

## The single-cell immune profile throughout gestation and its potential value for identifying women at risk for spontaneous preterm birth

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### ABSTRACT

Precisely timed immune adaptations, observed in the maternal circulation, underpin the notion of an immune clock of human pregnancy that supports its successful progression and completion at delivery. This immune clock is divided into three immunological phases, with the first phase starting at the time of conception and implantation, shifting into the second phase that supports homeostasis and tolerance throughout pregnancy, and culminating in the last phase of labor and parturition. Disruptions of this immune clock are reported in pregnancy complications such as spontaneous preterm birth. However, our understanding of the immune clock preceding spontaneous preterm birth remains scattered. In this review, we describe the chronology of maternal immune cell adaptations during healthy pregnancies and highlight its disruption in spontaneous preterm birth. With a focus on single-cell cytometric, proteomic and transcriptomic approaches, we review recent studies of term and spontaneous preterm pregnancies and discuss the need for future prospective studies aimed at tracking pregnancies longitudinally on a multi-omic scale. Such studies will be critical in determining whether spontaneous preterm pregnancies progress at an accelerated pace or follow a preterm-intrinsic pattern when compared to those delivered at term.

### Introduction

Premature delivery, a condition impacting 10 % of all pregnancies world-wide, is associated with severe adverse outcomes that affect neonatal and long-term health [1–3]. The majority of preterm birth cases (60–70 %) occurs after the spontaneous onset of premature labor with intact membranes or preterm prelabor rupture of membranes (PPROM), which are together considered as spontaneous preterm births (sPTB) [4]. The remaining 30–40 % are medically indicated preterm deliveries (i.e., iatrogenic) [4]. Spontaneous preterm birth is typically associated with intra-amniotic infection, sterile intra-amniotic

inflammation, and a breakdown of maternal-fetal homeostasis [5]. However, for a significant subset of sPTB (20–30 %), the cause remains unidentified (i.e., idiopathic) [1,4–6]. Hence, sPTB remains largely unpredictable due to a lack of reliable biomarkers and an incomplete understanding of the underlying pathobiological mechanisms [7].

In healthy pregnancies, precisely timed cellular immune dynamics can be observed in the peripheral blood over the course of pregnancy and have been proposed as a target for monitoring healthy pregnancy progression, including the onset of physiologic labor [8,9]. The term “immune clock of pregnancy” encompasses such systemic immune dynamics [8]. However, how the immune clock deviates in sPTB and to

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what extent immune dysregulation precedes sPTB remain areas that must be elucidated for the immune clock to be employed in predicting and monitoring sPTB. Deviations from healthy immune dynamics may manifest as a cascade of events that simply occurs earlier in pregnancies that will culminate in sPTB, i.e., as an accelerated immune clock. Alternatively, these immune dysfunctions may follow a preterm-intrinsic pattern that deviates from term gestation.

The goal of this review is to summarize the current understanding of how the peripheral immune clock deviates in spontaneous preterm birth compared to uncomplicated term pregnancies. The contents of this review are systematically approached according to the three primary immunological phases - early pregnancy (first trimester), mid-pregnancy (from the second trimester until the early third trimester), and labor and delivery - to begin to define the immune clock of sPTB. We define the maternal immune clock here as measurements that assess the immune system directly through transcriptomic or cytometry studies of maternal immune cells, and indirectly via plasma/serum measurement of miRNA, proteins, and metabolites.

### **The maternal peripheral immune clock of pregnancy**

To gain an understanding of immune dysfunctions associated with sPTB, we first describe the changes occurring in the maternal peripheral immune system during an uncomplicated, term pregnancy. Pregnancy is a defined period of dramatic physiological, hormonal, and metabolic alterations, which are paralleled by shifts in the maternal immune system [8,10–19]. The maternal-fetal interface dynamically alters its immune cell composition and function over the course of pregnancy (as reviewed extensively by PrabhuDas et al., Yang et al., Gomez-Lopez et al., and Green et al. [20–23]) to establish a local microenvironment conducive to decidualization, implantation, and placentation in early pregnancy, and to support the immunomodulatory processes required for maternal-fetal homeostasis and ultimately parturition [20,21, 23–27]. The systemic immune clock of pregnancy is initiated by hormonal changes occurring during implantation and placentation, and is reinforced when spiral artery remodeling occurs in the human decidua at eight to ten weeks of gestation [28], allowing passage of fetal antigens and placental material, including cell-free fetal DNA and RNA, to the maternal circulation [29–34]. This physiologic change also coincides with an exponential increase in pregnancy-associated hormone concentrations in the circulation [35], which significantly contribute to functional immune adaptations [16,36]. Echoing the immune dynamics at the maternal-fetal interface, the peripheral immune clock of pregnancy can be divided into three immunological phases. The early phase of pregnancy, reflecting the first trimester [ $< 13 + 6$  weeks gestational age (GA)], coincides with conception, implantation, and placentation. The second phase during mid-pregnancy (14–34 weeks GA) reflects a state of pregnancy homeostasis and tolerance. At the latter part of the mid-pregnancy phase, a shift towards preparation for parturition can be observed. The very last phase represents the acute process of labor and delivery. These dynamics, measured in the maternal blood, are well established and have been used to inform computational models to predict GA and time to the onset of labor [8–10,12,14,17,18,37,38].

Numerous studies have reported the specific modulation of individual cell types throughout gestation. For instance, pregnancy is a state of relative neutrophilia [39–41], likely exacerbated throughout gestation by a progressive delay in spontaneous neutrophil apoptosis [42]. Immature-like neutrophils progressively accumulate in the maternal circulation, peaking in the third trimester [43]. Moreover, neutrophils display an altered state of activation during pregnancy [40,44,45], which has been compared to that observed in patients with sepsis [46, 47]. Monocytes, like neutrophils, increase in number and proportion throughout gestation [10], and their subpopulations shift towards increased proportions of the intermediate phenotype [40,48,49]. Type I interferon gene expression in monocytes spikes in very early pregnancy (approximately six to nine weeks), coinciding with the initial release of

fetal material into the maternal circulation, before this signature disappears in the later part of the first trimester [10]. Circulating monocytes display increased expression of genes involved in inflammatory processes, migration, and aging from early to mid and mid to late gestation [50]. Circulating Natural Killer (NK) cells, another type of innate immune cell, progressively increase their expression of genes involved in responses to IFN and viral infection across pregnancy [10]. However, in the last 100 days of pregnancy, NK cell responses to IFN $\alpha$  stimulation are dampened with approaching labor [9]. Further, the proportion of innate-lymphoid cell (ILC) subtypes in the circulation changes throughout pregnancy, with ILC2 becoming the dominant subtype in late gestation [51].

Adaptive immune cell subsets demonstrate pronounced changes with progressing pregnancy. Transitional and B-1 cell frequencies decrease throughout pregnancy while plasmablasts increase [10,37,52]. Functionally, T and B cells overexpress alternative RNA splicing processes and downregulate canonical pathways of adaptive immunity [10]. Signatures of lymphocyte-mediated cytotoxicity gradually decrease over the course of pregnancy [50]. A classic, yet debated, T-cell paradigm describes pregnancy as a state of CD4 Th2 dominance over Th1 and Th17 responses [37,53]; this may be partially due to the enhanced activity of homeostatic cells, such as regulatory T-cells (Tregs) and macrophages, throughout the second phase of pregnancy [5]. Indeed, regulatory and antigen-specific T-cells increase in the maternal circulation as pregnancy progresses [54–56], and tolerogenic adaptations, such as enhanced IL-2-associated STAT5 phosphorylation in CD4 $^{+}$  T-cell subsets, peak in the third trimester [8]. Yet, as labor approaches, the systemic T-cell signature becomes increasingly reflective of an inflammatory state, which is in line with the role of immune activation in this pregnancy phase [12,17]. Immune dynamics of term, and also preterm, labor culminate in an efflux of activated immune cells into the maternal-fetal interface [5,14,26].

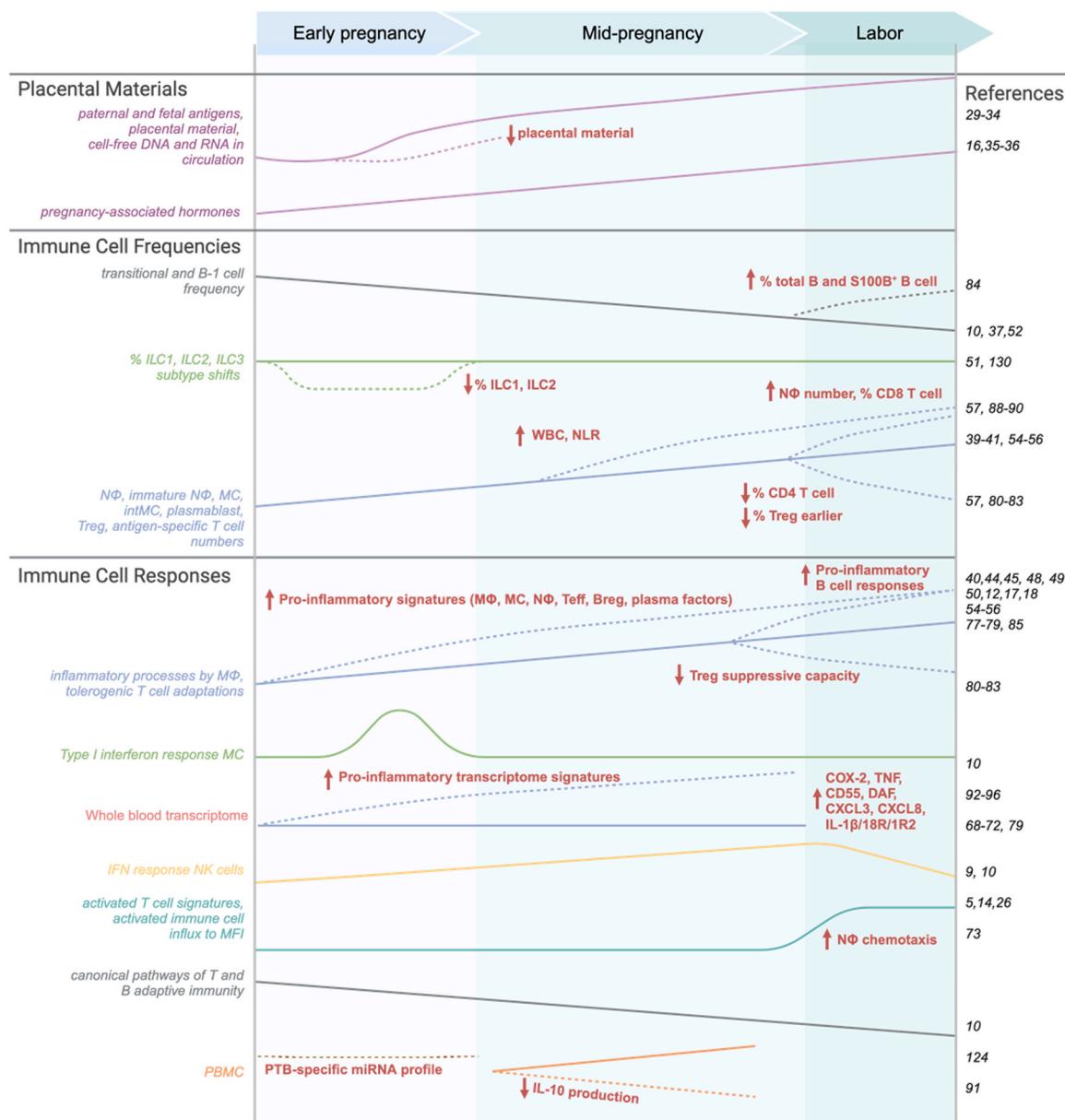
Together, the above studies describing the immune clock of healthy pregnancy support the notion that tracking precisely timed, gestational age-dependent, and labor-specific immune dynamics in the maternal circulation may be used for monitoring of pregnancy progression to identify imbalanced or accelerated immune mechanisms indicative of a risk for sPTB.

