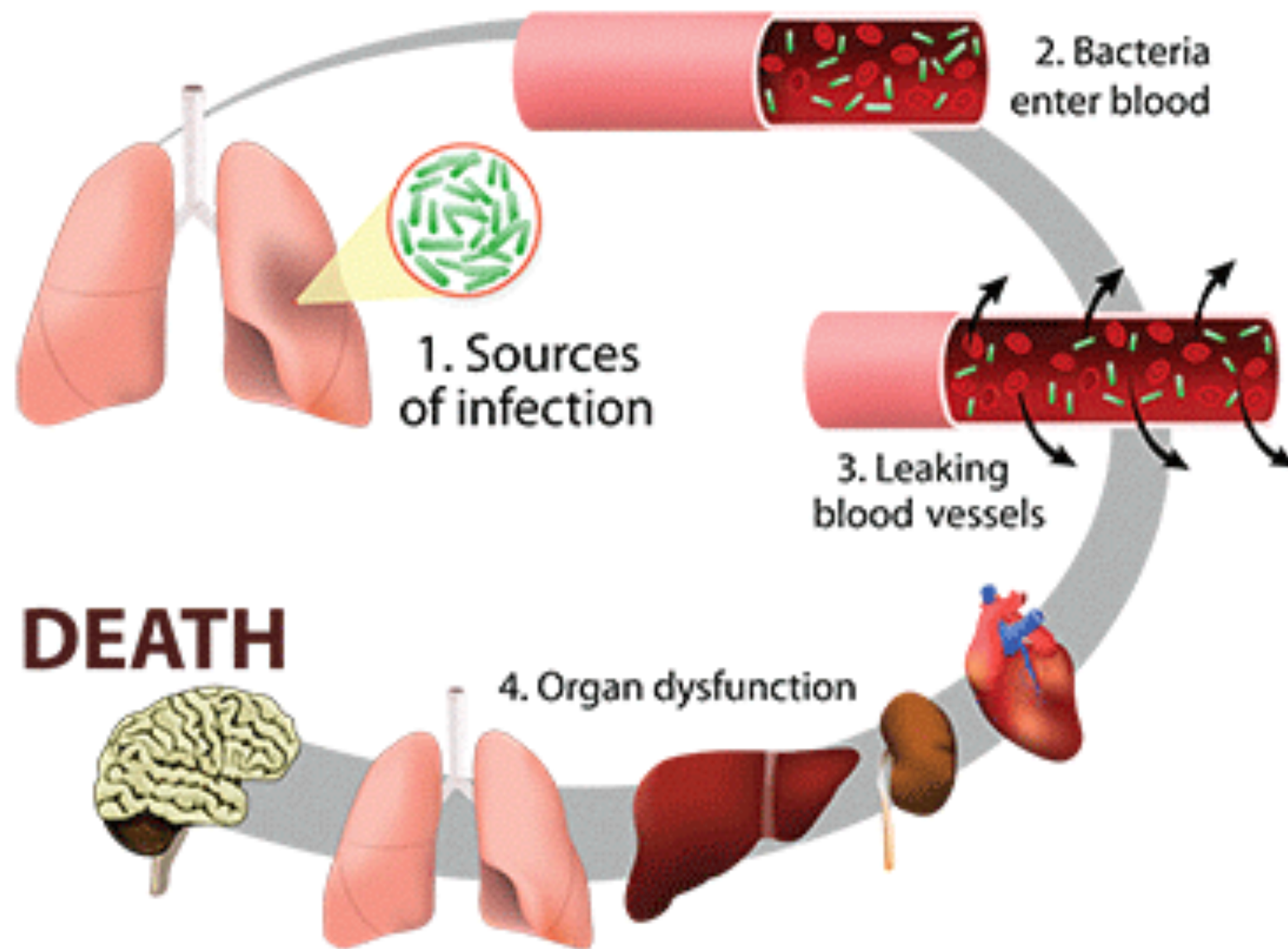


SIRS DRG 871 death
#1 cause of ICU deaths
time sensitivity
virus severe
bacteria
blood chemicals
DRG 870 death
infection organ failure

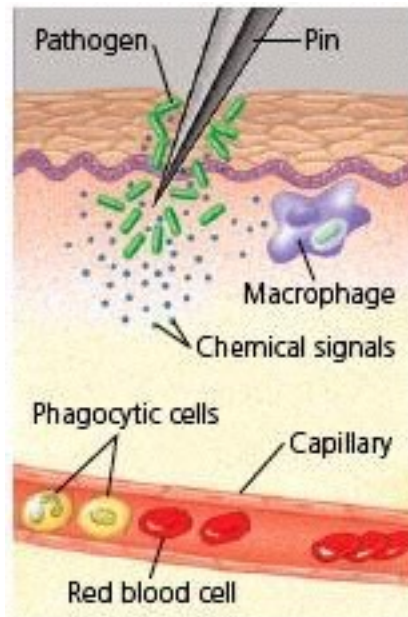
SEPSIS

toxic response
fungi shock
inflammation
top billed DRG
reimbursement
mortality
50% unnecessary
severe
parasite
No dedicated drug tx
increased LOS
death
difficult
diagnosis

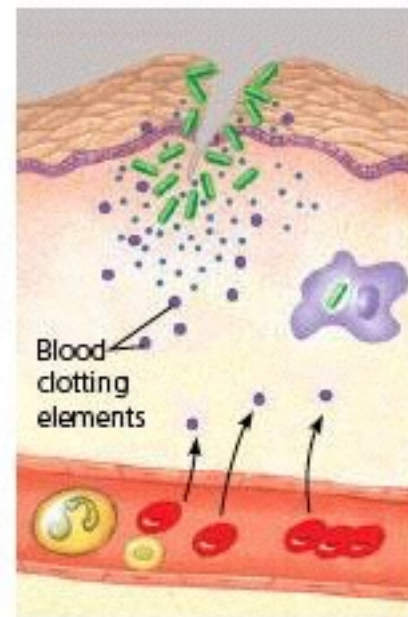
Sepsis, an infection gone wrong



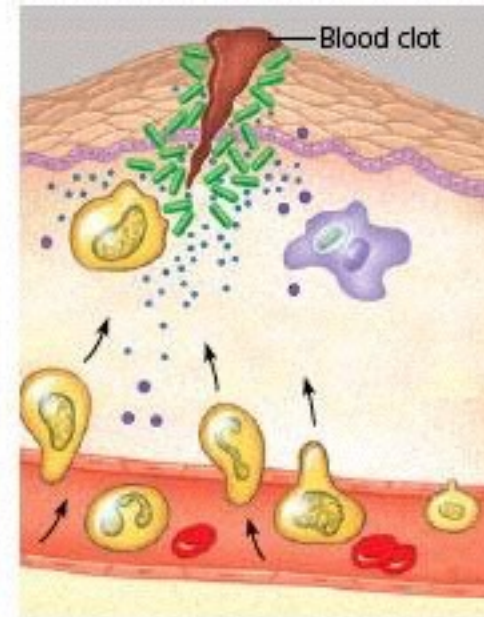
Inflammatory response



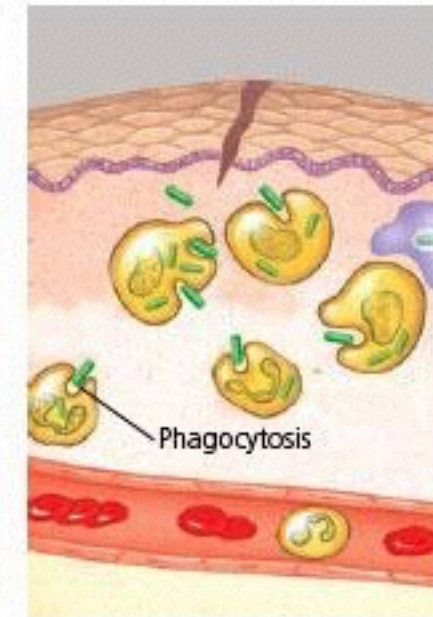
1 Chemical signals released by activated macrophages and mast cells at the injury site cause nearby capillaries to widen and become more permeable.



