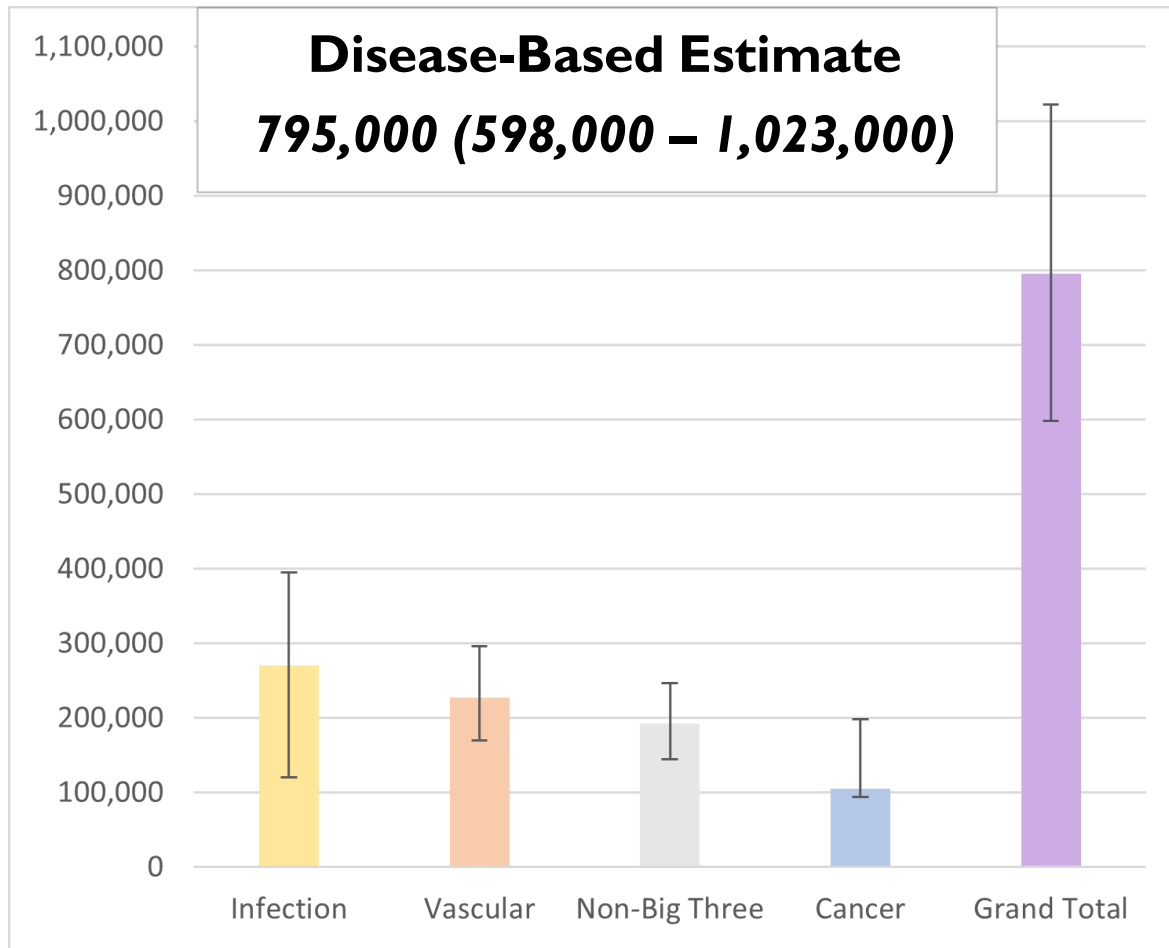
**Vascular**

**Infection**

**Cancer**

*Our prior work showed that the “Big Three” account for 75% of serious harms in both malpractice claims & clinical studies of diagnostic error.*

# Total Serious Misdiagnosis-Related Harms in the U.S. per Year



## Serious Harms ~795,000/yr

- ~425,000 disabilities
- ~370,000 deaths

## Serious Harms Breakdown

- 34% Infection – 271,000
- 29% Vascular – 228,000
- 24% Non-Big 3 – 192,000
- 13% Cancer – 105,000

*N.B. – Data are for U.S. in 2014;  
current estimate is ~909,000*

# 'Top 15' Diseases Leading to Serious Harms when Missed



## 'Top 5' shown below from each 'Big 3' Category

*These 15 diseases account for ~50% of serious harms*

*Just 5 diseases account for ~39%*

VASCULAR	
1	Stroke
4	Venous Thromboembolism
	Arterial Thromboembolism
	Aortic Aneurysm & Dissection
	Myocardial Infarction

INFECTION	
2	Sepsis
3	Pneumonia
	Meningitis & Encephalitis
	Spinal Abscess
	Endocarditis
	Appendicitis (#6 all ages)

CANCER	
5	Lung Cancer
	Breast Cancer
	Colorectal Cancer
	Melanoma
	Prostate Cancer

# Diseases List Causing High- Severity Harms

Table 4. Proportion of misdiagnosis-related harms attributable to “Big Three” diseases reported in ED malpractice claims, broken down by high-severity versus low-/medium-severity harms\*

Category	Condition (Diseases Grouped by “Big Three” Categories and Total Harms Broken Down by Organ System)	High-Severity Harm* Cases - % of Total (n)	Low-/Medium-Severity Harm* Cases - % of Total (n)
<b>Big Three Disease Category Breakdown</b>	<b>Big Three† (subtotal)</b>	<b>72.0% (952)</b>	<b>38.4% (365)</b>
	<b>Vascular events</b>	<b>41.5% (549)</b>	<b>10.9% (104)</b>
	Stroke	13.5% (179)	3.4% (32)
	Myocardial infarction	8.3% (110)	2.7% (26)
	Aortic aneurysm/dissection	6.1% (81)	0.5% (5)
	Venous thromboembolism	5.1% (68)	1.4% (13)
	Arterial thromboembolism	2.8% (37)	0.7% (7)
	OTHER vascular events	5.6% (74) (each ≤ 2.2%)	2.2% (21)
	<b>Infections</b>	<b>22.5% (298)</b>	<b>25.6% (243)</b>
	Meningitis/encephalitis	4.7% (62)	0.9% (9)
	Sepsis	4.7% (62)	0.8% (8)
	Spinal & intracranial abscess	2.6% (34)	0.3% (3)
	Pneumonia	2.1% (28)	1.6% (15)
	Necrotizing fasciitis	1.2% (16)	0.5% (5)
	OTHER infections	7.3% (96) (each ≤ 1.0%)	21.4% (203)
	<b>Cancers</b>	<b>7.9% (105)</b>	<b>1.9% (18)</b>
	Lung cancer	3.9% (51)	0.5% (5)
	OTHER cancers	4.1% (54) (each ≤ 0.8%)	1.4% (13)
	<b>Non-Big Three‡ (subtotal)</b>	<b>28.0% (371)</b>	<b>61.6% (585)</b>
	Trauma	11.3% (149)	33.8% (321)
	Other	16.8% (222)	27.8% (264)
	<b>TOTAL HARMS</b>	<b>100% (1,323)</b>	<b>100% (950)</b>
<b>Major Organ System Breakdown</b>	<b>Top 5 Organ Systems</b>	<b>78.6% (1040)</b>	<b>45.1% (428)</b>
	Neurologic (including stroke)	34.1% (451)	14.9% (142)
	Cardiovascular (not including stroke)	22.8% (302)	6.1% (58)
	Pulmonary	7.6% (100)	3.1% (29)
	Gastrointestinal	7.1% (94)	18.8% (179)
	Hematologic (including VTE)	7.0% (93)	2.1% (20)
	<b>All Other Organ Systems‡</b>	<b>21.4% (283)</b>	<b>54.9% (522)</b>
	<b>TOTAL HARMS</b>	<b>100% (1,323)</b>	<b>100% (950)</b>

VTE = venous thromboembolism

\* Data sources and definitions are the same as in Table 3.

† The “Big Three” diseases refer to vascular events, infections, and cancers, which, together, account for approximately three-fourths of all serious misdiagnosis-related harms in malpractice claims (Newman-Toker et al., 2019).<sup>17</sup>

‡ The top “other” organ system was musculoskeletal/joints, accounting for 3.5% (n=46/1,323) of high-severity harms and 25.7% (n=244/250) of low-/medium-severity harms. Note that craniocervical fractures with neurological injury are listed as “neurologic.”

42% vascular  
23% infection

#1 Stroke  
#2 Heart attack  
#3 Aortic (AA/AD)  
#4 Cord compression  
#5 Pulm. embolus

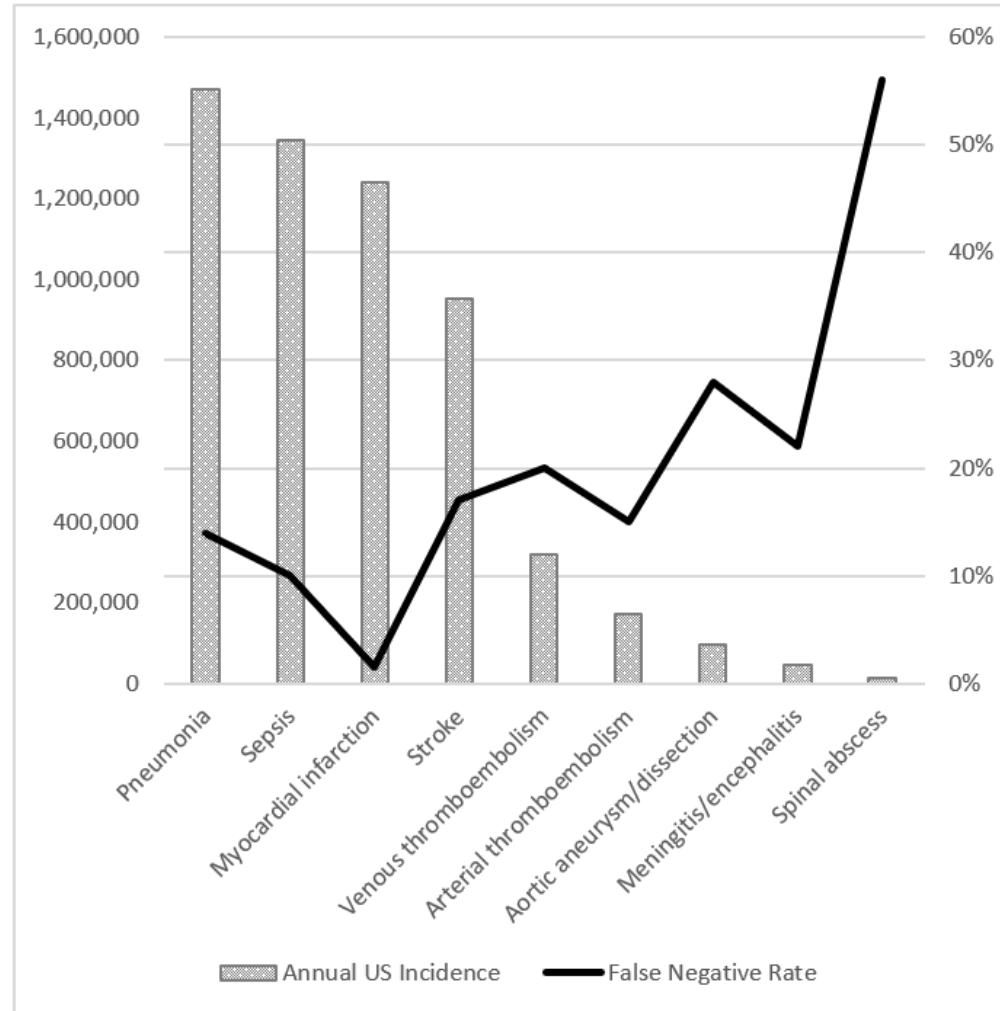
Neurologic #1  
organ system (34% of  
high-severity harms)





# Incidence & Rate of ED Errors/Harms

**Error rates inversely related to  
population disease incidence**



## Overall Rates

- Dx Error ~5%
- Dx Adv. event ~2%
- Serious harm ~0.3%

## Harms ~370,000

- >100,000 disabilities
- >250,000 deaths



# Delayed Diagnosis of DVT & PE

**12.4% initially  
missed in ED**



Table 1

Symptom that Each Patient Reported as the Main Reason Prompting Their Visit to the ED

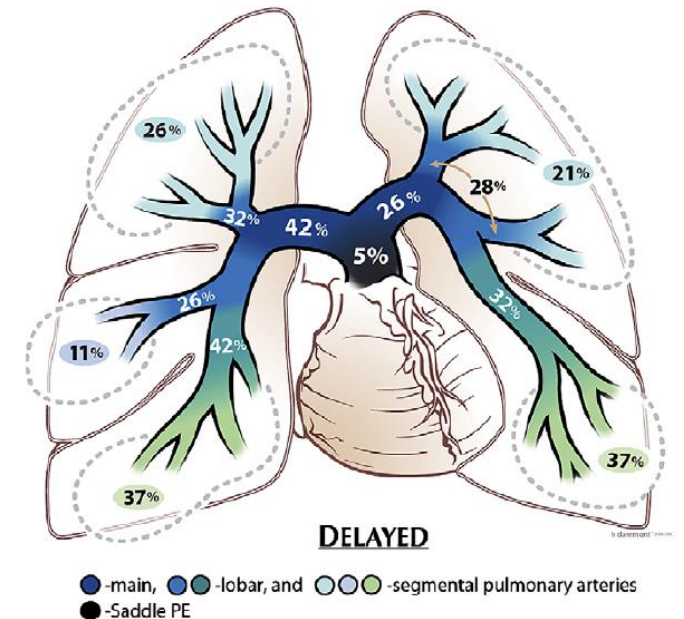
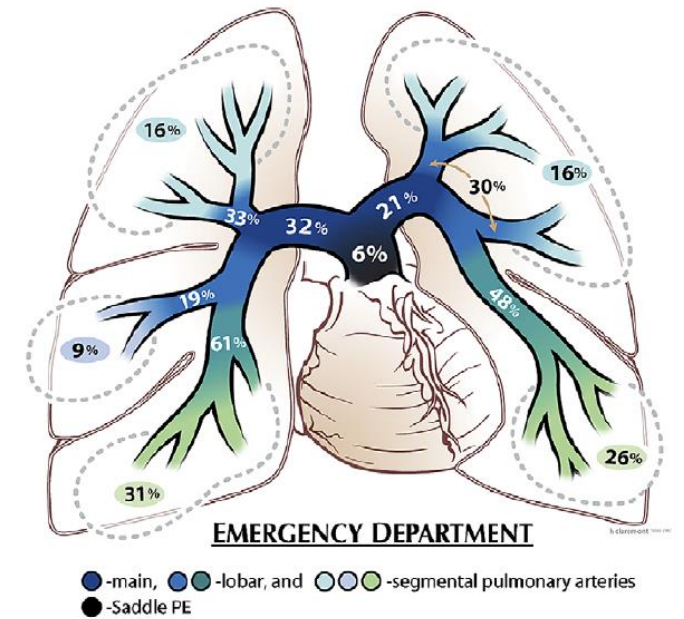
First Symptom	ED Diagnosis (n)	Delayed Diagnosis (n)
Dyspnea	59	1
Substernal chest pain only	10	2
Pleuritic chest pain only	27	6
Substernal and pleuritic chest pain	12	0
Cough	2	1
Leg pain	10	0
Dizziness	4	3
Syncope	2	2
Confusion/abnormal behavior	0	1
Other	15	4
Total	141	20

Table 2

Comparison of Variables Hypothesized to Differ between Groups

Variable	ED Diagnosis (n = 141)		Delayed Diagnosis (n = 20)		p-value
Age (yr), mean (SD)	51	(17)	61	(15)	<0.001
Duration of symptoms* before ED (hr), mean (SD)	92	(101)	99	(89)	0.42
Altered mental status at diagnosis† (%)	11	(8)	6	(30)	0.009
Prior cardiopulmonary disease* (%)	33	(23)	5	(25)	0.54
Adverse outcome in hospital‡ (%)	12	(8.5)	6	(30)	0.01

Kline et al., Acad Emerg Med 2007



**Figure 2.** Location of emboli within the pulmonary vasculature for the two study groups. (Top) ED diagnosis group: pa-

# Delayed Diagnosis of DVT & PE

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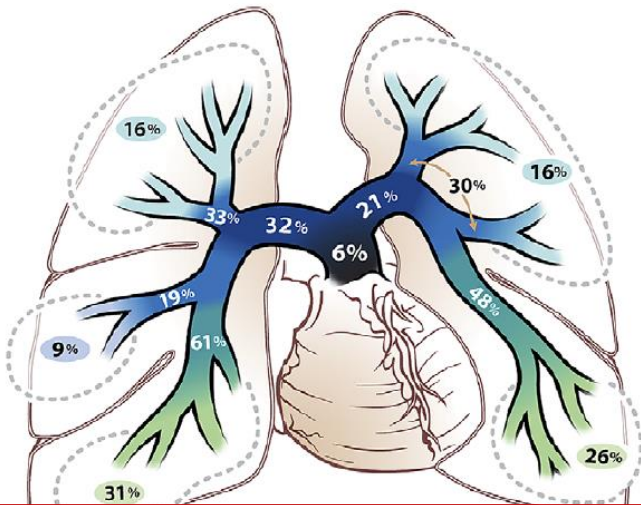
**Atypical Presentations**  
 \* CC dyspnea 42% vs. 5%  
 \* Altered MS 8% vs. 30%

Table 2  
Comparison of Variables Hypothesized to Differ between Groups

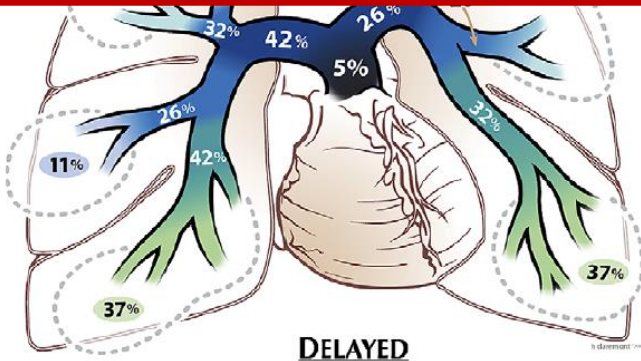
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**Adverse Outcomes**  
 9% vs. 30%

Kline et al., Acad Emerg Med 2007



**No Difference Seen in Pathophysiology or Disease Severity**



● -main, ● -lobar, and ○ -segmental pulmonary arteries  
 ● -Saddle PE

Figure 2. Location of emboli within the pulmonary vasculature for the two study groups. (Top) ED diagnosis group: pa-

# Top Serious Harm is Missed Stroke

**BASE CASE**

- ▶ #1 harm overall across clinical settings (also #1 harm in emergency department)
- ▶ Missed initially: stroke (~17%) vs. heart attack (~1.5%) [ $>10\times$ ]
- ▶ Estimated ~200,000 missed strokes/TIAs per year
- ▶ Estimated ~100,000 harmed by missed opportunity
- ▶ Risks rise precipitously with subtler/less obvious (“atypical”) cases
  - ▶ **Wrong patient group** (18-45yo vs.  $>75$ yo) [**OR 7**]
  - ▶ **Milder** (subarachnoid hemorrhage without vs. with altered mental status) [**OR 7**]
  - ▶ **Transient** (transient ischemic attack [TIA] vs. completed stroke) [**OR 11**]
  - ▶ **Non-specific** (**DIZZINESS / VERTIGO** vs. motor) [**OR 14**]