### **Deviations in the maternal peripheral immune clock associated with spontaneous preterm birth**

Deviations in the maternal immune clock that may drive sPTB could occur during any phase of pregnancy. During early pregnancy, such deviations could indicate a predisposition to undergo sPTB later in gestation, whereas deviations occurring during mid-pregnancy could indicate an earlier or accelerated parturition process. While early- and mid-pregnancy signatures would indicate immune deviations in individuals who are still asymptomatic, the observation of such signatures near or during active labor might indicate a distinct labor-specific pathology. Below, we describe the sPTB-associated immune deviations that have been identified so far during the different maternal immune clock phases (Fig. 1).

#### *Peripheral immune profiles during spontaneous preterm labor*

The immune profile of sPTB in the maternal circulation has been most extensively studied during the acute process of labor. In both women with term or preterm labor, the absolute numbers of peripheral monocytes and neutrophils are increased as assessed by clinical hematological analyses [57]. Circulating innate immune cell activation [8,9, 12] and infiltration into local tissues [58–62] is a hallmark of both term and preterm labor. However, it is important to note that spontaneous preterm labor (sPTL) is not simply labor that begins prematurely, but likely represents a distinct pathological process that shares a common pathway with labor at term [12,14]. For example, sPTL involves a



**Fig. 1.** The immune clock of human pregnancy in uncomplicated and spontaneous preterm birth pregnancies. Solid lines reflect immune dynamics observed in uncomplicated pregnancy, while bold text in red and dotted lines indicate observations made in pregnancies affected by spontaneous preterm birth. Scarcity of studies on single-cell immune profiles throughout preterm pregnancies, as displayed in this overview, currently limit the opportunity to leverage these dynamics for sPTB prediction. ILC: innate lymphoid cell, Breg: regulatory B cell, WBC: white blood cell, NLR: neutrophil-to-lymphocyte ratio, N $\phi$ : neutrophil, M $\phi$ : macrophage, MC: monocyte, intMC: intermediate monocyte, Treg: CD4 $^{+}$  regulatory T cell, Teff: T effector cell, NK: Natural Killer cell, MFI: maternal-fetal interface, PBMC: peripheral blood mononuclear cell, IL: interleukin.

breakdown of maternal-fetal tolerance mediated by enhanced pro-inflammatory effector T-cell and macrophage responses that can be distinct from those observed in term labor [5, 26, 63–66]. Moreover, these local processes of sPTL are reflected in the peripheral maternal blood immune profile [17, 18, 67–69].

In immune profiling studies, sPTL has been compared to: (1) threatened PTL (regular premature uterine contractions); (2) PPROM; (3) immune profiles of healthy pregnancies carrying to term matched for preterm GA at time of sampling; (4) immune profiles at term in labor (TL); or (5) at term not in labor (TNL, i.e., elective C-section). One study carefully curated cases in four conditions (sPTL, preterm no labor [PTNL/mainly iatrogenic non-labor PTB], TL, and TNL) and performed gene expression profiling of five tissues (chorion, amnion, placenta/villi, decidua, myometrium) as well as maternal and fetal blood [69]. A

unique local uterine signature of immune activation, mainly associated with infection and inflammation, was overrepresented in PTL and not found in any of the other conditions shortly before delivery [69]. The maternal blood reflected these transcriptomic changes occurring with delivery although it showed the lowest proportion of substantial transcript changes (>1 or 2 standard deviations) when compared with local tissues [e.g., decidua, chorion, and amnion (Bukowski et al. [69], meta-analyzed in Vora et al. [68])].

It is important to consider the different comparators and confounding variables across studies when synthesizing a peripheral immune profile of sPTL. sPTL cases are routinely compared either to spontaneous labor at term (sTL) or to non-laboring gestational-age matched samples. The comparison between sPTL and sTL is confounded by the difference in GA. The comparison of sPTL to any non-laboring gestational-age

matched sample is confounded by the absence of labor. As such, an optimal control group for sPTL does not exist. Below, we summarize evidence of preterm signatures in the major immune cell subsets according to the available comparator groups that have been employed in different studies.

Compared with term labor cases, studies report an exaggerated inflammatory response accompanying PTL, in which the immune balance of PTL is shifted towards an innate-dominant transcriptomic blood signature with corresponding dampened adaptive immunity [68]. Maternal whole blood Cyclooxygenase (COX)-2 and tumor necrosis factor (TNF) mRNA expression is elevated in sPTL compared to TL [70]. Moreover, peripheral blood leukocytes express higher mRNA levels of CD55, an activation marker and negative regulator of membrane complex formation, in idiopathic or infection-associated PTL relative to non-PTL controls, although it was not reported whether controls were GA-matched or term labor cases [71].

Compared with preterm cases not in labor, women with late PTL (34–37 weeks GA) show increased gene expression of Decay-Accelerating Factor (DAF), an inhibitor of the complement pathway, among their peripheral leukocytes, suggesting dampening of this inflammatory pathway [72]. Peripheral blood neutrophils of women with PTL exhibit enhanced migratory capacity towards a fetal membrane substrate compared with neutrophils taken prior to the active process of labor from women with PPROM or TNL deliveries [73]. Moreover, PTL-derived neutrophils show enhanced activation and adhesion marker expression, Toll Like Receptor (TLR)-4 expression, and increased capacity for oxidative burst following stimulation compared to GA-matched healthy cases [74,75]. Neutrophil numbers have been proposed as a prognostic marker for PTB through calculation of the neutrophil-lymphocyte ratio (NLR), which is significantly elevated during mid-to-late gestation in pregnancies culminating in sPTL and PTB [76].

Peripheral blood monocytes from PTL cases are potent reactive oxygen species (ROS) producers when stimulated compared with monocytes from preterm non-laboring women [57,74]. More CD14<sup>+</sup> monocytes expressed TLR4 and at a higher abundance per cell in PTL cases compared with GA-matched non-laboring controls [77]. The monocyte gene expression profile in sPTL compared with GA-matched non-laboring pregnancies revealed an enrichment of miRNA target genes involved in ‘positive regulation of Interleukin (IL)-2 production’, ‘positive regulation of mononuclear cell proliferation’, and ‘negative regulation of protein kinase activity’ [78]. Moreover, the RNA expression of C-X-C-motif ligand 3 (CXCL3), CXCL8, Interleukin (IL)-1 $\beta$ , IL-18R, and IL-1R2 in both whole peripheral blood and peripheral monocytes was positively correlated with PTL [79]. Such observations are reaffirmed by the reported enrichment of gene expression signatures from macrophages and monocytes in sPTL compared with other immune subsets [12].

Among the adaptive immune cell subsets, absolute lymphocyte numbers remain stable, however, their proportions are decreased relative to increased neutrophil and monocyte numbers in labor cases compared to cases not in labor, regardless of gestational age at birth [57]. Within the T-cell compartment, one study reported a PTL-specific shift towards increased CD8<sup>+</sup> and decreased CD4<sup>+</sup> circulating T-cell frequencies [57]. Despite altered frequencies, an activated T-cell gene expression signature is enhanced in PTL compared to GA-matched non-laboring pregnancies [12]. Idiopathic or chorioamnionitis-associated PTL at 28–36 weeks of gestation is associated with decreased proportions of CD4<sup>+</sup>CD25<sup>+</sup>FoxP3<sup>+</sup> Tregs in the circulation compared to GA-matched controls or threatened PTL cases (regular uterine contractions) [80]. However, Treg proportions from sPTL cases resemble those from TL cases, supporting the notion of an immune regulatory shift that occurs as part of the common pathway of parturition [80]. This observation is further reinforced by the correlation of decreasing CD4<sup>+</sup>CD25<sup>int/hi</sup>CD127<sup>lo</sup> Treg proportions with a shorter time to delivery interval in patients with cervical insufficiency

and/or sPTL [81]. Phenotypically, Foxp3<sup>+</sup> Tregs from PTL cases (occurring between 24 and 36 GA) show decreased HLA-DR expression and suppressive capacity relative to cases prior to active labor (PPROM) and GA-matched term controls [82,83], potentially indicating altered function. Together, this indicates an association of Treg phenotype and function with the state of labor.

Fewer studies on circulating B cells in sPTL are available. Significantly increased total B cell and S100B<sup>+</sup> B cell frequencies can be observed in sPTB cases (preterm, laboring) compared to TNL (term, non-laboring) controls [84]. A significantly higher maternal anti-HLA class I seropositivity was noted in sPTL at 34 weeks GA compared with PPROM cases and normal term deliveries with or without labor [85].

While changes in the profile of circulating NK cells are associated with pregnancy complications such as preeclampsia, recurrent pregnancy loss, and implantation failure [86], their role in PTB is less clear. Peripheral NK cell proportions increase in both preterm or term labor compared to cases without labor [57], and, together with other leukocytes, NK cells are recruited to the human chorioamniotic membranes in term labor [62]. Consistent with these observations, an NK cell signature was reported to diminish in mid-gestation and then peak as the end of pregnancy approaches [12]. Moreover, this signature was significantly increased in TL cases compared to TNL; however, such a change was not reported in sPTL cases [12]. A definitive role for NK cells in preterm birth remains to be fully demonstrated.

Taken together, these studies of the immune signature of sPTB at time of labor and delivery indicate a general loss of immune regulation, including in innate immune cells, resulting in an enhanced pro-inflammatory state.