2 Fluid, antimicrobial proteins, and clotting elements move from the blood to the site. Clotting begins.

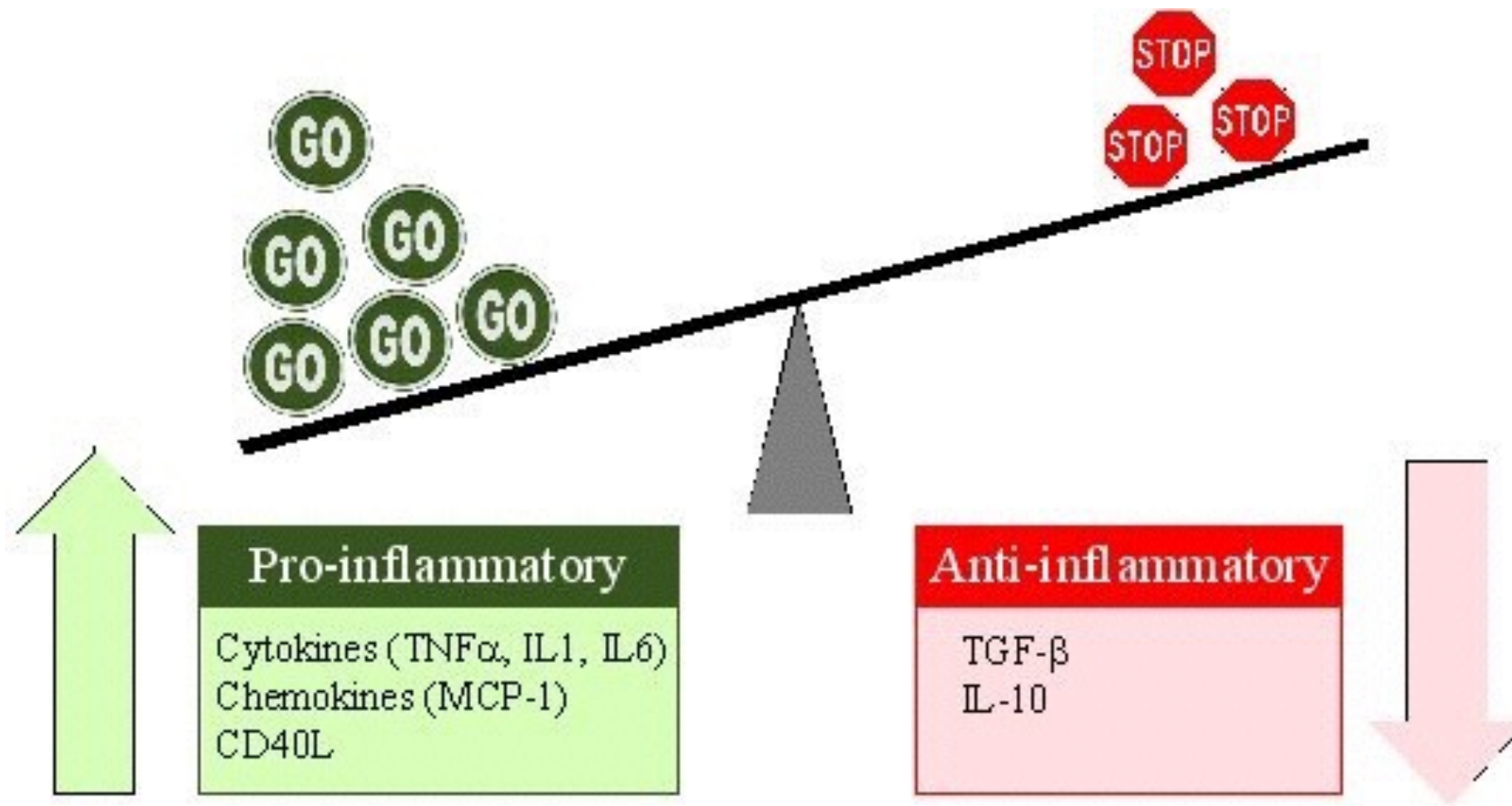


3 Chemokines released by various kinds of cells attract more phagocytic cells from the blood to the injury site.



4 Neutrophils and macrophages phagocytose pathogens and cell debris at the site, and the tissue heals.

Resolution of the inflammatory response



In sepsis this regulation is disrupted

Why is sepsis important?

Septicemia is the
11th leading
cause of death
in the US

Over **750,000**
cases of severe sepsis or
septic shock
annually and rising

Accounts for
20-30% of all
hospital deaths

Patients with sepsis have
increased
hospital stays
and long-term
morbidity

Why is sepsis important?

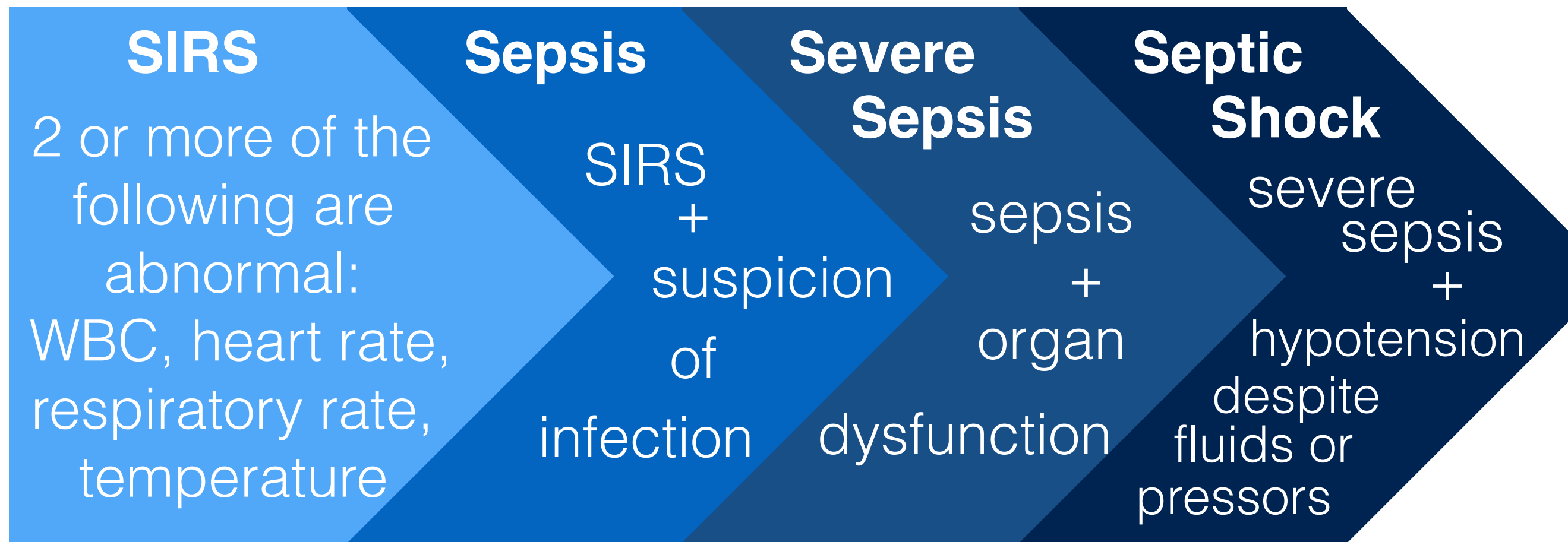


\$24.3 billion
dollars spent nationally

**Top 5 most
expensive
conditions**

**Increased
spending hasn't
improved
outcomes**

Sepsis-2 Consensus Definition



Defining sepsis clinically: Sepsis-2 vs Sepsis-3



Systemic Inflammatory Response Syndrome (SIRS)