# Top Serious Harm is Missed Stroke

**BASE CASE**

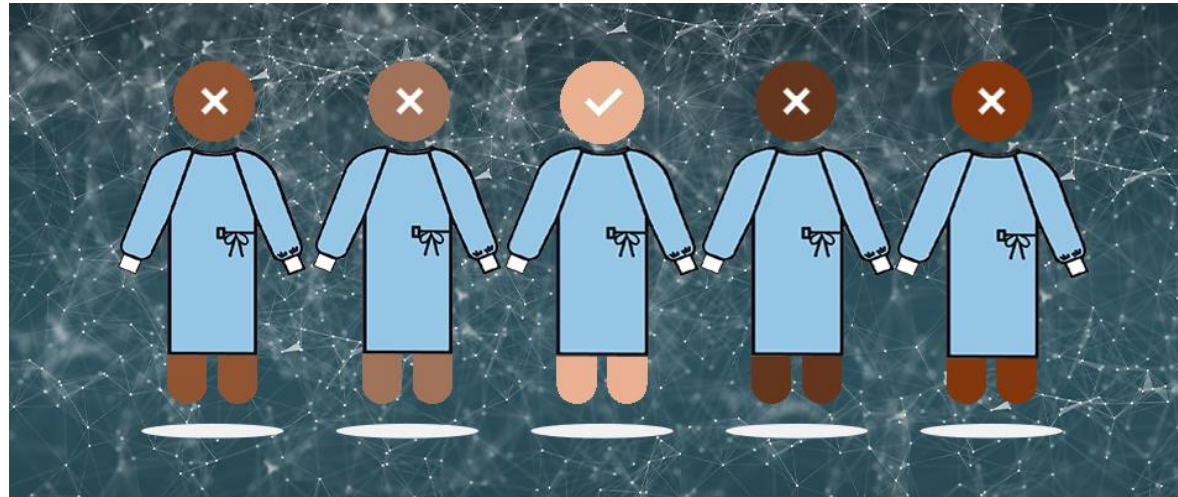
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**GIVEN THESE FACTORS, J.M.N. HAD A 95% CHANCE OF BEING MISDIAGNOSED**

# Diagnostic Errors – Disparities for People of Color



## *Black vs. Non-Hispanic White*



### Increased Risk of Being Missed

- **Stroke – +18%** (Newman-Toker, 2014)
  - Sepsis – +21% (Nassery, 2021)
  - Heart attack – +30% (Sharp, 2021)

### Increased Risk of Not Being Tested

- **Stroke / CT or MRI – +11%** (Kim, 2011)
  - **Stroke / MRI – +17%** (Kim, 2011)

**THE ONLY THING WORSE... FOR J.M.N. TO HAVE BEEN A WOMAN OR MINORITY**



# Core Definitions



**DIAGNOSTIC ERROR** is the failure to...

- establish an accurate and timely explanation of the patient's health problem(s)

or

- communicate that explanation to the patient

# Diagnostic Errors – Related Definitions



## ▶ Missed Opportunity

...a failure to make a correct or timely diagnosis resulting from a preventable process failure (omission or commission), given the evolving context at the time, linked to the sociotechnical work system (*adapted from Singh, 2014*)

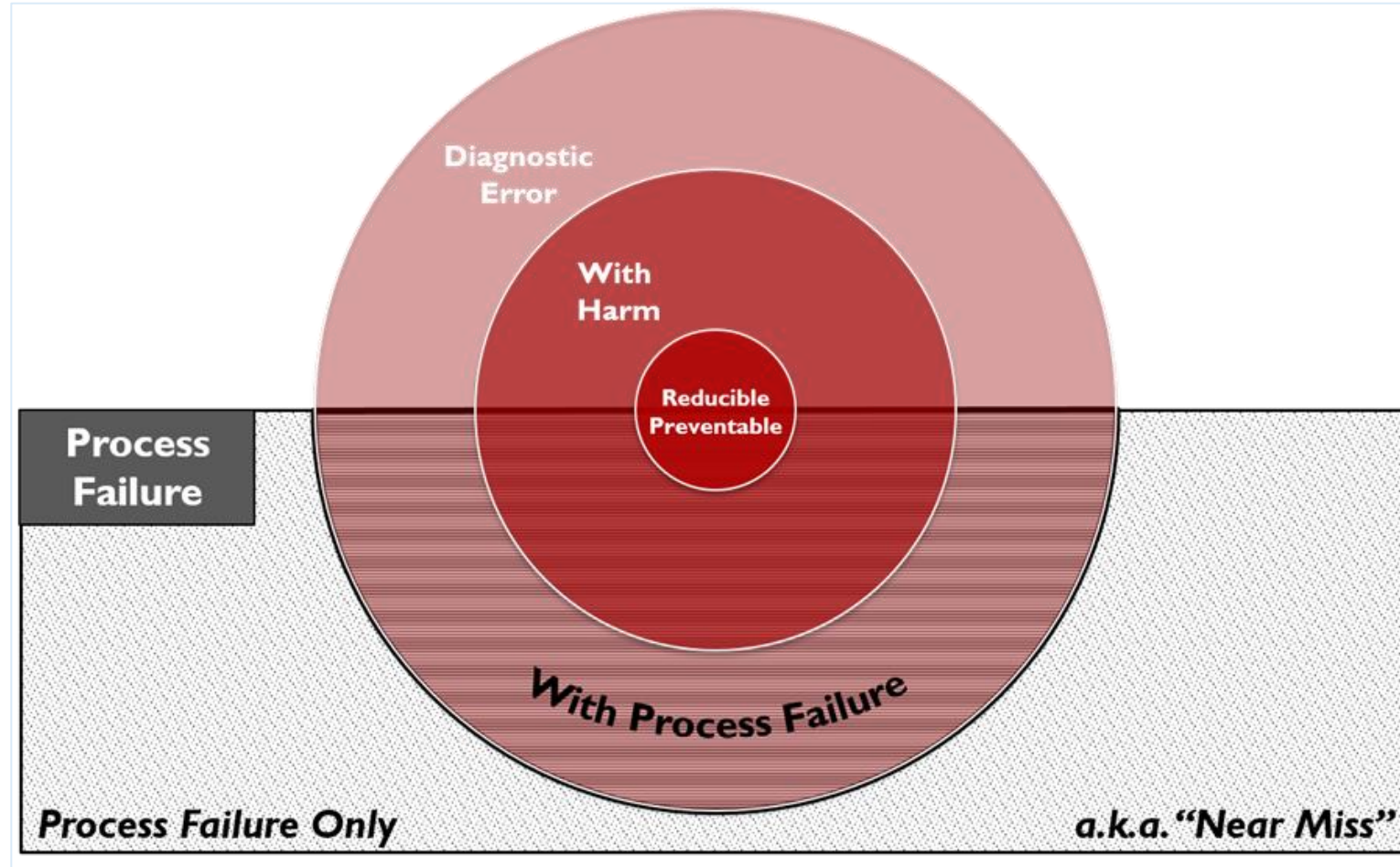
## ▶ Misdiagnosis-related Harm

...harm resulting from the delay or failure to treat a condition actually present (when the working diagnosis was wrong or unknown) or from treatment provided for a condition not actually present. (*adapted from Newman-Toker, 2009*)

- **Evolving basilar occlusion** – thrombolysis (intravenous [ $<4.5$  hr] or intra-arterial [4.5-6+ hr])
- **Large cerebellar stroke or hemorrhage** – ICU monitoring with intraventricular catheter or posterior fossa decompression if clinical state worsens
- **TIA or minor stroke** – early secondary prevention, especially in high-risk vascular lesions or atrial fibrillation (aspirin, heparin, or warfarin)



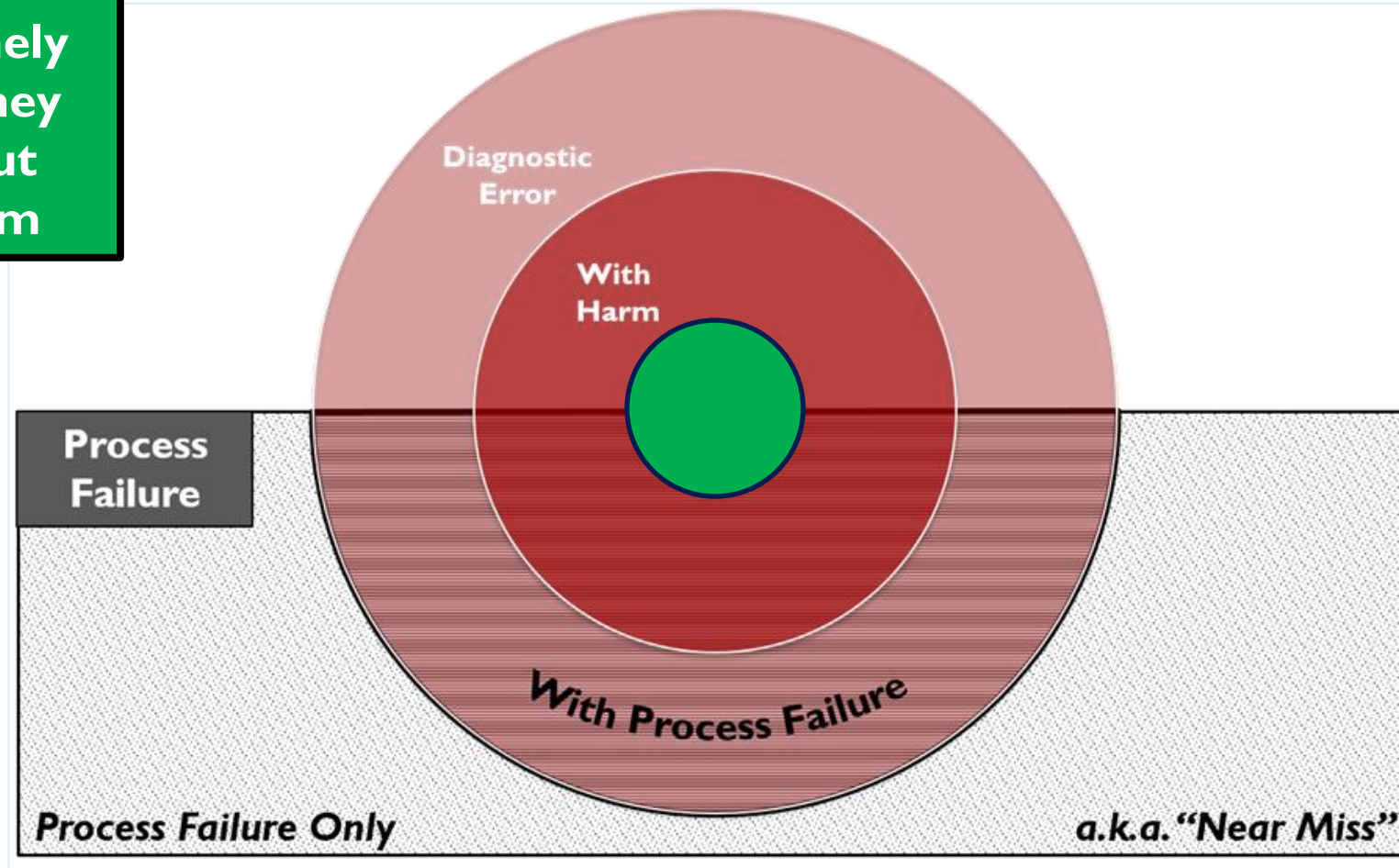
# Diagnostic Errors – Summary of Definitions



# Diagnostic Errors – Summary of Definitions



Patients care about an accurate, timely diagnosis, but they care most about preventing harm





# Common Causes

# Diagnostic Error RCA – Fishbone

Post operative patient with  
multiple consultants

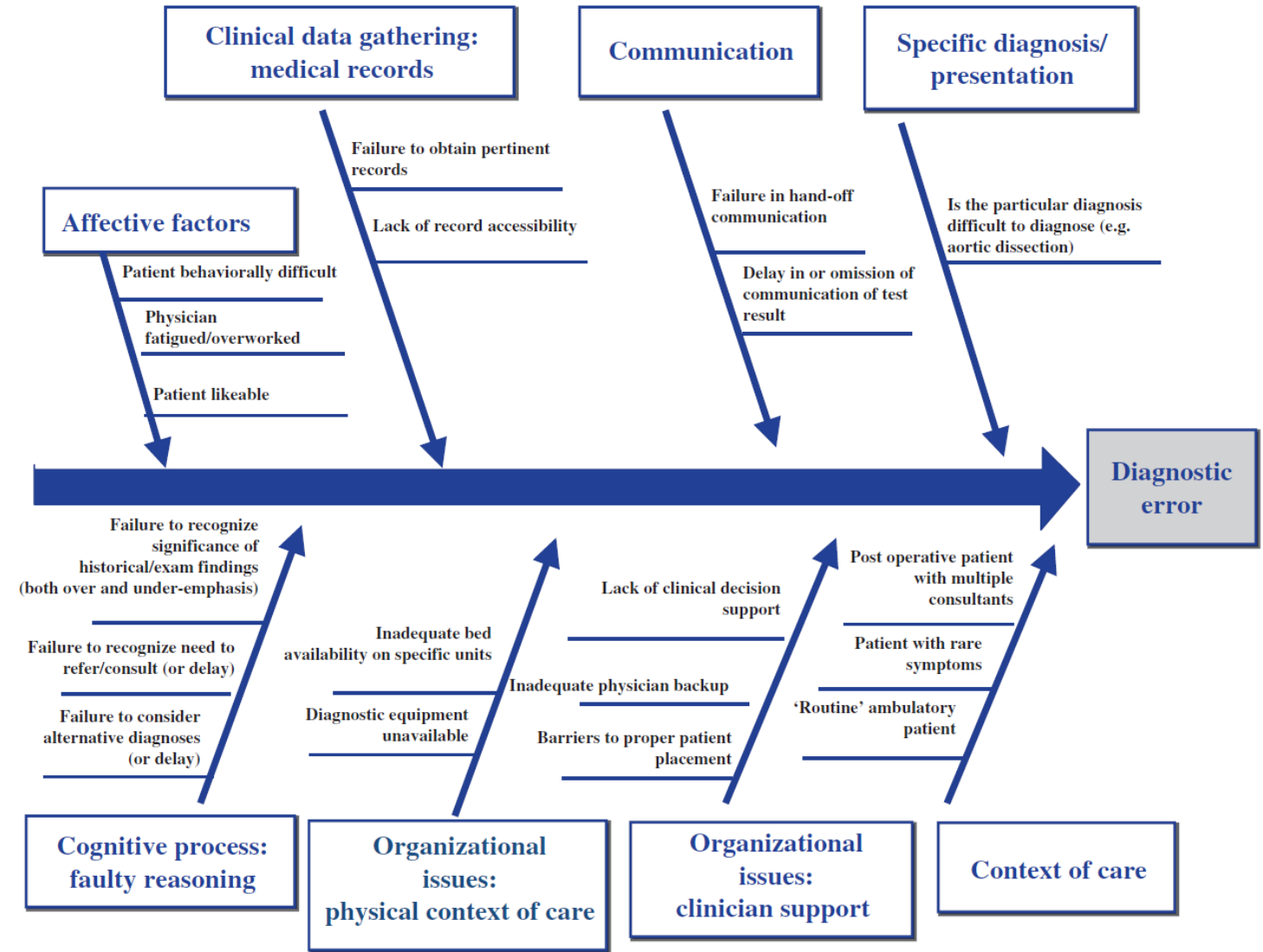
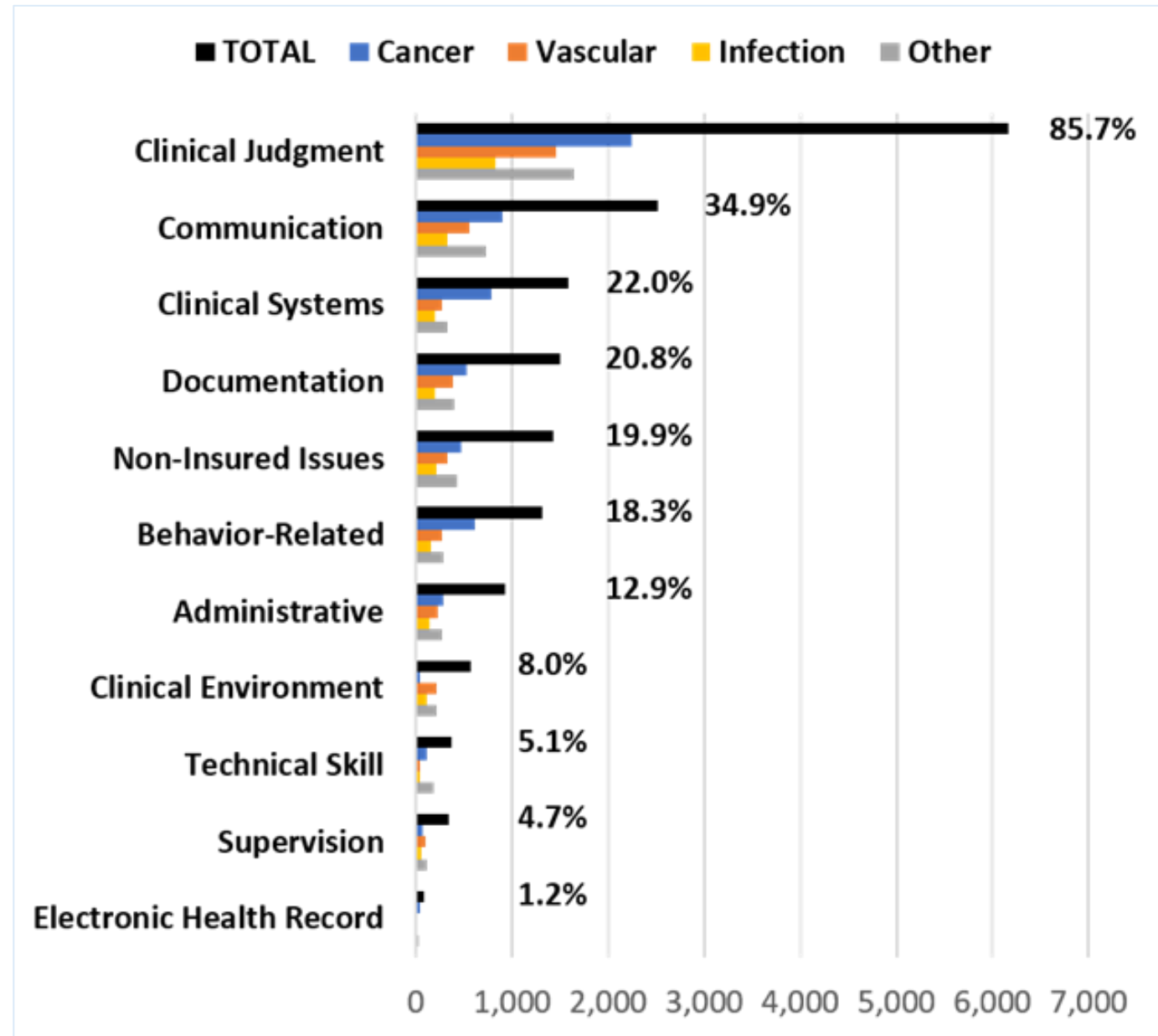


Figure 1 Diagnostic error fishbone framework in use at Maine Medical Center.