#### *Peripheral immune profiles preceding spontaneous preterm birth during mid-pregnancy (2nd and first half of 3rd trimester)*

To computationally identify biomarker profiles of preterm birth in individuals without any sPTB symptoms during mid-pregnancy, peripheral maternal blood immune profiles of sPTB obtained at the time of diagnosis [17,18,67–69] have been successfully mapped onto maternal blood obtained during the second trimester [12,14,19,68]. This suggests that mechanisms of labor may be detectable in the maternal blood before the onset of preterm labor symptoms. In other words, there is computational support for the notion that in mid-pregnancy, sPTB immune profiles can be expected to be distinguishable from healthy mid-pregnancy term pregnancies. Indeed, Stelzer et al. have shown that maternal proteome, metabolome, and immune signatures assessed during the last 100 days of pregnancy are able to predict the time to onset of labor in both term and a small number of preterm labor cases [9]. Similarly, another study found mid-trimester proteomic biomarkers in serum to be correlated with time to delivery in sPTB cases [87]. These studies suggest that regulation of the maternal immune clock, particularly the shift from increased immune activation to dampened immune responsiveness in innate immune populations four weeks before the onset of labor, is at least partially shared between term and preterm labor [9]. As such, measurements during the second phase of pregnancy can uncover an earlier or accelerated parturition process in asymptomatic pregnant individuals who end up delivering preterm. For instance, significantly increased white blood cell (WBC) counts and neutrophil-to-lymphocyte ratio (NLR) together with lower whole blood lymphocyte counts and lymphocyte-to-monocyte ratio (LMR) can be detected during the second to third trimester (17–32 weeks GA) in asymptomatic pregnant individuals who will deliver preterm compared to pregnant individuals who deliver at term [88–90]. This indicates a shift towards increased innate immunity and systemic inflammation during mid-pregnancy. These changes in maternal blood cell counts were detected on average 70 days prior to hospitalization for the study by Ma et al. and four weeks for Park et al., and were able to predict the risk of sPTB. In parallel, PBMC-derived IL-10, induced by *in vitro* LPS stimulation, decreased from 16 to 22 weeks GA to 25–28 weeks GA in

pregnant individuals who delivered before 35 weeks GA, while IL-10 production increased in those who delivered at term, indicating a potential dysfunction of homeostatic processes in preterm cases [91].

The mid-pregnancy shift towards inflammation in asymptomatic PTB cases has also been reported by transcriptomic studies. Maternal whole blood transcriptome signals, collected between 14 and 36 weeks of gestation and binned by GA, show that inflammatory transcripts are upregulated in asymptomatic individuals who will undergo sPTB compared to term delivery [92,93]. Gene set enrichment of differentially expressed genes from sPTB vs. term delivery identified an immune signature (PPARG1-FOXP3 gene set) associated with sPTB at 20 weeks GA [94]. Another transcriptomic study, reanalyzing Heng et al., 2016 data, tested whether genetic variants previously associated with GA and PTB were different in terms of their peripheral blood expression [95]. They found that early B cell factor 1 (EBF1) and selenocysteine-tRNA-specific eukaryotic elongation factor (EEFSEC) were downregulated in sPTB pregnancies collected between 17 and 23 weeks' GA. Similarly, the expression of genes involved in the inflammatory response (e.g., B2M, RUNX3, TLR4, CXCR3 TLR2, and IL10) measured before 28 weeks GA contributed to the prediction sPTB (<34 weeks) and correlated with their potential miRNA regulators [96].

The maternal soluble profile in mid-pregnancy, i.e., serum/plasma analytes during the second trimester, has received much attention when searching for predictive biomarkers. Across these studies, the general theme of an increased inflammatory environment before the onset of symptoms culminating in sPTB has been repeatedly demonstrated. This environment is characterized by elevated levels of cytokines [97,98], growth factors and enzymes (e.g., TGF $\beta$ , G-CSF, MMP-9, ITIH4) [99–102], and complement factors (e.g., C5a, thrombin antithrombin) [87,103]. G-CSF and thrombin-antithrombin remain associated with sPTB at 28 weeks gestation, i.e., the beginning of the third trimester [104,105]. C-reactive protein (CRP) levels are increased in the first trimester and remain elevated in the second trimester in sPTB cases [106–109]. However, the inflammatory profile is accompanied by changes in other systems such as serum eicosanoid lipid profiles [109], alkane metabolites such as undecane [110], and proteins involved in metabolism and endocrine function, such as insulin-like growth factor-binding protein 4 (IGFBP4), sex hormone-binding globulin (SHBG), and corticotropin-releasing hormone (CRH) [87,101]. CRH levels, suggested as an indicator of the placental clock of pregnancy [111] and enabling the neuroendocrine communication between placenta and brain, have been tested in multiple studies and found to be associated with sPTB in the first half of the second trimester [112,113] and in the early third trimester [114]. Yet, CRH failed to predict sPTB in the second trimester in high-risk recurrent sPTB patients [115]. Standard blood lipid measurements show LDL, HDL, and cholesterol concentrations to be associated with sPTB, pointing towards metabolic imbalances in mid-pregnancy [7].

Plasma miRNA profiles at 20–24 weeks GA in sPTB cases are profoundly different from term pregnancies, with specific miRNAs being completely absent in sPTB [116] or clustering in a PTB- and chromosome-specific profile, suggesting co-regulated expression [117]. More specifically, slight differences in miRNA cargo were observed in placental exosomes at 15–18 weeks GA in sPTB cases, as compared to term pregnancies [118]. These results are linked to the general dysregulation of miRNA profiles analyzed over the course of preterm pregnancies [119].

Last, integrating known clinical risk factors and local cervical indicators of PTB risk improves the identification of sPTB cases: measuring cervicovaginal IL-6 and serum ferritin, TNF,  $\alpha$ -fetoprotein, alkaline phosphatase, or G-CSF together with cervical length or fetal fibronectin enhances the clinical ability to predict sPTB [120–123].

Overall, the involvement of multiple biological modalities that interact with immune cell function, as measurable in the maternal circulation, imply that preterm birth is preceded by differential adaptations to pregnancy that extend beyond immune dysregulation.

#### *Peripheral immune profiles preceding spontaneous preterm birth in early pregnancy (first trimester)*

Measurements of the immune system obtained at the start of pregnancy offer the promise of identifying early and actionable biomarkers for estimating the risk for sPTB. Most first trimester PTB studies to date have identified plasma/serum markers to screen for preterm birth signatures, while three studies have measured cellular attributes in the first trimester maternal blood [7]. First trimester miRNA profiles expressed in PBMC proved to be predictive of sPTB before 35 weeks GA [124]. These miRNAs regulate genes that are enriched in pathways related to transcription, membrane trafficking, the circadian clock, and estrogen signaling - all basic processes of cellular functionality. Further, whole genome RNA expression analyses of blood via microarray were most predictive of sPTB when conducted in the first trimester compared to the second or third. Such prediction was based on an enhanced IL-6 gene expression signature, suggesting an inflammation-skewed environment present from the outset of pregnancy [93]. This is in line with IL-6 being the most potent biomarker of intra-amniotic inflammation associated with preterm labor when measured in the amniotic fluid [125–128], while a similar correlation has been reported between intra-amniotic inflammation and maternal plasma IL-6 [129]. Lastly, decreased frequencies of all three types of innate lymphoid cells (ILC) were observed in the circulation of women in the first trimester who will experience sPTB [130], suggesting an increased recruitment to the maternal-fetal interface where they might be contributing to pathological processes, culminating in the increased ILC frequencies that have been reported at time of delivery [131].

To broaden the context around these isolated cellular measurements, it is insightful to look at the soluble mediator profile of sPTB, which has been found to be different from term pregnancies. Immune activating and inflammatory markers in first trimester serum are associated with PTB [132] together with complement cascade components [133–135], phospho- and glycoproteome components [136], and specifically G-CSF, MIF, IL-1 $\beta$ , IL-6, IL-10, MMP-9, and VCAM-1 [105,137–140]. However, other studies do not report a specific cytokine or progesterone-induced blocking factor (PIBF) dysregulation early in pregnancy [108, 141–143] or found them to only be present in the context of extreme maternal body-mass-indices (BMI) [98]. Increased levels of plasma CRP, a circulating indicator of inflammation, during early gestation were associated with sPTB by some studies [137,144], while others found no difference [108,141,145].

The amount of cell-free maternal/fetal DNA in the first trimester maternal circulation was not different between healthy and pathologic pregnancies [146]; however, the profile of miRNA expression in plasma exosomes during early pregnancy was drastically different between sPTB and term pregnancies and continued with dynamically different trajectories until delivery, with TGF $\beta$ , p53, and glucocorticoid receptor signaling among the differentially expressed processes compared to term pregnancies [119]. Furthermore, circulating metabolites found to be different in early sPTB pregnancies belonged to pathways of inflammation-related tryptophan metabolism [142] and Treg-mediated modulation of antigen-presenting cell functions [147]. Lastly, circulating markers released by the placenta but not linked with inflammation per se, such as pregnancy-associated plasma protein-A (PAPP-A), and markers pointing towards imbalances in immune-modulating metabolism, such as lipid markers linked to insulin, have been associated with preterm birth when measured during the first trimester [7].

Thus, despite numerous advances in characterizing the systemic signature of sPTB in the first trimester of pregnancy, there remains a need for comprehensive, high-dimensional approaches that prospectively follow pregnancies until delivery to identify reliable biomarkers that can then be monitored during early pregnancy to evaluate sPTB risk.

## Conclusion and considerations for future research assessments

Our understanding of peripheral immune clock deviations tracking with spontaneous preterm birth is incomplete. Current knowledge is insufficient for delineating the precise timeline of immunological events preceding sPTB, given that: (1) systemic studies at the cellular level are still few; (2) the majority of current studies perform cross-sectional analyses of data collected over relatively short or longer (masking temporal dynamics) time frames within a trimester; and (3) longitudinal data (or analyses of such) are critically lacking. Thus, whether spontaneous preterm pregnancies progress at an accelerated pace or follow a preterm-intrinsic pattern when compared to term pregnancies cannot be discerned based on currently existing data. Future prospective studies aimed at tracking pregnancies longitudinally will be critical to identifying early and actionable biomarkers and therapeutic candidates for sPTB risk assessment and treatment.

