## Progress toward liquid biopsies in pediatric solid tumors

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#### Abstract

Pediatric solid tumors have long been known to shed tumor cells, DNA, RNA, and proteins into the blood. Recent technological advances have allowed for improved capture and analysis of these typically scant circulating materials. Efforts are ongoing to develop "liquid biopsy" assays as minimally invasive tools to address diagnostic, prognostic, and disease monitoring needs in childhood cancer care. Applying these highly sensitive technologies to serial liquid biopsies is expected to advance understanding of tumor biology, heterogeneity, and evolution over the course of therapy, thus opening new avenues for personalized therapy. In this review, we outline the latest technologies available for liquid biopsies and describe the methods, pitfalls, and benefits of the assays that are being developed for children with extracranial solid tumors. We discuss what has been learned in several of the most common pediatric solid tumors including neuroblastoma, sarcoma, Wilms tumor, and hepatoblastoma and highlight promising future directions for the field.

Keywords Liquid biopsy · Cell-free DNA · Pediatric solid tumors · Next-generation sequencing · Epigenetics

## **1** Introduction

Cancer is a group of diseases that arises from genetic inheritance, environmental factors, or accumulated errors in DNA replication that result in uncontrolled cell proliferation [1]. Of these diseases, pediatric solid tumors often have particularly devastating outcomes. Fortunately,

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increasing knowledge about childhood cancer biology and tumorigenesis has enabled advances in chemotherapy, supportive care, and personalized medicine which have improved outcomes. However, it has become apparent that intensive treatments can negatively impact survivors' quality of life [2–9] and that therapy for children with solid tumors should be optimally tailored to each child to maximize the likelihood of cure while minimizing short- and long-term toxicity. At population levels, this is best accomplished by stratifying risk according to patient demographics, clinical characteristics, and tumor biology, with escalating treatment for those at the highest risk of relapse [10–13]. At the individual level, understanding tumor and host biology promises truly personalized care by facilitating targeting of specific drivers of disease [14, 15].

Primary or metastatic tumor biopsies at diagnosis, resection, or relapse are undeniably the gold standard for identifying tumor biology, diagnosing disease, and therapeutic decision-making. However, invasive biopsies are difficult to obtain in children, limiting their ability to monitor disease or determine when alternate treatments may be appropriate. Additionally, all children receive advanced imaging at diagnosis and for disease monitoring that may expose them to ionizing radiation and/or anesthesia [16]. Despite this, many children will relapse despite having no evidence of disease on clinical imaging.

Peripheral blood sampling is an increasingly attractive avenue for developing minimally invasive biomarkers that may complement tissue biopsies and imaging. It has long been known that tumors shed cells, nucleotides, proteins, and vesicles into the blood [17]. Because the material in a liquid biopsy is likely to represent the most aggressive part of a rapidly dividing malignancy, many of the genomic driving aberrations described in tumor biopsies should be identifiable in the peripheral blood [18]. Therefore, assays based on interrogating these circulating analytes, (i.e., "liquid biopsies") are expected to emerge as tools to diagnose, monitor, and aid in therapeutic decision-making in real time using simple serial blood tests [19]. In adult malignancies, these approaches have led to new screening and diagnostic tests based on known biology [20], and many of the same approaches are currently being adapted for use in children with solid tumors. However, childhood cancers differ considerably from adult malignancies as they infrequently harbor recurrent genomic aberrations [21], driving the need for pediatric-focused initiatives.

In this review, we will first describe some of the technologies being pursued for circulating analytes such as circulating tumor cells (CTCs) and macromolecular structures (nucleosomes and exosomes), cell-free DNA (cfDNA), and cell-free RNA (cfRNA) (Fig. 1, left). The diversity of approaches for use in liquid biopsies mirrors what has been accomplished using tumor tissue including assessments of genetic mutations, fusions, expression, and epigenetics. Next, we will discuss how liquid biopsies can be used to identify these genomic features and what is currently being evaluated across the spectrum of pediatric solid tumors. We conclude with some of the future directions in the field and potential applications to implement liquid biopsies for diagnostic classification, outcome prediction, disease monitoring, and therapeutic decision making in childhood cancer.