# Top Causes of Diagnostic Errors

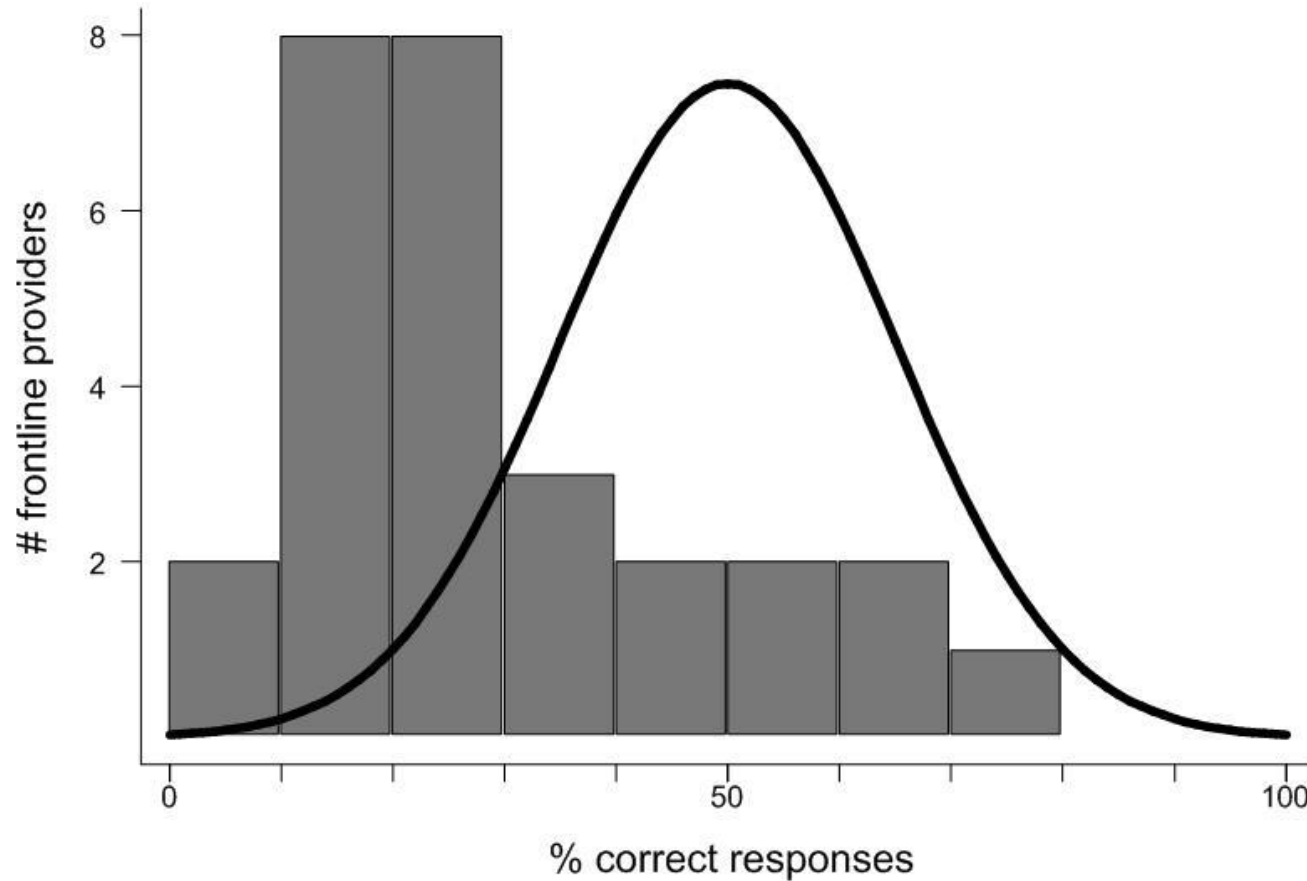


*Newman-Toker et al., Diagnosis (Berl.) 2019*

# Misconceptions are Common in the Frontlines

**BASE CASE**

**10-Q T/F  
Quiz for 28  
ED/PCPs**



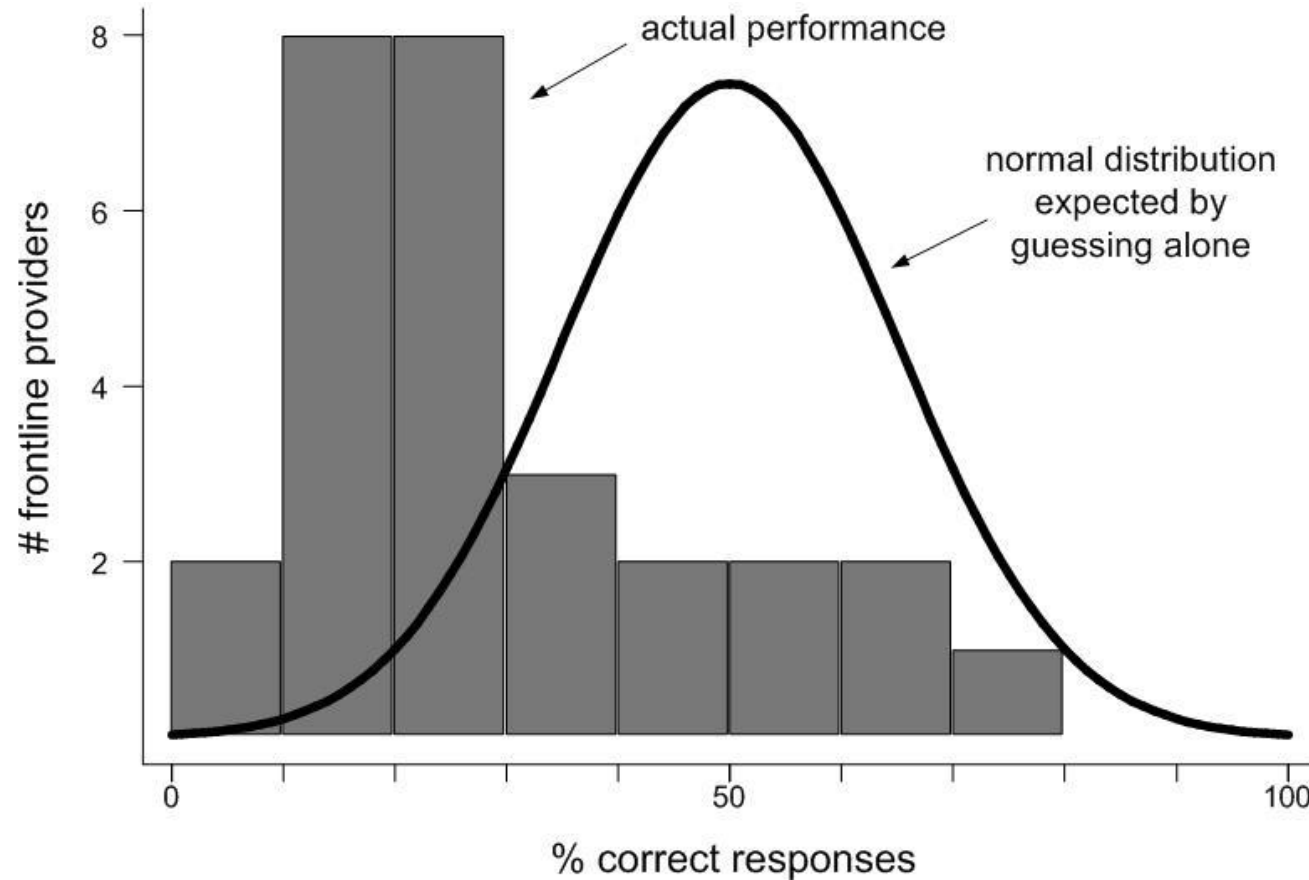


# Misconceptions are Common in the Frontlines

**BASE CASE**

**MISCONCEPTIONS** ← **CHANCE** → **UNDERSTANDING**

**10-Q T/F  
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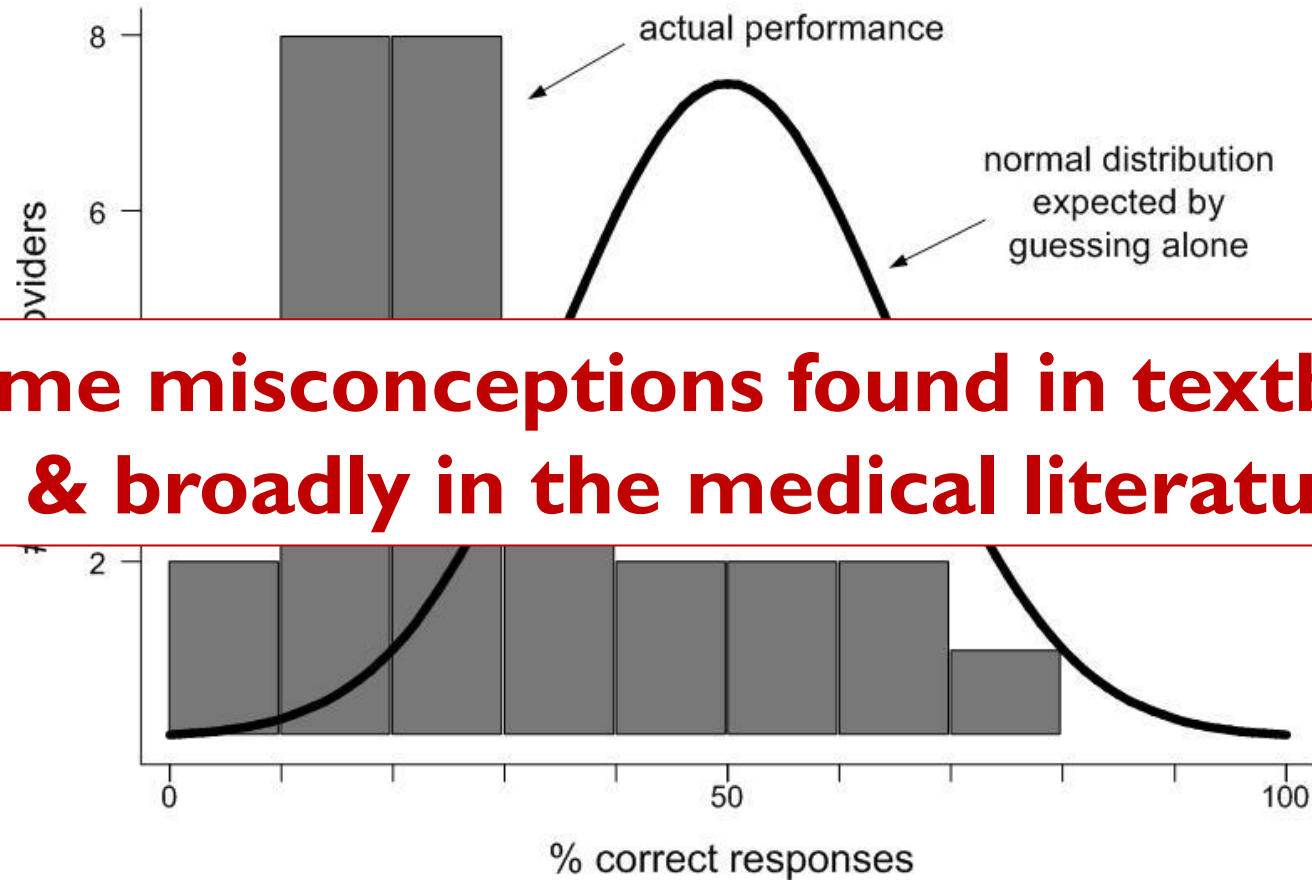


# Misconceptions are Common in the Frontlines

**BASE CASE**

**MISCONCEPTIONS** ← **CHANCE** → **UNDERSTANDING**

10-Q T/F  
Quiz for 2  
ED/PCPs



**Same misconceptions found in textbooks  
& broadly in the medical literature**



# Cognitive Errors

# “Systems” vs. “Cognitive” Errors



*Adapted from Graber, DEM 2011 (base art Tim Parish 2008)*

# Diagnostic Errors – Two Dominant Theories re: Cognitive Causes

**COGNITIVE  
BIAS**



**Debiasing &  
Timeouts**

**EXPERTISE  
GAPS**



**The Four T's**  
**Team, Train, Tech, Tune**



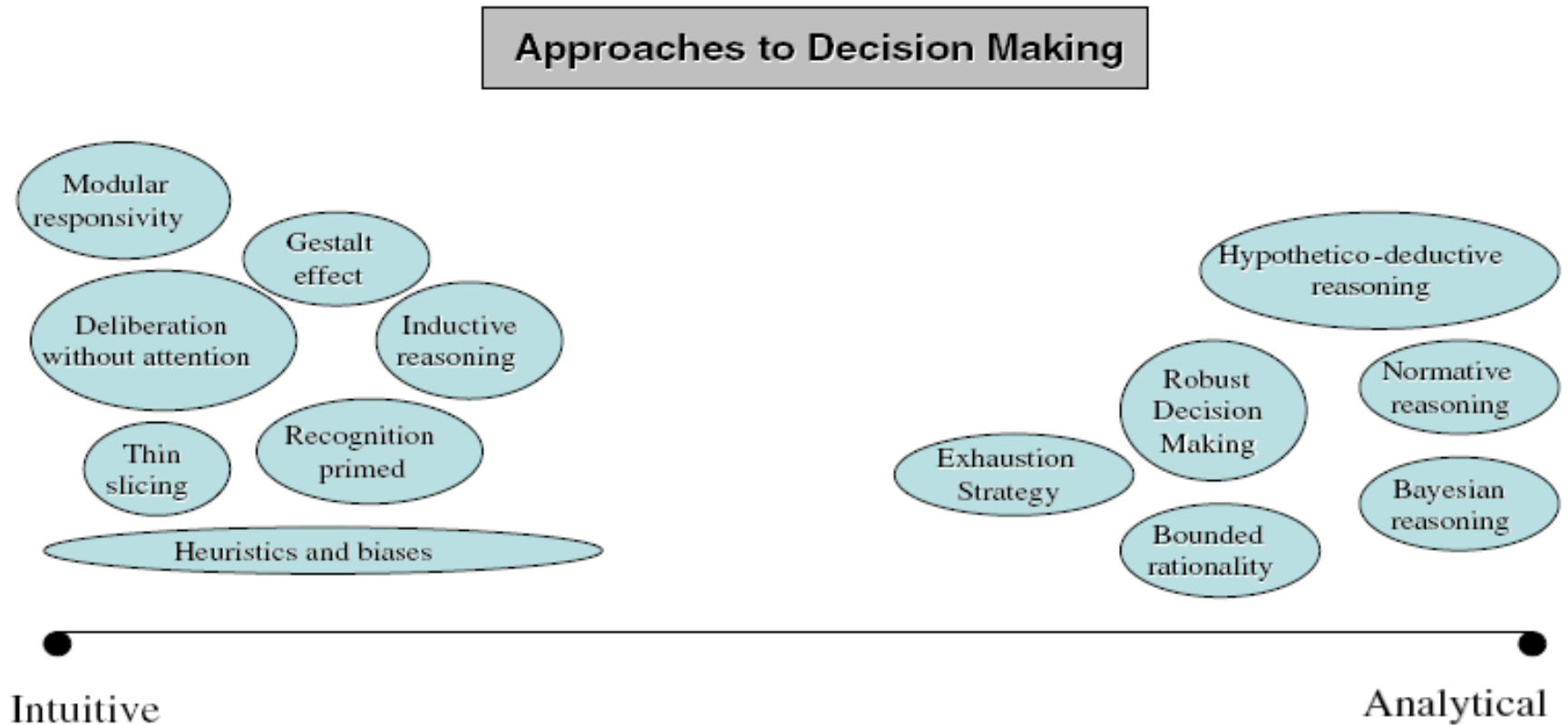
# Cognitive Bias



# Intuitive vs. Analytical Strategies

## Clinical cognition and diagnostic error: applications of a dual process model of reasoning

Pat Croskerry

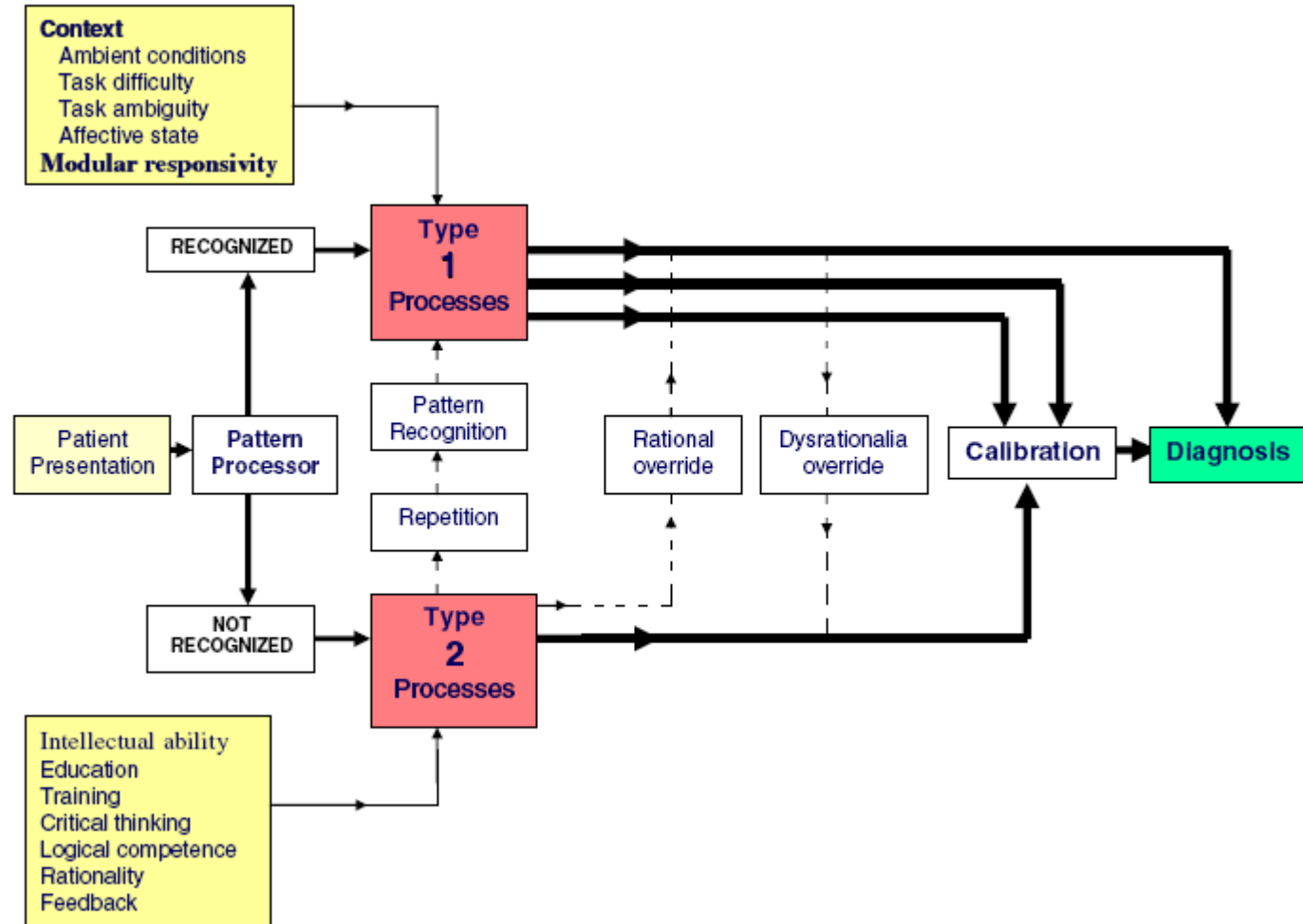


Croskerry, Adv Health Sci Educ Theory Pract 2009



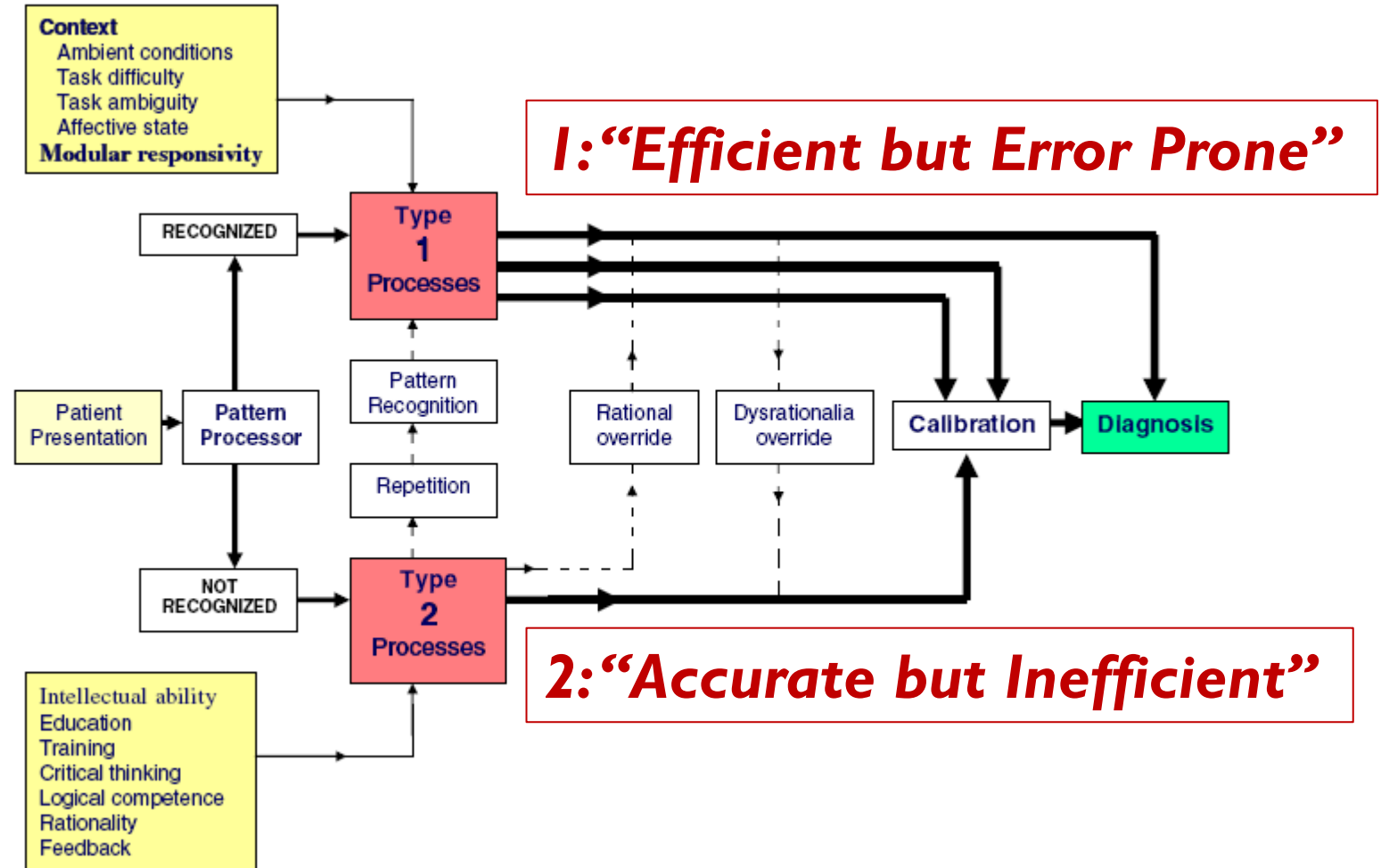
# Dual Process Model of Cognition

## Clinical cognition and diagnostic error: applications of a dual process model of reasoning



# Dual Process Model of Cognition

## Clinical cognition and diagnostic error: applications of a dual process model of reasoning



# Cognitive Heuristics & Biases



<u>HEURISTIC OR PHENOMENON</u>	<u>PITFALL</u>	<u>CORRECTIVE STRATEGIES</u>	<u>CLINICAL MAXIMS</u>	<u>ILLUSTRATIVE STUDIES</u>
<b>Framing Effects:</b>	Being swayed by subtle wording to focus on certain aspects of a case more than others	Examine case from alternative perspectives and re-evaluate different pieces of clinical information	Deliberately consider from another angle: "Let's play devil's advocate..." or "Let's re-review elements of the history..."	Cartmill, R.S.V. & Thornton, J.G; <i>Lancet</i> , 1992 McNeil et al; <i>NEJM</i> , 1982
<b>Anchoring Heuristic:</b>	Relying on initial impressions and not adjusting diagnostic probabilities properly with new data	Formally estimate probabilities in light of new data or second opinion; look up selected probability data on Pubmed; do this with own patient as you would when giving second opinion	"If the patient is not responding to treatment or is worsening, is one possibility that this is the wrong diagnosis? Have I properly weighed key clinical data in making a diagnosis?"	Tversky and Kahneman; <i>Science</i> , 1974
<b>Availability Heuristic:</b>	Judging by ease of recalling past cases based on recency or impact	Verify with legitimate statistics from the literature	"Am I unduly influenced by my experience with one memorable or recent case?"	Salem-Schatz et al; <i>JAMA</i> , 1990
<b>Representativeness Heuristic:</b>	Ignoring prior probabilities and base rate frequencies of different diagnoses that seem to match the patient's pattern of presentation	Formally incorporate prior probability into considerations; look up literature on prevalence and occurrence of diseases	Pay attention to base rates: "If you hear hoof beats, think about horses not zebras."	Kahneman & Tversky; <i>Psychol Review</i> , 1973
<b>Blind Obedience:</b>	Showing undue deference to authority or technology	Look up diagnostic test performance characteristics in medical literature using Pubmed or other sources	"Does a negative value on a test definitively rule out a disease? How common are false positives?"	Woolf & Kamerow; <i>Arch Intern Med</i> , 1990

*Adapted from Redelmeier, Ann Intern Med 2005*

# Cognitive Heuristics & Biases



**BASE CASE**

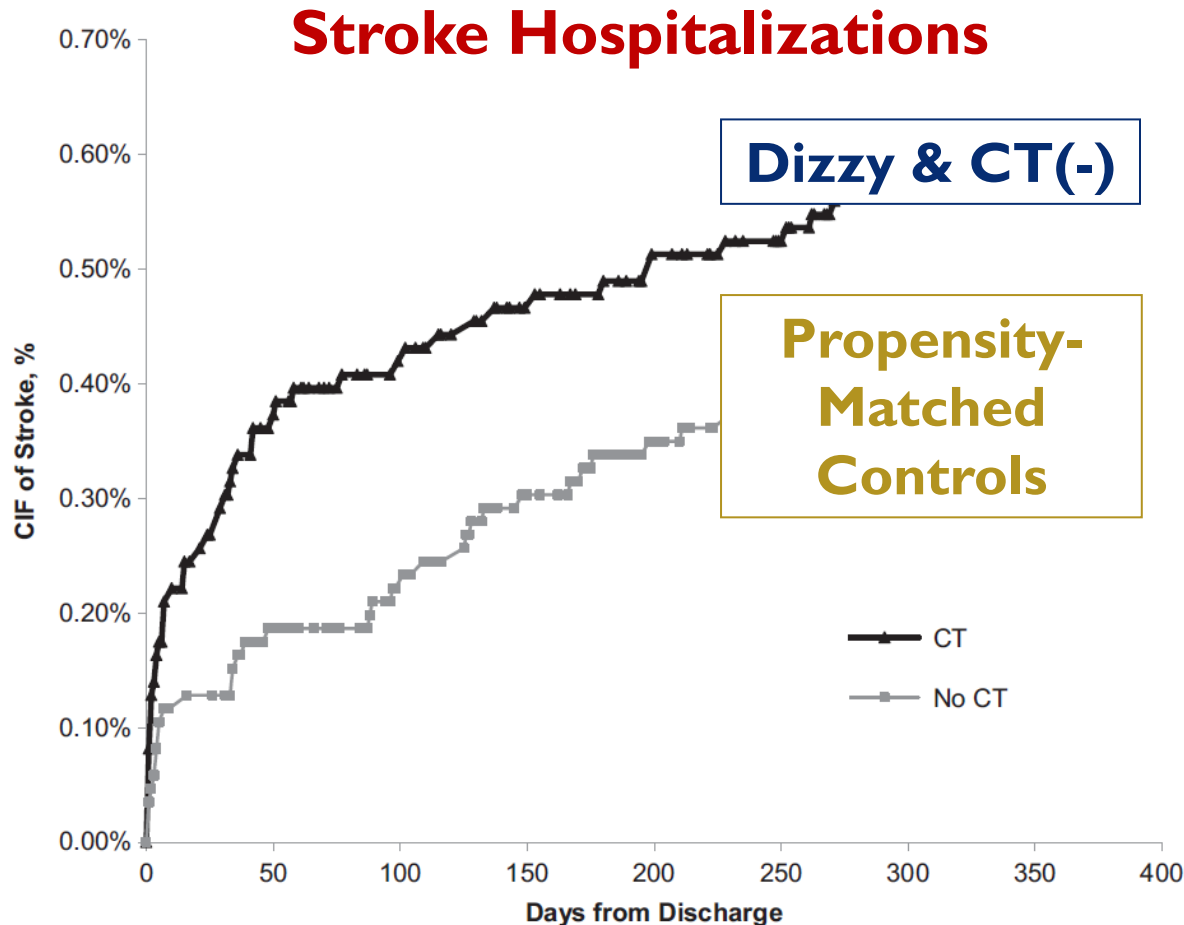
<u>HEURISTIC OR PHENOMENON</u>	<u>PITFALL</u>	<u>CORRECTIVE STRATEGIES</u>	<u>CLINICAL MAXIMS</u>	<u>ILLUSTRATIVE STUDIES</u>