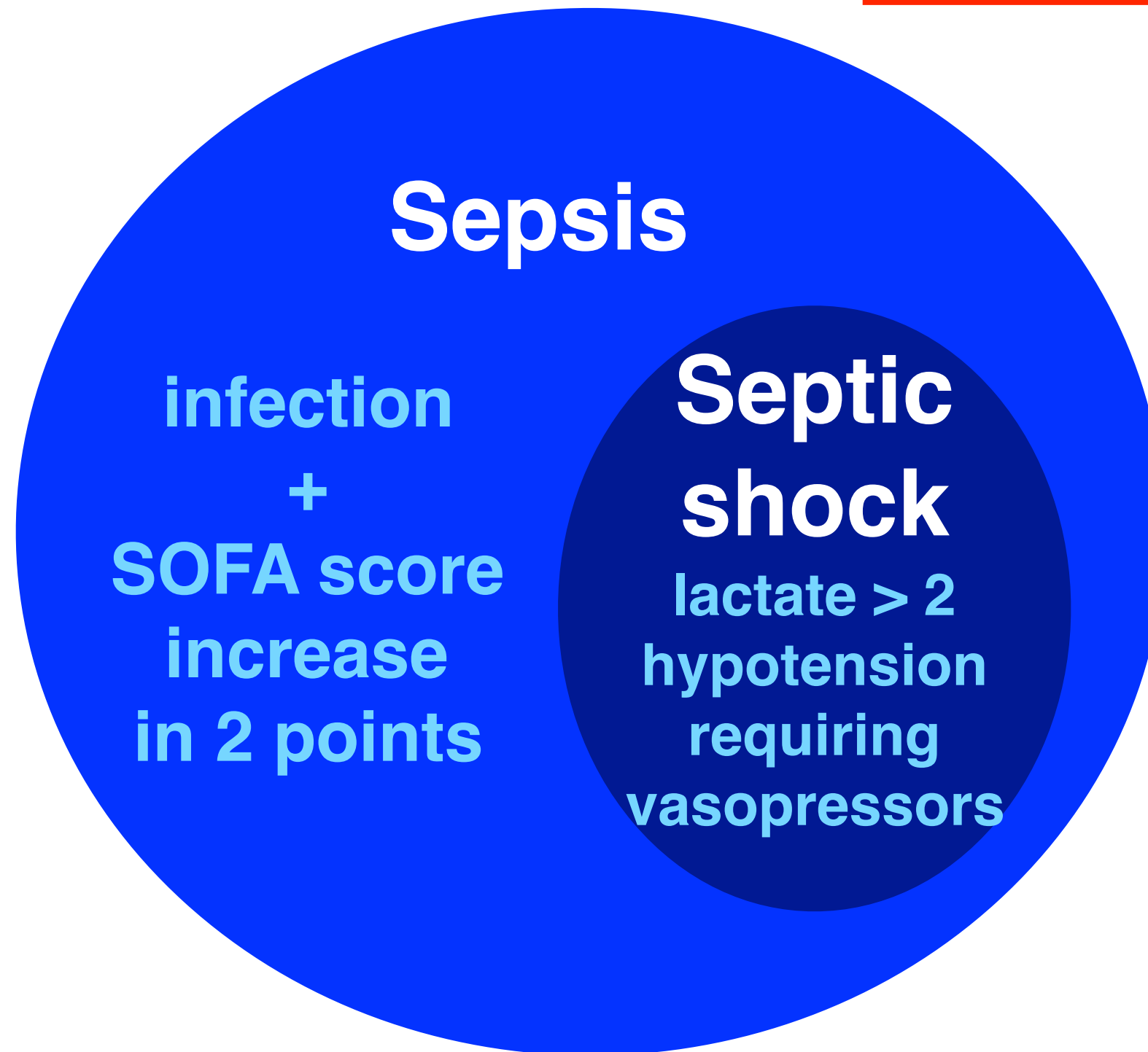
Patient meets any two of the following criteria:

- Heart rate > 90 beats per minutes
- Temperature > 100.4°F or < 96.8°F
- Respiratory rate > 20 breaths per minute
- WBC > 12k cells/mm³ or < 4k cells/mm³

An estimated 70-90% of all patients meet the SIRS criteria at some point during their hospital stay

Sepsis-3 Consensus Definition

**New Definitions
as of Feb 2016**



Sequential Organ Failure Assessment (SOFA) Scores

Table 1. Sequential [Sepsis-Related] Organ Failure Assessment Score^a

System	Score				
	0	1	2	3	4
Respiration					
Pao ₂ /Fio ₂ , mm Hg (kPa)	≥400 (53.3)	<400 (53.3)	<300 (40)	<200 (26.7) with respiratory support	<100 (13.3) with respiratory support
Coagulation					
Platelets, ×10 ³ /μL	≥150	<150	<100	<50	<20
Liver					
Bilirubin, mg/dL (μmol/L)	<1.2 (20)	1.2-1.9 (20-32)	2.0-5.9 (33-101)	6.0-11.9 (102-204)	>12.0 (204)
Cardiovascular	MAP ≥70 mm Hg	MAP <70 mm Hg	Dopamine <5 or dobutamine (any dose) ^b	Dopamine 5.1-15 or epinephrine ≤0.1 or norepinephrine ≤0.1 ^b	Dopamine >15 or epinephrine >0.1 or norepinephrine >0.1 ^b
Central nervous system					
Glasgow Coma Scale score ^c	15	13-14	10-12	6-9	<6
Renal					
Creatinine, mg/dL (μmol/L)	<1.2 (110)	1.2-1.9 (110-170)	2.0-3.4 (171-299)	3.5-4.9 (300-440)	>5.0 (440)
Urine output, mL/d				<500	<200

Abbreviations: Fio₂, fraction of inspired oxygen; MAP, mean arterial pressure; Pao₂, partial pressure of oxygen.

^a Adapted from Vincent et al.²⁷

^b Catecholamine doses are given as μg/kg/min for at least 1 hour.

^c Glasgow Coma Scale scores range from 3-15; higher score indicates better neurological function.

