



# **REVIEW ARTICLE**



# Diagnosis of neonatal sepsis: the past, present and future

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**ABSTRACT:** Sepsis remains a significant cause of neonatal mortality and morbidity, especially in low- and middle-income countries. Neonatal sepsis presents with nonspecific signs and symptoms that necessitate tests to confirm the diagnosis. Early and accurate diagnosis of infection will improve clinical outcomes and decrease the overuse of antibiotics. Current diagnostic methods rely on conventional culture methods, which is time-consuming, and may delay critical therapeutic decisions. Nonculture-based techniques including molecular methods and mass spectrometry may overcome some of the limitations seen with culture-based techniques. Biomarkers including hematological indices, cell adhesion molecules, interleukins, and acute-phase reactants have been used for the diagnosis of neonatal sepsis. In this review, we examine past and current microbiological techniques, hematological indices, and inflammatory biomarkers that may aid sepsis diagnosis. The search for an ideal biomarker that has adequate diagnostic accuracy early in sepsis is still ongoing. We discuss promising strategies for the future that are being developed and tested that may help us diagnose sepsis early and improve clinical outcomes.

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### **IMPACT:**

- Reviews the clinical relevance of currently available diagnostic tests for sepsis.
- Summarizes the diagnostic accuracy of novel biomarkers for neonatal sepsis.
- Outlines future strategies including the use of omics technology, personalized medicine, and point of care tests.

## INTRODUCTION

Neonatal sepsis is a clinical syndrome characterized by nonspecific signs and symptoms caused by invasion by pathogens. 1,2 Sepsis is deemed culture-proven if confirmed by microbial growth on blood cultures or other sterile bodily fluids. Debate exists over the occurrence of culture-negative sepsis and whether antibiotics should be continued in culture-negative cases.<sup>3</sup> Sepsis is categorized as early onset if diagnosed within the first 72 h of life, which is due to perinatal risk factors, or late-onset if diagnosed after 72 h and secondary to nosocomial risk factors. Neonatal sepsis is still a major cause of morbidity and mortality despite advances in neonatal medicine.<sup>4</sup> Incidence varies from 1 to 4 cases per 1000 live births in high-income countries, but as high as 49-170 cases in low- and middle-income countries with a case fatality rate up to 24%.5-8 Survivors of neonatal sepsis are at increased risk for adverse neurodevelopmental outcomes including cerebral palsy, hearing loss, visual impairment, and cognitive delays even in those whose cultures were negative but were treated with antibiotics. <sup>9,10</sup>

The diagnosis of confirmed sepsis relies on conventional microbiologic culture techniques, which can be time-consuming.<sup>11</sup> Despite the high sensitivity in detecting low bacterial loads (1–4 colony-forming unit (CFU)/mL), many providers view negative blood cultures with skepticism when presented with a sick infant.<sup>12</sup> The diagnosis "culture-negative" sepsis or "clinical sepsis" has led to a 10-fold increase in antibiotic use in neonates with evidence of unintended

harm including increased risk for necrotizing enterocolitis, fungal infections, bronchopulmonary dysplasia, and death.<sup>12</sup>

Advances in rapid culture techniques, antibiotic stewardship, and bundled approaches to prevent central line-associated bloodstream infections have reduced morbidity and mortality from neonatal sepsis. 13,14 Newer molecular approaches and nonculture-based methods to assist in timely detection and accurate diagnosis of sepsis are needed. Current biomarkers and adjunct hematological indices used in routine clinical practice have limited value and are difficult to interpret due to low sensitivity and changing normal ranges during the neonatal period. 15,16 An ideal marker should have sensitivity and negative predictive value (NPV) approaching 100%; specificity and positive predictive value (PPV) over 85%. <sup>17,18</sup> None of the biomarkers or combination of biomarkers have adequate diagnostic accuracy to be used reliably in the diagnosis of neonatal sepsis.<sup>19</sup> We aim to review the past and current diagnostic modalities and present some insight on future diagnostic strategies in neonatal sepsis (Fig. 1).

## PATHOPHYSIOLOGY OF NEONATAL SEPSIS

Host immune responses including cytokines and chemokines during neonatal sepsis may aid in the diagnosis and/or assessing the severity of sepsis. A summary of the biomarkers associated with host immune pathways that change during sepsis is depicted in Fig. 2. Paneth cells and intestinal lymphoid cells produce

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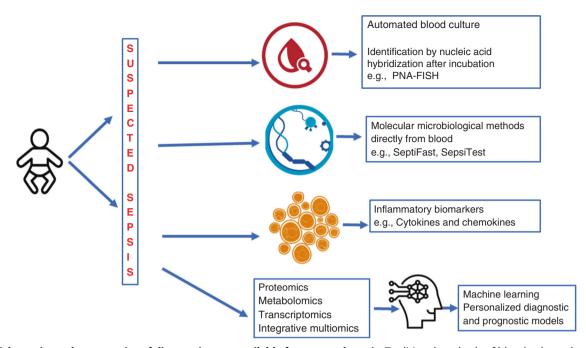


Fig. 1 A Schematic on the categories of diagnostic tests available for neonatal sepsis. Traditional methods of blood cultures have changed to automated blood culture monitoring for bacterial growth by  $CO_2$  detection. Newer tests involve rapidly identifying organisms from positive cultures by fluorescent in situ hybridization techniques. Molecular microbiological diagnostics using PCR for bacterial and fungal genes can be applied directly to blood specimens. Inflammatory biomarkers including CRP, procalcitonin, and cytokines are another category of adjunctive diagnostic tests. Multiomic technology enables us to scour genome-wide gene expression, protein and metabolites for developing diagnostic tests and prognostic models.

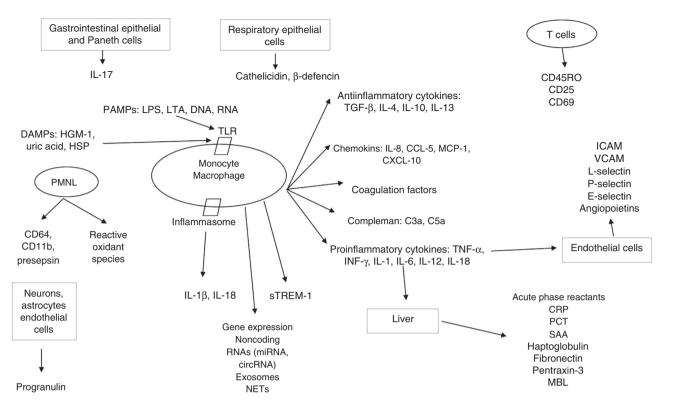
interleukin-17 (IL-17), which has a role in local defense and development of systemic inflammatory response syndrome.<sup>2</sup> Respiratory epithelia secrete antimicrobial proteins and peptides including cathelicidin and β-defensins.<sup>21</sup> Gram-positive microorganisms and their cell wall lipoteichoic acid signal through tolllike receptor-2 (TLR-2), while gram-negative microorganisms and their secreted lipopolysaccharide (LPS) signal through TLR-4 receptors.<sup>22</sup> These signaling cascades are associated with the production of nuclear factor-kB-dependent inflammatory cytokines and chemokines. Nucleotide-binding and oligomerization domain-like receptors lead to the production of IL-1ß and IL-18 by a protein complex called the inflammasome.<sup>23</sup> Activation of pathogen recognition receptors results in the generation of inflammatory mediators such as IL-1\(\beta\), IL-6, IL-8, IL-12, IL-18, interferon-γ (INF-γ) and tumor necrosis factor-α (TNF-α).<sup>24</sup> Proinflammatory cytokines activate endothelial cells leading to increased expression of cell adhesion molecules such as soluble intercellular adhesion molecules, selectins, angiopoietins, CD11b, and CD18.<sup>25</sup> Chemokines including CXCL10, CCL5 (RANTES), and CCL3, and complement proteins such as C3a and C5a cathelicidin and defensins are also stimulated by proinflammatory cytokines.<sup>26</sup> Damage-associated molecular patterns (DAMPs, alarmins), such as high-mobility group box-1 and uric acid, are released from damaged cells and induce cytokine production, coagulation cascade, and regulate polymorphonuclear cell function.<sup>27</sup> Antiinflammatory cytokines such as transforming growth factor-β, IL-4, IL-10, IL-11, and IL-13 are expressed to control and balance inflammation.<sup>28</sup> Acute-phase reactants (APRs) such as C-reactive protein (CRP), procalcitonin (PCT), serum amyloid A (SAA) are produced predominantly in the liver in response to complement activation, pathogen-associated molecular patterns (PAMPs) activity, and proinflammatory cytokine secretion.

# CURRENT METHODS TO DIAGNOSE NEONATAL SEPSIS Microbiological culture methods

Conventional culture techniques remain the "gold standard" to confirm the diagnosis of neonatal sepsis. The introduction of automated systems that detect the presence of growth from bacterial CO<sub>2</sub> production has reduced the time to organism detection to 24–48 h.<sup>29,30</sup> Factors that may influence the recovery of pathogens from the blood include amount of blood volume obtained, timing of collection, and number of samples collected.

In neonates, the presence of low or intermittent bacteremia and maternal intrapartum antimicrobial exposure may decrease the sensitivity of blood cultures. <sup>12,31</sup> The delay in pathogen identification and antibiotic susceptibility testing increases exposure to broad-spectrum antibiotics, which may lead to bacterial antibiotic resistance and delay in targeted antimicrobial therapy. <sup>9,32,33</sup> The volume of blood sampled for cultures is the single most important factor influencing the recovery of pathogens from blood cultures. <sup>34</sup> However, collection of optimal blood volume can be difficult in extremely preterm infants and repeated phlebotomy may increase the risk of requiring blood transfusions. Schelonka et al. reported that a blood culture volume of 1 mL injected into pediatric blood culture bottles had excellent sensitivity even if organisms were present at very low concentrations (<4 colony-forming units (CFU)/mL). <sup>31</sup>

The need for obtaining anaerobic cultures in neonates before commencing antibiotics is unclear.<sup>35</sup> The overall incidence of clinically significant anaerobic isolates found in a neonatal population was 0.2% of all blood cultures performed.<sup>36</sup> Previous studies showed that the use of anaerobic blood cultures led to increased identification of both aerobic and facultative anaerobic bacteria.<sup>37</sup> Créixems et al. reported that among 10,024 paired blood cultures (aerobic and anaerobic), 19% of patients with bacteremia would have been missed if aerobic cultures alone were used, not including the three strictly anaerobic infections identified.<sup>38</sup> In



**Fig. 2 The relationship between host immunity and biomarkers.** CD cluster of differentiation, sTREM-1 soluble triggering receptor expressed on myeloid cells-1, ICAM intracellular adhesion molecule, VCAM vascular cell adhesion molecule, RNA ribonucleic acid, DNA deoxyribonucleic acid, DAMPs damage-associated molecular patterns, HGM-1 high-mobility group box 1, LPS lipopolysaccharide, LTA lipoteichoic acid, NETs neutrophil extracellular traps, TLR toll-like receptor, HSP heat-shock protein, TNF-α tumor necrosis factor-α, INF-γ interferon-γ, IL interleukin, MCP-1 monocyte chemoattractant protein-1, CXCL-10 chemokine ligand-10.

contrast, Dunne et al. found increased sensitivity in isolating aerobic and facultative anaerobic isolates from pediatric patients when two aerobic blood cultures were performed versus paired aerobic/anaerobic cultures.<sup>39</sup> It is unclear whether treating anaerobes in routine sepsis management in neonates improves clinical outcomes.