Inflammation that is distinct from the inflammatory signatures of term delivery is associated with spontaneous preterm labor at delivery. Yet, it remains unclear whether a canonical inflammatory profile occurs in all phenotypes of this syndrome before the onset of symptoms, as the changes in lipid metabolism, endocrine factors, and placental miRNA cargo described above all suggest multifocal involvement in the pathophysiology of preterm birth. It is imperative to consider that preterm birth is a syndrome with a range of underlying pathophysiology. Available studies do not always stratify between known etiologies of sPTB, which may include intraamniotic infection, sterile inflammation, or fetal immune activation [1,5]. This limitation may explain discrepancies of sPTB-associated markers between studies, hindering the description of an immune profile preceding sPTB and identification of reliable biomarkers. One example where the peripheral immune clock profile is impacted by preterm birth etiologies are cases with acute histologic chorioamnionitis that present with a more pronounced inflammatory phenotype compared to cases without, which is also dependent on factors such as GA or maternal weight [97,106]. Another example from a recent single-cell study suggests that placental signatures detectable in the maternal circulation of pregnancies who ultimately undergo sPTL or PPROM involve both shared and distinct signatures, depending on the sPTB subset [14]. These examples highlight the necessity for reporting and distinguishing sPTB subsets, whose specific underlying mechanisms may precipitate in differing immune profiles. In addition, while maternal blood is an easily accessible sample, monitoring local processes, such as the cervicovaginal environment including cervical parameters, can yield additional puzzle pieces to elucidate biomarkers of the immune clock of preterm pregnancy. This strategy promises to lead to clinical improvements [120–123]. Similarly, longitudinal studies which track not just clinical outcome(s), but also placental gross and histologic pathology in a systematic manner will yield significantly more insights into the underlying processes of sPTB at the maternal-fetal interface, potentially reflected and measurable in the maternal peripheral circulation [148–150]. Lastly, going forward, assessing the risk for sPTB and tracking its immune clock will require the consideration of other pre-pregnancy risk factors, such as BMI and nutritional status [151], stress perception [152], physical activity [153], microbiome [154], and (epi)genetics [155]. This will determine the extent to which the immune system can serve as the sole diagnostic or key therapeutic target in the early identification of asymptomatic pregnancies at risk of preterm birth.

## CRediT authorship contribution statement

**Diop Maïgane:** Writing – review & editing, Visualization, Data curation. **Stelzer Ina:** Writing – review & editing, Writing – original draft, Visualization, Project administration, Investigation, Data curation, Conceptualization. **Feyaerts Dorien:** Writing – review & editing, Writing – original draft, Visualization, Project administration, Investigation, Data curation, Conceptualization. **Gomez-Lopez Nardhy:**

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## Declaration of Competing Interest

The authors declare that no conflicts of interest exist.

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## References

- [1] Romero R, Dey SK, Fisher SJ. Preterm labor: one syndrome, many causes. *Science* 2014;345(6198):760–5. PMID: PMC4191866.
- [2] Ohuma EO, Moller AB, Bradley E, Chakwera S, Hussain-Alkhatib L, Lewin A, Okwaraji YB, Mahanani WR, Johansson EW, Lavin T, Fernandez DE, Domínguez GG, de Costa A, Cresswell JA, Krasovec J, Lawn JE, Blencowe H, Requejo J, Moran AC. National, regional, and global estimates of preterm birth in 2020, with trends from 2010: a systematic analysis. *Lancet* 2023;402(10409): 1261–71. PMID: 37805217.
- [3] Perin J, Mulick A, Yeung D, Villavicencio F, Lopez G, Strong KL, Prieto-Merino D, Cousens S, Black RE, Liu L. Global, regional, and national causes of under-5 mortality in 2000–19: an updated systematic analysis with implications for the Sustainable Development Goals. *Lancet Child Adolesc Health* 2022;6(2):106–15. PMID: PMC8786667.
- [4] Goldenberg RL, Culhane JF, Iams JD, Romero R. Epidemiology and causes of preterm birth. *Lancet* 2008;371(9606):75–84. PMID: PMC7134569.
- [5] Gomez-Lopez N, Galaz J, Miller D, Farias-Jofre M, Liu Z, Arenas-Hernandez M, Garcia-Flores V, Shaffer Z, Greenberg JM, Theis KR, Romero R. The immunobiology of preterm labor and birth: intra-amniotic inflammation or breakdown of maternal-fetal homeostasis. *Reproduction* 2022;164(2):R11–45. PMID: PMC9233101.
- [6] Barros FC, Papageorgiou AT, Victora CG, Noble JA, Pang R, Iams J, Cheikh Ismail L, Goldenberg RL, Lambert A, Kramer MS, Carvalho M, Conde-Agudelo A, Jaffer YA, Bertino E, Gravett MG, Altman DG, Ohuma EO, Purwar M, Frederick IO, Bhutta ZA, Kennedy SH, Villar J. International fetal and newborn growth consortium for the 21st century. The distribution of clinical phenotypes of preterm birth syndrome: implications for prevention. *JAMA Pediatr* 2015;169(3): 220–9. PMID: 25561016.
- [7] Hornaday KK, Wood EM, Slater DM. Is there a maternal blood biomarker that can predict spontaneous preterm birth prior to labour onset? A systematic review. *PLoS One* 2022;17(4):e0265853. PMID: PMC8979439.
- [8] Aghaeipour N, Ganio EA, McIlwain D, Tsai AS, Tingle M, Van Gassen S, Gaudillière DK, Baca Q, McNeil L, Okada R, Ghaemi MS, Furman D, Wong RJ, Winn VD, Druzin ML, El-Sayed YY, Quaintance C, Gibbs R, Darmstadt GL, Shaw GM, Stevenson DK, Tibshirani R, Nolan GP, Lewis DB, Angst MS, Gaudillière B. An immune clock of human pregnancy. *Sci Immunol* 2017;2(15): eaan2946. PMID: PMC5701281.
- [9] Stelzer IA, Ghaemi MS, Han X, Ando K, Hédon JJ, Feyaerts D, Peterson LS, Rumer KK, Tsai ES, Ganio EA, Gaudillière DK, Tsai AS, Choisy B, Gaigne LP, Verdonk F, Jacobsen D, Gavasso S, Traber GM, Ellenberger M, Stanley N, Becker M, Culos A, Fallahzadeh R, Wong RJ, Darmstadt GL, Druzin ML, Winn VD,