## 2 Circulating analytes for liquid biopsy

## 2.1 CTCs and macromolecular structures

CTCs were first reported in 1869 [22], and are defined as cells circulating freely in the bloodstream with genetic resemblance to their tumor origin. CTCs have now been identified across a range of malignancies, including in patients with metastatic prostate, breast, ovarian, colorectal, and lung cancer [23]. Therefore, CTCs have become appealing analytes for liquid biopsies in childhood cancers as well. CTCs constitute a very small fraction of cells in the bloodstream (5 to 1281 CTCs per mL of blood) and are challenging to identify and capture [24]. Thus, early research efforts were aimed at circulating tumor cell detection, enrichment, and enumeration techniques, while more recent approaches have probed the contents of CTCs, mainly DNA and RNA.

Exosomes are small extracellular vesicles that are lipid bilayer-coated bodies containing DNA, RNA, and proteins, with membrane surface molecules that include MHC proteins



**Fig. 1** Overview of approaches to capturing and investigating circulating analytes from liquid biopsies. In the presence of malignancy, a liquid biopsy (i.e., blood) has been demonstrated to contain single tumor cells, free nucleic acids, exosomes containing nucleic acids and proteins, and free circulating nucleosomes. These components, sampled by simple phlebotomy, can be analyzed to detect single nucleotide mutations,

copy number aberrations, fusions, translocations, and epigenetic changes reflective of tumor genetic heterogeneity. Abbreviations: cfDNA, cell-free DNA; ctDNA, circulating tumor DNA; qPCR, quantitative PCR; RT-qPCR, quantitative reverse transcription PCR; WES, whole exome sequencing; WGS, whole genome sequencing

[25–27] (Fig. 1, left). Secreted by many living cell types including cancer cells, exosomes facilitate cell-cell communication by allowing for intercellular exchange of signaling RNAs such as long non-coding RNAs (lncRNAs), micro RNAs (miRNAs), mitochondrial DNA, single- and double-stranded genomic DNA, and proteins [25, 28, 29]. Greater than 10<sup>9</sup> exosomes per mL have been observed in blood [30, 31], though they are also present in serum, urine, saliva, cerebral spinal fluid, and amniotic fluid, and can cross the blood-brain barrier [25-27]. Early studies focused on detecting and quantifying exosomal presence in the blood; however, it was demonstrated that cancer patients could not be reliably distinguished from healthy individuals by total exosome quantity or exosomal size alone [32]. Therefore, most current studies focus on the accurate capture of exosomes and assay their nucleic acid and protein content.

Circulating nucleosomes and histones are nuclear components observed in blood (Fig. 1, left). Each nucleosome is comprised of DNA wrapped 1.65 times around an eighthistone core, and the N-terminal histone tail protrudes from the nucleosome core and is a site for post-translational modifications [33]. Histone modifications are epigenetic means by which gene expression is regulated via chromatin accessibility and nucleosome positioning [34]. Cell death results in chromatin fragmentation and shedding of nucleosomes and histones into the bloodstream, which can then be detected and interrogated for liquid biopsy applications [35, 36]. Thus, circulating cfDNA, nucleosomes, and histones are closely connected. Indeed, around the time that tumor DNA was first observed in cancer patient plasma, increased levels of circulating nucleosomes were also reported in several adult cancers compared with those in controls [36, 37]. As many as 200 ng per mL of nucleosomes have been quantified in metastatic colorectal cancer [38]. Emerging methods for studying nucleosomes will be discussed in the technologies section.

#### 2.2 Circulating nucleic acids

The probing of circulating cfDNA and cfRNA has been of significant interest to liquid biopsy development [39] (Fig. 1, left). cfDNA was first reported in 1948 [17] and later appreciated in the 1990s for its potential applications in detecting cancer with circulating tumor DNA (ctDNA) [40, 41] and non-invasive prenatal testing with fetal-derived cfDNA [42]. Released into the bloodstream through apoptosis and/or necrosis of cancer cells themselves (circulating tumor cells, primary tumor, or metastatic lesions [43]) or from dying cells in the surrounding tumor microenvironment, cfDNA has been demonstrated to be either free double-stranded DNA fragments or nucleosome-associated [44]. In cancer patients, 0–5 ng to over 1000 ng cfDNA can be isolated per mL of plasma [39]; and for healthy individuals, 0–100 ng per mL of plasma can be extracted [45]. The proportion of tumor-derived

cfDNA often varies among patients depending on tumor burden [46]. The short half-life of cfDNA (16–90 min) allows for real-time assessments, including responsiveness to tumordirected therapy [47]. Unlike tissue biopsies, cfDNA may better represent the diverse tumor cell population and tumor heterogeneity [48, 49].