<b>Framing Effects:</b>	Being swayed by subtle wording to focus on certain aspects of a case more than others	Examine case from alternative perspectives and re-evaluate different pieces of clinical information	Deliberately consider from another angle: <b>"Let's play devil's advocate..."</b> or <b>"Let's re-review elements of the history..."</b>	Cartmill, R.S.V. & Thornton, J.G; <i>Lancet</i> , 1992 McNeil et al; <i>NEJM</i> , 1982
<b>Anchoring Heuristic:</b>	Relying on initial impressions and not adjusting diagnostic probabilities properly with new data	Formally estimate probabilities in light of new data or second opinion; look up selected probability data on Pubmed; do this with <i>own</i> patient as you would when giving second opinion	<b>"If the patient is not responding to treatment or is worsening, is one possibility that this is the wrong diagnosis? Have I properly weighed key clinical data in making a diagnosis?"</b>	Tversky and Kahneman; <i>Science</i> , 1974
<b>Availability Heuristic:</b>	Judging by ease of recalling past cases based on recency or impact	Verify with legitimate statistics from the literature	<b>"Am I unduly influenced by my experience with one memorable or recent case?"</b>	Salem-Schatz et al; <i>JAMA</i> , 1990
<b>Representativeness Heuristic:</b>	Ignoring prior probabilities and base rate frequencies of different diagnoses that seem to match the patient's pattern of presentation	Formally incorporate prior probability into considerations; look up literature on prevalence and occurrence of diseases	Pay attention to base rates: <b>"If you hear hoof beats, think about horses not zebras."</b>	Kahneman & Tversky; <i>Psychol Review</i> , 1973
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*Adapted from Redelmeier, Ann Intern Med 2005*

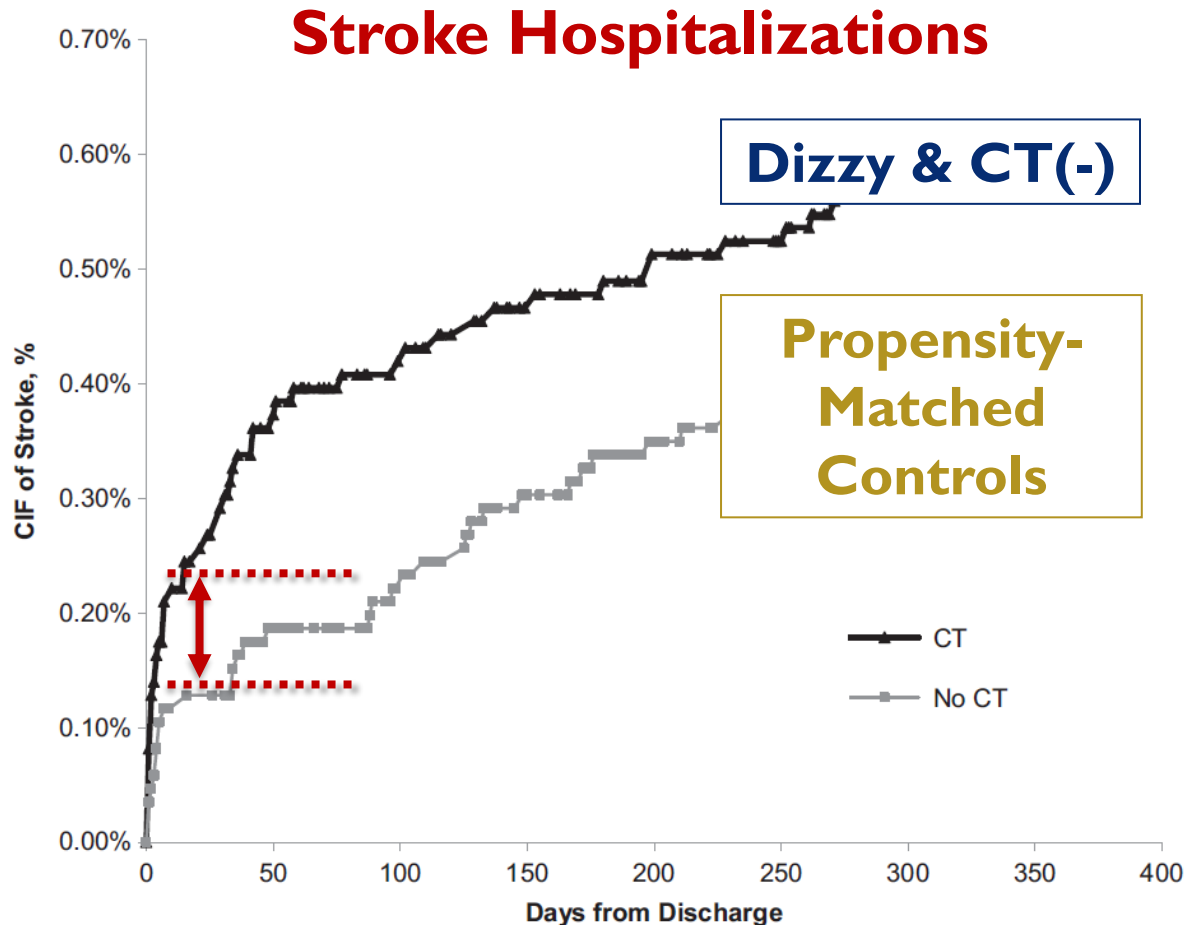


# False Reassurance from Negative CT Imaging

**BASE CASE**



**Imaging Misuse:**  
CT does not “rule out”  
stroke in dizziness...  
negative CT *predicts*  
future stroke (OR 2.3)



**Imaging Misuse:**  
CT does not “rule out”  
stroke in dizziness...  
negative CT *predicts*  
future stroke (OR 2.3)



# Expertise Gaps



## 1. **What it's Not: MYTHS**

- ▶ Diagnostic expertise is based largely on innate gifts
- ▶ Confidence accurately reflects competence
- ▶ Diagnostic skills are universal

## 2. **What it Is: TRUTHS**

- ▶ Diagnostic decisions vary in difficulty
- ▶ Diagnostic decisions are context dependent
- ▶ Great diagnosis is targeted and efficient

Experts are  
Made not Born

# DELIBERATE PRACTICE



<https://i.ytimg.com/vi/l-sjUoGO250/maxresdefault.jpg>



## 1. Source

- ▶ Education (esp. “effortful study” – at your limits)
- ▶ Experience (esp. with timely, guided feedback)
- ▶ Reflection (esp. systematic practice improvement)

## 2. Result

- ▶ Extensive domain knowledge (illness/symptom scripts)
- ▶ Intuitive, accurate processing familiar diagnoses (Sys. 1)
- ▶ Ability to solve new problems more accurately (Sys. 2)



# Diagnostic Errors – Expertise vs. Specialization



**Generalist\*  $\neq$  Lack of Expertise**

**Expert  $\neq$  Specialist**

**Specialist  $\neq$  Expert**

**Specialist = Easier to Gain Expertise**



## **1. Tough Task & Limitations of the Human Brain**

- ▶ Generalists have a MUCH tougher task
- ▶ Cognitive and affective traps (biases)
- ▶ Overconfidence/miscalibration (lack of feedback)

## **2. Inadequate Education & Training**

- ▶ Education does not focus on uncued diagnosis
- ▶ No one gets enough experience or training
- ▶ Time pressure limits practice improvement



**Obviousness predicts correct diagnosis**

**Subtlety predicts incorrect diagnosis**

- a) low prevalence (pre-test probability / base rate)
- b) degree of difficulty (atypical, non-specific, red herrings, “wrong” demographic group, bigger problems)
- c) training background, knowledge/familiarity/expertise

**Points to Gaps  
in Expertise**

# Diagnostic Errors – Two Dominant Theories re: Cognitive Causes

**COGNITIVE  
BIAS**



**Debiasing &  
Timeouts**

**EXPERTISE  
GAPS**

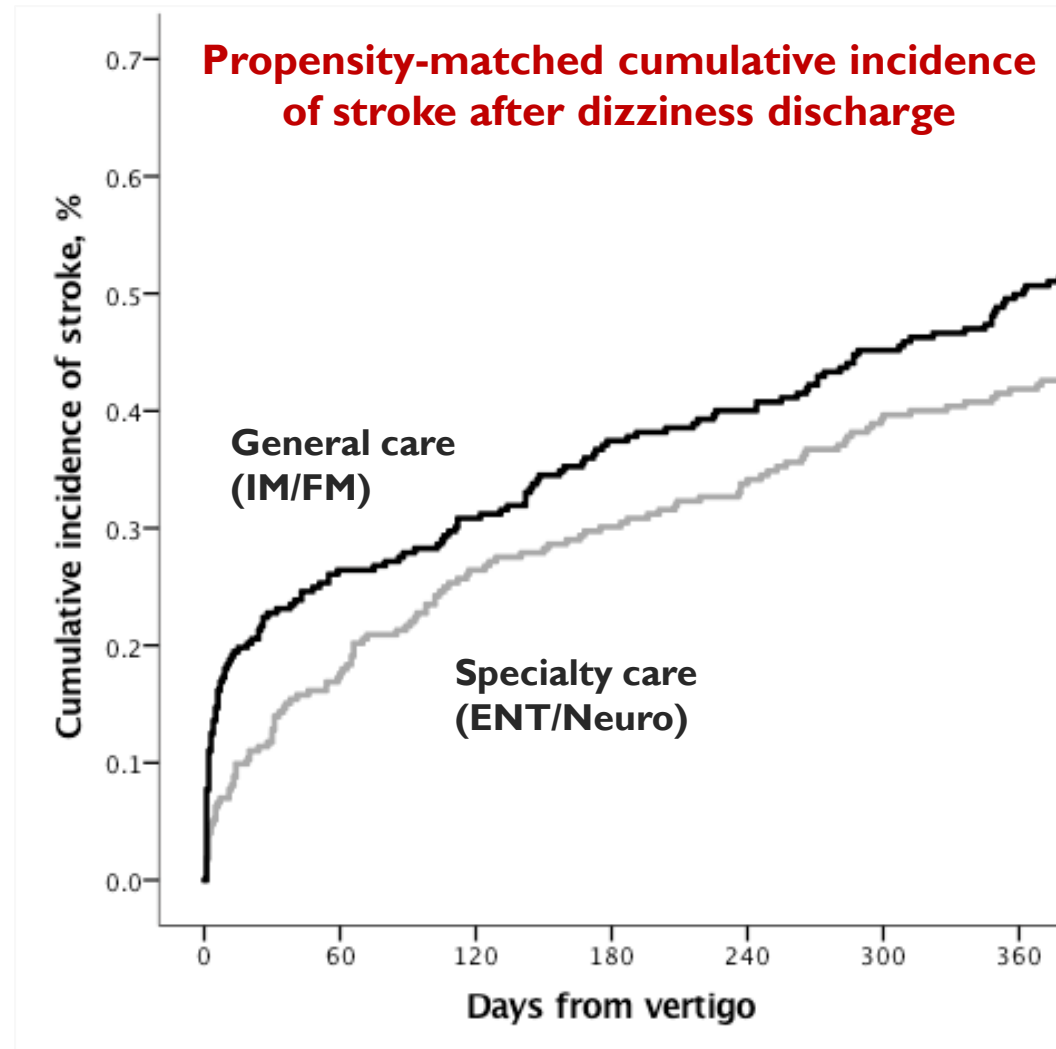


**The Four T's**

**Team, Train, Tech, Tune**

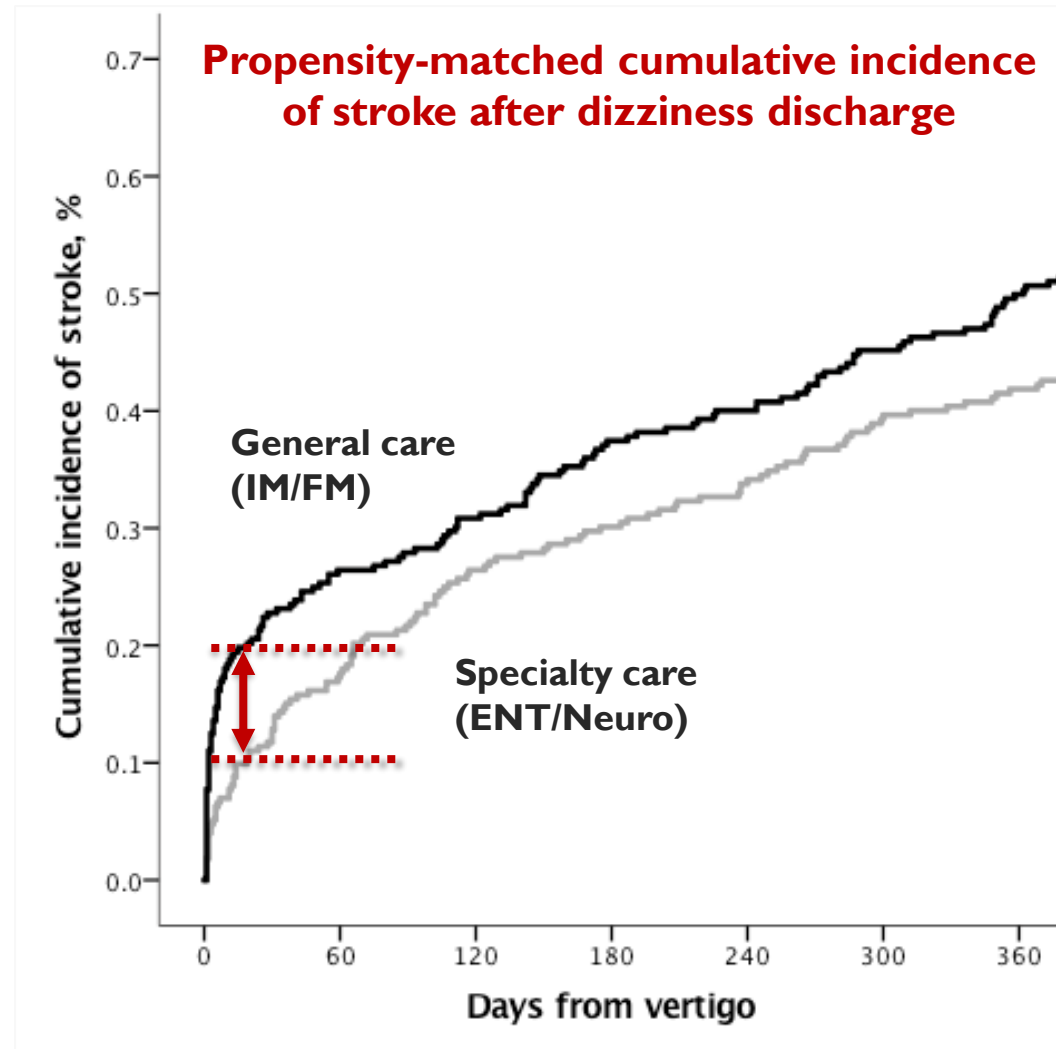
# Expertise Helps in Diagnosing Dizziness