- Gibbs RS, Ling XB, Sylvester K, Carvalho B, Snyder MP, Shaw GM, Stevenson DK, Contrepois K, Angst MS, Aghaeepour N, Gaudillière B. Integrated trajectories of the maternal metabolome, proteome, and immune predict labor onset. *Sci Transl Med* 2021;13(592):eabd9898. PMCID: PMC8136601.
- [10] Chen D, Wang W, Wu L, Liang L, Wang S, Cheng Y, Zhang T, Chai C, Luo Q, Sun C, Zhao W, Lv Z, Gao Y, Wu X, Sun N, Zhang Y, Zhang J, Chen Y, Tong J, Wang X, Bai Y, Sun C, Jin X, Niu J. Single-cell atlas of peripheral blood mononuclear cells from pregnant women. *Clin Transl Med* 2022;12(5):e821. PMCID: PMC9076016.
- [11] Monteiro C, Kasahara T, Sacramento PM, Dias A, Leite S, Silva VG, Gupta S, Agrawal A, Bento CAM. Human pregnancy levels of estrogen and progesterone contribute to humoral immunity by activating TFH /B cell axis. *Eur J Immunol* 2021;51(1):167–79. PMID: 33012073.
- [12] Pique-Regi R, Romero R, Tarca AL, Sendler ED, Xu Y, Garcia-Flores V, Leng Y, Luca F, Hassan SS, Gomez-Lopez N. Single cell transcriptional signatures of the human placenta in term and preterm parturition. *Elife* 2019;8:e52004. PMCID: PMC6949028.
- [13] Pique-Regi R, Romero R, Garcia-Flores V, Peyvandipour A, Tarca AL, Pusod E, Galaz J, Miller D, Bhatti G, Para R, Kanninen T, Hadaya O, Paredes C, Motomura K, Johnson JR, Jung E, Hsu CD, Berry SM, Gomez-Lopez N. A single-cell atlas of the myometrium in human parturition. *JCI Insight* 2022;7(5):e153921. PMCID: PMC8983148.
- [14] Garcia-Flores V, Romero R, Tarca AL, Peyvandipour A, Xu Y, Galaz J, Miller D, Chaiworapongsaa T, Chaemsathong P, Berry SM, Awonuga AO, Bryant DR, Pique-Regi R, Gomez-Lopez N. Deciphering maternal-fetal cross-talk in the human placenta during parturition using single-cell RNA sequencing. *Sci Transl Med* 2024;16(729):eadh8335. PMID: 38198568.
- [15] Abu-Raya B, Michalski C, Sadarangani M, Lavoie PM. Maternal immunological adaptation during normal pregnancy. *Front Immunol* 2020;11:575197. PMCID: PMC7579415.
- [16] Robinson DP, Klein SL. Pregnancy and pregnancy-associated hormones alter immune responses and disease pathogenesis. *Horm Behav* 2012;62(3):263–71. PMCID: PMC3376705.
- [17] Tarca AL, Romero R, Xu Z, Gomez-Lopez N, Erez O, Hsu CD, Hassan SS, Carey VJ. Targeted expression profiling by RNA-Seq improves detection of cellular dynamics during pregnancy and identifies a role for T cells in term parturition. *Sci Rep* 2019;9(1):848. PMCID: PMC6351599.
- [18] Tarca A.L., Pataki B.A., Romero R., Sirota M., Guan Y., Kutum R., Gomez-Lopez N., Done B., Bhatti G., Yu T., Andreoletti G., Chaiworapongsaa T., DREAM Preterm Birth Prediction Challenge Consortium, Hassan SS, Hsu CD, Aghaeepour N, Stolovitzky G, Csabai I, Costello JC. Crowdsourcing assessment of maternal blood multi-omics for predicting gestational age and preterm birth. *Cell Rep Med*; 2021 Jun 15;2(6):100323. PMCID: PMC8233692.
- [19] Gomez-Lopez N, Romero R, Galaz J, Bhatti G, Done B, Miller D, Ghita C, Motomura K, Farias-Jofre M, Jung E, Pique-Regi R, Hassan SS, Chaiworapongsaa T, Tarca AL. Transcriptome changes in maternal peripheral blood during term parturition mimic perturbations preceding spontaneous preterm birth. *Biol Reprod* 2022;106(1):185–99. PMCID: PMC8897989.
- [20] PrabhuDas M, Bonney E, Caron K, Dey S, Erlebacher A, Fazleabas A, Fisher S, Golos T, Matzuk M, McCune JM, Mor G, Schulz L, Soares M, Spencer T, Strominger J, Way SS, Yoshinaga K. Immune mechanisms at the maternal-fetal interface: perspectives and challenges. *Nat Immunol* 2015;16(4):328–34. PMCID: PMC5070970.
- [21] Yang F, Zheng Q, Jin L. Dynamic function and composition changes of immune cells during normal and pathological pregnancy at the maternal-fetal interface. *Front Immunol* 2019;10:2317. PMCID: PMC6813251.
- [22] Green ES, Arck PC. Pathogenesis of preterm birth: bidirectional inflammation in mother and fetus. *Semin Immunopathol* 2020;42(4):413–29. PMCID: PMC7508962.
- [23] Gomez-Lopez N, StLouis D, Lehr MA, Sanchez-Rodriguez EN, Arenas-Hernandez M. Immune cells in term and preterm labor. *Cell Mol Immunol* 2014; 11(6):571–81. ed. 2014 Nov.
- [24] Zhou JZ, Way SS, Chen K. Immunology of the uterine and vaginal mucosae. *Trends Immunol* 2018;39(4):302–14. PMID: 29433961.
- [25] Peterson LS, Stelzer IA, Tsai AS, Ghaemi MS, Han X, Ando K, Winn VD, Martinez NR, Contrepois K, Moufarrej MN, Quake S, Relman DA, Snyder MP, Shaw GM, Stevenson DK, Wong RJ, Arck P, Angst MS, Aghaeepour N, Gaudillière B. Multiomic immune clockworks of pregnancy. *Semin Immunopathol* [Internet] 2020;4. Available from: (<https://www.ncbi.nlm.nih.gov/pubmed/32020337>).
- [26] Miller D, Garcia-Flores V, Romero R, Galaz J, Pique-Regi R, Gomez-Lopez N. Single-cell immunobiology of the maternal-fetal interface. *J Immunol* 2022;209(8):1450–64. PMCID: PMC9536179.
- [27] Erlebacher A. Immunology of the maternal-fetal interface. *Annu Rev Immunol* 2013;31(1):387–411. PMID: 23298207.
- [28] Pijnenborg R, Dixon G, Robertson WB, Brosens I. Trophoblastic invasion of human decidua from 8 to 18 weeks of pregnancy. *Placenta* 1980;1(1):3–19. PMID: 7443635.
- [29] Lo YM, Corbett N, Chamberlain PF, Rai V, Sargent IL, Redman CW, Wainscoat JS. Presence of fetal DNA in maternal plasma and serum. *Lancet* 1997; 350(9076):485–7. ed. 1997 Aug 16.
- [30] Ngo TTM, Moufarrej MN, Rasmussen MH, Camunas-Soler J, Pan W, Okamoto J, Neff NF, Liu K, Wong RJ, Downes K, Tibshirani R, Shaw GM, Skotte L, Stevenson DK, Biggio JR, Elovitz MA, Melby M, Quake SR. Noninvasive blood tests for fetal development predict gestational age and preterm delivery. *Science* 2018;360(6393):1133–6. PMID: 29880692.
- [31] Bianchi DW, Lo YM. Fetal-maternal cellular and plasma DNA trafficking: the Yin and the Yang. *Ann N Y Acad Sci* 2001;945:119–31. PMID: 11708465.
- [32] Bianchi DW, Williams JM, Sullivan LM, Hanson FW, Klinger KW, Shuber AP. PCR quantitation of fetal cells in maternal blood in normal and aneuploid pregnancies. *Am J Hum Genet* 1997;61(4):822–9. PMCID: PMC1715976.
- [33] Kinder JM, Stelzer IA, Arck PC, Way SS. Immunological implications of pregnancy-induced microchimerism. 2017/05/10 ed *Nat Rev Immunol* 2017;17(8):483–94.
- [34] Kang M, Blenkiron C, Chamley LW. The biodistribution of placental and fetal extracellular vesicles during pregnancy following placentation. *Clin Sci (Lond)* 2023;137(5):385–99. PMCID: PMC10017278.
- [35] Tal R, Taylor H. Endocrinology of Pregnancy. Feingold KR, Anawalt B, Blackman MR, et al, editors *Endotext* [Internet]. South Dartmouth (MA): MDText.com, Inc.; 2000. Available from: (<https://www.ncbi.nlm.nih.gov/books/NBK278962/>).
- [36] Motomura K, Miller D, Galaz J, Liu TN, Romero R, Gomez-Lopez N. The effects of progesterone on immune cellular function at the maternal-fetal interface and in maternal circulation. *J Steroid Biochem Mol Biol* 2023;229:106254. PMCID: PMC10038932.
- [37] Apps R, Kotliarov Y, Cheung F, Han KL, Chen J, Biancotto A, Babyak A, Zhou H, Shi R, Barnhart L, Osgood SM, Belkaid Y, Holland SM, Tsang JS, Zerbe CS. Multimodal immune phenotyping of maternal peripheral blood in normal human pregnancy. *JCI Insight* 2020;5(7). PMID: 32163376.
- [38] Gomez-Lopez N, Romero R, Hassan SS, Bhatti G, Berry SM, Kusanovic JP, Pacora P, Tarca AL. The cellular transcriptome in the maternal circulation during normal pregnancy: a longitudinal study. *Front Immunol* 2019;10:2863. PMID: 31921132.
- [39] Wright ML, Goin DE, Smed MK, Jewell NP, Nelson JL, Olsen J, Hetland ML, Zoffmann V, Jawaheer D. Pregnancy-associated systemic gene expression compared to a pre-pregnancy baseline, among healthy women with term pregnancies. *Front Immunol* 2023;14:1161084. PMCID: PMC10277629.
- [40] Farias-Jofre M, Romero R, Galaz J, Xu Y, Tao L, Demery-Poulos C, Arenas-Hernandez M, Bhatti G, Liu Z, Kawahara N, Kanninen T, Shaffer Z, Chaiworapongsaa T, Theis KR, Tarca AL, Gomez-Lopez N. Pregnancy tailors endotoxin-induced monocyte and neutrophil responses in the maternal circulation. *Inflamm Res* 2022;71(5–6):653–68. PMCID: PMC9021564.
- [41] Luppi P, Haluszczak C, Trucco M, Deloia JA. Normal pregnancy is associated with peripheral leukocyte activation. *Am J Reprod Immunol* 2002;47(2):72–81. PMID: 11900591.
- [42] von Dadelszen P, Watson RW, Noorwali F, Marshall JC, Parodo J, Farine D, Lye SJ, Ritchie JW, Rotstein OD. Maternal neutrophil apoptosis in normal pregnancy, preeclampsia, and normotensive intrauterine growth restriction. *Am J Obstet Gynecol* 1999;181(2):408–14. PMID: 10454692.
- [43] Blazkova J, Gupta S, Liu Y, Gaudilliere B, Ganio EA, Bolen CR, Saar-Dover R, Fragiadakis GK, Angst MS, Hasni S, Aghaeepour N, Stevenson D, Baldwin N, Anguiano E, Chauassabel D, Altman MC, Kaplan MJ, Davis MM, Furman D. Multicenter systems analysis of human blood reveals immature neutrophils in males and during pregnancy. *J Immunol* 2017;198(6):2479–88. PMCID: PMC5337813.
- [44] Naccasha N, Gervasi MT, Chaiworapongsaa T, Berman S, Yoon BH, Maymon E, Romero R. Phenotypic and metabolic characteristics of monocytes and granulocytes in normal pregnancy and maternal infection. *Am J Obstet Gynecol* 2001;185(5):1118–23. PMID: 11717644.
- [45] Zhang J, Shynola O, Sabra S, Bang A, Briollais L, Lye SJ. Immunophenotyping and activation status of maternal peripheral blood leukocytes during pregnancy and labour, both term and preterm. *J Cell Mol Med* 2017;21(10):2386–402. PMCID: PMC5618694.
- [46] Sacks GP, Studena K, Sargent K, Redman CW. Normal pregnancy and preeclampsia both produce inflammatory changes in peripheral blood leukocytes akin to those of sepsis. *Am J Obstet Gynecol* 1998;179(1):80–6. PMID: 9704769.
- [47] Sharma S, Rodrigues PRS, Zaher S, Davies LC, Ghazal P. Immune-metabolic adaptations in pregnancy: a potential stepping-stone to sepsis. *EBioMedicine* 2022;86:104337. PMCID: PMC9782817.
- [48] Groen B, van der Wijk AE, van den Berg PP, Lefrandt JD, van den Berg G, Sollie KM, de Vos P, Links TP, Faas MM. Immunological adaptations to pregnancy in women with type 1 diabetes. *Sci Rep* 2015;5:13618. PMCID: PMC4585728.
- [49] Melgert BN, Spaans F, Borghuis T, Klok PA, Groen B, Bolt A, de Vos P, van Pampus MG, Wong TY, van Goor H, Bakker WW, Faas MM. Pregnancy and preeclampsia affect monocyte subsets in humans and rats. *PLoS One* 2012;7(9):e45229. PMCID: PMC3441708.
- [50] Liu X, Zhu L, Huang Z, Li Z, Duan R, Li H, Xie L, Ding W, Chen B, Gao Y, Su J, Wang X, Su W. A dynamic peripheral immune landscape during human pregnancy. *Fundam Res* 2022. S2667325822002813.
- [51] Zhao Y, Zhu Y, Chen X, Lin H, Qin N, Zhou Z, Liu H, Hao Y, Zhou C, Liu X, Jin L, Sheng J, Huang H. Circulating innate lymphoid cells exhibit distinctive distribution during normal pregnancy. *Reprod Sci* 2022;29(4):1124–35. PMCID: PMC8907087.
- [52] Bhat NM, Mithal A, Bieber MM, Herzenberg LA, Teng NN. Human CD5+ B lymphocytes (B-1 cells) decrease in peripheral blood during pregnancy. *J Reprod Immunol* 1995;28(1):53–60. PMID: 7537825.
- [53] Sykes L, MacIntyre DA, Yap XJ, Teoh TG, Bennett PR. The Th1:Th2 dichotomy of pregnancy and preterm labour. *Mediat Inflamm* 2012;2012:967629. PMCID: PMC3376783.
- [54] Somerset DA, Zheng Y, Kilby MD, Sansom DM, Drayson MT. Normal human pregnancy is associated with an elevation in the immune suppressive CD25+ CD4