## Rapid testing methods from positive blood cultures

Several diagnostic systems have been developed for the rapid identification of organisms found in positive blood cultures and provide faster turnaround times when compared to conventional methods (Table 1).<sup>40</sup> These Food and Drug Administration-cleared assays rapidly identify organisms growing in positive blood cultures, but do not eliminate the time required for growth from these cultures. Peptide nucleic acid fluorescent in situ hybridization molecular stains<sup>41</sup> is a well-validated method; the new QuickFISH system has reduced turnaround time to 20 min, enabling species identification results to be reported in the same time frame as Gram staining.<sup>42</sup> Polymerase chain reaction (PCR)based methods, including GeneXpert (1 h), FilmArray (1 h), and Verigene (2.5 h), are somewhat slower than QuickFISH, but have little or no sample processing and include selected antibiotic resistance genes.<sup>40</sup> Rapid assays are gradually becoming less labor-intensive and have led to improved clinical outcomes, shorter hospital stays, and dramatically lower healthcare costs. 43,44

Recent advances in molecular techniques enable amplification of microbial pathogens directly from whole-blood samples in under 12 h without relying on initial microbial growth in blood cultures (Table 1).<sup>40</sup> This provides the advantage of same-day identification and early targeted pathogen-specific antimicrobial therapy, especially in settings where there is pretreatment with antibiotics, low-density bacteremia, or where culture-negative sepsis is common. These molecular techniques predominantly rely

on the amplification methods of PCR for the bacterial 16S or 23S ribosomal RNA (rRNA) genes and the 18S rRNA gene of fungi. Diagnostic accuracy of systems such as SeptiFast, SepsiTest, and, most recently, detection of PCR-amplified pathogen DNA from the blood that is hybridized to capture probe-decorated nanoparticles detectable by a small portable T2 magnetic resonance (MR) platform have been reported. The Roche Light Cycler SeptiFast system requires 100 µL of blood and can detect 25 pathogens known to cause >90% of bloodstream infections, with a turnaround time of 6 h. A competing commercial assay, SepsiTest, is able to detect >300 pathogens; however, with a relatively slower turnaround time of 8–12 h. The T2 MR is an automated nanoparticle-based PCR assay that can detect as few as 1 CFU/mL of Candida spp. in the blood in ~3 h.

Some studies report a discordance between conventional culture and PCR methods during validation of molecular pathogen detection methods, which has led to continued uncertainty about the bacterial etiology of sepsis. <sup>49,50</sup> Furthermore, false-positive results were seen with high cycle thresholds, thus opening the possibility for nonspecific amplification and raising the questions about whether the bacteria present was the cause for the sepsis syndrome. <sup>51</sup> A systematic review concluded that molecular diagnostics had value as adjunctive tests with an overall sensitivity of 90% and specificity of 96%. <sup>52</sup> Molecular assays are not readily available, may be expensive, and have modest diagnostic accuracy. Hence, molecular assays are not ready to replace blood cultures as reference standards, but are useful as adjunctive tests in the diagnosis of neonatal sepsis.

## Hematological indices

Leukocyte (<5000 or ≥20000/mm³), absolute neutrophil (<1000 or ≥5000/mm³) and immature/total neutrophil counts (>0.2), and peripheral blood smear (toxic granulation, vacuolization and

Technique	Target pathogen	Resistance typing	Turnaround time	Sensitivity	Specificity
Culture-based technique	Ð				
Blood culture	All culturable microbes	Yes	48–72 h	1	1
Automated identification	All culturable microbes	Yes	24-48 h	ı	I
Nucleic acid-based identification	ıtification				
PNA-FISH	Differentiates between Staphylococcus aureus and CoNS; Enterococcus faecalis and Enterococcus species; Escherichia coli, Klebsiella pneumoniae, and Pseudomonas aeruginosa; and Candida species	No	1.5–3 h <sup>a</sup>	96–100%	96–100%
QuickFISH	S. aureus, CoNS, E. faecalis, other Enterococci, E. coli, K. pneumoniae, P. aeruginosa	No	<30 min <sup>a</sup>	%001–96	96–100%
MALDI-TOF	GP and GN bacteria, yeast, fungi, filamentous fungi, mycobacteria	In development	10–30 min <sup>a</sup>	ı	I
GeneXpert MRSA/ SA	S. aureus	mecA for methicillin resistance	<1 h <sup>a</sup>	98.3–100% for MSSA and MRSA	98.6–99.4% for MSSA and MRSA
Verigene gram- positive	Staphylococcus spp., S. aureus, S. epidermidis, S. lugdunensis, Streptococcus spp., S. pyogenes, S. agalactiae, S. anginosus group, S. pneumoniae, E. faecalis, E. faecium, and Listeria spp.	mecA for methicillin resistance and vanA/B genes for vancomycin resistance	2.5 h <sup>a</sup>	92.6–100%	95.4–100%
Verigene gram- negative	9 bacterial targets including <i>E. coli, Shigela</i> spp., <i>K. pneumoniae, K. oxytoca, P. aeruginosa, Serratia marcescens, Acinetobacter</i> spp., <i>Proteus</i> spp., <i>Citrobacter</i> spp., <i>Enterobacter</i> spp.	KPC, NDM, CTX-M, VIM, IMP, OXA	2 h³	97.1%	99.5%
FilmArray	27 targets, including staphylococci, streptococci, Enterococcus, Listeria, Acinetobacter, Neisseria meningitidis, P. aeruginosa and members of the Enterobacteriaceae family, as well as Candida spp.	<i>mecA, vanA/B,</i> and <i>K. pneumoniae</i> carbapenemase (KPC) genes	1 h³	%06<	ı
Culture-independent diagnostic tests	agnostic tests				
SeptiFast	25 pathogens (10 GN, 9 GP, 6 fungi)	1	4-6 h	63–83%	83-95%
SepsiTest	>345 pathogens, 13 fungi	ı	8–12 h	11–87%	83–96%
T2 MR Candida	C. albicans, C. glabrata, C. krusei, C. parapsilosis, C. tropicalis	In development	3-6 h	%06	%86

CONS coagulase-negative staphylococci,  ${\it GP}$  gram positive,  ${\it GN}$  gram negative.  $^{2}$ Turnaround times are after culture turns positive.

Table 1. Microbial identification from blood cultures and molecular nonculture techniques.

Dohle bodies) are traditionally used to aid the diagnosis of neonatal sepsis (Table 2).<sup>53</sup>

White blood cell count (WBC). Leukocyte count starts between 6000 and 30,000/mm³ in the first day of life and decreases to 5000–20,000 mm³ later. Neutrophil count tends to be lower at lower gestational ages (GAs) and peaks 6–8 h after birth. <sup>54</sup> Clinical conditions such as maternal fever and hypertension, perinatal asphyxia, meconium aspiration syndrome, delivery route, intraventricular hemorrhage, hemolysis, pneumothorax, convulsion, and even crying affect the neutrophil count. <sup>55</sup> A literature review by Sharma et al. reported that leukopenia (WBC count <5000/mm³) has a low sensitivity (29%), but high specificity (91%) for the diagnosis of neonatal sepsis. <sup>56</sup> Additional studies highlighted that leukopenia is more predictive of sepsis than leukocytosis (WBCs >20,000/mm³) at >4 h. <sup>57</sup> Neutrophil/lymphocyte ratios (NLR) of 1.24:6.76 and platelet/lymphocyte ratios of 57.7:94.05 may be diagnostic of neonatal sepsis. <sup>58,59</sup>

Absolute neutrophil count (ANC). Neutrophil counts are commonly evaluated in neonates with presumed sepsis, but can be affected by maternal and infant risk factors. 54,55 Neutropenia (ANC < 1000/mm³ at ≥4 h) is considered more specific for early-onset neonatal sepsis (EOS) as opposed to neutrophilia (ANC ≥ 10,000/ mm<sup>3</sup>).<sup>51,56,60</sup> Interpretation of ANC, however, must take into consideration the neonate's gestational and postnatal age as the lower limit of ANC decreases with lower GA. Furthermore, an analysis of 30,354 complete blood counts (CBCs) obtained in the first 72 h of life demonstrated that ANC peak later in early preterm neonates <28 weeks gestation as compared with neonates ≥28 weeks gestation (24 h of life vs 6–8 h, respectively).<sup>54</sup> Mean neutrophil volume >157 arbitrary units had sensitivity and specificity as 79% and 82% while sensitivity and specificity of CRP were 72% and 99%, respectively.<sup>61</sup> In 141 neonates with neonatal sepsis, cut-off level of delta neutrophil index was calculated as 4.6% with 85% sensitivity and 80% while CRP had 81% sensitivity and 82% specificity.62

Immature-to-total neutrophil (I:T) ratio. Compared to other hematological markers, I:T ratio may be the most sensitive indicator of neonatal sepsis, 60 but this parameter also varies with GA and postnatal age. In healthy newborns, the I:T ratio peaks at 0.16 during the first 24 h and gradually declines over days. Gandhi and Kondekar propose that I:T ratio >0.27 in term newborns and >0.22 in preterm neonates favor the diagnosis of neonatal sepsis. 60 Murphy and Weiner demonstrated that two normal I:T ratios correlated with a sterile blood culture had a maximum NPV of 100%. 63

Red cell distribution width (RDW). RDW shows increased red blood cell production in inflammatory and infectious diseases. Elevated RDW has been shown to be associated with increased mortality from sepsis in both adults and neonates. ADW was significantly higher in sepsis and among non-survivors. Cut-off levels as 16.3 and 19.5 had sensitivity (70–87%) and specificity (66.1–81%) in neonatal sepsis and gramnegative late-onset neonatal sepsis (LOS), respectively. 64,67

*Thrombocytopenia.* Thrombocytopenia is associated with neonatal sepsis.<sup>68</sup> Platelet volume increases while being more active and associated with cytokines and inflammatory mediators. A metanalysis that included 11 studies and 932 patients reported that MPV was higher in neonatal sepsis with a cut-off level between 8.6 and 11.4.<sup>69–71</sup>

# Inflammatory biomarkers

Acute-phase reactants. APRs are produced by the liver in response to cytokines, which are induced by infection and tissue injury. TNF- $\alpha$ ,

CRP, PCT, fibronectin, haptoglobin, pro-adrenomedullin (pro-ADM), and SAA have been evaluated in neonatal sepsis.