Sepsis-3 Consensus Definition

**New Definitions
as of Feb 2016**

qSOFA

respiratory rate ≥ 22 bpm

altered mental status

systolic BP ≤ 100 mmHg

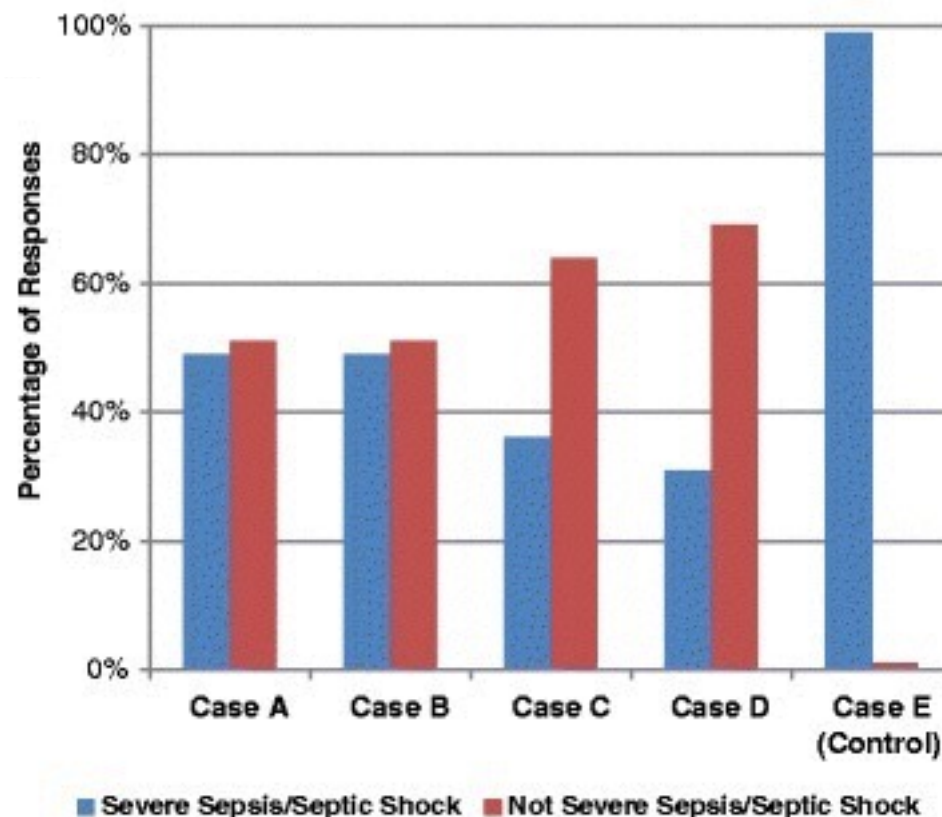
**Any two and
suspicion of
infection**

AUROC for predicting mortality among non-ICU patients of 0.81 (95% CI 0.80-0.82)

**Extensive debate continues about the
benefits of using the new definitions**

Diagnosis is challenging

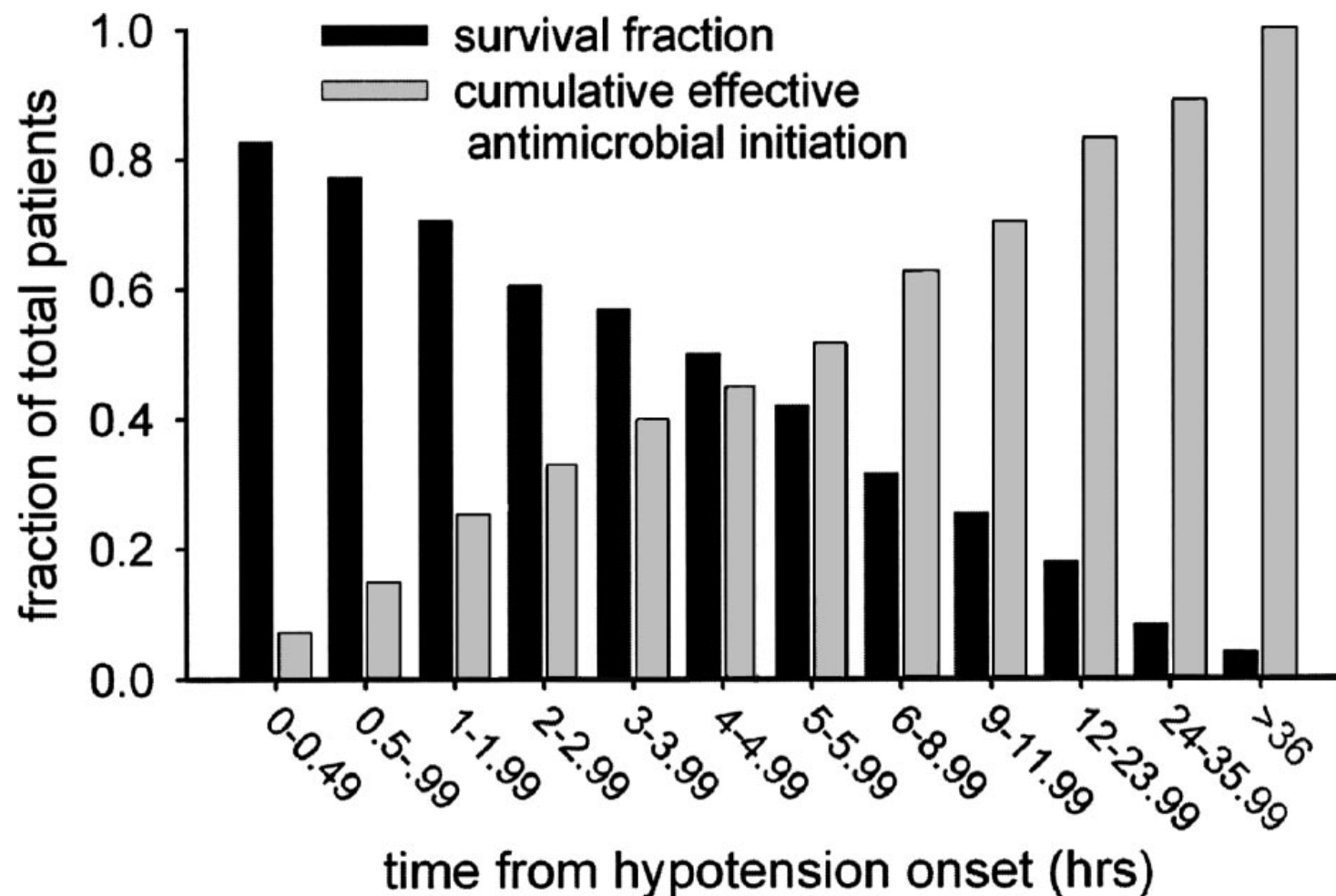
94 intensivists were asked to classify cases of suspected or confirmed infection and organ dysfunction based on the sepsis guidelines. Despite advanced knowledge of the guidelines, interrater agreement was poor.



Early detection decreases mortality and morbidity

7% increase in mortality for every hour that treatment is delayed after the onset of hypotension (systolic BP < 90 bpm)

[Kumar et al. 2006]



Emphasis on early identification of sepsis

Know the signs and symptoms of sepsis.



Shivering, fever,
or very cold



Extreme pain
or discomfort



Clammy
or sweaty skin



Confusion
or disorientation



Short of breath



High heart rate

If suspected, get medical care immediately.

SOURCE: CDC Vital Signs, August 2016

#VitalSigns

Vitalsigns™
CDC

<http://www.cdc.gov/vitalsigns/sepsis>



KNOW YOUR SEPSIS SIX.

1. GIVE HIGH-FLOW OXYGEN

2. TAKE BLOOD CULTURES

3. GIVE IV ANTIBIOTICS

4. GIVE A FLUID CHALLENGE

5. MEASURE LACTATE

6. MEASURE URINE OUTPUT

BY DOING THESE SIX SIMPLE THINGS IN THE FIRST HOUR,
YOU CAN DOUBLE YOUR PATIENT'S CHANCE OF SURVIVAL.

WWW.SEPSISTRUST.ORG TEL: 0845 606 8225 INFO@SEPSISTRUST.ORG



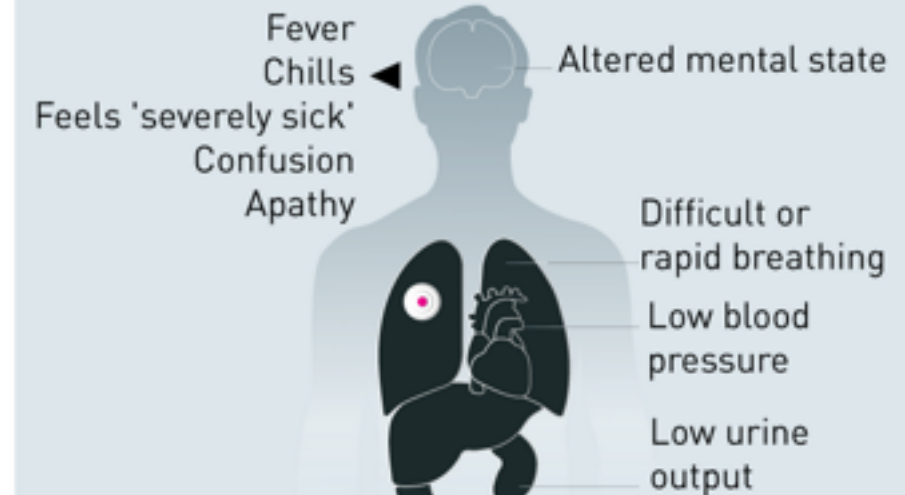
THE UK
SEPSIS
TRUST

Spot Sepsis:

Early treatment saves lives.