Cell-free messenger RNA (mRNA), lncRNA, and miRNA are also shed by dying cells and have been detected in blood in spite of endogenous ribonucleases. Circulating mRNA was first reported in cancer patient serum in 1999 [50]. Later, IncRNAs were detected in plasma. As they are over 200-bp in size, it is hypothesized that RNA secondary structure protects the fraction of non-vesicle bound lncRNAs from degradation [51, 52]. miRNAs, which are small (~22 base-pair) non-coding RNAs that function as translational inhibitors were observed extracellularly [53] and in plasma within Argonaute2 complexes or associated with lipoproteins [54, 55]. As the roles of lncRNAs and miRNAs are better elucidated, their potential application as liquid biomarkers will be defined.

## 3 Technologies to assess analytes for liquid biopsy

# 3.1 Detection of macromolecular structures: CTCs, exosomes, and nucleosomes

CTCs and other macromolecular structures are detected and counted in liquid biopsies (Fig. 1, right and Table 1). As of 2019, 265 clinical trials in the USA were being conducted on CTCs [69]. Indeed, the CellSearch™ CTC (Menarini Silicon Biosystems) enumeration assay was reported in 2010 [56] and is now FDA-approved for diagnosing metastatic breast, prostate, and colorectal cancer. The assay enriches EpCAM<sup>+</sup>/ CD45<sup>-</sup> CTCs using immunomagnetic separation to filter CTCs followed by flow-cytometric analysis for cell counting. Higher CTC numbers (>5 CTCs per 7.5 mL of blood) were associated with poor progression-free survival (PFS) in metastatic breast and prostate cancers, and conversely lower CTC counts were associated with improved overall survival [70–72]. Capture and enrichment systems that have been developed, such as CellSieve<sup>™</sup> (Creatv MicroTech) and ClearCell® FX (Genomax Technologies), allow for the investigation of EpCAM-negative CTCs by using physical differences to isolate them from the bloodstream [73, 74]. Once isolated, CTCs can be assessed by assaying commonly secreted proteins. For example, in the EPISPOT assay, viable CTCs were isolated from patients with breast and prostate cancer by culturing cells on membranes with antibodies against CD19, MUC1, PSA, and FGF2 [57]. Limitations for bulk analyses of CTCs include the need for a high yield and purity of samples; therefore, single-cell approaches probing CTC contents,

Analyte	Approach	Methods used	Example in adult malignancies
CTCs	Isolation/enumeration	Cell separation methods including immunoaffinity or size selection coupled with flow cytometry	CellSearch® [56]
	Analysis of CTC contents (DNA, RNA proteins)	Antibody-based protein low-input nucleic acid detection	EPISPOT [57] Smart-seq [58]
Exosomes	Isolation	Ultracentrifugation, size-exclusion filtration, affinity-based, label-free isolation	nPLEX [59]
	Analysis of exosomal contents (DNA, RNA, proteins)	Antibody-based protein Low-input nucleic acid detection	ExoDx® Lung (EGFR) [60]
Circulating nucleosomes/histones	Histone methylation	ELISA and other antibody- based detection	ELISA-based histone methylation assay [61]
	Nucleosome footprinting	Deep sequencing NGS	Snyder, et al. [44]
Circulating DNA (cfDNA, CTC DNA,	Genetic	Targeted PCR (qPCR, ddPCR, BEAMing), WES	cobas EGFR Mutation Test v2 [62]
exosomal DNA)		Non-targeted (WES, WGS)	Leary et al. [63]
	Epigenetic	5mC detection (MSRE-PCR, MS-PCR, MeDIP-seq, MBD-seq, TamC-seq, WGBS-seq)	Epi ProColon® [64]
		5hmC detection (Nano-hmC- Seal, Jump-seq)	Li, et al. [65] Song, et al. [66]
Circulating RNA (cfRNA, CTC RNA, exosomal RNA)	Transcriptomic	Targeted PCR (RT-PCR, RT-dPCR) Targeted RNA-seq	Sanders, et al. [67]
		Non-targeted RNA-seq	Giraldez, et al. [68]

Table 1 Summary of liquid biopsy technologies developed for the study of cancer.