C-reactive protein: CRP has been the most studied biomarker. <sup>16</sup> Serum CRP concentrations rise within 10 to 12 h in response to bacterial infections and peak after 36–48 h, with concentrations that correlate with illness severity. <sup>72</sup> Due to the delay in elevation, it is unreliable for the early diagnosis of neonatal sepsis (low sensitivity). <sup>15</sup> Furthermore, other noninfectious maternal and neonatal conditions may also result in elevated CRP levels, thus making it a nonspecific biomarker. <sup>72,73</sup> A systematic review of biomarkers for neonatal sepsis concluded that serial measurements of CRP at 24 to 48 h after onset of symptoms has been shown to increase its sensitivity and NPV and may be useful for monitoring response to treatment in infected neonates receiving antibiotics. <sup>16</sup> This suggests that CRP may be more useful for ruling out infection and discontinuing antibiotics when serial measurements are obtained.

Procalcitonin: PCT is synthesized in monocytes and hepatocytes as a prohormone of calcitonin in response to cytokine stimulation. After birth, it increases until postnatal day 2–4.74 PCT is downregulated by IFN-y, a commonly produced cytokine in viral infections. 72,75,76 Thus, PCT has emerged as a promising biomarker for the diagnosis of bacterial infections that may be useful in discriminating between bacterial and viral etiologies. After exposure to bacterial endotoxin, PCT levels rapidly rise within 2-4 h and peak within 6-8 h, thus making it a more sensitive marker than CRP for early diagnosis of neonatal sepsis.<sup>77</sup> This increase often correlates with the severity of the disease and mortality. However, in EOS, PCT measurements at birth may initially be normal; a serial PCT measurement at 24 h of age may be more helpful for early diagnosis.<sup>78</sup> Furthermore, serial PCT determinations allow shortening the duration of antibiotic therapy in term and near-term infants with suspected early-onset sepsis. However, before this PCT-quided strategy can be recommended, its safety and reliability must be confirmed in a larger cohort of neonates.

In a meta-analysis with 1959 patients, sensitivity and specificity of PCT were reported to be 81% (95% confidence interval (CI): 74–87) and 79% (95% CI: 69–87), respectively. 80 Studies in the meta-analysis used different cut-off thresholds (0.8-2.4 µg/L). PLR and NLR were 7.7 and 0.11 for LOS, while 3.2 and 0.3 for EOS indicating that diagnostic accuracy is better in LOS.81 Cord blood PCT >0.7 µg/L in the diagnosis of sepsis showed 69% sensitivity and 70% specificity and PCT has been used in combination with other biomarkers in EOS.<sup>82</sup> Canpolat et al. reported that PCT (>1.74 ng/mL) and CRP (>0.72 mg/dL) had 76% and 58% sensitivity and 58% and 85% specificity, respectively, on the third day of life in neonates with preterm premature rupture of membranes.83 Eschborn and Weitkamp evaluated 29 studies comparing PCT with CRP and found that mean sensitivity for EOS, LOS, and EOS + LOS was 73.6%, 88.9%, and 76.5% for PCT; 65.6%, 77.4%, and 66.4% for CRP, while mean specificity for EOS, LOS, and EOS + LOS was 82.8%, 75.6%, and 80.4% for PCT; 82.7%, 81.7%, and 91.3% for CRP, respectively.<sup>72</sup> The authors concluded that the performance of both biomarkers will be better with serial measurements, and correlation with clinical findings is needed for decision-making.

Serum amyloid A: SAA is another APR synthesized by hepatocytes, monocytes, endothelial, and smooth muscle cells in 8–24 h after bacterial exposure and is regulated by pro-inflammatory cytokines. SAA levels increase with age, with the lowest levels seen in umbilical cord blood, and the highest levels seen in old age.<sup>84</sup> In response to infection or injury, SAA levels rapidly increase up to 1000 times higher than baseline, but can be significantly influenced by the patient's hepatic function and nutritional

	Comments			Leukocyte (<5000, ≥20,000) and absolute neutrophil count	(<1000, ≥5000) were traditionally used parameters, but these parameters are affected by gestational age, postnatal hours and days, and clinical conditions such as maternal hypertension, perinatal asphyxia, intraventricular hemorrhage, etc.	The I/T ratio has better sensitivity than WBC and ANC Disadvantage of this ratio is the interreader difference. The ratio >0.2 has been traditionally used	Low platelet count can be found in neonatal sepsis, especially gram-negative and fungal sepsis, but often remain decreased during the sepsis process	No statistical difference between early- and late-onset sepsis; proven and clinical sepsis. Combination with IL-6 and CRP gave a better diagnostic performance. Levels normalized with treatment	DNI was insignificantly higher in late-onset sepsis. Proven sepsis had significantly higher DNI levels. Levels normalized with treatment. Mortality was predicted with DNI	Pooled sensitivity, specificity, PLR and NLR were 77%, 74%, 3.58, and 0.29, respectively. The pooled DOR was 15.18 (95% CI: 9.75–23.62). The proven sepsis group had better diagnostic performance than the clinical sepsis group. Term infants had higher sensitivity, specificity, PLR, and DOR
		NLR		ı	I	ı	ı	1	1	0.06-0.48
		PLR		1	ı	ı	ı	1	I	1.84-47.1
		NPV		94->99.8 74-96	74-96	96-99	46	65 55	77	73–100
		PPV		36 13–100	14-21	2.5	13–14	90 80 21	87	9-96.2
		Specificity		79–99 80–99	95-99	74-96 62-100	97-99 89-98	82 64 65	08	59-100
epsis.		Sensitivity		0.3–18 0.1–23	89-8	22–62 33–54	8-48	79 66 60	85	21-100
diagnosis of neonatal s	Performance	Cut-off		I	1	ı	I	>157 a.u. <159 a.u. <127.5 a.u.	4.6	1.8-4.3 CD64 index; 1010–6010
Most studied and promising biomarkers in the diagnosis of neonatal sepsis.	Patient characteristics		count <sup>51</sup>	EOS LOS	EOS LOS	EOS LOS	EOS LOS	76 proven, 126 clinical sepsis, 98 control All gestations (mean $30 \pm 5$ w), early- and late-onset sepsis <sup>61</sup>	110 proven, 31 clinical sepsis, 87 control All gestations (median 30 (23–41) w), early- and late-onset sepsis <sup>62</sup>	Meta-analysis of 17 studies including 3478 neonates, all gestations, EOS and/or LOS, proven and/or clinical sepsis <sup>118</sup>
Table 2. Most studie	Biomarker		Complete blood cell count <sup>51</sup>	WBC	ANC	I/T ratio	Platelet count	MNV, MNC, MNS	NO	CD64

Biomarker	Patient characteristics	Performance							Comments
		Cut-off	Sensitivity	Specificity	PPV	NPV	PLR	NLR	
CD11b	Meta-analysis of 9 studies including 843 neonates, all gestations, EOS and/or LOS, proven, and/or clinical sepsis <sup>121</sup>	12.6–600 MFI	65-100	56-100	50-100	61–100	2.1–156	0.01-0.49	Pooled sensitivity, specificity, PLR and NLR were 82%, 93%, 11.51 and 0.19, respectively. The pooled DOR was 59.50 (95% CI: 4.65–761.58). The diagnostic accuracy was higher in earlyonset sepsis
Presepsin	Meta-analysis of 11 studies including 793 neonates, all gestations, EOS and/or LOS, proven and/or clinical sepsis <sup>122</sup>	≤650 650–850 ≥850	91	85 97 86	ı	ı	1	ı	The pooled DOR: 71.78 (7.46–690.56) 542.72 (156.62–1880.60) 75.60 (8.32–686.53)
	Meta-analysis of 28 studies including 2661 neonates, all gestations, EOS and/or LOS, proven and/or clinical sepsis?		67–98	75–100	I	ı	1	I	Pooled sensitivity, specificity, PLR and NLR were 85%, 98%, 50.8 and 0.06, respectively. The pooled DOR was 864
sTREM-1	Meta-analysis of 8 studies including 667 neonates, all gestations but mostly term infants, EOS and/or LOS, proven and/or clinical sepsis <sup>128</sup>	77.5–1707.35 pg/ mL	70–100	48–100	34-93.3	62–90	1.6–9.33	0.07-0.48	Pooled sensitivity, specificity, PLR and NLR were 95%, 87%, 7 and 0.05, respectively. The pooled DOR was 132.49 (95% CI: 6.85–2560.70)
P-7	Meta-analysis of 31 studies including 1448 septic neonates <sup>102</sup>	3.6–300 pg/mL	54-100	45–100	I	I	1.63–88.79	0.03-0.50	Pooled sensitivity, specificity, PLR and NLR were 88%, 82%, 7.03 and 0.2, respectively. The pooled DOR was 29.54 (95% CI 18.56-47.04)
IL-8	Meta-analysis of 8 studies including 548 neonates, all gestations, EOS and/or LOS, proven and/or dinical sepsis <sup>109</sup>	0.65–100 pg/mL	34-94	66–100	64-100	59-95	2.22–80.49	006-0.76	Pooled sensitivity, specificity, PLR and NLR were 78%, 84%, 4.58 and 0.25, respectively. The pooled DOR was 21.64 (95% CI: 7.37–63.54)
TNF-α	Meta-analysis of 15 studies including 1201 neonates <sup>111</sup>	0.18–180 (20,000 in 2 studies)	21–100	43–100	I	I	I	I	Pooled sensitivity and specificity were 66%, 76%, respectively. The pooled DOR was 7.43 (95% CI 3.47–15.90). Diagnostic accuracy was found slightly better in LOS than EOS
CRP	Review of 27 studies including 4996 neonates	2.5–100 mg/L	22–100	59–100	31–100	38-96	I	1	
PCI	Meta-analysis of 16 studies including 1959 neonates, all gestations, EOS and/or LOS, proven and/or dinical sepsis <sup>80</sup>	0.5–5.75 µg/L	57-100	50-100	19–100	56–100	I	1	Pooled sensitivity, specificity, PLR and NLR were 81%, 79%, 3.9 and 0.24, respectively. The pooled DOR was 16 (95% CI: 8–32). Diagnostic accuracy was better in LOS than EOS
SAA	Meta-analysis of 9 studies including 823 neonates, all	1–68 mg/L	23–100	33–100	57-100	57-100	I	ı	Pooled sensitivity and specificity were 84%, 89%, respectively. The pooled DOR was 91.84 (95%