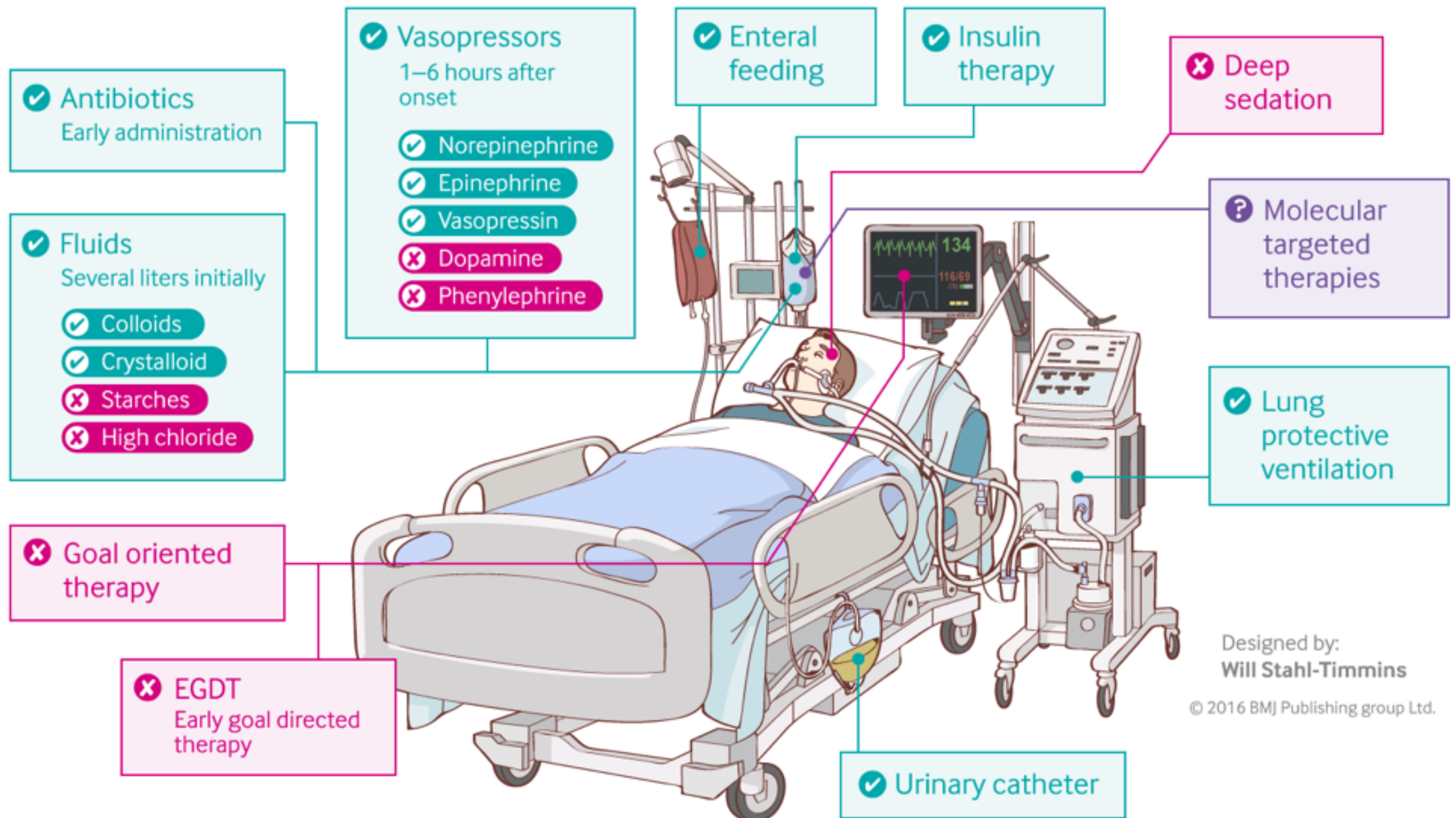
The following symptoms might indicate sepsis:



Two or more symptoms?
Contact your local hospital or physician.