- + regulatory T-cell subset. *Immunology* 2004;112(1):38–43. PMCID: PMC1782465.
- [55] Lissauer D, Piper K, Goodey O, Kilby MD, Moss PAH. Fetal-specific CD8+ cytotoxic T cell responses develop during normal human pregnancy and exhibit broad functional capacity. *J Immunol* 2012;189(2):1072–80. PMID: 22685312.
- [56] Tsuda S, Zhang X, Hamana H, Shima T, Ushijima A, Tsuda K, Muraguchi A, Kishi H, Saito S. Clonally expanded decidual effector regulatory T cells increase in late gestation of normal pregnancy, but not in preeclampsia, in humans. *Front Immunol* 2018;9:1934. PMCID: PMC6118230.
- [57] Yuan M, Jordan F, McInnes IB, Harnett MM, Norman JE. Leukocytes are primed in peripheral blood for activation during term and preterm labour. *Mol Hum Reprod* 2009;15(11):713–24. PMCID: PMC2762373.
- [58] Thomson AJ, Telfer JF, Young A, Campbell S, Stewart CJ, Cameron IT, Greer IA, Norman JE. Leukocytes infiltrate the myometrium during human parturition: further evidence that labour is an inflammatory process. 1999/06/22 ed *Hum Reprod* 1999;14(1):229–36.
- [59] Mackler AM, Iezza G, Akin MR, McMillan P, Yellon SM. Macrophage trafficking in the uterus and cervix precedes parturition in the mouse. *Biol Reprod* 1999;61(4): 879–83. PMID: 10491619.
- [60] Yellon SM, Mackler AM, Kirby MA. The role of leukocyte traffic and activation in parturition. *J Soc Gynecol Invest* 2003;10(6):323–38. PMID: 12969775.
- [61] Timmons BC, Fairhurst AM, Mahendroo MS. Temporal changes in myeloid cells in the cervix during pregnancy and parturition. *J Immunol* 2009;182(5):2700–7. PMCID: PMC2752643.
- [62] Gomez-Lopez N, Estrada-Gutierrez G, Jimenez-Zamudio L, Vega-Sanchez R, Vadillo-Ortega F. Fetal membranes exhibit selective leukocyte chemotactic activity during human labor. *J Reprod Immunol* 2009;80(1–2):122–31. PMID: 19406481.
- [63] Xu Y, Romero R, Miller D, Kadam L, Mial TN, Plazyo O, Garcia-Flores V, Hassan SS, Xu Z, Tarca AL, Drewlo S, Gomez-Lopez N. An M1-like macrophage polarization in decidual tissue during spontaneous preterm labor that is attenuated by rosiglitazone treatment. *J Immunol* 2016;196(6):2476–91. PMCID: PMC4779725.
- [64] Arenas-Hernandez M, Romero R, Xu Y, Panaiteescu B, Garcia-Flores V, Miller D, Ahn H, Done B, Hassan SS, Hsu CD, Tarca AL, Sanchez-Torres C, Gomez-Lopez N. Effector and activated T cells induce preterm labor and birth that is prevented by treatment with progesterone. *J Immunol* 2019;202(9):2585–608. PMCID: PMC6570421.
- [65] Gomez-Lopez N, Garcia-Flores V, Chin PY, Groome HM, Bijland MT, Diener KR, Romero R, Robertson SA. Macrophages exert homeostatic actions in pregnancy to protect against preterm birth and fetal inflammatory injury. *JCI Insight* 2021;6(19):e146089. PMCID: PMC8525593.
- [66] Gomez-Lopez N, Arenas-Hernandez M, Romero R, Miller D, Garcia-Flores V, Leng Y, Xu Y, Galaz J, Hassan SS, Hsu CD, Tse H, Sanchez-Torres C, Done B, Tarca AL. Regulatory T cells play a role in a subset of idiopathic preterm labor/birth and adverse neonatal outcomes. *Cell Rep* 2020;32(1):107874. PMCID: PMC7396155.
- [67] Couture C, Brien ME, Boufaied I, Duval C, Soglio DD, Enninga EAL, Cox B, Girard S. Proinflammatory changes in the maternal circulation, maternal-fetal interface, and placental transcriptome in preterm birth. *Am J Obstet Gynecol* 2023;228(3):332.e1–332.e17. PMID: 36027951.
- [68] Vora B, Wang A, Kosti I, Huang H, Paranjape I, Woodruff TJ, MacKenzie T, Sirota M. Meta-analysis of maternal and fetal transcriptomic data elucidates the role of adaptive and innate immunity in preterm birth. *Front Immunol* 2018;9: 993. PMCID: PMC5954243.
- [69] Bukowski R, Sadovsky Y, Goodarzi H, Zhang H, Biggio JR, Varner M, Parry S, Xiao F, Esplin SM, Andrews W, Saade GR, Ilekis JV, Reddy UM, Baldwin DA. Onset of human preterm and term birth is related to unique inflammatory transcriptome profiles at the maternal fetal interface. *PeerJ* 2017;5:e3685. PMCID: PMC5582610.
- [70] Tyagi V, Mustafa MD, Sharma T, Banerjee BD, Ahmed RS, Tripathi AK, Guleria K. Association of organochlorine pesticides with the mRNA expression of tumour necrosis factor-alpha (TNF- $\alpha$ ) & cyclooxygenase-2 (COX-2) genes in idiopathic preterm birth. *Indian J Med Res* 2016;143(6):731–8. PMCID: PMC5094112.
- [71] Nowicki S, Izban MG, Pawelczyk E, Pratap S, Olson G, Nowicki B. Preterm labor: CD55 in maternal blood leukocytes. *Am J Reprod Immunol* 2009; 61(5):360–7. PMCID: PMC293132.
- [72] Pacheco LD, Hankins GD, Costantine MM, Anderson GD, Pawelczyk E, Nowicki S, Nowicki BJ. The role of human decay-accelerating factor in the pathogenesis of preterm labor. *Am J Perinatol* 2011;28(7):565–70. PMID: 21380985.
- [73] Takeda J, Fang X, Olson DM. Pregnant human peripheral leukocyte migration during several late pregnancy clinical conditions: a cross-sectional observational study. *BMC Pregnancy Childbirth* 2017;17(1):16. PMCID: PMC5223432.
- [74] Gervasi MT, Chaiworapongsa T, Naccasha N, Blackwell S, Yoon BH, Maymon E, Romero R. Phenotypic and metabolic characteristics of maternal monocytes and granulocytes in preterm labor with intact membranes. *Am J Obstet Gynecol* 2001; 185(5):1124–9. PMID: 11717645.
- [75] Prearo Moço N, Camargo Batista RA, Fernandes Martin L, de Oliveira LG, Garcia de Lima Parada CM, Alarcão Dias-Melicio L, de Assis Golin M, Guimarães da Silva M. Toll-Like Receptor-2 and -4 expression by maternal neutrophils in preterm labor. *Gynecol Obstet Invest* 2018;83(1):1–8. PMID: 28359059.
- [76] Vakili S, Torabivard P, Tabrizi R, Shojaizadeh A, Asadi N, Hessami K. The association of inflammatory biomarker of neutrophil-to-lymphocyte ratio with spontaneous preterm delivery: a systematic review and meta-analysis. *Mediat Inflamm* 2021;2021:6668381. PMCID: PMC7870293.
- [77] Pawelczyk E, Nowicki BJ, Izban MG, Pratap S, Sashti NA, Sanderson M, Nowicki S. Spontaneous preterm labor is associated with an increase in the proinflammatory signal transducer TLR4 receptor on maternal blood monocytes. *BMC Pregnancy Childbirth* 2010;10:66. PMCID: PMC2972234.
- [78] Paquette AG, Shynlava O, Wu X, Kibschull M, Wang K, Price ND, Lye SJ. MicroRNA-transcriptome networks in whole blood and monocytes of women undergoing preterm labour. *J Cell Mol Med* 2019;23(10):6835–45. PMCID: PMC6787570.
- [79] Paquette AG, Shynlava O, Kibschull M, Price ND, Lye SJ. Global Alliance to Prevent Prematurity and Stillbirth Systems Biology of Preterm Birth Team. Comparative analysis of gene expression in maternal peripheral blood and monocytes during spontaneous preterm labor. *Am J Obstet Gynecol* 2018;218(3): 345.e1–345.e30. PMID: 29305255.
- [80] Xiong H, Zhou C, Qi G. Proportional changes of CD4+CD25+Foxp3+ regulatory T cells in maternal peripheral blood during pregnancy and labor at term and preterm. *Clin Invest Med* 2010;33(6):E422. PMID: 21134345.
- [81] Koucký M, Malíčková K, Cindrová-Davies T, Germanová A, Parízek A, Kalousová M, Hájek Z, Zima T. Low levels of circulating T-regulatory lymphocytes and short cervical length are associated with preterm labor. *J Reprod Immunol* 2014;106:110–7. PMID: 24855050.
- [82] Kisielewicz A, Schaefer M, Schmitt E, Hug F, Haensch GM, Meuer S, Zeier M, Sohn C, Steinborn A. A distinct subset of HLA-DR+ -regulatory T cells is involved in the induction of preterm labor during pregnancy and in the induction of organ rejection after transplantation. *Clin Immunol* 2010;137(2):209–20. PMID: 20822960.
- [83] Schober L, Radnai D, Schmitt E, Mahnke K, Sohn C, Steinborn A. Term and preterm labor: decreased suppressive activity and changes in composition of the regulatory T-cell pool. *Immunol Cell Biol* 2012;90(10):935–44. PMID: 22751216.
- [84] Busse M, Scharm M, Oettel A, Redlich A, Costa SD, Zenclussen AC. Enhanced S100B expression in T and B lymphocytes in spontaneous preterm birth and preeclampsia. *J Perinat Med* 2022;50(2):157–66. PMID: 34717052.
- [85] Lee J, Romero R, Xu Y, Kim JS, Topping V, Yoo W, Kusanovic JP, Chaiworapongsa T, Hassan SS, Yoon BH, Kim CJ. A signature of maternal anti-fetal rejection in spontaneous preterm birth: chronic chorioamnionitis, anti-human leukocyte antigen antibodies, and C4d. *PLoS One* 2011;6(2):e16806. PMCID: PMC3033909.
- [86] Fukui A, Funamizu A, Yokota M, Yamada K, Nakamura R, Fukuhara R, Kimura H, Mizunuma H. Uterine and circulating natural killer cells and their roles in women with recurrent pregnancy loss, implantation failure and preeclampsia. *J Reprod Immunol* 2011;90(1):105–10. PMID: 21632120.
- [87] Esplin MS, Merrell K, Goldenberg R, Lai Y, Iams JD, Mercer B, Spong CY, Miodownik M, Simhan HN, van Dorsten P, Dombrowski M. Eunice Kennedy Shriver National Institute of Child Health and Human Development Maternal-Fetal Medicine Units Network. Proteomic identification of serum peptides predicting subsequent spontaneous preterm birth. *Am J Obstet Gynecol* 2011;204(5):391. PMCID: PMC3103758.
- [88] Park S, Moon J, Kang N, Kim YH, You YA, Kwon E, Ansari A, Hur YM, Park T, Kim YJ. Predicting preterm birth through vaginal microbiota, cervical length, and WBC using a machine learning model. *Front Microbiol* 2022;13:912853. PMCID: PMC9378785.
- [89] Wu T, Li S, Gong X, Li J, Li X, Zhai Y, Huang J, Li X, Li L, Yang J, Wang X, Shi H, Yuan P, Zhao Y, Wei Y. Longitudinal cervical length measurements and spontaneous preterm birth in singleton and twin pregnancies. *JAMA Netw Open* 2024;7(4):e244592. PMCID: PMC11009824.
- [90] Ma M, Zhu M, Zhuo B, Li L, Chen H, Xu L, Wu Z, Cheng F, Xu L, Yan J. Use of complete blood count for predicting preterm birth in asymptomatic pregnant women: A propensity score-matched analysis. *J Clin Lab Anal* 2020;34(8): e23313. PMCID: PMC7439335.
- [91] Harper M, Li L, Zhao Y, Klebanoff MA, Thorp JM, Sorokin Y, Varner MW, Wapner RJ, Caritis SN, Iams JD, Carpenter MW, Peaceman AM, Mercer BM, Sciscione A, Rouse DJ, Ramin SM, Anderson GD, Eunice Kennedy Shriver National Institute of Child Health and Human Development (NICHD) Maternal-Fetal Medicine Units (MFMU) Network\*. Change in mononuclear leukocyte responsiveness in midpregnancy and subsequent preterm birth. *Obstet Gynecol* 2013;121(4):805–11. PMCID: PMC3830536.
- [92] Heng YJ, Pennell CE, McDonald SW, Vinturache AE, Xu J, Lee MWF, Briollais L, Lyon AW, Slater DM, Bocking AD, de Koning L, Olson DM, Dolan SM, Tough SC, Lye SJ. Maternal whole blood gene expression at 18 and 28 weeks of gestation associated with spontaneous preterm birth in asymptomatic women. *PLoS One* 2016;11(6):e0155191. PMCID: PMC4917227.
- [93] Ran Y, Huang D, Yin N, Wen Y, Jiang Y, Liu Y, Qi H. Predicting the risk of preterm birth throughout pregnancy based on a novel transcriptomic signature. *Mater Fetal Med* 2023;5(4):213–22.
- [94] Gupta JK, Care A, Goodfellow L, Alfirevic Z, Müller-Myhsok B, Alfirevic A. Genome and transcriptome profiling of spontaneous preterm birth phenotypes. *Sci Rep* 2022;12(1):1003. PMCID: PMC8770724.
- [95] Zhou G, Holzman C, Heng YJ, Kibschull M, Lye SJ, Vazquez A. EBF1 Gene mRNA levels in maternal blood and spontaneous preterm birth. *Reprod Sci* 2020;27(1): 316–24. PMID: 32046385.
- [96] Manuck TA, Eaves LA, Rager JE, Fry RC. Mid-pregnancy maternal blood nitric oxide-related gene and miRNA expression are associated with preterm birth. *Epidemiol* 2021;13(9):667–82. PMCID: PMC8173522.
- [97] Gargano JW, Holzman C, Senagore P, Thorsen P, Skogstrand K, Hougaard DM, Rahbar MH, Chung H. Mid-pregnancy circulating cytokine levels, histologic chorioamnionitis and spontaneous preterm birth. *J Reprod Immunol* 2008;79(1): 100–10. PMCID: PMC2683663.