Table 2 continued

Table 2 continued									
Biomarker	Patient characteristics	Performance							Comments
		Cut-off	Sensitivity	Specificity	PPV	NPV	PLR	NLR	
	gestations, EOS and/or LOS, proven and/or clinical sepsis <sup>87</sup>								CI: 16.78–502.80). CRP has higher pooled sensitivity and DOR than SAA
Pro-ADM	31 proven, 41 clinical sepsis and 52 control, preterm and term infants, EOS and/or LOS <sup>89</sup>	3.9 nmol/L	98	100	100	83	I	I	Diagnostic accuracy of pro-ADM was similar to IL-6 and CRP. Higher pro-ADM levels were found in gram-negative sepsis
Hepcidin	27 neonates with LOS and 17 control, VLBW infants <sup>94</sup>	92.2 mg/dL	76	100	100	87	I	ı	Diagnostic performance was better than CRP and combination with CRP did not give better performance than hepcidin alone
Progranulin	2 studies: neonates >34 w at risk of EOS, proven and clinical sepsis (n: 152), (n: 121) <sup>95</sup>	1.39–37.86 ng/ml	67-94	80–51	76-61	67-91	3.4–1.95	0.16-0.11	Progranulin was found efficient to predict EOS. Combination with CRP, PCT, and IL-6 gave a better diagnostic performance
Vascular endothelium	74 infected, 118 sICAM-1 non-infected sE-Selectin samples of 149 SAA neonates, pretern, and term infants with EOS or LOS <sup>99</sup>	228 ng/mL 132 mg/L 1 mg/L	76 54 23	75 82 92	999	83 73 66	I	I	LOS group had higher sICAM-1 and SAA while lower sE-Selectin levels. The combination of these biomarkers with hsCRP altogether gave sensitivity, specificity, PPV and NPV as 90%, 67%, 64 and 91%, respectively.
Molecular assays (Meta-analysis <sup>52</sup> )	All molecular tests (35 studies) Broad range PCR (9 studies) Real-time PCR (9 studies) Post-PCR processing (5 studies) Multiplex PCR (6 studies) LOS (10 studies) EOS and LOS (23 studies) Preterm (5 studies) Preterm 3 studies)	I	90 (38–100) 97 86 97 76 79 94 89 89	93 (32–100) 93 94 96 81 81 84 92 87	I	I	I	I	Molecular tests have the advantage of rapid results and can be used as add-on tests. Molecular assays, including PCR and hybridization methods, and have rapid detection times compared to blood cultures (6-8 h vs 20-36 h). Costs, availability of equipment and need for technical skills are disadvantages.
Future									
Omics approach	Metabolomics: sugars, lipids, small peptides, vitamins including glucose, maltase, lactate, acetate, ketone bodies, ρ-serine, acylcarnitines, acetoacetate, creatine 146 Proteomics: neutrophil defensin 1–2, cathelicidin, S100A12, S100A8, proapolipoprotein C2, apolipoprotein A–E–H, β-2 microglobulin, haptoglobin, desarginin 141,142	peptides, vitamins incl 2, cathelicidin, S100A1	luding glucose, 2, S100A8, proa	maltase, lactate polipoprotein C	, acetate, k 22, apolipop	etone bodies protein A–E–	, D-serine, acy Η, β-2 microgl	lcarnitines, a obulin, hapt	cetoacetate, creatine <sup>146</sup> oglobin, desarginin <sup>141,142</sup>
Nanotechnology Machine learning	Magnetic, gold, fluorescent, and lipid-based nanoparticles for contrast agents and biosensors 45,46	oid-based nanoparticle	s for contrast ag	lents and biose	nsors <sup>45,46</sup>				
Heart rate variability	Reduced heart rate variability and transient decelerations were associated with early diagnosis of sepsis in 633 neonates, 152 while reduced mortality due to different clinical problems including sepsis was reported in 2989 VLBW infants 151	transient decelerations orted in 2989 VLBW in	were associatec fants <sup>151</sup>	l with early diag	gnosis of se	psis in 633 r	ieonates, <sup>152</sup> w	hile reduced	mortality due to different clinical
Vital signs	Heart rate, respiratory rate, temperature, desaturations, bradycardias of 155 neonates between 23 and 32 w with LOS <sup>153</sup>	Triggering score ≥5	81	08	57	93	I	1	LOS was diagnosed 43.1 ± 79 h before culture positivity

Biomarker	Patient characteristics	Performance							Comments
		Cut-off	Sensitivity Specificity	Specificity	PPV	NPV	PLR	NLR	
Clinical findings	Fever, apneas, platelet counts, gender, bradypnea, band cells, catheter use, birth weight and maternal age, cervicovaginitis in 238 neonates 154	I	93	80	82	92	1	1	25 potential maternal and neonatal features were studied. The predictive model was created with a combination of clinical, laboratory, and demographic features
	Blood pressure, temperature, and saturation were found as vital candidate markers out of heart rate, respiratory rate, systolic blood pressure, and diastolic blood pressure in 7870 neonates <sup>155</sup>	aturation were found as	vital candidate	markers out o	ք heart rate	e, respiratory	rate, systolic	blood pressu	e, and diastolic blood pressure in
New genetic techniques	Noncoding miRNA- RNAs: miRNA, 181a <sup>157</sup> circRNA, miRNA- 16a <sup>158</sup> miRNA- 451 <sup>158</sup>	0.625 3.1 1.2	64 64	84 60 60	 61	- 88 62	I	1	Study groups included term infants, both EOS and LOS, proven and clinical sepsis. miRNA levels were correlated with WBC, CRP, and respiratory discomfort

WBC white blood cell count, EOS early-onset neonatal sepsis, LOS late-onset neonatal sepsis, ANC absolute neutrophil count, I/T ratio immature/total neutrophil count ratio, MNV mean neutrophil volume, MNC necrosis factor-α, CRP C-reactive protein, PCT procalcitonin, SAA serum amyloid A, pro-ADM proadrenomedullin, sICAM-1 soluble intercellular adhesion molecule-1, sE-Selectin soluble endothelial leukocyte mean neutrophil conductivity, MNS mean neutrophil scatter, DN/ delta neutrophil index, CD cluster of differentiation, sTREM-1 soluble triggering receptor expressed on myeloid cells-1, IL interleukin, TNF-a tumor polymerase chain reaction, VLBW very low birth weight infants, RNA ribonucleic acid, miRNA microRNA, circRNA circular RNA, NET neutrophil . PLR positive likelihood ratio, NLR negative likelihood ratio, DOR diagnostic odds ratio, MFI mean fluorescence intensity. adhesion molecule-1, PCR polymerase value, NPV negative predictive value, status.<sup>85</sup> In a study by Arnon and Litmanovitz, when compared with healthy infants at 0, 8, and 24 h, SAA levels in septic infants were significantly higher (p < 0.01) at all time points.<sup>53</sup> When compared with CRP, SAA had an overall better diagnostic accuracy for predicting EOS. Cetinkaya et al. also determined that SAA concentrations had better sensitivity and area under the curve when compared with CRP and PCT, although the difference was not statistically significant.<sup>86</sup> Different cut-off points between 1 and 68 mg/L were reported with a pooled 78% sensitivity and 92% specificity.<sup>87</sup>

Proadrenomedullin is a stable precursor of ADM, which modulates circulation, has antimicrobial properties, and protects against organ damage. High sensitivity (86.8%), specificity (100%), PPV (100%), and NPV (83.9%) with a cut-off value of 3.9 nmol/L of pro-ADM were observed in 76 neonates with neonatal sepsis. Higher pro-ADM levels were associated with increased sepsis severity and mortality. 90

Adipokines are released from adipose tissue and may initiate the secretion of inflammatory and anti-inflammatory cytokines. Visfatin (>10 ng/mL) and resistin (>8 ng/mL) had sensitivity and specificity over 90% in 62 septic neonates. Subsequent studies reported lower sensitivity and specificity for resistin, but levels were positively correlated with IL-6 and CRP. Hepcidin, progranulin, stromal cell-derived factor 1, endocan, and pentraxin-3 are less studied APRs, which have a role in inflammation, chemoattraction, complement activation, angiogenesis, and future studies are needed to evaluate the diagnostic accuracy of these markers.

Vascular endothelium: Vascular endothelium interacts with leukocytes, soluble mediators, PAMPs, and DAMPs, which have a role in sepsis pathogenesis. E-selectin, L-selectin, soluble intracellular adhesion molecule-1, soluble vascular cell adhesion molecule-1, and angiopoietin 1–2 were studied in the diagnosis of neonatal sepsis. However, the limitation of these markers includes no normative data in neonates, physiological increase in the first month of life, and lack of large studies.

Interleukins: IL-6 increases immediately after exposure to pathogens and normalizes in 24 h. 100 IL-6 has a proinflammatory effect inducing CRP, fibronectin, and SAA release from the liver, T cell differentiation, and B cell maturation. 101 IL-6 has been studied more than other cytokines and found to be increased in neonates with EOS and LOS, and various cut-off levels between 18 and 300 pg/mL were reported in 31 studies with 1448 septic neonates. 102 The pooled sensitivity and specificity of IL-6 were 88% and 82%, while PLR and NLR were 7.03 and 0.2, respectively. The combination of IL-6 with other markers such as CRP, pro-ADM, and PCT showed better diagnostic accuracy. 19,89,103

Cortes et al. evaluated the diagnostic accuracy of IL-6 and CRP in EOS and LOS.  $^{104}$  The authors concluded that IL-6 (>17.75 pg/ mL) showed greater accuracy in EOS, while CRP (>0.53 mg/dL) was more accurate in LOS. Kurul et al. showed that IL-6 (>580 pg/mL) and PCT (>0.94 ng/mL) were associated with 7-day mortality, while CRP was not.  $^{105}$ 

Ye et al. evaluated the utility of cytokines in 420 neonates with neonatal sepsis.  $^{106}$  Interleukin-2, IL-4, IL-6, IL-10, TNF- $\alpha$ , and INF- $\gamma$  were measured and compared with CRP. Interleukin-6 (>12.5 pg/mL) and IL-6/IL-10 ratio (>3.5) were found as valuable as CRP, while most sensitive and specific ILs were IL-6 (94.1%) and IL-6/IL-10 ratio (100%), respectively. Celik et al. observed that a cut-off level of 202 pg/mL for IL-6 differentiated gram-negative (n=73) from gram-positive (n=82) sepsis with 68% sensitivity and 58% specificity.  $^{107}$  In a later study, IL-6 (>400 pg/mL) alone or in combination with TNF- $\alpha$  (>32 pg/mL), IL-8 (>200 pg/mL), and granulocyte-colony stimulating factor (>1000 pg/mL) had 100% sensitivity, specificity, NPV and 38–69% PPV to differentiate gram-negative neonatal sepsis.  $^{108}$ 

Table 2 continued

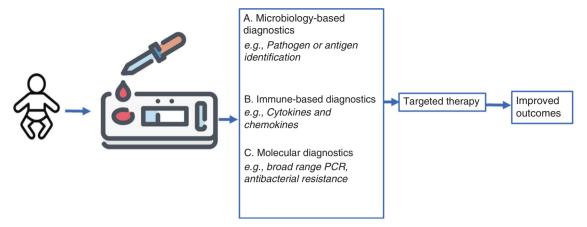


Fig. 3 Point of care testing for the diagnosis of neonatal sepsis. Blood samples are drawn on suspicion of infection on laboratory chips that are microbiology, immune, or molecular-based diagnostics. The results enable us to initiate targeted therapy. The rapid results and targeted therapy will improve clinical outcomes.