**BASE CASE**



# Expertise Helps in Diagnosing Dizziness

**BASE CASE**

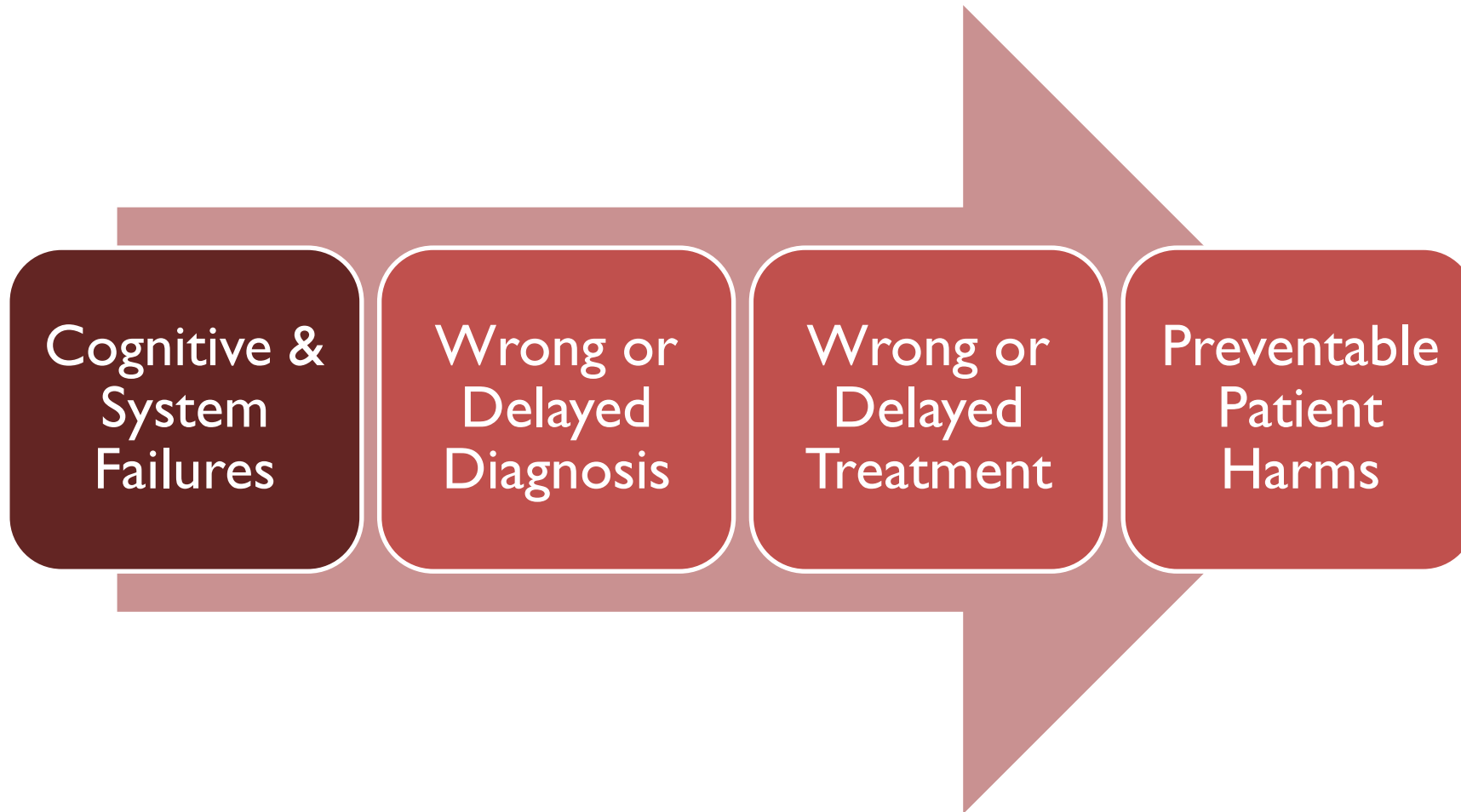




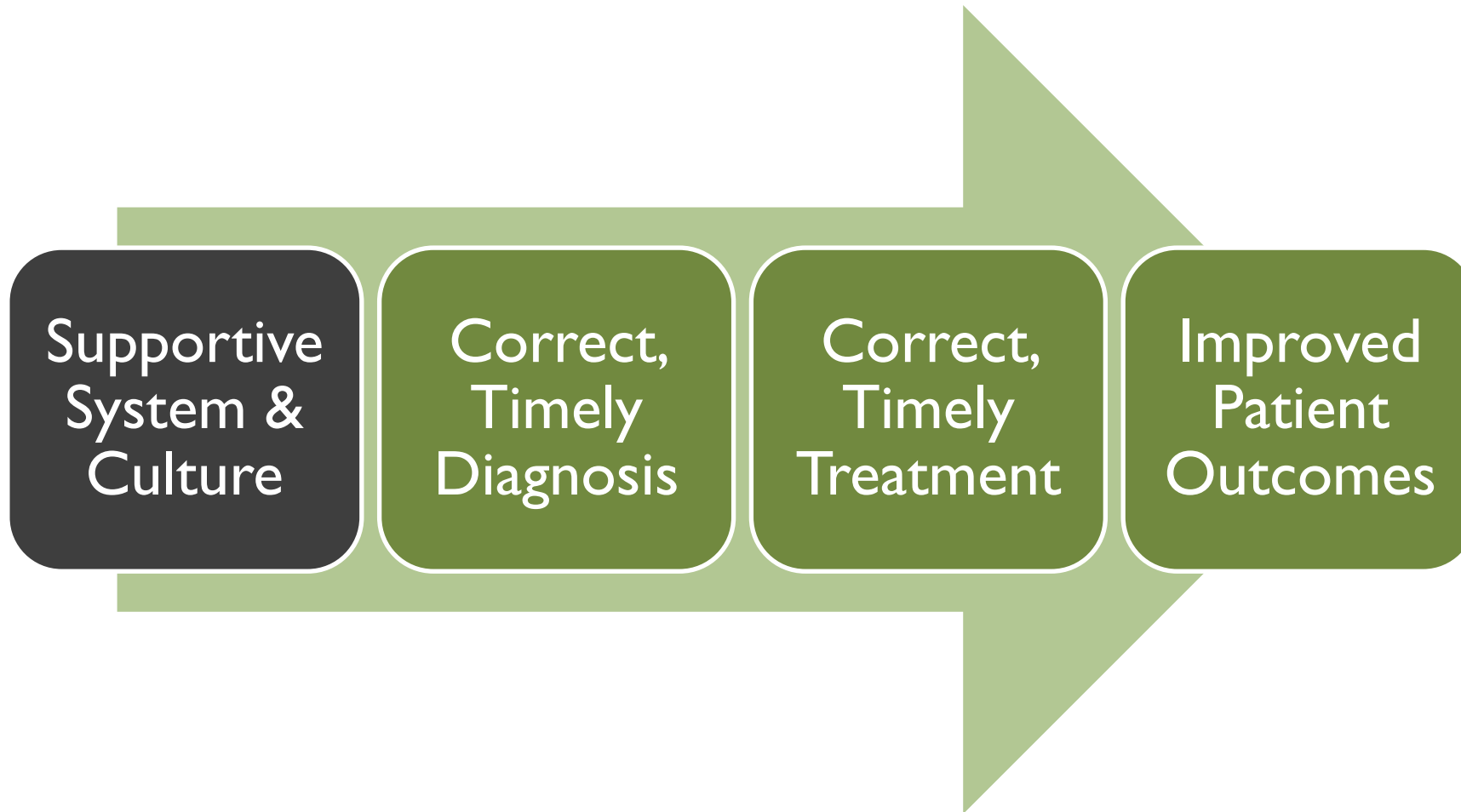


# Work System

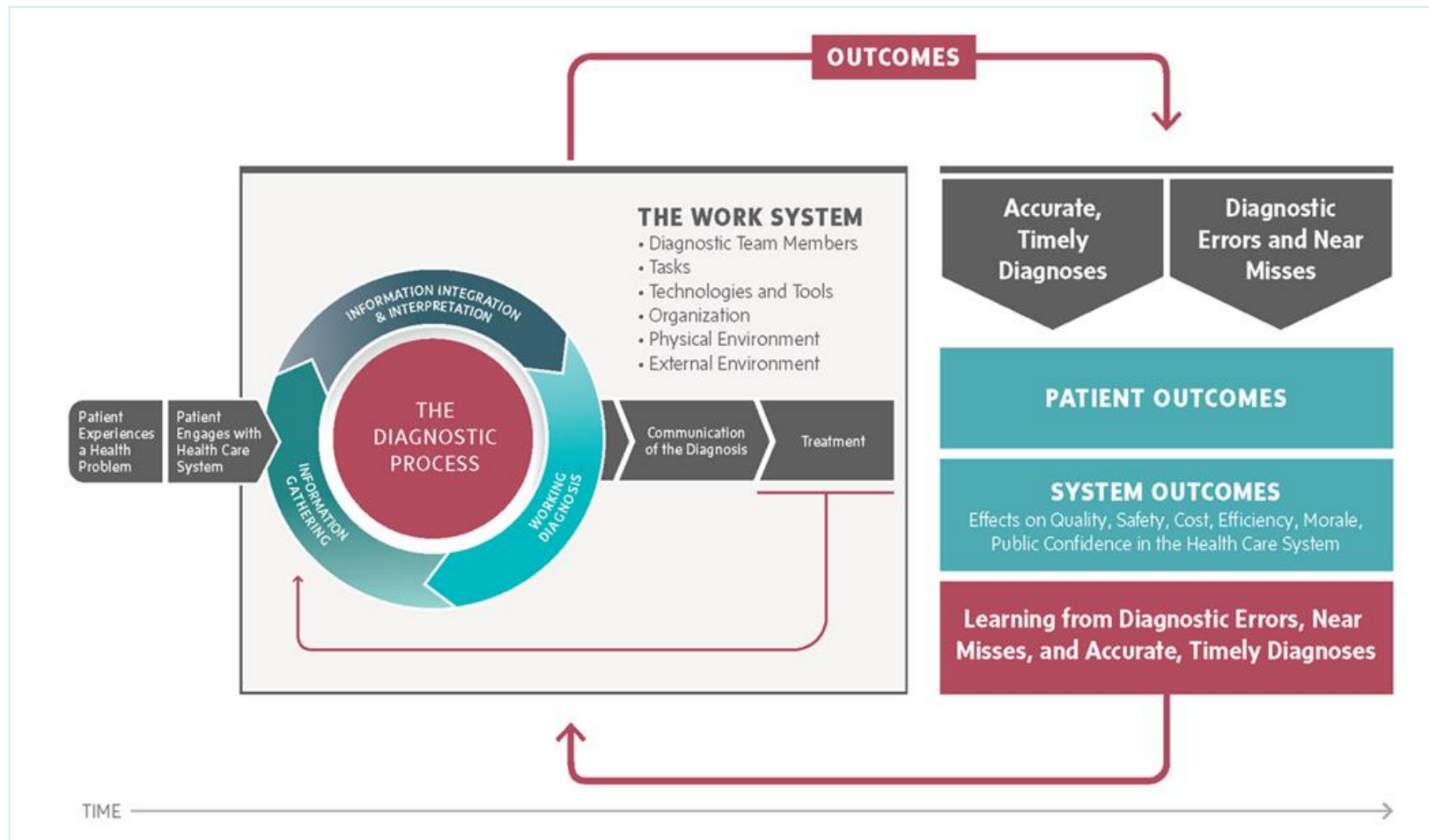
# Diagnostic Errors – Failed Dx Processes & Outcomes



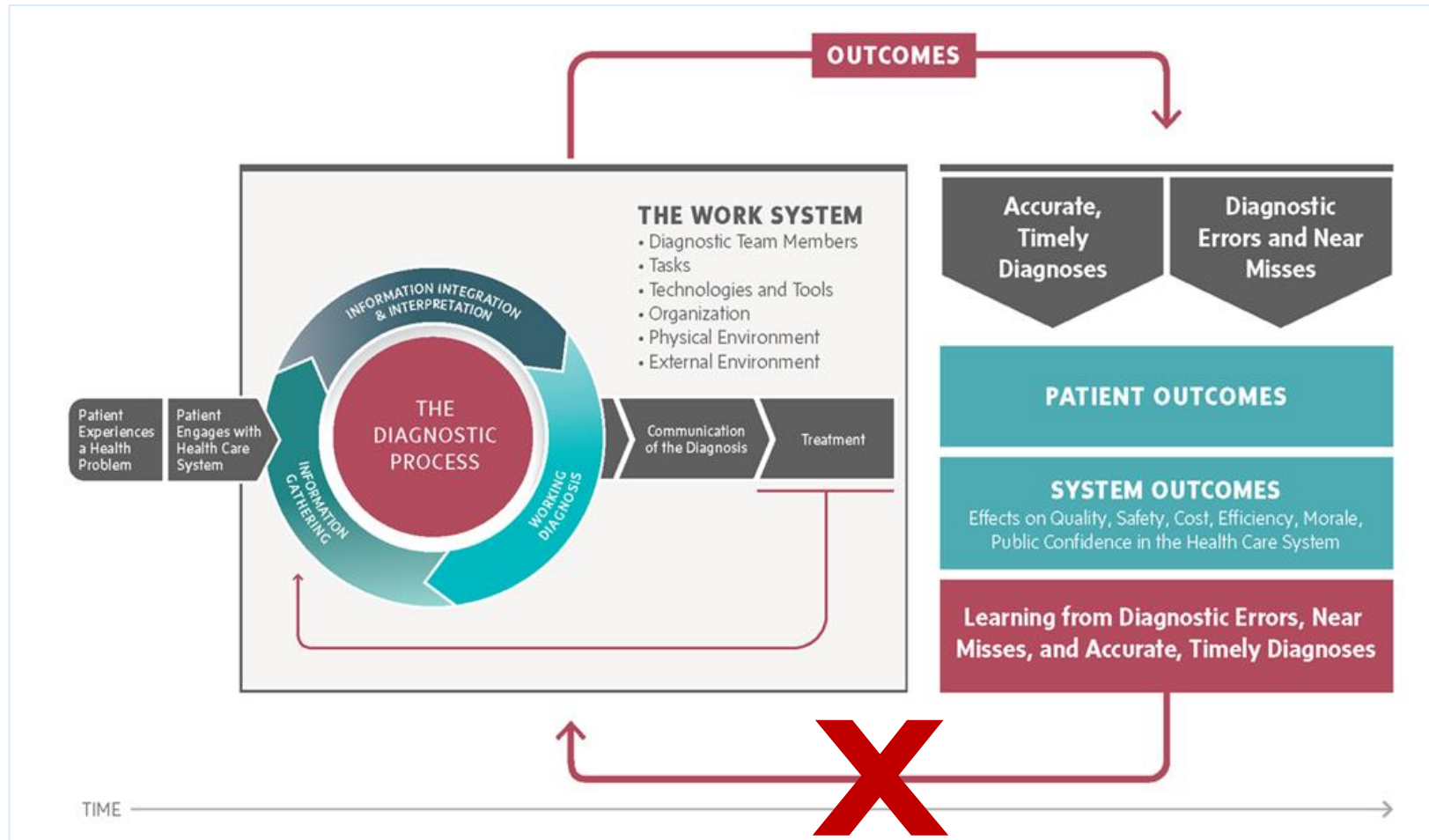
# Diagnostic Excellence – Optimal Dx Processes & Outcomes