5hmC, 5-hydroxymethylcytosine; 5mc, 5-methylcytosine; CTCs, circulating tumor cells; ddPCR, digital droplet polymerase chain reaction; ELISA, enzyme-linked immunosorbent assay; PCR, polymerase chain reaction; qPCR, quantitative polymerase chain reaction; RT-PCR, reverse transcriptase digital polymerase chain reaction; WES, whole exome sequencing; WGS, whole genome sequencing

especially CTC-derived nucleic acids, have emerged and will be an area of active research [69].

Isolation of exosomes faces technical challenges because traditional approaches are slow and consume large quantities of material. Exosome isolation methods include serial differential ultracentrifugation, antibody-based affinity purification (e.g., CD63, EpCAM), or size filtration [75]. Newer methods to decrease both processing time and required amount of sample include nPLEX, an assay that uses a surface plasmon resonance-based quantitative and high-throughput assay to achieve label-free exosome isolation [59]. As technologies have improved to capture exosomes, assays to probe exosomal contents have been developed. The first commercially available laboratory-developed tests for exosomes, the ExoDx® Lung assays (Exosome Diagnostics), investigates the RNA content of exosomes and will be discussed further in the transcriptomic assays section.

Cancer-specific histone post-translational modifications and nucleosome positioning have been extensively investigated [76, 77]. ELISA-based quantitation of circulating nucleosomes continues to be an area of research for liquid biopsy [61]. Focused assays test for histone methylation levels on circulating nucleosomes [78, 79], while broader nucleosome footprinting is an emerging technique to study genomic positioning in cfDNA analytes [44]. Recently, nucleosomal occupancy mapping on cfDNA was found to correlate with gene expression, cancer type, and cellular state [80].

#### 3.2 Genomic assays

CTC/exosome-derived DNA or cfDNA can be assessed for cancer-associated mutations, copy number variants (CNVs), or single-nucleotide polymorphisms (SNPs) using targeted PCR-based or genome-wide next-generation sequencing (NGS) approaches. One of the few FDA-approved liquid biopsies is the cobas® EGFR Mutation Test v2 (Roche), a realtime quantitative PCR (qPCR) companion diagnostic assay that screens a panel of known EGFR mutations and deletions [62]. While qPCR is used in this and other panel-based approaches, the technology is generally limited by the low nanogram amounts of plasma ctDNA present in some cancer patients. Therefore, digital PCR platforms have been developed to analyze specific mutations and deletions that improve analytical sensitivity, which include methods such as microfluidic droplet digital PCR (ddPCR) and BEAMing (beads, emulsion, amplification, and magnetics) [81-83] (Fig. 1, right and Table 1). Briefly, these approaches divide DNA templates into near single-molecule/single-target PCR reactions for quantitative detection without a standard curve. Recently, O'Leary et. al. compared ddPCR with BEAMing in cfDNA

from breast cancer patients in the PALOMA-3 trial and found good concordance between the two methods [84]. While these technologies require a pre-existing knowledge of mutations, advantages of ddPCR and BEAMing include low cost, short assay time, and the ability to multiplex mutation assessment.

Whole exome-sequencing (WES) offers a broader method to analyze cfDNA by sequencing the coding region contained in exons which are approximately 1% of the genome [85, 86] (Fig. 1, right and Table 1). In a seminal 2013 cfDNA study evaluating serial plasma samples from breast, lung, and ovarian cancers patients, WES identified genes with known association with acquired chemoresistance (e.g., *PIK3CA*), and clonal evolution of the cancers in response to therapy could be followed [49]. While WES can aid in biomarker discovery, most applications of WES in liquid biopsy are used to detect known mutations and CNVs. Additionally, because WES generally has lower depth of coverage than targeted sequencing panels, it may have limited ability to detect mutations below 5% allele frequencies [87].