© world-sepsis-day.org | made by Lindgruen GmbH

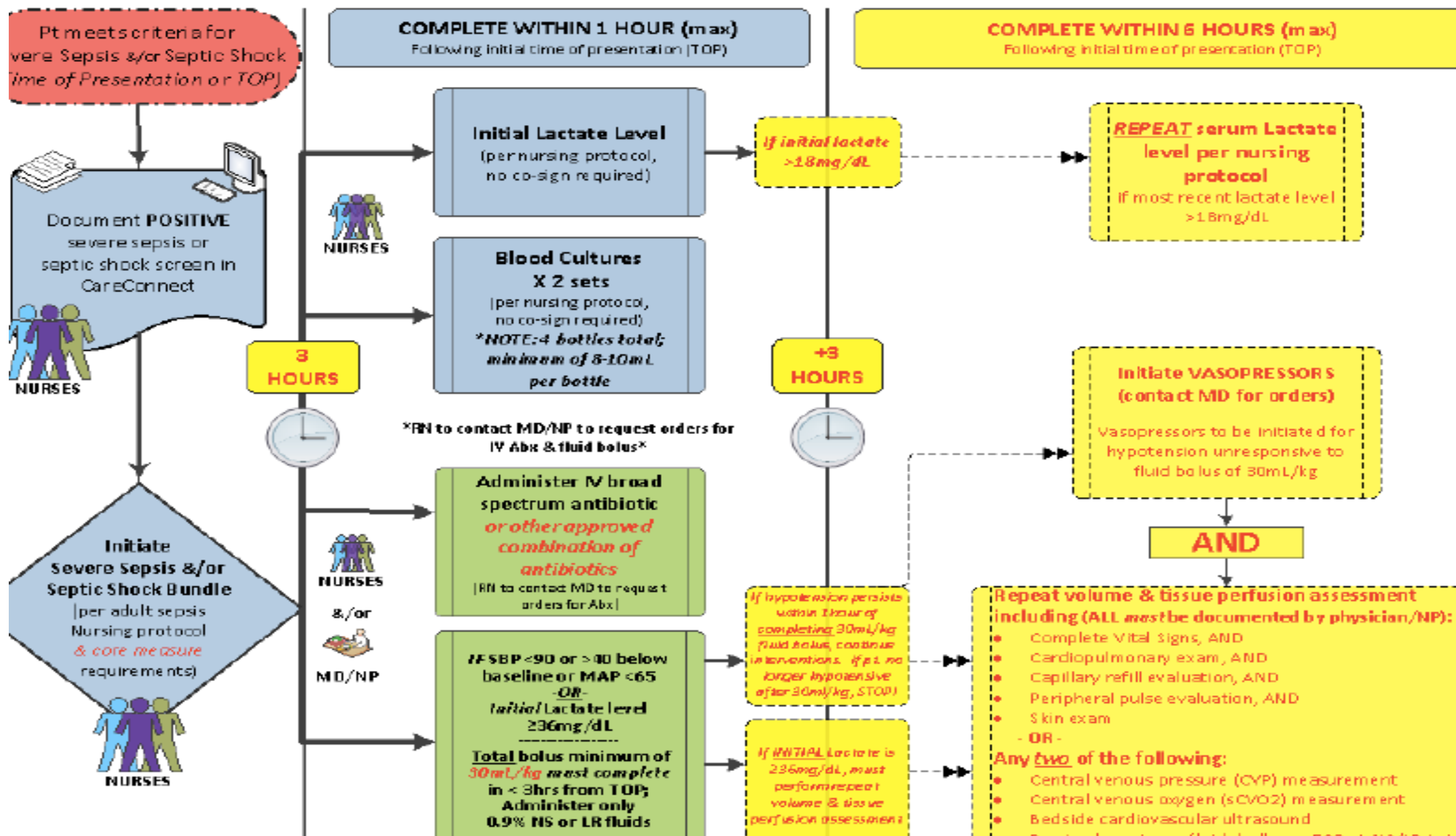
Treating sepsis: the latest evidence



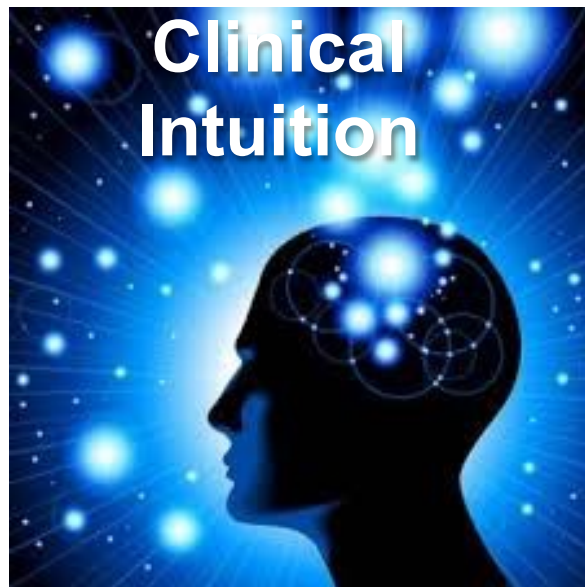
Designed by:
Will Stahl-Timmins

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Sepsis bundles



Approaches to sepsis identification



**Alerts based on the
Surviving Sepsis
Campaign Guidelines**



Screening checklists

Chart record – use patient label. Do not remove from chart

Evaluation for Severe Sepsis Screening Tool

Instructions: Use this optional tool to screen patients for severe sepsis in the emergency department, on the medical/surgical floors, or in the ICU.

1. Is the patient's history suggestive of a new infection?

- | | | |
|---|--|---|
| <input type="checkbox"/> Pneumonia, empyema | <input type="checkbox"/> Bone/joint infection | <input type="checkbox"/> Implantable device infection |
| <input type="checkbox"/> Urinary tract infection | <input type="checkbox"/> Wound infection | <input type="checkbox"/> Other infection _____ |
| <input type="checkbox"/> Acute abdominal infection | <input type="checkbox"/> Blood stream catheter infection | |
| <input type="checkbox"/> Meningitis | <input type="checkbox"/> Endocarditis | |
| <input type="checkbox"/> Skin/soft tissue infection | | |

___ Yes ___ No

2. Are any two of following signs & symptoms of infection both present and new to the patient? Note: laboratory values may have been obtained for inpatients but may not be available for outpatients.

- | | | |
|--|--|---|
| <input type="checkbox"/> Hyperthermia > 38.3 °C (101.0 °F) | <input type="checkbox"/> Tachypnea > 20 bpm | <input type="checkbox"/> Hyperglycemia (plasma glucose >140 mg/dL) or 7.7 mmol/L in the absence of diabetes |
| <input type="checkbox"/> Hypothermia < 36 °C (96.8°F) | <input type="checkbox"/> Leukocytosis (WBC count >12,000 μ L ⁻¹) | |
| <input type="checkbox"/> Altered mental status | <input type="checkbox"/> Leukopenia (WBC count < 4000 μ L ⁻¹) | |
| <input type="checkbox"/> Tachycardia > 90 bpm | | |

___ Yes ___ No

If the answer is yes, to both questions 1 and 2, *suspicion of infection* is present:

- ✓ Obtain: lactic acid, blood cultures, CBC with differential, basic chemistry labs, bilirubin.
- ✓ At the physician's discretion obtain: UA, chest x-ray, amylase, lipase, ABG, CRP, CT scan.

3. Are any of the following organ dysfunction criteria present at a site remote from the site of the infection that are NOT considered to be chronic conditions? Note: in the case of bilateral pulmonary infiltrates the remote site stipulation is waived.

- ☐ SBP < 90 mmHg or MAP <65 mmHg
- ☐ SBP decrease > 40 mm Hg from baseline
- ☐ Creatinine > 2.0 mg/dl (176.8 mmol/L) or urine output < 0.5 ml/kg/hour for 2 hours
- ☐ Bilirubin > 2 mg/dl (34.2 mmol/L)
- ☐ Platelet count < 100,000 μ L
- ☐ Lactate > 2 mmol/L (18.0 mg/dl)
- ☐ Coagulopathy (INR >1.5 or aPTT >60 secs)
- ☐ Acute lung injury with PaO₂/FiO₂ <250 in the absence of pneumonia as infection source
- ☐ Acute lung injury with PaO₂/FiO₂ <200 in the presence of pneumonia as infection source

___ Yes ___ No

If *suspicion of infection* is present AND *organ dysfunction* is present, the patient meets the criteria for SEVERE SEPSIS and should be entered into the severe sepsis protocol.

Date: ____/____/____ (circle: dd/mm/yy or mm/dd/yy)

Time: ____: ____ (24 hr. clock)

Sepsis Best Practice Alerts (BPAs) embedding into the EHR

Alert if patient

- meets at least two of the SIRS criteria,
 - Heart rate > 90 beats per minutes
 - Temperature $> 100.4^{\circ}\text{F}$ or $< 96.8^{\circ}\text{F}$
 - Respiratory rate > 20 breaths per minute
 - WBC $> 12\text{k cells/mm}^3$ or $< 4\text{k cells/mm}^3$

AND,

- hypotensive (systolic BP < 90 mmHg) or
- hypoperfusive (lactate ≥ 4.0)



Nonspecific alarms pose a huge burden

187 audible alerts per bed per day in a typical ICU

An estimated **72-99%** of these **are false alerts**

Burden of alerts results in **delayed reactions** or even ignoring potentially critical alerts

Clinical alerts are consistently ranked as **a top patient safety concern** by the ECRI Institute

General purpose severity scores

Acute physiology and chronic health evaluation II (APACHE II)

Simplified Acute Physiology Score II (SAPS II)

Sequential organ failure assessment (SOFA) scores

Modified early warning score (MEWS)

Sepsis severity score

predict mortality, not septic shock

High fidelity physiologic monitoring



**Moorman et al.
created HeRO
Monitor to predict
neonatal sepsis from
continuous
waveform data**



Interest in finding new biomarkers, but so far limited success



Procalcitonin

**C-reactive
protein**

Lactate

Individually they lack specificity

Other statistical approaches

Gultepe et al. 2014 learned Bayesian network to predict lactate and mortality in patients with sepsis