# Diagnostic Excellence – Learning Health System Concept

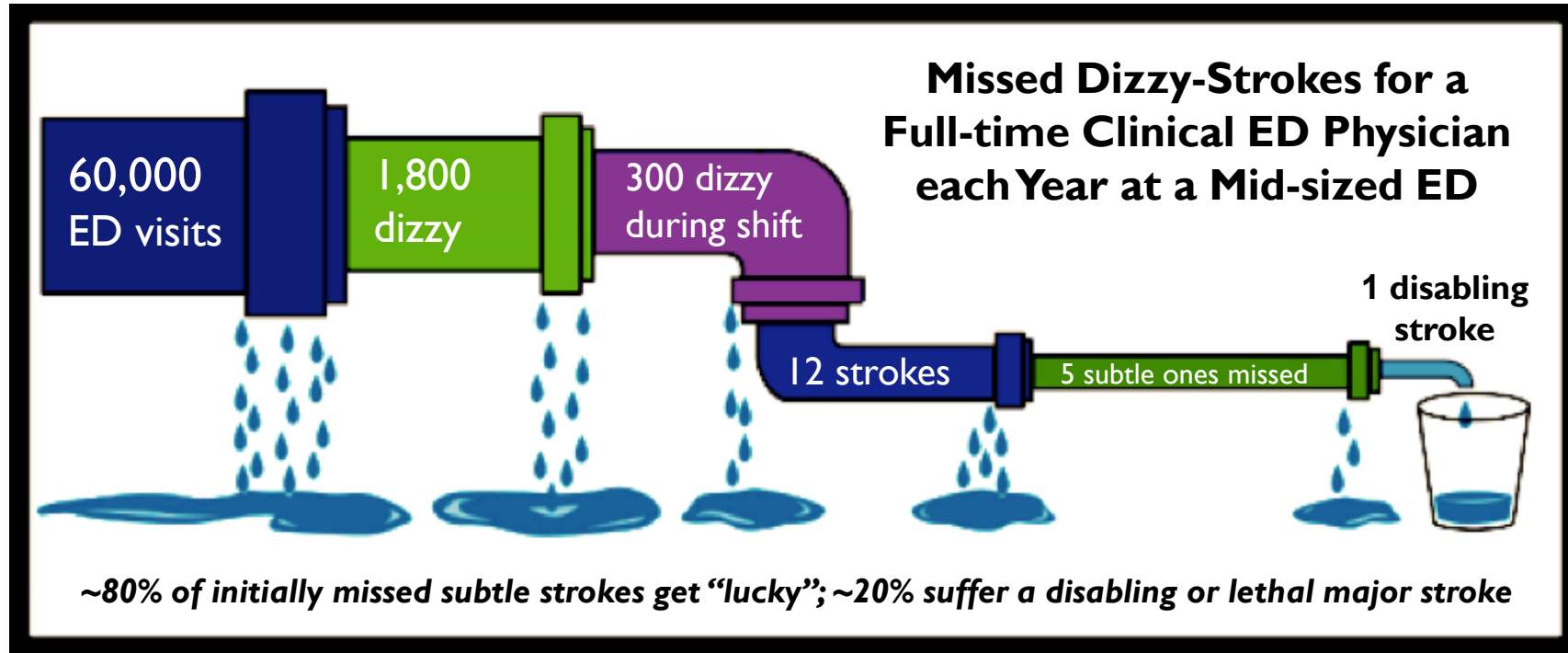


# Diagnostic Excellence – Learning Health System Concept



# Diagnostic “Calibration Gap” Makes it Tough to Learn

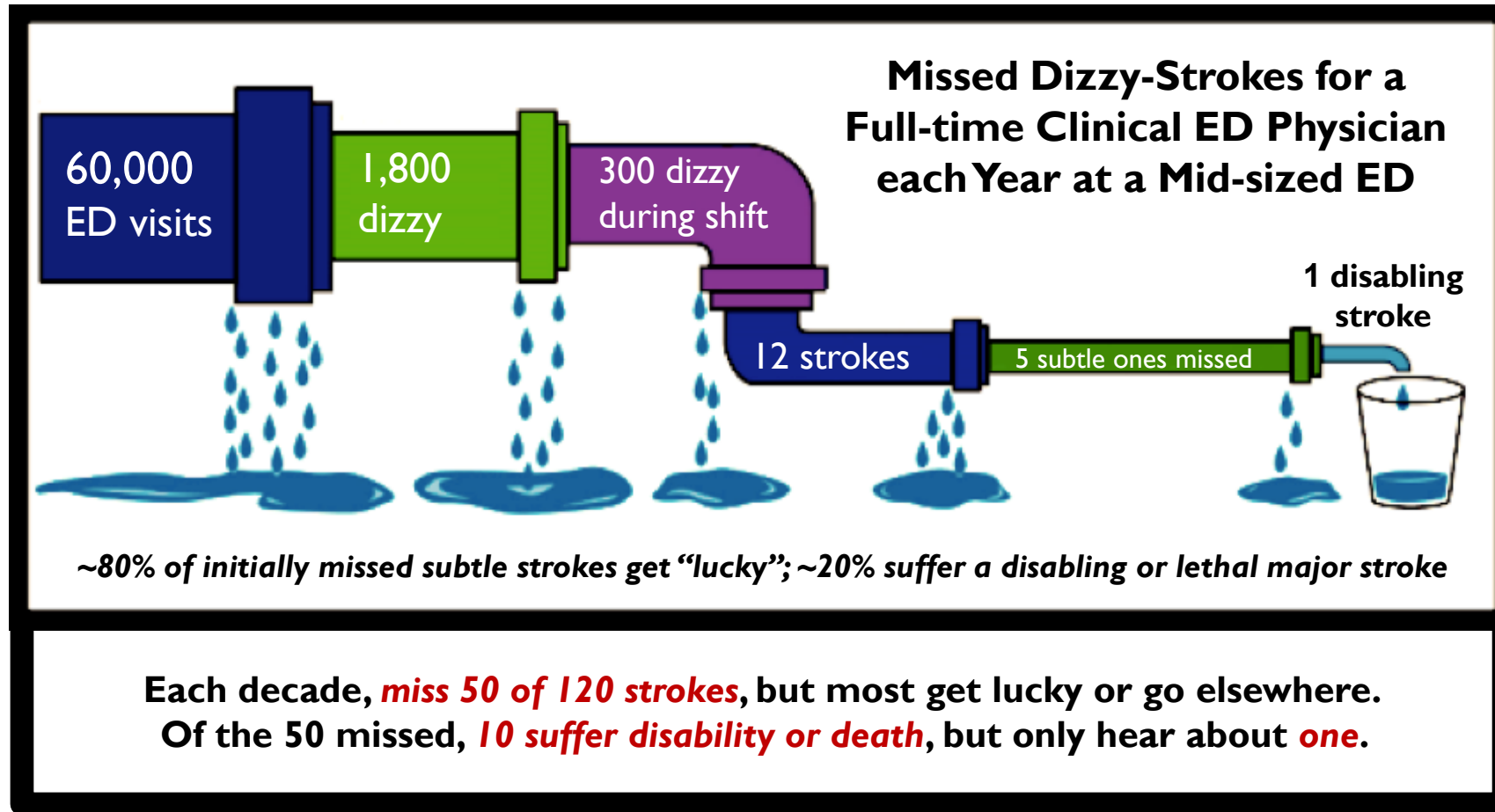
**BASE CASE**





# Diagnostic “Calibration Gap” Makes it Tough to Learn

**BASE CASE**



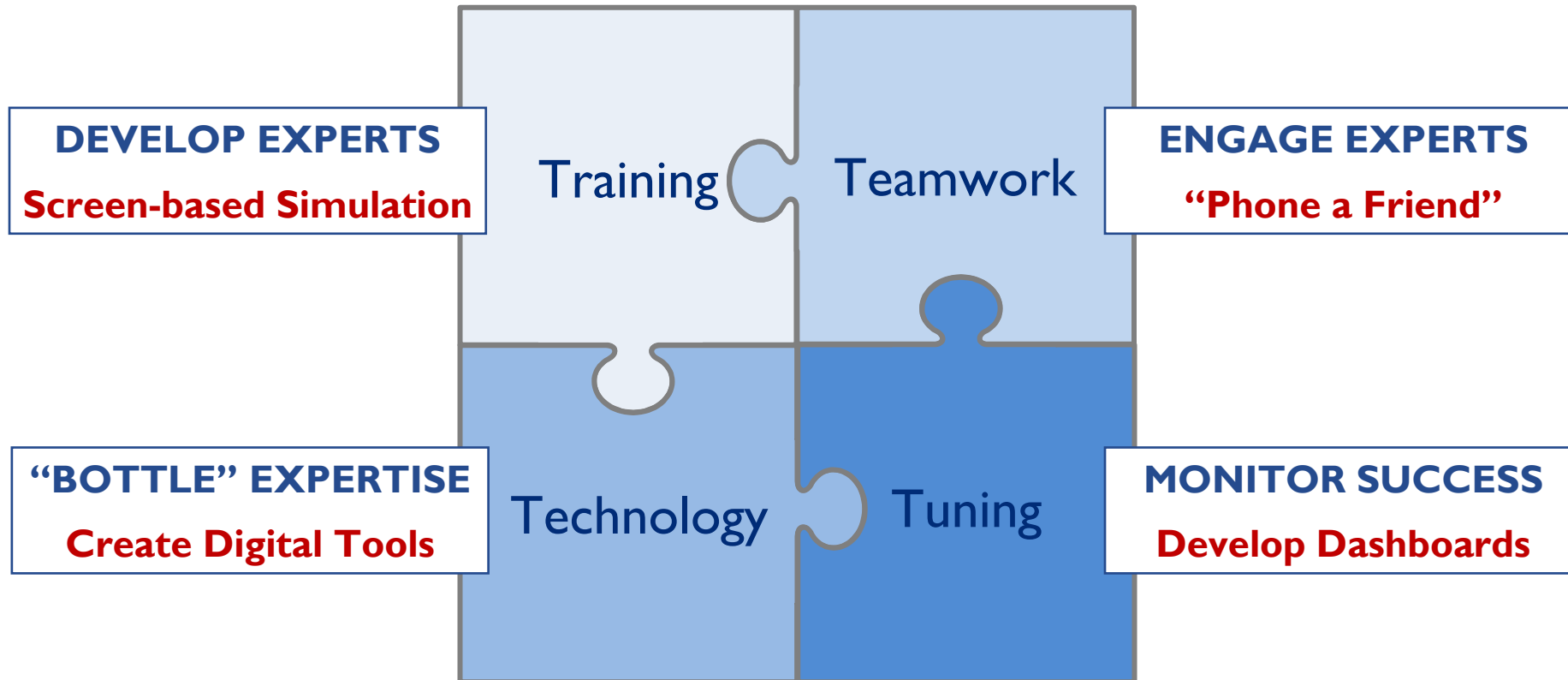
**Perceived Dx Accuracy = ~99%**

**Actual Dx Accuracy = ~60%**



# Systems Solutions

# Diagnostic Excellence – Four Ts to Transform Diagnosis



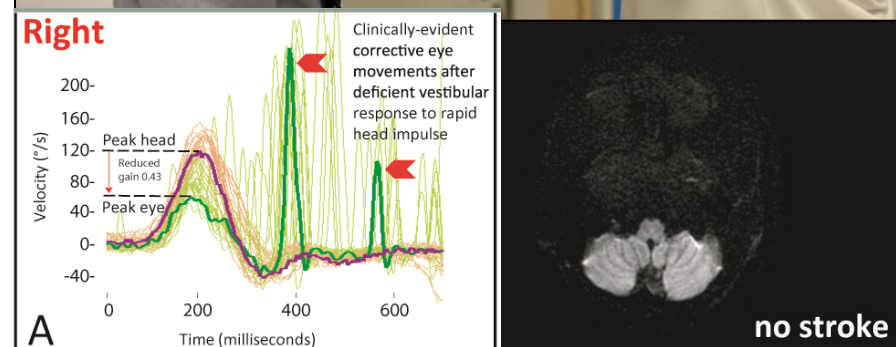
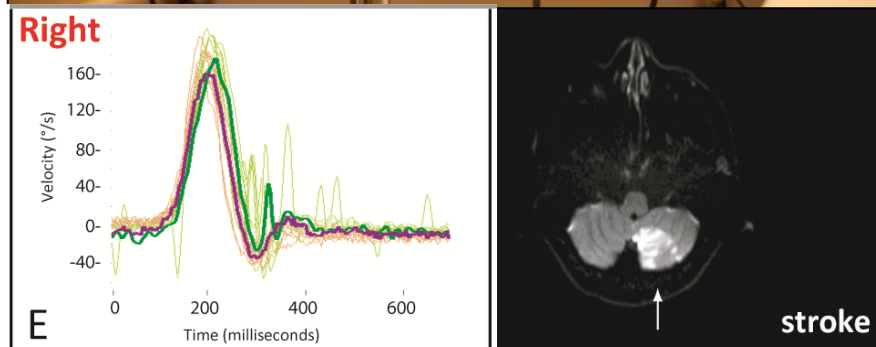
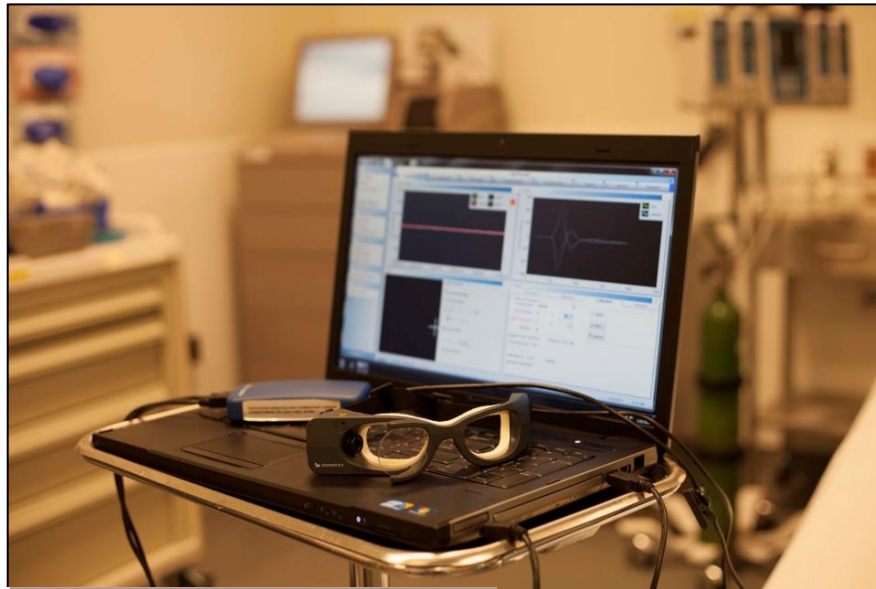


# Four Ts – #1 Teamwork



# Portable Video-Oculography – The “Eye ECG”

**BASE CASE**

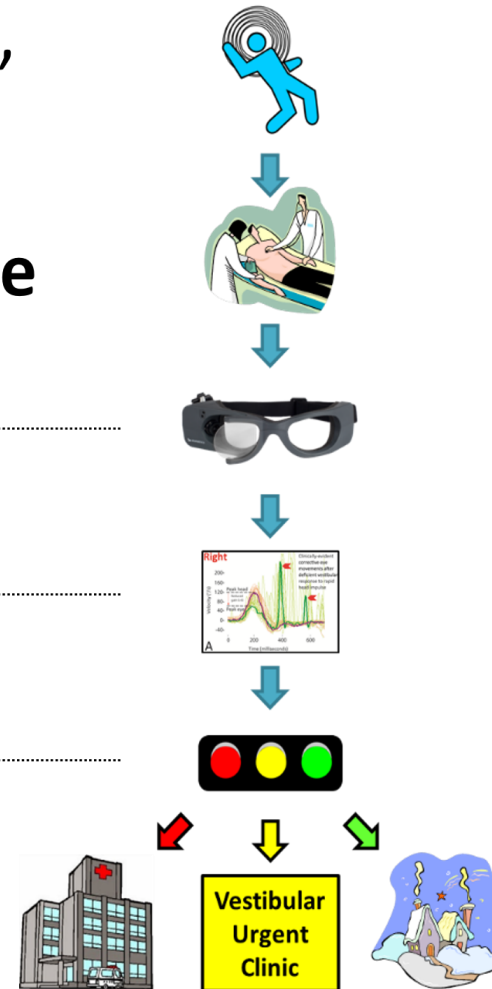


### VOG Rapid Triage – “Eye ECG” via Tele-Dizzy Consultation Service

*Local Personnel  
Perform VOG Tests*

*Remote Experts  
Interpret VOG Results*

*Disposition Recommendation  
Within 1 Hour of Testing*

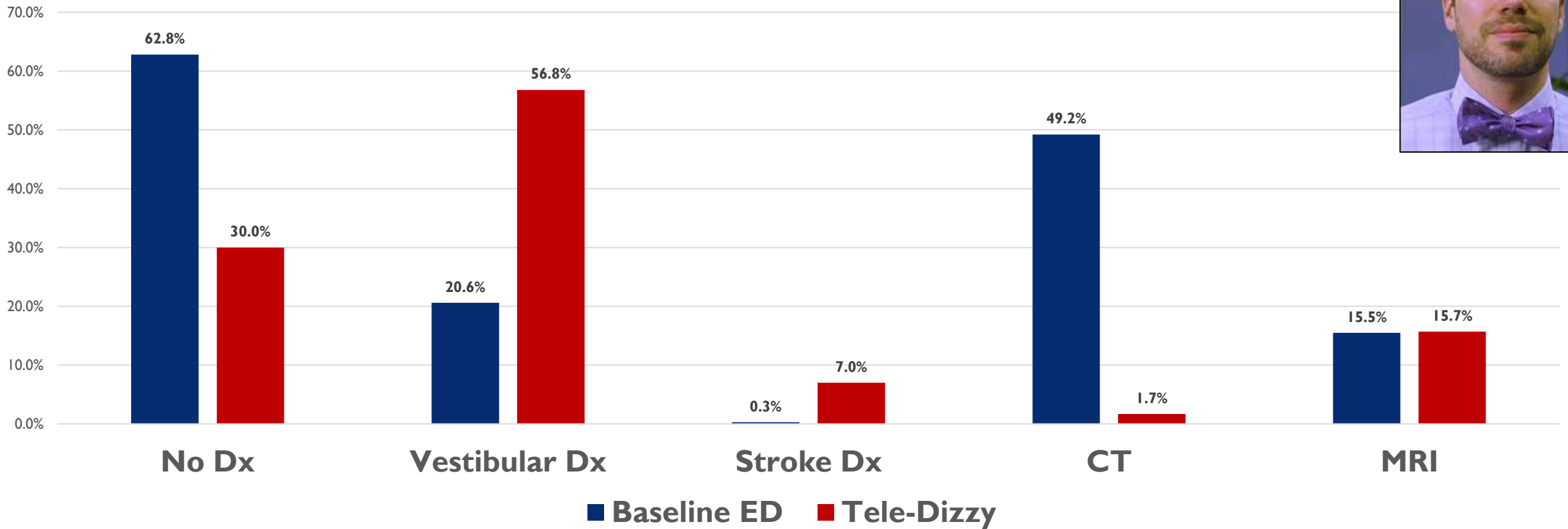




# VOG-Based Tele-Dizzy Consultation Service Successes

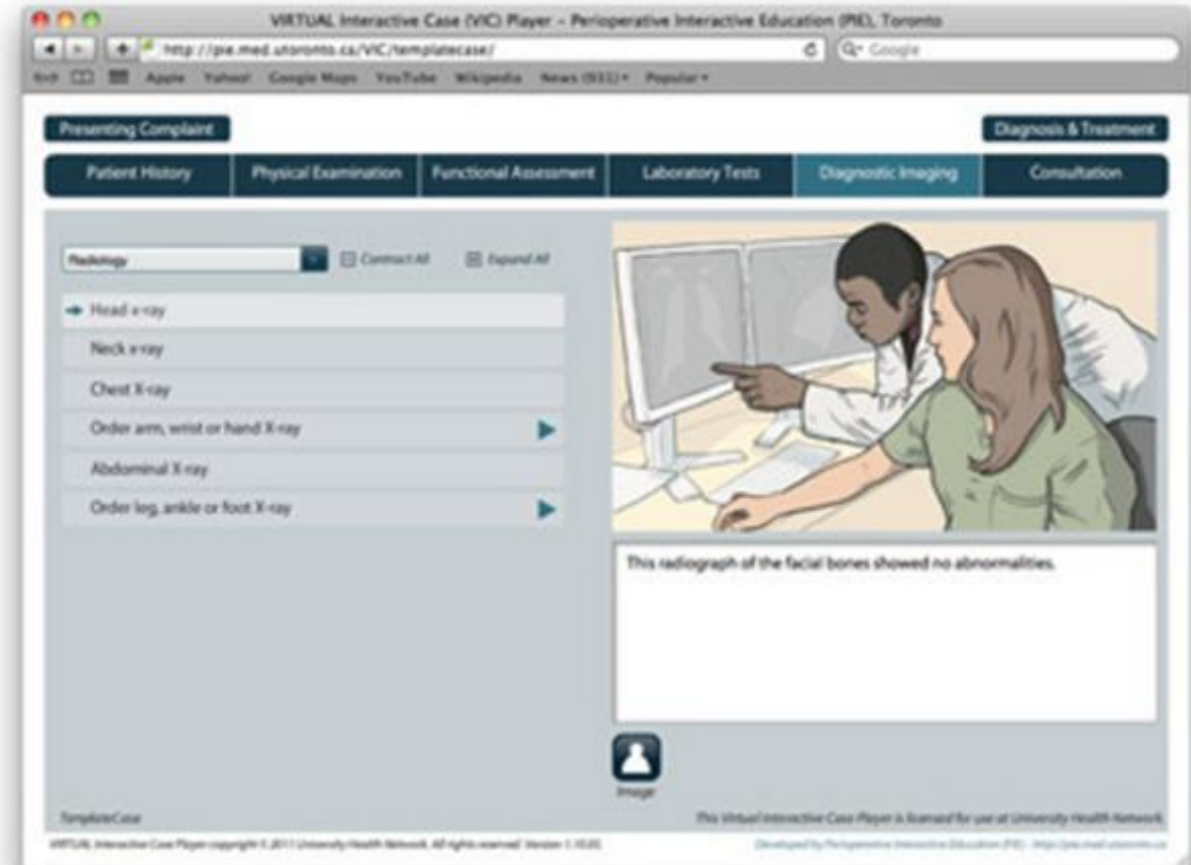
**BASE CASE**

Tele-Dizzy (n=287) vs. Matched Baseline (n=374) at JHH



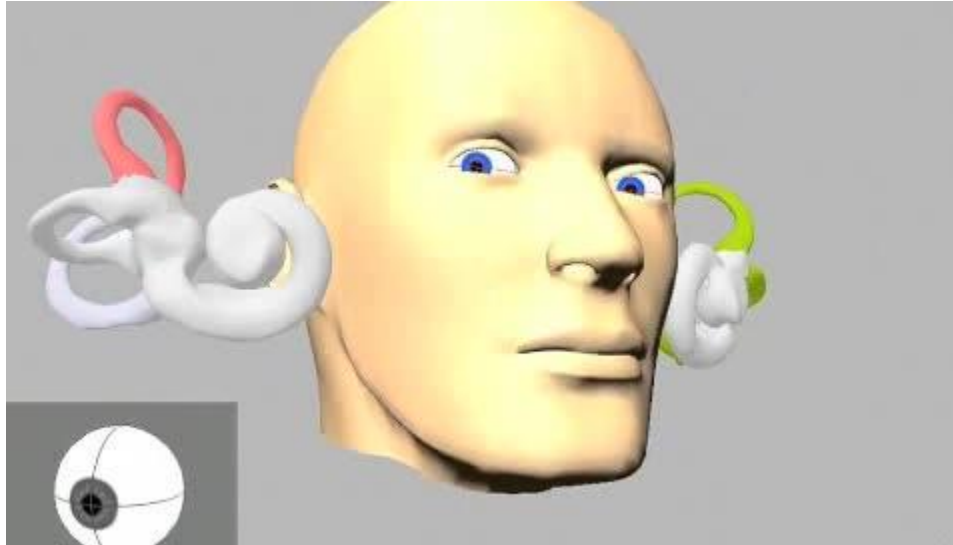
*p<0.0001 for each comparison  
except MRI utilization (p=0.95)*