IL-8 is another proinflammatory cytokine promoting chemotaxis and activation of granulocytes and increases within 1–3 h with a half-life <4 h. Diagnostic accuracy was evaluated in a meta-analysis with eight studies with 548 neonates (cut-off levels between 0.65 and 300 pg/mL), which reported a pooled sensitivity and specificity of 78 and 84% similar to CRP. 109

TNF-α is secreted from natural killer cells by IL-2 to induce T cell proliferation, vasodilatation, and neutrophil adhesion. <sup>110</sup> In a systematic review (where TNF-α cut-off values ranged from 1.7 to 70 pg/mL) at a mean cut-off value of 18.94 pg/m/L, the sensitivity was 79% and specificity was 81% and better accuracy in LOS than EOS. <sup>111</sup> Meta-analyses of data from neonates show variable sensitivity and specificity for IL-6, IL-8, and TNF-α with only moderate accuracy in diagnosing neonatal sepsis. <sup>16,109,111</sup> However, when combined with other cytokines or late proinflammatory markers, such as CRP, sensitivity, and specificity increase. <sup>106,112,113</sup> Currently, measuring cytokines for the diagnosis of neonatal sepsis may not be practical or cost-effective because enzyme immunoassays are expensive and time-consuming.

Cell adhesion molecules: Leukocyte antigens are upregulated after bacterial exposure and can be quantified by flow cytometry. These markers increase in minutes after infection and levels were not affected by GA, the timing of sepsis onset, type of microorganism, or non-infectious diseases. The Limitation of these markers is in need of high technology and non-standardized normal ranges.

Cluster differentiation molecule-64 (CD64) expressed from neutrophils and monocytes facilities phagocytosis and intracellular killing of opsonized microorganisms. Increased levels can be detected in 1 h and stable for 24 h. Shi et al. performed a meta-analysis of CD64 levels from 17 studies, including 3478 neonates, and found that pooled sensitivity, specificity, PLR, and NLR were 77%, 74%, 3.58, and 0.29, respectively. <sup>118</sup> Serial measurements and combination with other markers have been reported with varying diagnostic accuracy. <sup>119,120</sup> Increased CD11b expression was found both in EOS and LOS with high sensitivity and specificity up to 100%. <sup>112</sup> In a recent meta-analysis including nine studies with 843 neonates showed that CD11b is a promising biomarker with sensitivity, specificity, PLR, and NLR as 82%, 93%, 11.51, and 0.19, respectively. <sup>121</sup>

Soluble CD14 fragment (presepsin) is a specific and high-affinity receptor complex of LPSs and activates TLR to proinflammatory cytokine secretion. Both meta-analyses revealed that presepsin was as accurate as PCT and CRP in the diagnosis of neonatal sepsis. T7,122 Gram-negative infections lead to higher sCD14 levels. Cord blood presepsin levels were evaluated in 288

preterm infants with premature rupture of membranes for EOS and a cut-off level ≥1370 pg/mL yielded an odds ratio of 12.6 (95% confidence level: 2.5–28.1). <sup>124</sup> Presepsin, PCT, IL-6, and IL-8 were compared in the diagnosis of EOS and presepsin was found as the most accurate biomarker with 88.9% sensitivity and 85.7% specificity. <sup>125</sup>

Soluble triggering receptor expressed on myeloid cells-1 (sTREM-1) regulates the innate immune system and inflammation by promoting the release of proinflammatory cytokines. Increased levels were found in neonatal sepsis with a cut-off value of 310 pg/mL, although higher levels were reported in culture-proven sepsis. 126 Urine sTREM-1 >78.5 pg/mL had 90% sensitivity, 78% specificity, 68% PPV, and 94% NPV in 62 neonates with sepsis, respectively. 127 A meta-analysis including eight studies with 667 neonates reported that sensitivity and specificity of sTREM-1 were 95% and 87%, respectively. 128 Limitations include a small number of studies and different cut-off levels between 77.5 and 1707 pg/mL. 128

The challenge of biomarker identification is reflected by the fact that over 3000 sepsis biomarker studies have been published with almost 200 candidate biomarkers evaluated. Phowever, there is not a single biomarker that has sufficient diagnostic accuracy for the diagnosis of neonatal sepsis. The combination of biomarkers or their serial measurements may be strategies to enhance diagnostic accuracy. A combination of IL-6, sTREM-1, and PCT has been suggested, as each biomarker represents a different component in the pathophysiology of sepsis. Others propose that early- and mid-phase markers such as neutrophil CD64 and PCT should be combined with the late-phase biomarker CRP for maximal diagnostic benefit. A recent literature review summarizes the utility of combining both early and late biomarkers for neonatal sepsis.

## Strategies for the future

Mass spectrometry for identification of pathogens from blood culture specimens. Matrix-assisted laser desorption-ionization/time-of-flight (MALDI-TOF) mass spectroscopy is a relatively new approach that can identify microorganisms within 30 min after blood culture positivity. <sup>131</sup> Meta-analyses have found that the use of MALDI-TOF for diagnosis of infection from culture bottles has acceptable sensitivity and specificity <sup>132</sup> and with higher sensitivity in gramnegative infections compared to gram-positive infections. <sup>133</sup>

Point-of-care (POC) devices for diagnosis of neonatal sepsis. Rapid tests done at the bedside that could confirm the diagnosis or provide prognostic information have the potential to improve patient outcomes and decrease healthcare costs (Fig. 3). Novel techniques such as analysis of volatile organic compounds in the

breath have been demonstrated to be reasonably sensitive and specific<sup>134</sup> and capable of distinguishing sepsis from inflammation in rat models, <sup>135</sup> yet to be validated in human studies. POC devices using a variety of biomarkers including blood plasma protein quantification and leukocyte monitoring are being evaluated for the diagnosis of sepsis. <sup>136</sup>

Omics technologies and personalized medicine. Omics technologies provide data on genome-wide gene expression, protein translation, and metabolite production that are differentially regulated in neonatal sepsis.  $^{137,138}$  Proteomics measures protein components released after infection or inflammation. Cord blood and amniotic fluid proteomics have provided information regarding the fetal response to intra-amniotic inflammation and have successfully predicted EOS with >92% accuracy.  $^{139,140}$  Proteomics including neutrophil defensin 1–2, cathelicidin, S100A12, S100A8, pro-apolipoprotein C2, apolipoprotein A-E-H,  $\beta$ -2 microglobulin, haptoglobin, desarginin from amniotic fluid, cord blood, and plasma were found to be valuable in the diagnosis of EOS and LOS.  $^{141-143}$ 

Metabolomics by nuclear MR imaging (NMR) and gas chromatography-mass spectrometry (GC-MS) has also been investigated in adult sepsis with favorable results. <sup>144</sup> Urinary metabolomics profile of adult pneumococcal pneumonia, for example, has been found to be distinctly different from viral and other bacterial causes of pneumonia. <sup>145</sup> This indicates that evaluation of urinary metabolite profiles may be useful for effective diagnosis and lead to faster targeted antibiotic treatment. Urine samples of neonates with sepsis were evaluated with H-NMR and GC-MS showed an increase in glucose, maltose, lactate, acetate, ketone bodies, p-serine, and also normalization of variations with treatment. <sup>146</sup>

A prospective observational study comparing genome-wide expression profiles of 17 VLBW infants with bacterial sepsis identified distinct clusters of gene expression patterns in grampositive and gram-negative sepsis when compared with controls. 147 Genomic analysis may determine sepsis risk, treatment response, and prognosis while evaluating gene variants responsible for PRPs, signaling molecules and cytokines. 143,148

Machine learning. Machine learning and artificial intelligence are increasingly used to sort transcriptomic, proteomic, and metabolomic data for biomarker screening, developing prognostication models, and for identifying the right patients for specific therapies (personalized medicine). One example is the Pediatric Sepsis Biomarker Risk Model (PERSEVERE), which was developed and validated as a prognostic enrichment tool for pediatric septic shock and in predicting mortality. <sup>138,149</sup> Ongoing research is investigating the application of the PERSEVERE model in neonatal sepsis prognostication. <sup>150</sup>

Reduced heart rate variability and transient decelerations were detected in hours to days before diagnosis of sepsis.  $^{151,152}$  In these studies, early diagnosis of sepsis and reduced mortality has been reported. Recently predictive models using machine learning were developed. These models use the vital signs, clinical, and laboratory features of patients. Mithal et al. calculated a triggering score of  $\geq 5$  by using heart rate, respiratory rate, temperature, desaturation, and bradycardia events. The authors found that LOS was diagnosed  $43.1 \pm 79\,\mathrm{h}$  before culture positivity with 81% sensitivity, 80% specificity, 57% PPV, and 93% NPV in 72 patients.  $^{153}$  Clinical findings such as birth weight, gender, catheter use, and laboratory findings such as blood gas parameters, CBC were also integrated into prediction models and found valuable in the diagnosis of sepsis.  $^{154,155}$ 

*New genetic techniques.* Non-coding RNAs (transcriptomics) including microRNAs (miRNA) and circular RNAs regulate many cell signaling pathways including cell proliferation, differentiation, development, metabolism, apoptosis, and proinflammatory cytokine production. <sup>156</sup> Both increased (miRNA 15-16a-23b-451) and

decreased (miRNA 25-129-132-181a-223) expression were reported, while 80–89% sensitivity and 79–98% specificity were found in the diagnosis of neonatal sepsis. 157,158 Exosomes and neutrophil extracellular traps released during inflammation may be therapeutic targets in the future.

## **Conclusions**

Identification of an ideal biomarker to diagnose neonatal sepsis is still the holy grail, but advances in technology have given us a glimpse of the promising tests for the future. Inflammatory markers such as CRP and PCT as well as other hematological indices used currently have limited value in neonates. Serial measurements of an ideal combination of biomarkers have shown to increase diagnostic accuracy but remain expensive and cumbersome for clinical practice. Molecular diagnostic tools such as PCR and sequencing, as well as MS, offer promise for more rapid and sensitive detection of disease. Omics technology and machine learning may provide us with diagnostic and prognostic models that could be personalized for the future.