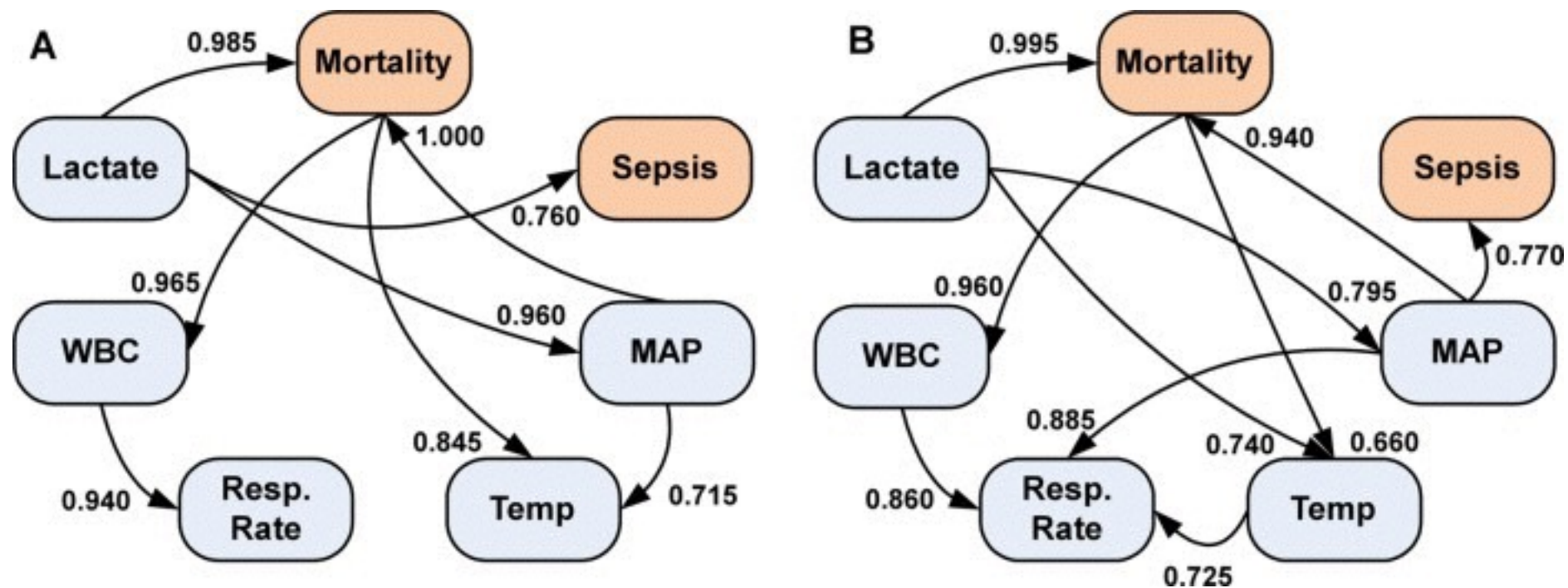


Fig. Bayesian networks from the five clinical measurements and two outcomes. (A) The Bayesian network structure determined from the mean of the five clinical measurements. (B) The Bayesian network structure from the median of five clinical measurements.

**Need a high sensitivity high specificity tool
that can easily be implemented using routinely collected
data**

Electronic Health Records (EHRs)