- [98] Curry AE, Vogel I, Drews C, Schendel D, Skogstrand K, Flanders WD, Hougaard D, Olsen J, Thorsen P. Mid-pregnancy maternal plasma levels of interleukin 2, 6, and 12, tumor necrosis factor-alpha, interferon-gamma, and granulocyte-macrophage colony-stimulating factor and spontaneous preterm delivery. *Acta Obstet Gynecol Scand* 2007;86(9):1103–10. PMID: 17712652.
- [99] Jelliffe-Pawlowski LL, Rand L, Bedell B, Baer RJ, Oltman SP, Norton ME, Shaw GM, Stevenson DK, Murray JC, Ryckman KK. Prediction of preterm birth with and without preeclampsia using mid-pregnancy immune and growth-related molecular factors and maternal characteristics. *J Perinatol* 2018;38(8):963–72. PMCID: PMC6089890.
- [100] McDonald CR, Darling AM, Conroy AL, Tran V, Cabrera A, Liles WC, Wang M, Aboud S, Urassa W, Fawzi WW, Kain KC. Inflammatory and angiogenic factors at mid-pregnancy are associated with spontaneous preterm birth in a cohort of tanzanian women. *PLoS One* 2015;10(8):e0134619. PMCID: PMC4527774.
- [101] Saade GR, Boggess KA, Sullivan SA, Markenson GR, Iams JD, Coorod DV, Pereira LM, Esplin MS, Cousins LM, Lam GK, Hoffman MK, Severinsen RD, Pugmire T, Flick JS, Fox AC, Lueth AJ, Rust SR, Mazzola E, Hsu C, Dufford MT, Bradford CL, Ichetovkin IE, Fleischer TC, Polipitiya AD, Critchfield GC, Kearney PE, Boniface JJ, Hickok DE. Development and validation of a spontaneous preterm delivery predictor in asymptomatic women. *Am J Obstet Gynecol* 2016;214(5):633.e1–633.e24. PMID: 26874297.
- [102] Kramer MS, Kahn SR, Platt RW, Genest J, Chen MF, Goulet L, Séguin L, Lydon J, McNamara H, Libman M, Dahhou M, Lamoureux J, Skogstrand K, Thorsen P. Mid-trimester maternal plasma cytokines and CRP as predictors of spontaneous preterm birth. *Cytokine* 2010;49(1):10–4. PMID: 19783155.
- [103] Ezrin AM, Brohman B, Willmot J, Baxter S, Moore K, Luther M, Fannon MR, Sibai B. Circulating serum-derived microparticles provide novel proteomic biomarkers of spontaneous preterm birth. *Am J Perinatol* 2015;32(6):605–14. PMID: 25829561.
- [104] Hackney DN, Catov JM, Simhan HN. Low concentrations of thrombin-inhibitor complexes and the risk of preterm delivery. *Am J Obstet Gynecol* 2010;203(2):184. PMID: 20510913.
- [105] Whitcomb BW, Schisterman EF, Luo X, Chegini N. Maternal serum granulocyte colony-stimulating factor levels and spontaneous preterm birth. *J Women's Health (Larchmt)* 2009;18(1):73–8. PMCID: PMC2744483.
- [106] Bullen BL, Jones NM, Holzman CB, Tian Y, Senagore PK, Thorsen P, Skogstrand K, Hougaard DM, Sikorskii A. C-reactive protein and preterm delivery: clues from placental findings and maternal weight. *Reprod Sci* 2013;20(6):715–22. PMCID: PMC3713547.
- [107] Hvilsted GB, Thorsen P, Jeune B, Bakketveit LS. C-reactive protein: a serological marker for preterm delivery? *Acta Obstet Gynecol Scand* 2002;81(5):424–9. PMID: 12027816.
- [108] Ferguson KK, McElrath TF, Chen YH, Mukherjee B, Meeker JD. Longitudinal profiling of inflammatory cytokines and C-reactive protein during uncomplicated and preterm pregnancy. *Am J Reprod Immunol* 2014;72(3):326–36. PMCID: PMC4573571.
- [109] Aung MT, Yu Y, Ferguson KK, Cantonwine DE, Zeng L, McElrath TF, Pennathur S, Mukherjee B, Meeker JD. Prediction and associations of preterm birth and its subtypes with eicosanoid enzymatic pathways and inflammatory markers. *Sci Rep* 2019;9(1):17049. PMCID: PMC6863859.
- [110] Souza RT, McKenzie EJ, Jones B, de Seymour JV, Thomas MM, Zarate E, Han TL, McCowan L, Sulek K, Villas-Boas S, Kenny LC, Cecatti JG, Baker PN. Trace biomarkers associated with spontaneous preterm birth from the maternal serum metabolome of asymptomatic nulliparous women - parallel case-control studies from the SCOPE cohort. *Sci Rep* 2019;9(1):13701. PMCID: PMC6757051.
- [111] McLean M, Bisits A, Davies J, Woods R, Lowry P, Smith R. A placental clock controlling the length of human pregnancy. 1995/05/01 ed *Nat Med* 1995;1(5):460–3.
- [112] Leung TN, Chung TK, Madsen G, McLean M, Chang AM, Smith R. Elevated mid-trimester maternal corticotrophin-releasing hormone levels in pregnancies that delivered before 34 weeks. *Br J Obstet Gynaecol* 1999;106(10):1041–6. PMID: 10519429.
- [113] McLean M, Bisits A, Davies J, Walters W, Hackshaw A, De Voss K, Smith R. Predicting risk of preterm delivery by second-trimester measurement of maternal plasma corticotropin-releasing hormone and alpha-fetoprotein concentrations. *Am J Obstet Gynecol* 1999;181(1):207–15. PMID: 10411821.
- [114] Ruiz RJ, Fullerton J, Brown CEL, Dudley DJ. Predicting risk of preterm birth: the roles of stress, clinical risk factors, and corticotropin-releasing hormone. *Biol Res Nurs* 2002;4(1):54–64. PMID: 12363283.
- [115] Sibai B, Meis PJ, Klebanoff M, Dombrowski MP, Weiner SJ, Moawad AH, Northen A, Iams JD, Varner MW, Caritis SN, O'Sullivan MJ, Miodovnik M, Leveno KJ, Conway D, Wapner RJ, Carpenter M, Mercer B, Ramin SM, Thorp JM, Peaceman AM, Gabbe S. Maternal fetal medicine units network of the National Institute of Child Health and Human Development. Plasma CRH measurement at 16 to 20 weeks' gestation does not predict preterm delivery in women at high-risk for preterm delivery. *Am J Obstet Gynecol* 2005;193(3 Pt 2):1181–6. PMID: 16157134.
- [116] Gray C, McCowan LM, Patel R, Taylor RS, Vickers MH. Maternal plasma miRNAs as biomarkers during mid-pregnancy to predict later spontaneous preterm birth: a pilot study. *Sci Rep* 2017;7(1):815. PMCID: PMCS5429750.
- [117] Wommack JC, Trzeciakowski JP, Miranda RC, Stowe RP, Ruiz RJ. Micro RNA clusters in maternal plasma are associated with preterm birth and infant outcomes. *PLoS One* 2018;13(6):e0199029. PMCID: PMC6021076.
- [118] Truong G, Guanzon D, Kinhal V, Elfeky O, Lai A, Longo S, Nuzhat Z, Palma C, Scholz-Romero K, Menon R, Mol BW, Rice GE, Salomon C. Oxygen tension regulates the miRNA profile and bioactivity of exosomes released from extravillous trophoblast cells - Liquid biopsies for monitoring complications of pregnancy. *PLoS One* 2017;12(3):e0174514. PMCID: PMC5370130.
- [119] Menon R, Debnath C, Lai A, Guanzon D, Bhatnagar S, Kshetrapal PK, Sheller-Miller S, Salomon C, Garbhini study team. Circulating exosomal miRNA profile during term and preterm birth pregnancies: a longitudinal study. *Endocrinology* 2019;160(2):249–75. PMCID: PMC6394761.
- [120] Pateroster DM, Stella A, Gerace P, Manganelli F, Plebani M, Snijders D, Nicolini U. Biochemical markers for the prediction of spontaneous pre-term birth. *Int J Gynaecol Obstet* 2002;79(2):123–9. PMID: 12427396.
- [121] Vogel I, Goepfert AR, Thorsen P, Skogstrand K, Hougaard DM, Curry AH, Cliver S, Andrews WW. Early second-trimester inflammatory markers and short cervical length and the risk of recurrent preterm birth. *J Reprod Immunol* 2007;75(2):133–40. PMID: 17442403.
- [122] Goldenberg RL, Andrews WW, Mercer BM, Moawad AH, Meis PJ, Iams JD, Das A, Caritis SN, Roberts JM, Miodovnik M, Menard K, Thurnau G, Dombrowski MP, McNellis D. The preterm prediction study: granulocyte colony-stimulating factor and spontaneous preterm birth. *Natl Inst Child Health Hum Dev Maternal-Fetal Med Units Netw Am J Obstet Gynecol* 2000;182(3):625–30. PMID: 10739519.
- [123] Goldenberg RL, Iams JD, Mercer BM, Meis PJ, Moawad A, Das A, Miodovnik M, Vandorsten PJ, Caritis SN, Thurnau G, Dombrowski MP. Maternal-Fetal Medicine Units Network. The Preterm Prediction Study: toward a multiple-marker test for spontaneous preterm birth. *Am J Obstet Gynecol* 2001;185(3):643–51. PMID: 11568793.
- [124] Winger EE, Reed JL, Ji X, Gomez-Lopez N, Pacora P, Romero R. MicroRNAs isolated from peripheral blood in the first trimester predict spontaneous preterm birth. *PLoS One* 2020;15(8):e0236805. PMCID: PMC7425910.
- [125] Yoon BH, Romero R, Moon JB, Shim SS, Kim M, Kim G, Jun JK. Clinical significance of intra-amniotic inflammation in patients with preterm labor and intact membranes. *Am J Obstet Gynecol* 2001;185(5):1130–6. PMID: 11717646.
- [126] Romero R, Miranda J, Chaiworapongsa T, Chaemsaithong P, Gotsch F, Dong Z, Ahmed AI, Yoon BH, Hassan SS, Kim CJ, Korzeniewski SJ, Yeo L. A novel molecular microbiologic technique for the rapid diagnosis of microbial invasion of the amniotic cavity and intra-amniotic infection in preterm labor with intact membranes. *Am J Reprod Immunol* 2014;71(4):330–58. PMCID: PMC3954440.
- [127] Romero R, Miranda J, Chaiworapongsa T, Korzeniewski SJ, Chaemsaithong P, Gotsch F, Dong Z, Ahmed AI, Yoon BH, Hassan SS, Kim CJ, Yeo L. Prevalence and clinical significance of sterile intra-amniotic inflammation in patients with preterm labor and intact membranes. *Am J Reprod Immunol* 2014;72(5):458–74. PMCID: PMC4192099.
- [128] Cobo T, Aldecoa V, Holeckova M, Andrys C, Filella X, Jacobsson B, Kacerovsky M. A Rapid Amniotic Fluid Interleukin-6 Assessment for the Identification of Intra-Amniotic Inflammation in Women with Preterm Labor and Intact Membranes. *Fetal Diagn Ther* 2021;48(5):327–32. PMID: 33902036.
- [129] Park H, Park KH, Kim YM, Kook SY, Jeon SJ, Yoo HN. Plasma inflammatory and immune proteins as predictors of intra-amniotic infection and spontaneous preterm delivery in women with preterm labor: a retrospective study. *BMC Pregnancy Childbirth* 2018;18(1):146. PMCID: PMC5944139.
- [130] Akoto C, Chan CYS, Tshivula-Matala COO, Ravi K, Zhang W, Vatish M, Norris SA, Hemelaar J. Innate lymphoid cells are reduced in pregnant HIV positive women and are associated with preterm birth. *Sci Rep* 2020;10(1):13265. PMCID: PMC7413261.
- [131] Xu Y, Romero R, Miller D, Silva P, Panaitescu B, Theis KR, Arif A, Hassan SS, Gomez-Lopez N. Innate lymphoid cells at the human maternal-fetal interface in spontaneous preterm labor. *Am J Reprod Immunol* 2018;79(6):e12820. PMCID: PMC5948134.
- [132] Sun B, Parks WT, Simhan HN, Bertolet M, Catov JM. Early pregnancy immune profile and preterm birth classified according to uteroplacental lesions. *Placenta* 2020;89:99–106. PMID: 32056560.
- [133] Cantonwine DE, Zhang Z, Rosenblatt K, Goudy KS, Doss RC, Ezrin AM, Page G, Brohman B, McElrath TF. Evaluation of proteomic biomarkers associated with circulating microparticles as an effective means to stratify the risk of spontaneous preterm birth. *Am J Obstet Gynecol* 2016;214(5):631.e1–631.e11. PMCID: PMC4851565.
- [134] McElrath TF, Cantonwine DE, Jeyabalan A, Doss RC, Page G, Roberts JM, Brohman B, Zhang Z, Rosenblatt KP. Circulating microparticle proteins obtained in the late first trimester predict spontaneous preterm birth at less than 35 weeks' gestation: a panel validation with specific characterization by parity. *Am J Obstet Gynecol* 2019;220(5):488.e1–488.e11. PMID: 30690014.
- [135] Lynch AM, Wagner BD, Deterding RR, Gicles PC, Gibbs RS, Janoff EN, Holers VM, Santoro NF. The relationship of circulating proteins in early pregnancy with preterm birth. *Am J Obstet Gynecol* 2016;214(4):517.e1–8. PMCID: PMC5145264.
- [136] D'Silva AM, Hyett JA, Coorssen JR. Proteomic analysis of first trimester maternal serum to identify candidate biomarkers potentially predictive of spontaneous preterm birth. *J Proteom* 2018;178:31–42. PMID: 29448056.
- [137] Zhu H, Yang MJ. Maternal plasma concentrations of macrophage migration inhibitory factor at first trimester as a predictive biomarker of preterm delivery in Chinese women. *Clin Chim Acta* 2018;483:286–90. PMID: 29684382.
- [138] Mavrelid I, Theodora M, Lambrou G, Avgeris M, Papantonio N, Treager-Synodos J, Daskalakis G, Kolialaxi A. First trimester maternal plasma proteomic changes predictive of spontaneous moderate/late preterm delivery. *J Matern Fetal Neonatal Med* 2023;36(2):2232074. PMID: 37424082.
- [139] Poon LCY, Nekrasova E, Anastassopoulos P, Livanos P, Nicolaides KH. First-trimester maternal serum matrix metalloproteinase-9 (MMP-9) and adverse pregnancy outcome. *Prenat Diagn* 2009;29(6):553–9. PMID: 19242924.