#### REFERENCES

- 1. Kim, F., Polin, R. A. & Hooven, T. A. Neonatal sepsis. BMJ 371, m3672 (2020).
- Shane, A. L., Sánchez, P. J. & Stoll, B. J. Neonatal sepsis. Lancet 390, 1770–1780 (2017).
- Cantey, J. B. & Baird, S. D. Ending the culture of culture-negative sepsis in the neonatal ICU. *Pediatrics*. 140, e20170044. https://doi.org/10.1542/peds.2017-0044 (2017).
- 4. Zaidi, A. K. et al. Effect of case management on neonatal mortality due to sepsis and pneumonia. *BMC Public Health* **11**(Suppl. 3), S13 (2011).
- Stoll, B. J. & Shane, A. L. in Nelson Textbook of Pediatrics, Vol. 20 (eds Kliegman, R., Stanton, B., St. Geme, J., Schor, N. & Behrman, R.) Ch. 109, 794 (Elsevier, 2013).
- Weston, E. J. et al. The burden of invasive early-onset neonatal sepsis in the United States, 2005–2008. Pediatr. Infect. Dis. J. 30, 937–941 (2011).
- Osrin, D., Vergnano, S. & Costello, A. Serious bacterial infections in newborn infants in developing countries. Curr. Opin. Infect. Dis. 17, 217–224 (2004).
- Oza, S., Lawn, J. E., Hogan, D. R., Mathers, C. & Cousens, S. N. Neonatal cause-of-death estimates for the early and late neonatal periods for 194 countries: 2000-2013. *Bull. World Health Organ.* 93, 19–28 (2015).
- Mukhopadhyay, S. et al. Neurodevelopmental outcomes following neonatal lateonset sepsis and blood culture-negative conditions. Arch. Dis. Child Fetal Neonatal Ed. 106, 467–473. https://doi.org/10.1136/archdischild-2020-320664 (2021).
- Mukhopadhyay, S. et al. Impact of early-onset sepsis and antibiotic use on death or survival with neurodevelopmental impairment at 2 years of age among extremely preterm infants. J. Pediatr. 221, 39–46.e35 (2020).
- Jardine, L., Davies, M. W. & Faoagali, J. Incubation time required for neonatal blood cultures to become positive. J. Paediatr. Child Health 42, 797–802 (2006).
- Sarkar, S., Bhagat, I., DeCristofaro, J. D., Wiswell, T. E. & Spitzer, A. R. A study of the role of multiple site blood cultures in the evaluation of neonatal sepsis. *J. Perinatol.* 26, 18–22 (2006).
- Mukhopadhyay, S., Sengupta, S. & Puopolo, K. M. Challenges and opportunities for antibiotic stewardship among preterm infants. Arch. Dis. Child Fetal Neonatal Ed. 104. F327–F332 (2019).
- Taylor, J. E. et al. A quality improvement initiative to reduce central line infection in neonates using checklists. Eur. J. Pediatr. 176, 639–646 (2017).
- Brown, J. V. E., Meader, N., Wright, K., Cleminson, J. & McGuire, W. Assessment of C-reactive protein diagnostic test accuracy for late-onset infection in newborn infants: a systematic review and meta-analysis. JAMA Pediatr. 174, 260–268 (2020).
- Hedegaard, S. S., Wisborg, K. & Hvas, A. M. Diagnostic utility of biomarkers for neonatal sepsis-a systematic review. *Infect. Dis.* 47, 117–124 (2015).
- Ng, P. C., Ma, T. P. & Lam, H. S. The use of laboratory biomarkers for surveillance, diagnosis and prediction of clinical outcomes in neonatal sepsis and necrotising enterocolitis. Arch. Dis. Child Fetal Neonatal Ed. 100, F448–452 (2015).
- 18. Mussap, M., Noto, A., Cibecchini, F. & Fanos, V. The importance of biomarkers in neonatology. *Semin. Fetal Neonatal Med.* **18**, 56–64 (2013).
- Celik, I. H. et al. What are the cut-off levels for IL-6 and CRP in neonatal sepsis? J. Clin. Lab. Anal. 24, 407–412 (2010).
- Deshmukh, H. S. et al. The microbiota regulates neutrophil homeostasis and host resistance to *Escherichia coli* K1 sepsis in neonatal mice. *Nat. Med.* 20, 524–530 (2014).
- Starner, T. D., Agerberth, B., Gudmundsson, G. H. & McCray, P. B. Jr. Expression and activity of beta-defensins and LI-37 in the developing human lung. *J. Immunol.* 174, 1608–1615 (2005).

- Zhang, J. P., Chen, C. & Yang, Y. Changes and clinical significance of toll-like receptor 2 and 4 expression in neonatal infections. *Zhonghua Er Ke Za Zhi* 45, 130–133 (2007).
- Leaphart, C. L. et al. A critical role for Tlr4 in the pathogenesis of necrotizing enterocolitis by modulating intestinal injury and repair. J. Immunol. 179, 4808–4820 (2007).
- Cornell, T. T., Wynn, J., Shanley, T. P., Wheeler, D. S. & Wong, H. R. Mechanisms and regulation of the gene-expression response to sepsis. *Pediatrics* 125, 1248–1258 (2010).
- Figueras-Aloy, J. et al. Serum soluble Icam-1, Vcam-1, L-Selectin, and P-Selectin levels as markers of infection and their relation to clinical severity in neonatal sepsis. Am. J. Perinatol. 24, 331–338 (2007).
- Kingsmore, S. F. et al. Identification of diagnostic biomarkers for infection in premature neonates. Mol. Cell Proteom. 7, 1863–1875 (2008).
- van Zoelen, M. A. et al. Role of Toll-like receptors 2 and 4, and the receptor for advanced glycation end products in high-mobility group box 1-induced inflammation in vivo. Shock 31, 280–284 (2009).
- Sikora, J. P., Chlebna-Sokol, D. & Krzyzanska-Oberbek, A. Proinflammatory cytokines (II-6, II-8), cytokine inhibitors (II-6sr, Stnfrii) and anti-inflammatory cytokines (II-10, II-13) in the pathogenesis of sepsis in newborns and infants. Arch. Immunol. Ther. Exp. 49, 399–404 (2001).
- Cockerill, F. R. 3rd Application of rapid-cycle real-time polymerase chain reaction for diagnostic testing in the clinical microbiology laboratory. *Arch. Pathol. Lab Med.* 127, 1112–1120 (2003).
- Huang, A. H., Yan, J. J. & Wu, J. J. Comparison of five days versus seven days of incubation for detection of positive blood cultures by the Bactec 9240 system. *Eur. J. Clin. Microbiol. Infect. Dis.* 17, 637–641 (1998).
- Schelonka, R. L. et al. Volume of blood required to detect common neonatal pathogens. J. Pediatr. 129, 275–278 (1996).
- 32. Cotten, C. M. Adverse consequences of neonatal antibiotic exposure. *Curr. Opin. Pediatr.* **28**, 141–149 (2016).
- Greenberg, R. G. et al. Prolonged duration of early antibiotic therapy in extremely premature infants. *Pediatr. Res.* 85, 994–1000 (2019).
- Bouza, E., Sousa, D., Rodríguez-Créixems, M., Lechuz, J. G. & Muñoz, P. Is the volume of blood cultured still a significant factor in the diagnosis of bloodstream infections? *J. Clin. Microbiol.* 45, 2765–2769 (2007).
- Mukhopadhyay, S. & Puopolo, K. M. Relevance of neonatal anaerobic blood cultures: new information for an old question. J. Pediatr. Infect. Dis. Soc. 7, e126–e127 (2018).
- Messbarger, N. & Neemann, K. Role of anaerobic blood cultures in neonatal bacteremia. J. Pediatr. Infect. Dis. Soc. 7, e65–e69 (2018).
- Yaacobi, N., Bar-Meir, M., Shchors, I. & Bromiker, R. A prospective controlled trial of the optimal volume for neonatal blood cultures. *Pediatr. Infect. Dis. J.* 34, 351–354 (2015).
- Créixems, M. R. et al. Use of anaerobically incubated media to increase yield of positive blood cultures in children. *Pediatr. Infect. Dis. J.* 21, 443–446 (2002).
- Dunne, W. M. Jr., Tillman, J. & Havens, P. L. Assessing the NEED FOR ANAEROBIC MEDIUM FOR THE RECOVERY OF CLINICALLY SIGNIFICANT BLOOD CULTURE ISOLATES IN CHILdren. *Pediatr. Infect. Dis. J.* 13, 203–206 (1994).
- Kothari, A., Morgan, M. & Haake, D. A. Emerging technologies for rapid identification of bloodstream pathogens. Clin. Infect. Dis. 59, 272–278 (2014).
- Calderaro, A. et al. Comparison of peptide nucleic acid fluorescence in situ hybridization assays with culture-based matrix-assisted laser desorption/ionization-time of flight mass spectrometry for the identification of bacteria and yeasts from blood cultures and cerebrospinal fluid cultures. Clin. Microbiol. Infect. 20. 0468–0475 (2014).
- Deck, M. K. et al. Multicenter evaluation of the staphylococcus quickfish method for simultaneous identification of *Staphylococcus aureus* and coagulase-negative Staphylococci directly from blood culture bottles in less than 30 min. *J. Clin. Microbiol.* 50, 1994–1998 (2012).
- Forrest, G. N. et al. Impact of rapid in situ hybridization testing on coagulasenegative staphylococci positive blood cultures. J. Antimicrobial Chemother. 58, 154–158 (2006).
- Ly, T., Gulia, J., Pyrgos, V., Waga, M. & Shoham, S. Impact upon clinical outcomes of translation of PNA fish-generated laboratory data from the clinical microbiology bench to bedside in real time. *Ther. Clin. Risk Manag.* 4, 637–640 (2008).
- Neely, L. A. et al. T2 magnetic resonance enables nanoparticle-mediated rapid detection of candidemia in whole blood. Sci. Transl. Med. 5, 182ra154 (2013).
- Mancini, N. et al. The era of molecular and other non-culture-based methods in diagnosis of sepsis. Clin. Microbiol Rev. 23, 235–251 (2010).
- Haag, H., Locher, F. & Nolte, O. Molecular diagnosis of microbial aetiologies using Sepsitest™ in the daily routine of a diagnostic laboratory. *Diagn. Microbiol. Infect. Dis.* 76, 413–418 (2013).