Medical history

Vital signs



Laboratory tests



Procedures



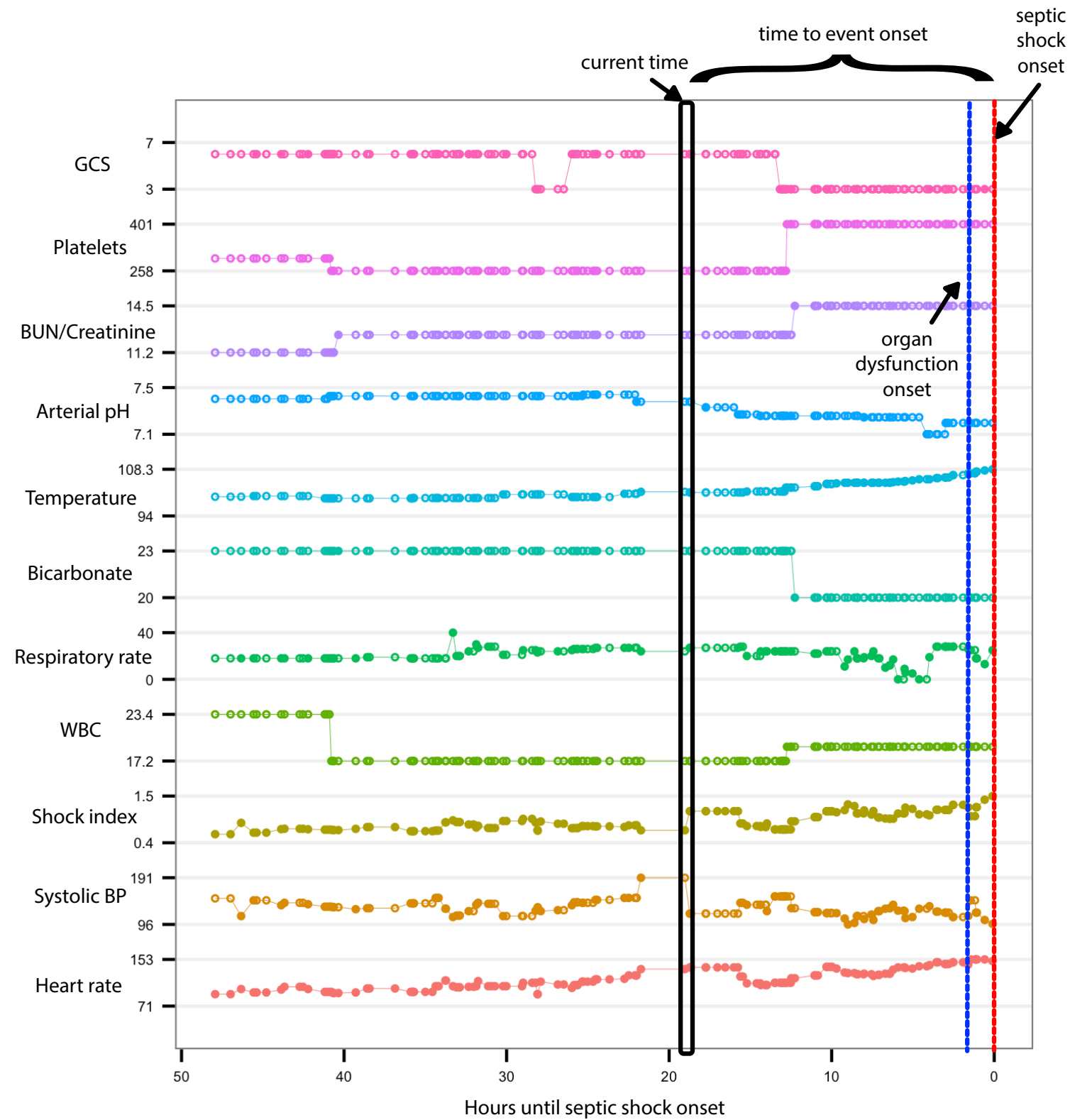
Medications



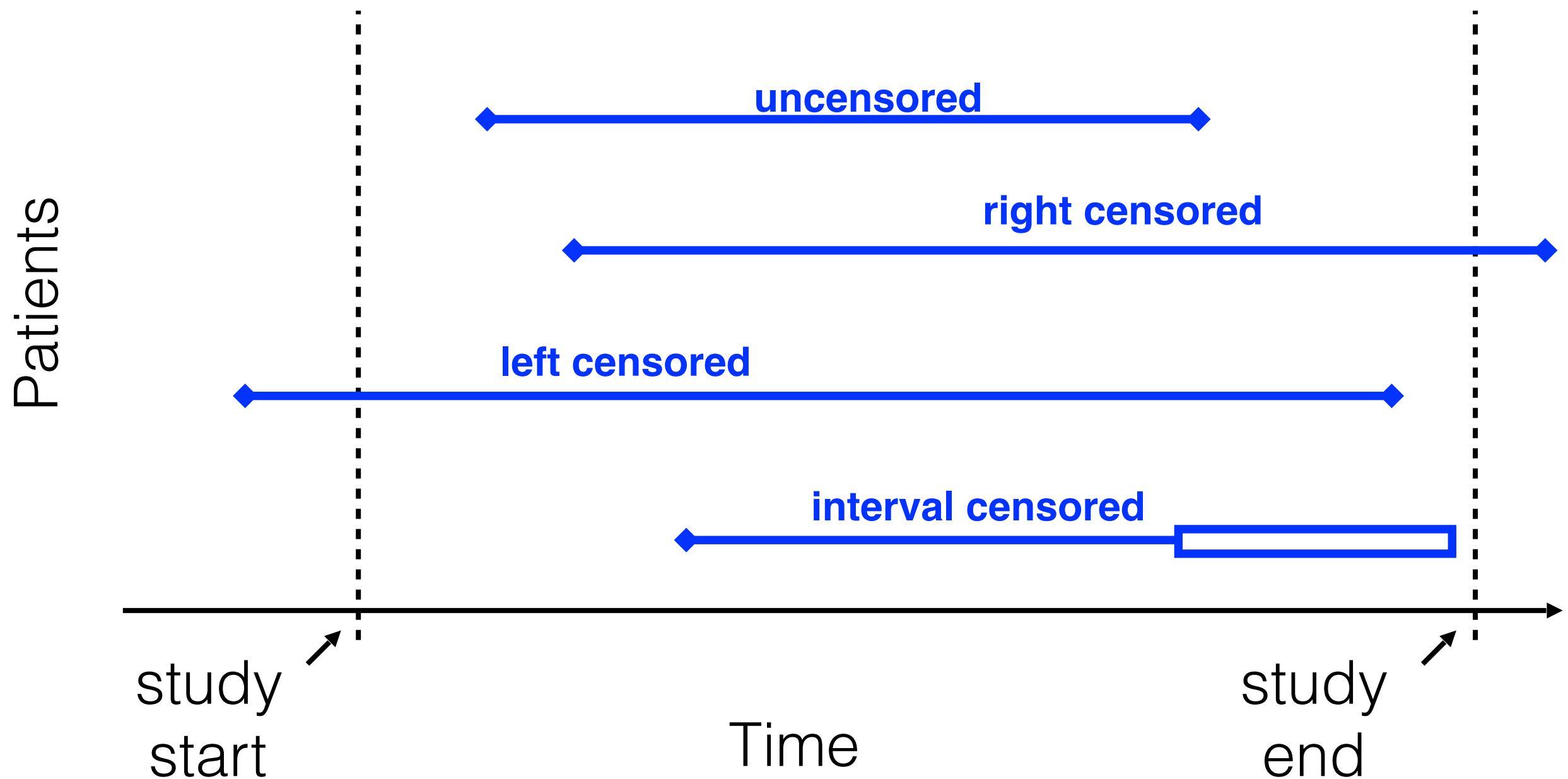
Clinical notes



Use signals to learn a time to event model



Censoring



In the traditional case with only right censoring,

C time of censoring

$Y = \min \{T, C\}$ outcome

Multiple imputation Cox proportional hazards model

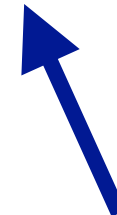
baseline hazard



$$\lambda(t_m|x_i) = \lambda_0(t_m)e^{\beta x_i}$$



impute the time
multiple times in the
case of interval
censoring



feature-dependent
term

Earliness of predictions

Results computed
at a **TPR of 0.85**
and corresponding
FPR of 0.33

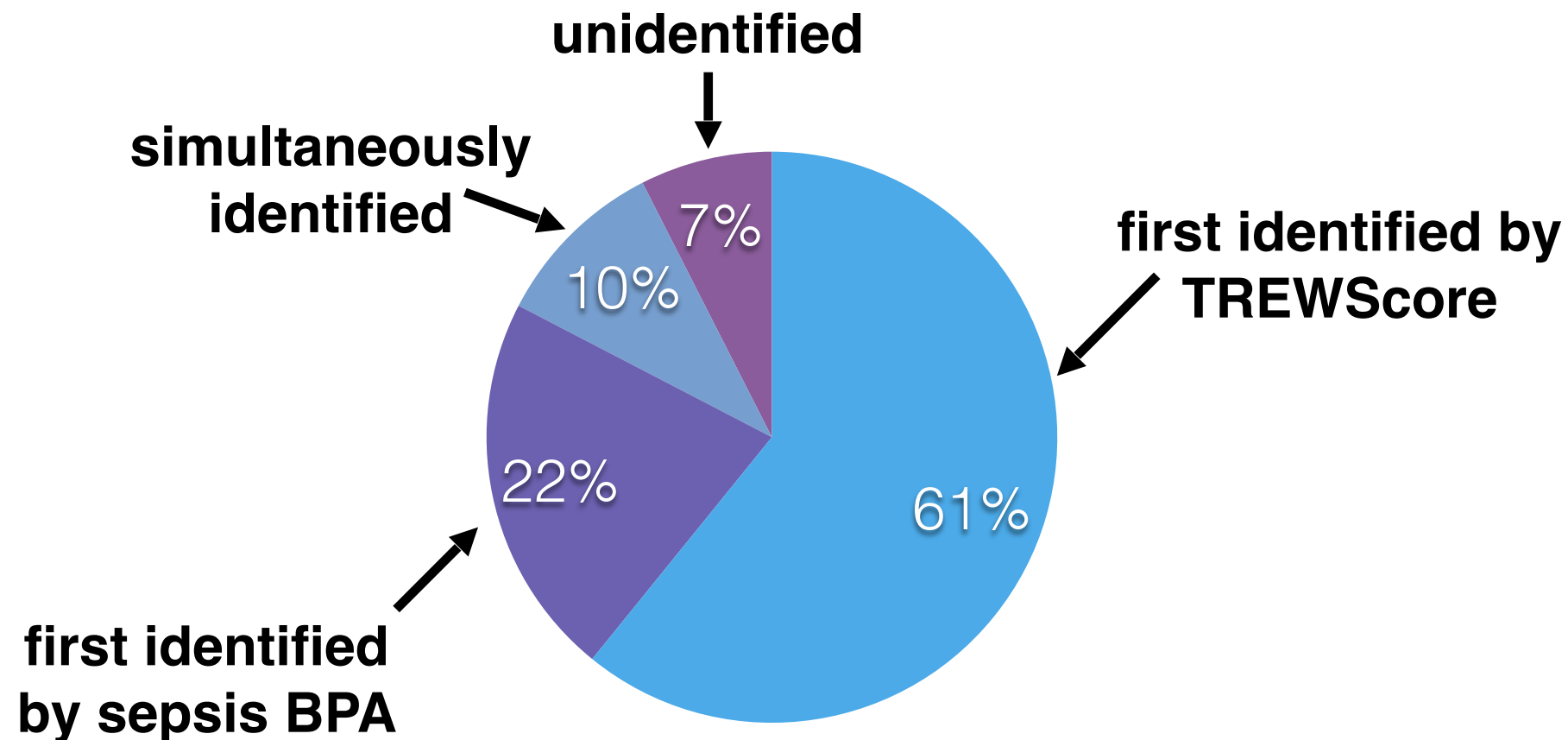


TREWScore identified patients a **median 28.2 (IQR 10.6-94.2)**
hours prior to shock onset

68.8 % of these were identified a **median 7.43 (IQR 2.53-25.4)**
hours prior to any sepsis-related organ dysfunction

Earliness compared to a sepsis BPA

Identification prior to septic shock onset



TREWScore identified **99 more patients** prior to sepsis-related organ dysfunction (**58.6% increase** in total number of patients identified prior to organ dysfunction)

SIRS DRG 871 death
#1 cause of ICU deaths
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bacteria
blood chemicals
DRG 870 death
infection organ failure

SEPSIS

toxic response
fungi shock
inflammation
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