## Four Ts – #2 Training



# Gamification of Training Using Simulation

**BASE CASE**



aVOR 'app' (MacDougall)



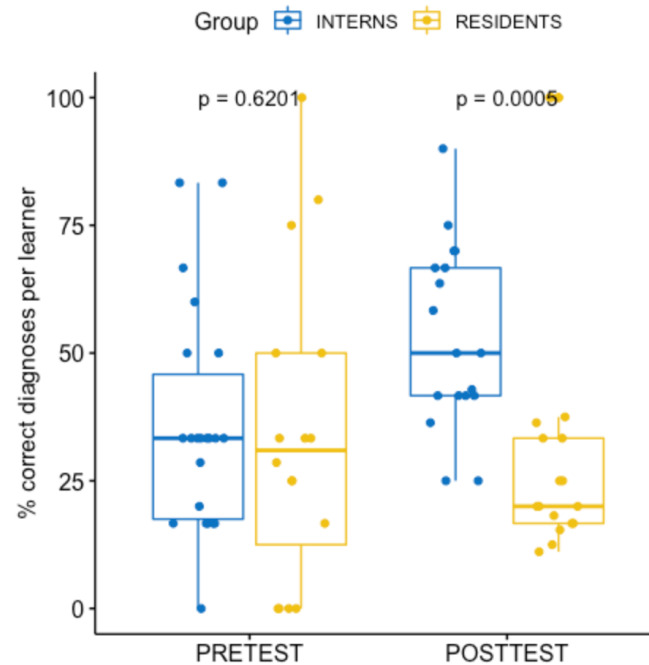
'Rosita' (Ceballos)

Building a simulation training library of real-world cases  
Cognitive (history-taking) + psychomotor (exam) skills  
**= SCALABLE DIAGNOSTIC EXPERTISE**

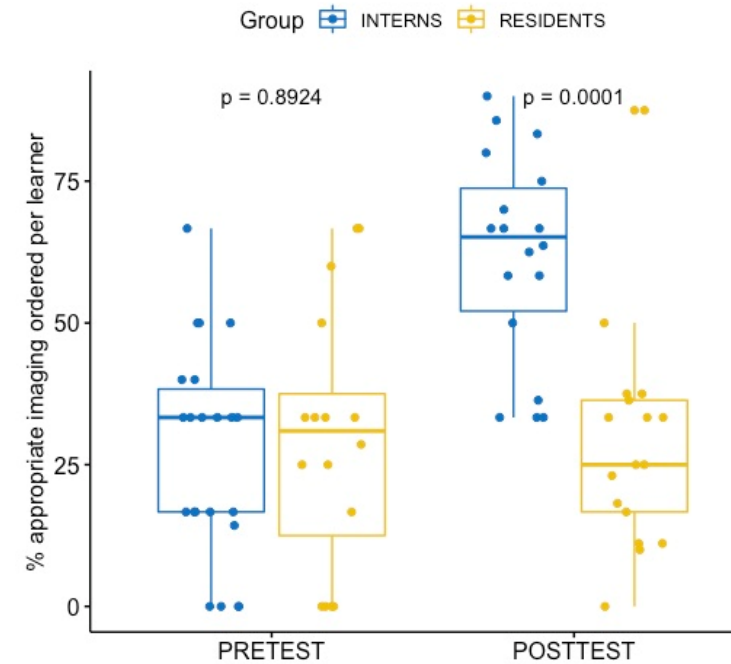
# Virtual Patient Training Outperforms Residency

**BASE CASE**

**Diagnostic Accuracy**



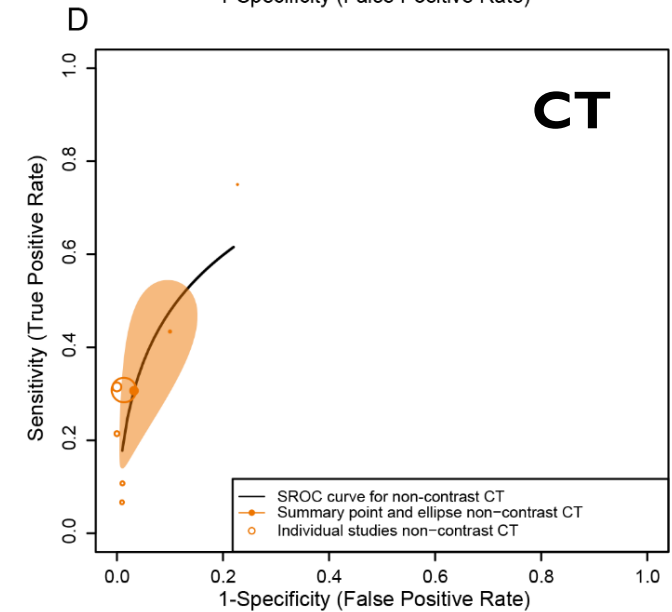
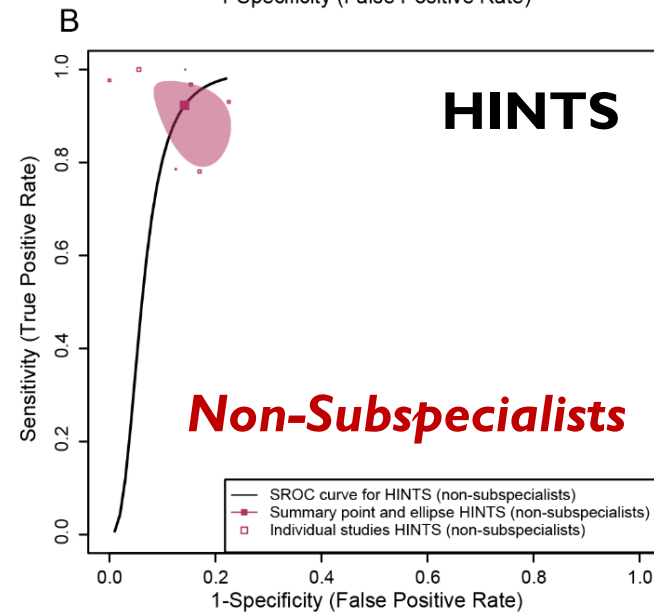
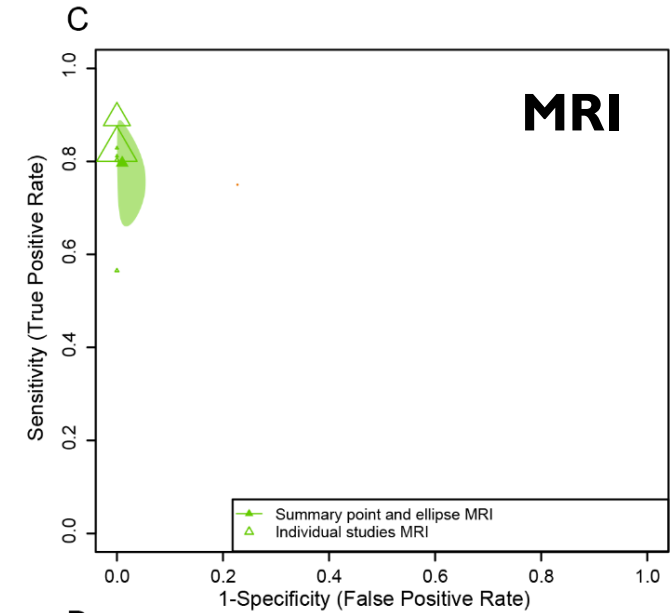
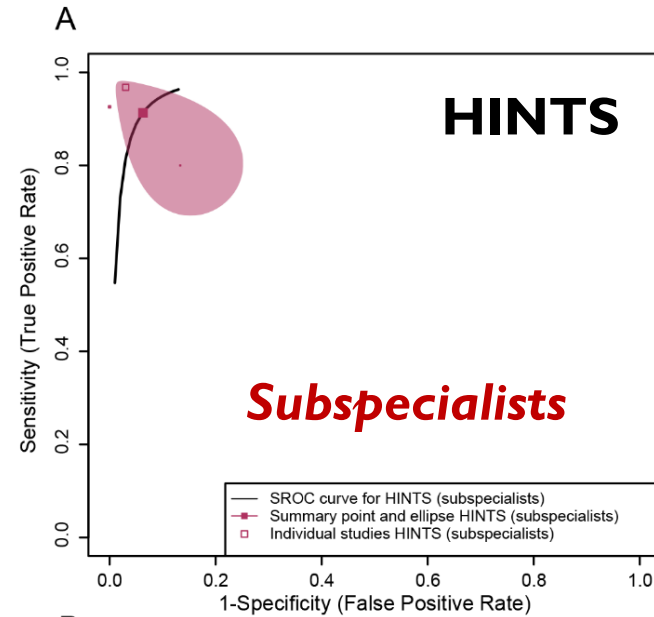
**Appropriate Imaging**



**9 Hours of Sim Training Better than 2 Years of Medicine Residency**

# ED Clinicians Can Be Trained to Use HINTS at Expert Level

**BASE CASE**





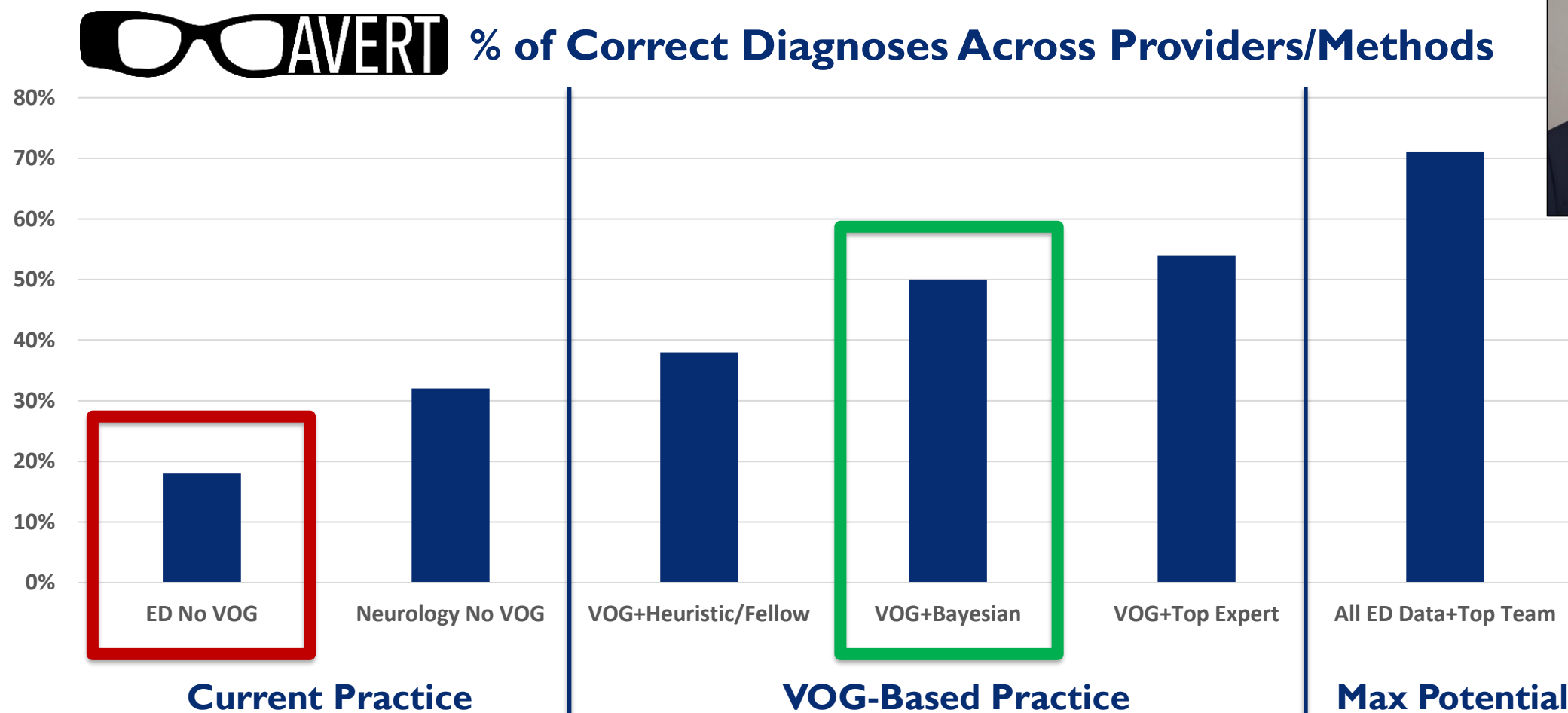


## Four Ts – #3 Technology



# Algorithms Already Outperform Current Practice

**BASE CASE**





# “eyePhone” Mobile App

**BASE CASE**



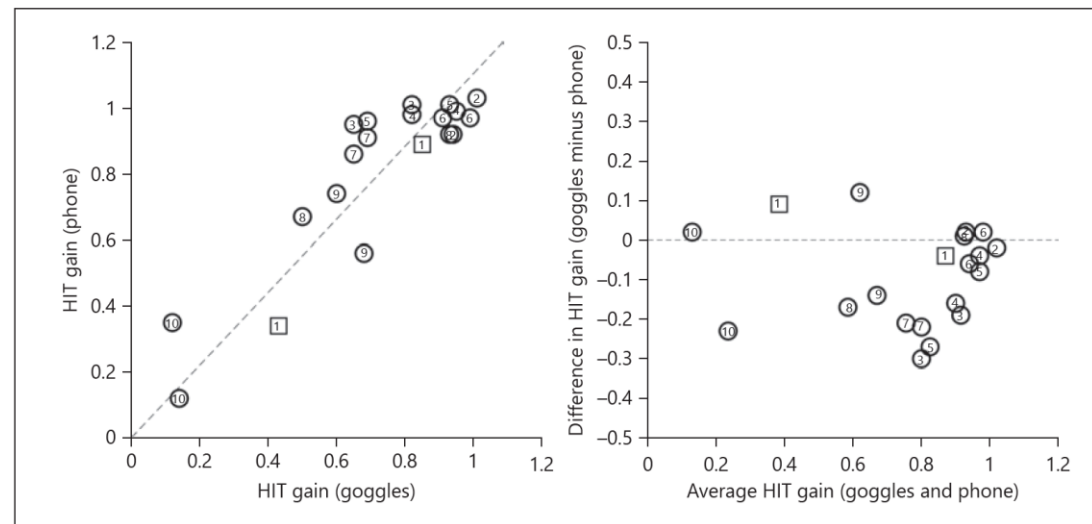
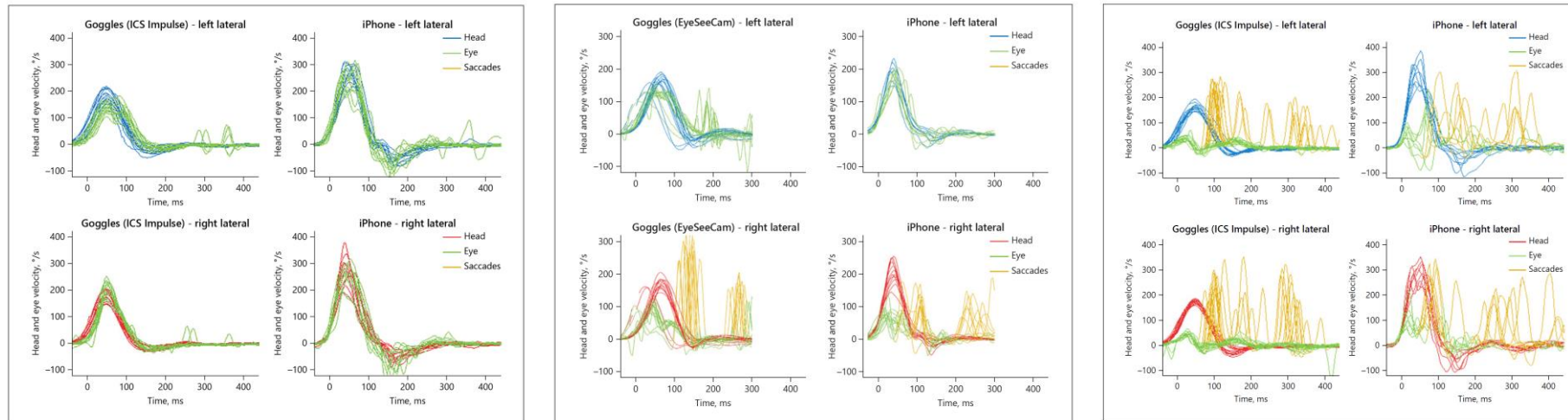
US Provisional Patent No.  
62/883,373