- Straub, J. et al. Diagnostic accuracy of the Roche Septifast Pcr System for the rapid detection of blood pathogens in neonatal sepsis-a prospective clinical trial. PLoS ONE 12, e0187688 (2017).
- 49. Liu, C. L. et al. Comparison of 16s rRNA gene PCR and blood culture for diagnosis of neonatal sepsis. *Arch. Pediatr.* **21**, 162–169 (2014).
- Reier-Nilsen, T., Farstad, T., Nakstad, B., Lauvrak, V. & Steinbakk, M. Comparison of broad range 16s rDNA PCR and conventional blood culture for diagnosis of sepsis in the newborn: a case control study. BMC Pediatr. 9, 5 (2009).
- Iroh Tam, P. Y. & Bendel, C. M. Diagnostics for neonatal sepsis: current approaches and future directions. *Pediatr. Res.* 82, 574–583 (2017).
- Pammi, M., Flores, A., Versalovic, J. & Leeflang, M. M. Molecular assays for the diagnosis of sepsis in neonates. *Cochrane Database Syst. Rev.* 2, CD011926 (2017).
- Arnon, S. & Litmanovitz, I. Diagnostic tests in neonatal sepsis. Curr. Opin. Infect. Dis. 21, 223–227 (2008).
- Schmutz, N., Henry, E., Jopling, J. & Christensen, R. D. Expected ranges for blood neutrophil concentrations of neonates: the Manroe and Mouzinho Charts Revisited. J. Perinatol. 28, 275–281 (2008).
- Manroe, B. L., Weinberg, A. G., Rosenfeld, C. R. & Browne, R. The neonatal blood count in health and disease. I. Reference values for neutrophilic cells. *J. Pediatr.* 95, 89–98 (1979).
- Sharma, D., Farahbakhsh, N., Shastri, S. & Sharma, P. Biomarkers for diagnosis of neonatal sepsis: a literature review. J. Matern. Fetal Neonatal Med. 31, 1646–1659 (2018).
- Newman, T. B., Puopolo, K. M., Wi, S., Draper, D. & Escobar, G. J. Interpreting complete blood counts soon after birth in newborns at risk for sepsis. *Pediatrics* 126, 903–909 (2010).
- Can, E., Hamilcikan, S. & Can, C. The value of neutrophil to lymphocyte ratio and platelet to lymphocyte ratio for detecting early-onset neonatal sepsis. J. Pediatr. Hematol. Oncol. 40, e229–e232 (2018).
- Arcagok, B. C. & Karabulut, B. Platelet to lymphocyte ratio in neonates: a predictor of early onset neonatal sepsis. *Mediterr. J. Hematol. Infect. Dis.* 11, e2019055 (2019).
- Gandhi, P. & Kondekar, S. A review of the different haematological parameters and biomarkers used for diagnosis of neonatal sepsis. *EMJ Hematol.* 7, 85–92 (2019).
- Celik, I. H. et al. Automated determination of neutrophil vcs parameters in diagnosis and treatment efficacy of neonatal sepsis. *Pediatr. Res.* 71, 121–125 (2012).
- Celik, I. H. et al. The value of delta neutrophil index in neonatal sepsis diagnosis, follow-up and mortality prediction. Early Hum. Dev. 131, 6–9 (2019).
- Murphy, K. & Weiner, J. Use of leukocyte counts in evaluation of early-onset neonatal sepsis. *Pediatr. Infect. Dis. J.* 31, 16–19 (2012).
- Ellahony, D. M., El-Mekkawy, M. S. & Farag, M. M. A study of red cell distribution width in neonatal sepsis. *Pediatr. Emerg. Care* 36, 378–383 (2020).
- Han, Y. Q. et al. Red blood cell distribution width predicts long-term outcomes in sepsis patients admitted to the intensive care unit. Clin. Chim. Acta 487, 112–116 (2018).
- Martin, S. L. et al. Red cell distribution width and its association with mortality in neonatal sepsis. J. Matern. Fetal Neonatal Med. 32, 1925–1930 (2019).
- Dogan, P. & Guney Varal, I. Red cell distribution width as a predictor of lateonset gram-negative sepsis. *Pediatr. Int.* 62, 341–346 (2020).
- Spector, S. A., Ticknor, W. & Grossman, M. Study of the usefulness of clinical and hematologic findings in the diagnosis of neonatal bacterial infections. *Clin. Pediatr.* 20, 385–392 (1981).
- Wang, J. et al. Diagnostic value of mean platelet volume for neonatal sepsis: a systematic review and meta-analysis. *Medicine* 99, e21649 (2020).
- Oncel, M. Y. et al. Mean platelet volume in neonatal sepsis. J. Clin. Lab Anal. 26, 493–496 (2012).
- Aydemir, C., Aydemir, H., Kokturk, F., Kulah, C. & Mungan, A. G. The cut-off levels
  of procalcitonin and c-reactive protein and the kinetics of mean platelet volume
  in preterm neonates with sepsis. *BMC Pediatr.* 18, 253 (2018).
- Eschborn, S. & Weitkamp, J. H. Procalcitonin versus c-reactive protein: review of kinetics and performance for diagnosis of neonatal sepsis. *J. Perinatol.* 39, 893–903 (2019).
- Celik, I. H., Demirel, G., Canpolat, F. E., Erdeve, O. & Dilmen, U. Inflammatory responses to hepatitis B virus vaccine in healthy term infants. *Eur. J. Pediatr.* 172, 839–842 (2013).
- Stocker, M., Hop, W. C. & van Rossum, A. M. Neonatal Procalcitonin Intervention Study (Neopins): effect of procalcitonin-guided decision making on duration of antibiotic therapy in suspected neonatal early-onset sepsis: a Multi-Centre Randomized Superiority and Non-Inferiority Intervention Study. BMC Pediatr. 10, 89 (2010).

- Balog, A., Ocsovszki, I. & Mándi, Y. Flow cytometric analysis of procalcitonin expression in human monocytes and granulocytes. *Immunol. Lett.* 84, 199–203 (2002).
- Christ-Crain, M. & Müller, B. Procalcitonin in bacterial infections-hype, hope, more or less? Swiss Med. Wkly 135, 451–460 (2005).
- Ruan, L. et al. The combination of procalcitonin and C-reactive protein or presepsin alone improves the accuracy of diagnosis of neonatal sepsis: a metaanalysis and systematic review. Crit. Care 22, 316 (2018).
- Altunhan, H., Annagür, A., Örs, R. & Mehmetoğlu, I. Procalcitonin measurement at 24 h of age may be helpful in the prompt diagnosis of early-onset neonatal sepsis. *Int. J. Infect. Dis.* 15, e854–858 (2011).
- Stocker, M. et al. Procalcitonin-guided decision making for duration of antibiotic therapy in neonates with suspected early-onset sepsis: a Multicentre, Randomised Controlled Trial (Neopins). *Lancet* 390, 871–881 (2017).
- Vouloumanou, E. K., Plessa, E., Karageorgopoulos, D. E., Mantadakis, E. & Falagas, M. E. Serum procalcitonin as a diagnostic marker for neonatal sepsis: a systematic review and meta-analysis. *Intens. Care Med.* 37, 747–762 (2011).
- Aloisio, E., Dolci, A. & Panteghini, M. Procalcitonin: between evidence and critical issues. Clin. Chim. Acta 496, 7–12 (2019).
- Frerot, A. et al. Cord blood procalcitonin level and early-onset sepsis in extremely preterm infants. Eur. J. Clin. Microbiol Infect. Dis. 38, 1651–1657 (2019).
- Canpolat, F. E., Yigit, S., Korkmaz, A., Yurdakok, M. & Tekinalp, G. Procalcitonin versus CRP as an early indicator of fetal infection in preterm premature rupture of membranes. *Turk. J. Pediatr.* 53, 180–186 (2011).
- Lannergård, A., Friman, G., Ewald, U., Lind, L. & Larsson, A. Serum amyloid A (SAA) protein and high-sensitivity c-reactive protein (hsCRP) in healthy newborn infants and healthy young through elderly adults. *Acta Paediatr.* 94, 1198–1202 (2005).
- Chauhan, N., Tiwari, S. & Jain, U. Potential biomarkers for effective screening of neonatal sepsis infections: an overview. *Microb. Pathog.* 107, 234–242 (2017).
- Cetinkaya, M., Ozkan, H., Köksal, N., Celebi, S. & Hacimustafaoğlu, M. Comparison of serum amyloid A concentrations with those of C-reactive protein and procalcitonin in diagnosis and follow-up of neonatal sepsis in premature infants. J. Perinatol. 29, 225–231 (2009).
- Yuan, H. et al. Diagnosis value of the serum amyloid a test in neonatal sepsis: a meta-analysis. *Biomed. Res. Int.* 2013, 520294 (2013).
- 88. Hinson, J. P., Kapas, S. & Smith, D. M. Adrenomedullin, a multifunctional regulatory peptide. *Endocr. Rev.* **21**, 138–167 (2000).
- Oncel, M. Y. et al. Proadrenomedullin as a prognostic marker in neonatal sepsis. Pediatr. Res. 72, 507–512 (2012).
- Fahmey, S. S., Mostafa, H., Elhafeez, N. A. & Hussain, H. Diagnostic and prognostic value of proadrenomedullin in neonatal sepsis. *Korean J. Pediatr.* 61, 156–159 (2018).
- 91. Cekmez, F. et al. Diagnostic value of resistin and visfatin, in comparison with c-reactive protein, procalcitonin and interleukin-6 in neonatal sepsis. *Eur. Cytokine Netw.* **22**, 113–117 (2011).
- 92. Aliefendioglu, D., Gursoy, T., Caglayan, O., Aktas, A. & Ovali, F. Can resistin be a new indicator of neonatal sepsis? *Pediatr. Neonatol.* **55**, 53–57 (2014).
- 93. Khattab, A. A., El-Mekkawy, M. S., Helwa, M. A. & Omar, E. S. Utility of serum resistin in the diagnosis of neonatal sepsis and prediction of disease severity in term and late preterm infants. *J. Perinat. Med.* **46**, 919–925 (2018).
- 94. Wu, T. W. et al. The utility of serum hepcidin as a biomarker for late-onset neonatal sepsis. *J. Pediatr.* **162**, 67–71 (2013).
- 95. Rao, L. et al. Progranulin as a novel biomarker in diagnosis of early-onset neonatal sepsis. *Cytokine* **128**, 155000 (2020).
- Badr, H. S., El-Gendy, F. M. & Helwa, M. A. Serum stromal-derived-factor-1 (Cxcl12) and its alpha chemokine receptor (Cxcr4) as biomarkers in neonatal sepsis. J. Matern. Fetal Neonatal Med. 31, 2209–2215 (2018).
- 97. Zonda, G. I. et al. Endocan a potential diagnostic marker for early onset sepsis in neonates. *J. Infect. Dev. Ctries* **13**, 311–317 (2019).
- 98. Fahmey, S. S. & Mostafa, N. Pentraxin 3 as a novel diagnostic marker in neonatal sepsis. *J. Neonatal Perinat. Med.* **12**, 437–442 (2019).
- Edgar, J. D., Gabriel, V., Gallimore, J. R., McMillan, S. A. & Grant, J. A prospective study of the sensitivity, specificity and diagnostic performance of soluble intercellular adhesion molecule 1, highly sensitive c-reactive protein, soluble E-selectin and serum amyloid A in the diagnosis of neonatal infection. BMC Pediatr. 10, 22 (2010).
- Machado, J. R. et al. Neonatal sepsis and inflammatory mediators. *Mediators Inflamm.* 2014, 269681 (2014).
- Buck, C., Bundschu, J., Gallati, H., Bartmann, P. & Pohlandt, F. Interleukin-6: a sensitive parameter for the early diagnosis of neonatal bacterial infection. *Pediatrics* 93, 54–58 (1994).
- 102. Sun, B. et al. A meta-analysis of interleukin-6 as a valid and accurate index in diagnosing early neonatal sepsis. *Int. Wound J.* 16, 527–533 (2019).