- [140] Denney JM, Nelson E, Wadhwa P, Waters T, Mathew L, Goldenberg RL, Culhane JF. Cytokine profiling: variation in immune modulation with preterm birth vs. uncomplicated term birth identifies pivotal signals in pathogenesis of preterm birth. *J Perinat Med* 2021;49(3):299–309. PMCID: PMC9849608.
- [141] Shin JE, Shin JC, Kim SJ, Lee Y, Park IY, Lee S. Early midtrimester serum insulin-like factors and cervical length to predict preterm delivery. *Taiwan J Obstet Gynecol* 2016;55(1):45–9. PMID: 26927247.
- [142] Synan L, Ghazvini S, Uthaman S, Cutshaw G, Lee CY, Waite J, Wen X, Sarkar S, Lin E, Santillan M, Santillan D, Bardhan R. First trimester prediction of preterm birth in patient plasma with machine-learning-guided raman spectroscopy and metabolomics. *ACS Appl Mater Interfaces* 2023;15(32):38185–200. PMCID: PMC10625673.
- [143] Beta J, Szekeres-Bartho J, Skyfta E, Akolekar R, Nicolaides KH. Maternal serum progesterone-induced blocking factor at 11-13 weeks' gestation in spontaneous early preterm delivery. *Fetal Diagn Ther* 2011;29(3):197–200. PMID: 21212635.
- [144] Pitiphat W, Gillman MW, Joshipura KJ, Williams PL, Douglass CW, Rich-Edwards JW. Plasma C-reactive protein in early pregnancy and preterm delivery. *Am J Epidemiol* 2005;162(11):1108–13. PMCID: PMC1994922.
- [145] Bakalis SP, Poon LCY, Vayna AM, Pafilis I, Nicolaides KH. C-reactive protein at 11-13 weeks' gestation in spontaneous early preterm delivery. *J Matern Fetal Neonatal Med* 2012;25(12):2475–8. PMID: 22900797.
- [146] Poon LCY, Musci T, Song K, Syngelaki A, Nicolaides KH. Maternal plasma cell-free fetal and maternal DNA at 11-13 weeks' gestation: relation to fetal and maternal characteristics and pregnancy outcomes. *Fetal Diagn Ther* 2013;33(4):215–23. PMID: 23466432.
- [147] Harville EW, Li YY, Pan K, McRitchie S, Pathmasiri W, Sumner S. Untargeted analysis of first trimester serum to reveal biomarkers of pregnancy complications: a case-control discovery phase study. *Sci Rep* 2021;11(1):3468. PMCID: PMC7876105.
- [148] Brink LT, Roberts DJ, Wright CA, Nel DG, Schubert PT, Boyd TK, Hall DR, Odendaal H. Placental pathology in spontaneous and iatrogenic preterm birth: Different entities with unique pathologic features. *Placenta* 2022;126:54–63. PMCID: PMC10555798.
- [149] Suresh S, Freedman A, Adams M, Hirsch E, Ernst LM. Placental histology for targeted risk assessment of recurrent spontaneous preterm birth. *Am J Obstet Gynecol* 2024;230(4):452.e1–452.e11. PMID: 37751829.
- [150] Morgan TK. Role of the placenta in preterm birth: a review. *Am J Perinatol* 2016;33(3):258–66. PMID: 26731184.
- [151] Battat TL, Erez O. Spontaneous preterm birth: a fetal-maternal metabolic imbalance. *Matern Fetal Med* 2023;5(4):223–8.
- [152] Staneva A, Bogossian F, Pritchard M, Wittkowski A. The effects of maternal depression, anxiety, and perceived stress during pregnancy on preterm birth: a systematic review. *Women Birth* 2015;28(3):179–93. PMID: 25765470.
- [153] Takami M, Tsuchida A, Takamori A, Aoki S, Ito M, Kigawa M, Kawakami C, Hirahara F, Hamazaki K, Inadera H, Ito S. Japan Environment & Children's Study (JECS) Group. Effects of physical activity during pregnancy on preterm delivery and mode of delivery: The Japan Environment and Children's Study, birth cohort study. *PLoS One* 2018;13(10):e0206160.
- [154] Bayar E, Bennett PR, Chan D, Sykes L, MacIntyre DA. The pregnancy microbiome and preterm birth. *Semin Immunopathol* 2020;42(4):487–99. PMCID: PMC7508933.
- [155] Mead EC, Wang CA, Phung J, Fu JY, Williams SM, Merialdi M, Jacobsson B, Lye S, Menon R, Pennell CE. The role of genetics in preterm birth. *Reprod Sci* 2023;30(12):3410–27. PMCID: PMC10692032.