Parker et al., Digit Biomarkers 2021  
Parker et al., Digit Biomarkers 2022

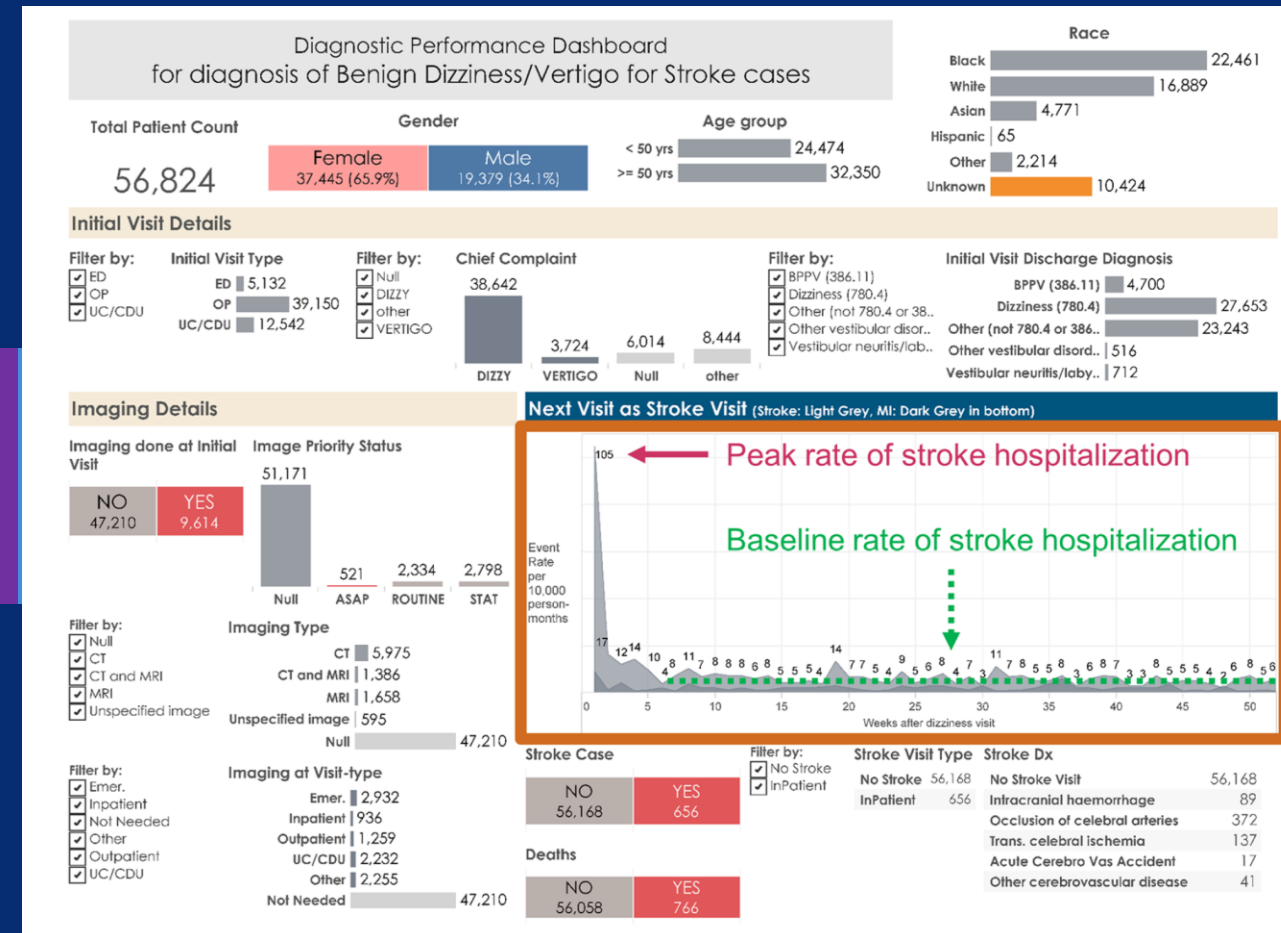


# “eyePhone” Measurement Comparable to VOG

**BASE CASE**



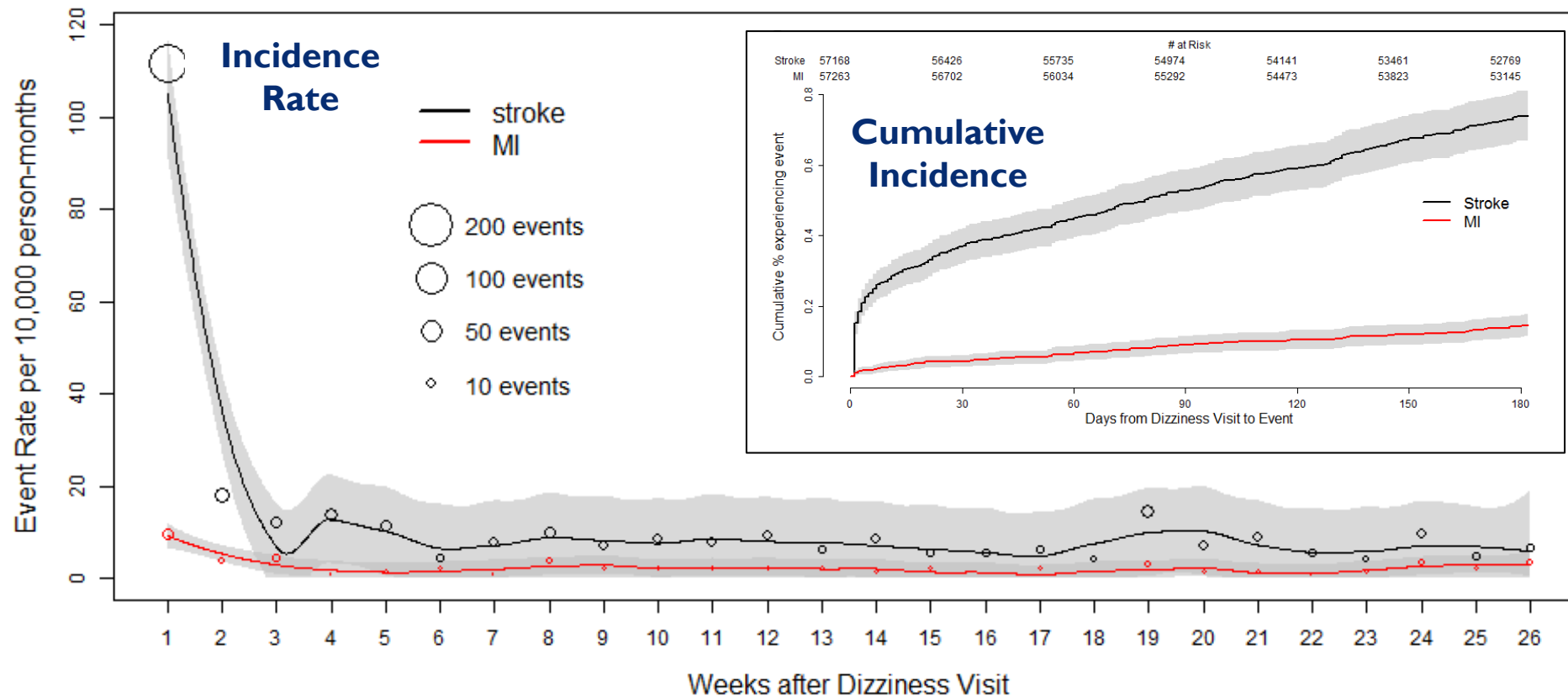
## Four Ts – #4 Tuning



# Creating “Needles” that We Can “Move” Toward Excellence



## Weekly Incidence of Stroke & Heart Attack after a “Benign” ED Dizziness Discharge



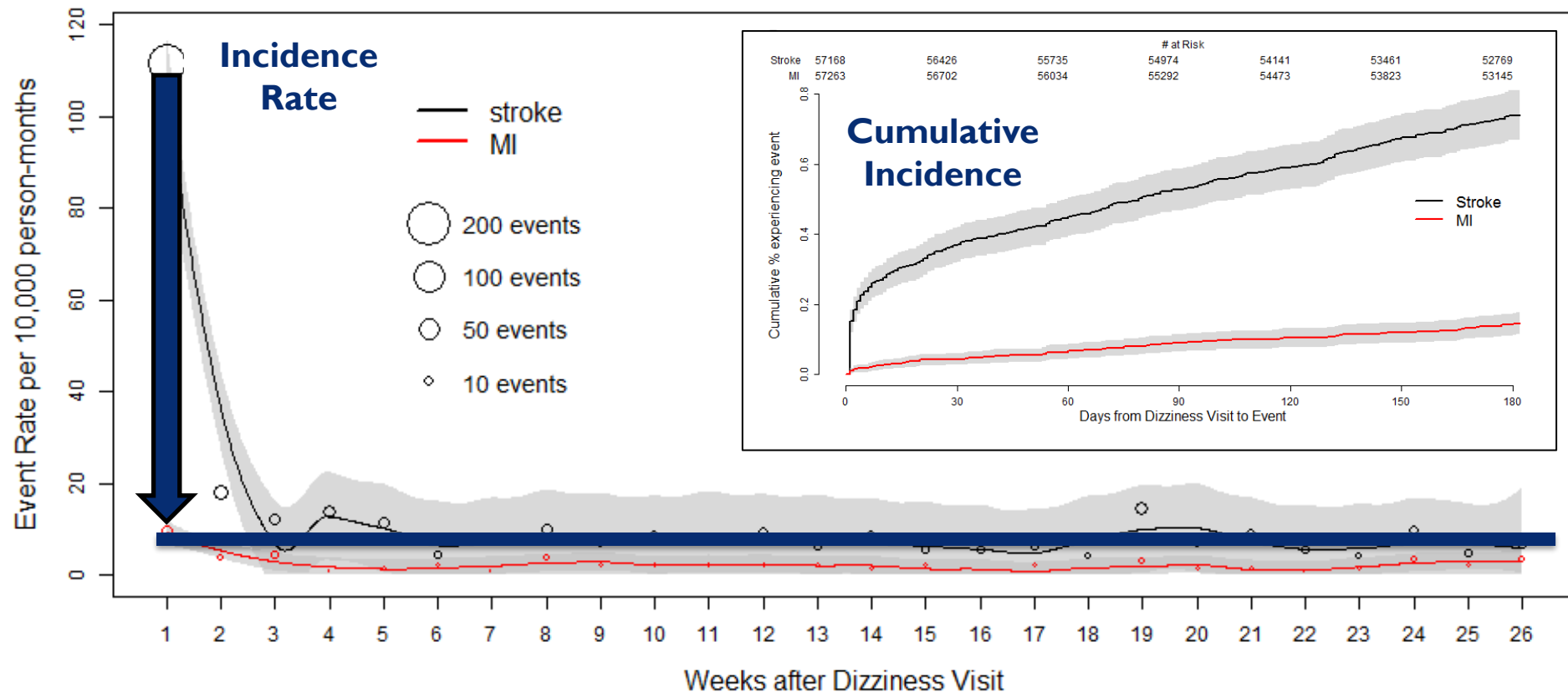
Nassery et al. (using KP – JHM Collaborative Grant, 2016; MAPRI Co-I Ketan Mane)



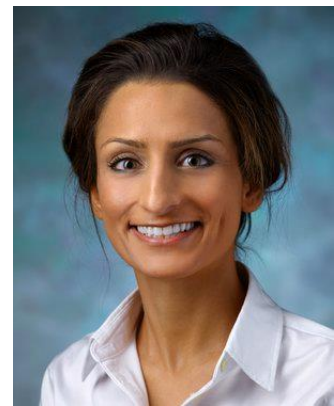
# Creating “Needles” that We Can “Move” Toward Excellence



## Weekly Incidence of Stroke & Heart Attack after a “Benign” ED Dizziness Discharge



Nassery et al. (using KP – JHM Collaborative Grant, 2016; MAPRI Co-I Ketan Mane)



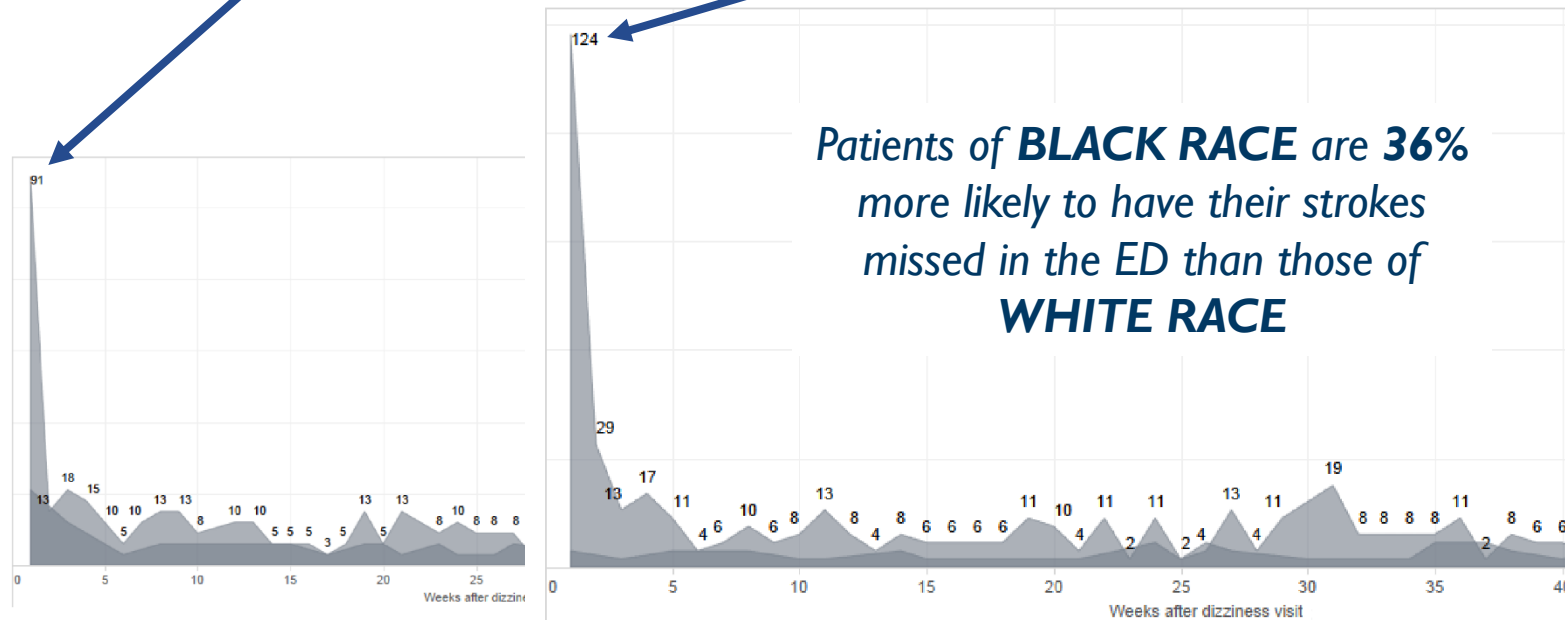
# Monitoring Progress towards Eliminating Disparities

**BASE CASE**

Peak rate of stroke hospitalization for patients of **WHITE** vs. **BLACK RACE**

**WHITE RACE = 91** per 10,000 person months with peak to baseline rate ratio = **12.7**

**BLACK RACE = 124** per 10,000 person months with peak to baseline rate ratio = **16.9**





The background of the left half of the slide features the Johns Hopkins University crest, which is a shield-shaped emblem with a blue background. It contains a green triangle at the top with a blue spire, and a blue dome with green outlines below it. A red horizontal bar is superimposed over the middle of the crest.

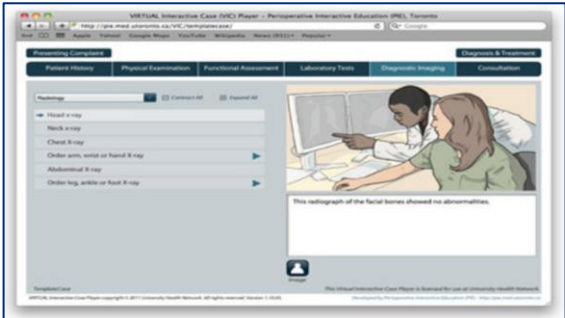
# Epilogue: The Base Case





# D.X. – Four Ts to Deliver Expertise at Scale

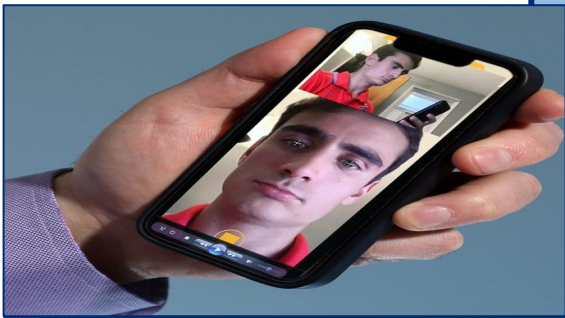
**BASE CASE**



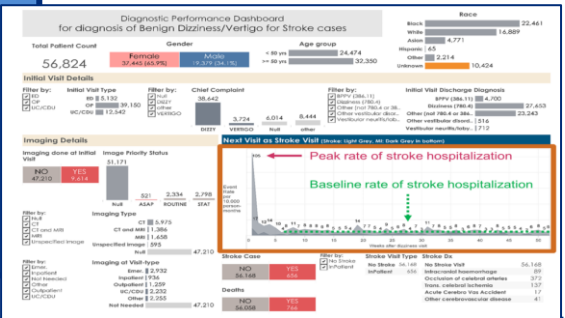
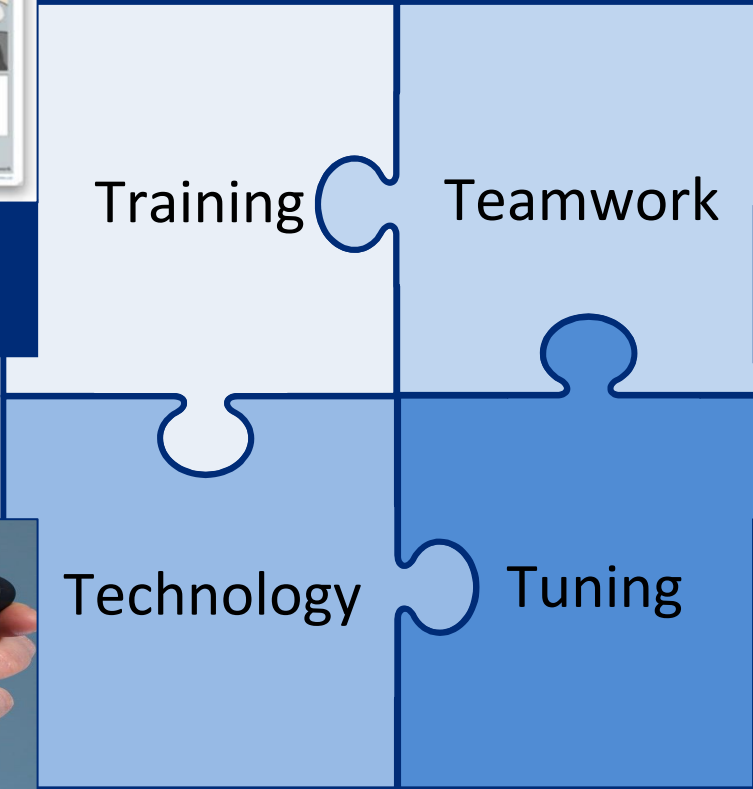
Build Expertise:  
*Screen-Based Simulation*



Engage Experts:  
*Tele-Dizzy*



Bottle Expertise:  
*“eyePhone” mobile app*



Monitor Success:  
*SPADE Dashboards*

# Care Transformation: CPG, Quality Metric, & Payment

**BASE CASE**

## Practice Guideline

First Ever Clinical Practice Guideline for Emergency Medicine

Guidelines for reasonable and appropriate care in the emergency department 3 (GRACE-3): Acute dizziness and vertigo in the emergency department

Jonathan A. Edlow FACER, MD<sup>1,2</sup> | Christopher Carpenter MD, MSc<sup>3,4</sup> |  
Martaza Akhter MD<sup>5,6</sup> | Danya Khoury MD<sup>7,8</sup> | Eric Marcolini MD<sup>9,10</sup> |  
William J. Meurer MD<sup>11</sup> | David Merrill<sup>12</sup> | James G. Naples MD<sup>13,14</sup> |  
Robert Olin MBBCh, MA, MSc<sup>15,16</sup> | Rodney Omeron MD, MPH<sup>17,18</sup> |  
Sameer Sharif MD, BMSc (Hon)<sup>19</sup> | Matt Sliet MD<sup>20,21</sup> |  
Sunel Upadhyay MD, MSc<sup>22,23</sup> | Lucas Oliveira J, e Silva MD, MSc<sup>24,25</sup> |  
Ella Sundberg<sup>26</sup> | Karen Tarr<sup>27,28</sup> | Stovene Yarned MD<sup>29,30</sup> |  
David E. Newman-Toker MD, PhD<sup>31</sup> | Fernanda Bellolio MD, MSc<sup>32,33</sup>

Edlow et al., Acad EM 2023

## Performance Measure

First US Nationally Endorsed "Avoid H.A.R.M." Quality Metric

Partnership for Quality Measurement  
Powered by Statista

About | EBM | CQMC | PRMR | MSR | Measures | Public Comments | Get Involved | Contact

Avoid Hospitalization After Release with a Misdiagnosis—ED Stroke/Dizziness (Avoid H.A.R.M.—ED Stroke/Dizziness)

CBE ID: 3746 | Endorsed: 2023-12 | Endorsement Status: Endorsed | 1.1 New or Maintenance: New

Cycle / Most Recent Endorsement Activity: Spring 2023 | Is Under Review: No | Next Planned Maintenance Review: Spring

Austin & Newman-Toker, 2023

## Payment Policy

HSCRC – Advancing Innovation in Maryland Program

Advancing Innovation in Maryland

Advancing innovation in Maryland (AIM) is a program that seeks to advance innovation in the delivery of health services and improve patient outcomes. The program is designed to support the development and implementation of innovative health services and improve patient outcomes. The program is designed to support the development and implementation of innovative health services and improve patient outcomes.

HSCRC Website

42



# Key Takeaways

# Key Takeaways – CCC, Big Three, 4Ts



- ▶ An estimated 900,000 Americans suffer death or permanent disability each year from diagnostic errors at a societal cost of >\$200 billion.
- ▶ The Big Three (vascular events, infections, and cancers) account for 75% of the serious harms from diagnostic error. Vascular events are #1 in the ED. Missed stroke causes the most harm. Atypical, non-specific, or otherwise atypical presentations represent the biggest risk factor.
- ▶ Strategies to achieve diagnostic excellence and minimize misdiagnosis-related harms are Teamwork, Training, Technology, and Tuning. The 4Ts should be applied as wraparound solutions for each symptom-disease pair, emphasizing converting “off pathway” patients to “on pathway.”