- Bender, L. et al. Early and late markers for the detection of early-onset neonatal sepsis. Dan. Med. Bull. 55, 219–223 (2008).
- Cortes, J. S. et al. Interleukin-6 as a biomarker of early-onset neonatal sepsis. Am. J. Perinatol. 38, e338–e346. https://doi.org/10.1055/s-0040-1710010 (2020).
- Kurul, S. et al. Association of inflammatory biomarkers with subsequent clinical course in suspected late onset sepsis in preterm neonates. Crit. Care 25, 12 (2021).
- 106. Ye, Q., Du, L. Z., Shao, W. X. & Shang, S. Q. Utility of cytokines to predict neonatal sepsis. *Pediatr. Res.* **81**, 616–621 (2017).
- Celik, I. H. et al. The role of serum interleukin-6 and C-reactive protein levels for differentiating aetiology of neonatal sepsis. Arch. Argent. Pediatr 113, 534–537 (2015).
- Raynor, L. L. et al. Cytokine screening identifies NICU patients with gramnegative bacteremia. *Pediatr. Res.* 71, 261–266 (2012).
- 109. Zhou, M., Cheng, S., Yu, J. & Lu, Q. Interleukin-8 for diagnosis of neonatal sepsis: a meta-analysis. *PLoS ONE* **10**, e0127170 (2015).
- Beutler, B. A., Milsark, I. W. & Cerami, A. Cachectin/tumor necrosis factor: production, distribution, and metabolic fate in vivo. *J. Immunol.* 135, 3972–3977 (1985).
- 111. Lv, B. et al. Tumor necrosis factor-alpha as a diagnostic marker for neonatal sepsis: a meta-analysis. Scientific World J. 2014, 471463 (2014).
- 112. Delanghe, J. R. & Speeckaert, M. M. Translational research and biomarkers in neonatal sepsis. *Clin. Chim. Acta* **451**, 46–64 (2015).
- Ganesan, P., Shanmugam, P., Sattar, S. B. & Shankar, S. L. Evaluation of IL-6, CRP and Hs-Crp as early markers of neonatal sepsis. *J. Clin. Diagn. Res.* 10, Dc13–17 (2016).
- 114. Venet, F., Lepape, A. & Monneret, G. Clinical review: flow cytometry perspectives in the ICU - from diagnosis of infection to monitoring of injury-induced immune dysfunctions. Crit. Care 15, 231 (2011).
- Mazzucchelli, I. et al. Diagnostic performance of triggering receptor expressed on myeloid cells-1 and Cd64 index as markers of sepsis in preterm newborns. Pediatr. Crit. Care Med. 14. 178–182 (2013).
- 116. Du, J. et al. Diagnostic utility of neutrophil Cd64 as a marker for early-onset sepsis in preterm neonates. *PLoS ONE* **9**, e102647 (2014).
- Pugni, L. et al. Presepsin (soluble Cd14 subtype): reference ranges of a new sepsis marker in term and preterm neonates. PLoS ONE 10, e0146020 (2015).
- Shi, J., Tang, J. & Chen, D. Meta-analysis of diagnostic accuracy of neutrophil Cd64 for neonatal sepsis. *Ital. J. Pediatr.* 42, 57 (2016).
- 119. Dilli, D., Oguz, S. S., Dilmen, U., Koker, M. Y. & Kizilgun, M. Predictive values of neutrophil Cd64 expression compared with interleukin-6 and C-reactive protein in early diagnosis of neonatal sepsis. J. Clin. Lab Anal. 24, 363–370 (2010).
- 120. Streimish, I. et al. Neutrophil Cd64 with hematologic criteria for diagnosis of neonatal sepsis. *Am. J. Perinatol.* **31**, 21–30 (2014).
- 121. Qiu, X. et al. Is neutrophil Cd11b a special marker for the early diagnosis of sepsis in neonates? A systematic review and meta-analysis. BMJ Open 9, e025222 (2019).
- 122. Bellos, I. et al. The diagnostic accuracy of presepsin in neonatal sepsis: a metaanalysis. Eur. J. Pediatr. 177, 625–632 (2018).
- Blanco, A. et al. Serum levels of Cd14 in neonatal sepsis by gram-positive and gram-negative bacteria. Acta Paediatr. 85, 728–732 (1996).
- 124. Seliem, W., & Sultan, A. M. Presepsin as a predictor of early onset neonatal sepsis in the umbilical cord blood of premature infants with premature rupture of membranes. *Pediatr. Int.* 60, 428–432 (2018).
- 125. Ahmed, A. M. et al. Serum biomarkers for the early detection of the early-onset neonatal sepsis: a single-center prospective Study. Adv. Neonatal Care 19, E26–E32 (2019).
- 126. Adly, A. A., Ismail, E. A., Andrawes, N. G. & El-Saadany, M. A. Circulating soluble triggering receptor expressed on myeloid cells-1 (Strem-1) as diagnostic and prognostic marker in neonatal sepsis. Cytokine 65, 184–191 (2014).
- 127. Alkan Ozdemir, S., Ozer, E. A., Ilhan, O., Sutcuoglu, S. & Tatli, M. Diagnostic value of urine soluble triggering receptor expressed on myeloid cells (Strem-1) for late-onset neonatal sepsis in infected preterm neonates. J. Int. Med. Res. 46, 1606–1616 (2018).
- 128. Bellos, I. et al. Soluble Trem-1 as a predictive factor of neonatal sepsis: a metaanalysis. *Inflamm. Res.* **67**, 571–578 (2018).
- Dolin, H. H., Papadimos, T. J., Stepkowski, S., Chen, X. & Pan, Z. K. A novel combination of biomarkers to herald the onset of sepsis prior to the manifestation of symptoms. Shock 49, 364–370 (2018).
- Gilfillan, M. & Bhandari, V. Biomarkers for the diagnosis of neonatal sepsis and necrotizing enterocolitis: clinical practice guidelines. *Early Hum. Dev.* 105, 25–33 (2017)
- Luethy, P. M. & Johnson, J. K. The use of matrix-assisted laser desorption/ionization time-of-flight mass spectrometry (MALDI-TOF MS) for the identification of pathogens causing sepsis. J. Appl. Lab Med. 3, 675–685 (2019).

- 132. Scott, J. S., Sterling, S. A., To, H., Seals, S. R. & Jones, A. E. Diagnostic performance of matrix-assisted laser desorption ionisation time-of-flight mass spectrometry in blood bacterial infections: a systematic review and meta-analysis. *Infect. Dis.* 48, 530–536 (2016).
- 133. Ruiz-Aragón, J. et al. Direct bacterial identification from positive blood cultures using matrix-assisted laser desorption/ionization time-of-flight (MALDI-TOF) mass spectrometry: a systematic review and meta-analysis. Enferm. Infecc. Microbiol Clin. 36, 484–492 (2018).
- Guamán, A. V. et al. Rapid detection of sepsis in rats through volatile organic compounds in breath. J. Chromatogr. B 881-882, 76–82 (2012).
- 135. Fink, T. et al. Volatile organic compounds during inflammation and sepsis in rats: a potential breath test using ion-mobility spectrometry. *Anesthesiology* 122, 117–126 (2015).
- Oeschger, T., McCloskey, D., Kopparthy, V., Singh, A. & Erickson, D. Point of care technologies for sepsis diagnosis and treatment. Lab Chip 19, 728–737 (2019).
- Abbas, M. & El-Manzalawy, Y. Machine learning based refined differential gene expression analysis of pediatric sepsis. *BMC Med. Genomics* 13, 122 (2020).
- Wong, H. R. et al. Prospective clinical testing and experimental validation of the Pediatric Sepsis Biomarker Risk Model. Sci. Transl. Med. 11, eaax9000. https://doi. org/10.1126/scitranslmed.aax9000 (2019).
- 139. Buhimschi, C. S. et al. Proteomic profiling of the amniotic fluid to detect inflammation, infection, and neonatal sepsis. *PLoS Med.* **4**, e18 (2007).
- 140. Buhimschi, C. S. et al. Using proteomics in perinatal and neonatal sepsis: hopes and challenges for the future. *Curr. Opin. Infect. Dis.* **22**, 235–243 (2009).
- Buhimschi, I. A. & Buhimschi, C. S. The role of proteomics in the diagnosis of chorioamnionitis and early-onset neonatal sepsis. *Clin. Perinatol.* 37, 355–374 (2010).
- Ho, J. et al. Pathological role and diagnostic value of endogenous host defense peptides in adult and neonatal sepsis: a systematic review. Shock 47, 673–679 (2017).
- 143. Mangioni, D. et al. Toward rapid sepsis diagnosis and patient stratification: What's new from microbiology and omics science. J. Infect. Dis. 221, 1039–1047 (2020).
- Schmerler, D. et al. Targeted metabolomics for discrimination of systemic inflammatory disorders in critically ill patients. J. Lipid Res. 53, 1369–1375 (2012).
- Slupsky, C. M. et al. Pneumococcal pneumonia: potential for diagnosis through a urinary metabolic profile. J. Proteome Res. 8, 5550–5558 (2009).
- 146. Fanos, V. et al. Urinary (1)H-Nmr and Gc-Ms metabolomics predicts early and late onset neonatal sepsis. Early Hum. Dev. 90(Suppl. 1), S78–83 (2014).
- 147. Cernada, M. et al. Genome-wide expression profiles in very low birth weight infants with neonatal sepsis. *Pediatrics* **133**, e1203–1211 (2014).
- Lu, H. et al. Host genetic variants in sepsis risk: a field synopsis and metaanalysis. Crit. Care 23, 26 (2019).
- 149. Wong, H. R. et al. Biomarkers for estimating risk of hospital mortality and long-term quality-of-life morbidity after surviving pediatric septic shock: a secondary analysis of the life after pediatric sepsis evaluation investigation. *Pediatr. Crit. Care Med.* 22. 8–15 (2021).

- Gharaibeh, F. A., Lahni, P. M., Alder, M. N. & Wong, H. R. P. A. S. in *Pediatric Academic Societies Meeting*.
- Moorman, J. R. et al. Mortality reduction by heart rate characteristic monitoring in very low birth weight neonates: a randomized trial. *J. Pediatr.* 159, 900–906. e901 (2011).
- Griffin, M. P. et al. Abnormal heart rate characteristics preceding neonatal sepsis and sepsis-like illness. *Pediatr. Res.* 53, 920–926 (2003).
- 153. Mithal, L. B. et al. Vital signs analysis algorithm detects inflammatory response in premature infants with late onset sepsis and necrotizing enterocolitis. *Early Hum. Dev.* 117, 83–89 (2018).
- 154. Helguera-Repetto, A. C. et al. Neonatal sepsis diagnosis decision-making based on artificial neural networks. *Front. Pediatr.* **8**, 525 (2020).
- 155. Song, W. et al. A predictive model based on machine learning for the early detection of late-onset neonatal sepsis: development and observational study. JMIR Med. Inf. 8, e15965 (2020).
- Fatmi, A. et al. Mirna-23b as a biomarker of culture-positive neonatal sepsis. Mol. Med. 26, 94 (2020).
- Liu, G., Liu, W. & Guo, J. Clinical significance of Mir-181a in patients with neonatal sepsis and its regulatory role in the lipopolysaccharide-induced inflammatory response. Exp. Ther. Med. 19, 1977–1983 (2020).
- El-Hefnawy, S. M. et al. Biochemical and molecular study on serum miRNA-16A and miRNA- 451 as neonatal sepsis biomarkers. *Biochem. Biophys. Rep.* 25, 100915 (2021).

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#### COMPETING INTERESTS

The authors declare no competing interests.

## **ADDITIONAL INFORMATION**

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