Compared with WES, whole-genome sequencing (WGS) offers insight into the entire genetic landscape (Fig. 1, right and Table 1). WGS covers mutations in non-coding regions which include introns, regulatory elements, and non-coding RNAs that WES does not capture [88]. This allows for better assessment of CNVs, SNPs, and larger structural variations. WGS was first reported on cfDNA from colorectal cancer and breast cancer patients to identify chromosomal rearrangements and copy number changes, including ERBB2 and CDK6 amplification [63]. WGS on cfDNA was soon after applied to demonstrate applicability of minimal residual disease detection in pre- and post-operative cancer patients [89]. Sequencing coverage, along with its associated costs, can be a barrier to WES and WGS approaches. Therefore, lowcoverage sequencing (i.e., 0.1x coverage) and associated computational approaches continue to be an area of active research for NGS-based cfDNA liquid biopsies [90-92].

## 3.3 Epigenetic-based assays

Liquid biopsies that focus solely on detecting tumor-specific, low-frequency mutant alleles face challenges if the mutations are lower than the limit of detection in the sampled cfDNA. In contrast, epigenetic modifications are ubiquitous, and the deposition of epigenetic marks is organ- and cell-type specific [93, 94]. Thus, epigenetic analysis of cfDNA can also be used to investigate the tumor microenvironment and metabolic and immune responses to cancers (Fig. 1, right and Table 1). Furthermore, mapping of these epigenetic features can enhance cancer diagnosis, prognosis, and relapse detection [95].

The most common DNA modification is cytosine methylation (5mC), which occurs throughout CpG islands and is associated with transcriptional repression. Despite an overall decrease in 5mC levels reported in cancers [96], aberrant focal 5mC deposition has been observed, supporting models of epigenetic influence on cancer initiation, progression, and invasion [33, 97, 98]. For individual or multiplexed targeting of specific methylated regions, techniques that employ methylation-sensitive restriction endonuclease (MSRE)-PCR or methylation-specific-PCR (MS-PCR) are utilized [99, 100]. Most of the cfDNA 5mC-based assays that are the furthest in the clinical validation pipeline are based on MS-PCR using candidate methylated genes. Indeed, the only epigeneticbased FDA-approved liquid biopsy available is Epi ProColon® (Epigenomics), which consists of MethyLight PCR detection of a single target, methylated *SEPT9* [64].

The general approaches for genome-wide DNA methylome mapping include the following: (1) methods that use MSRE coupled to sequencing [101, 102]; (2) enrichment and affinity capture of 5mC-containing DNA fragments including MeDIP-seq [103]), MBD-Seq [104], or a 5mC chemical labeling strategy (e.g. Tet-assisted 5mC sequencing [105]); and (3) bisulfite-conversion-based sequencing methods (BS-Seq) that achieve single-base resolution differentiation of unmethylated and methylated cytosines [106]. To date, most whole-genome methylation studies applied to cfDNA are currently either biomarker discovery or proof-of-concept studies. The application of whole-genome BS-seq [107, 108], MeDIP-seq [109, 110], and other genome-wide methylation mapping technologies to cfDNA for liquid biopsies are likely to continue to emerge.

Other promising epigenetic marks for liquid biopsy detection include oxidized derivatives of 5mC: 5hydroxymethylcytosine (5hmC), 5-formylcytosine (5fC), and 5-carboxylcytosine (5caC), which are produced by teneleven-translocation (TET) dioxygenase catalysis in mammalian cells [111]. Of these cytosine modifications, 5hmC has been most developed as a potential liquid biopsy [112]. Differential deposition of 5hmC has been observed in primary tumor DNA, suggesting that genomic patterns of 5hmC capture tumor heterogeneity. Affinity-based [113, 114] and single-base resolution methods [115–119] have been developed to analyze genome-wide 5hmC; for targeted 5hmC detection, most of these technologies could be coupled to PCR or arrays. A promising method for liquid biopsy in particular is nano-hmC-seal [120]. Nano-hmC-seal modified the hmCseal approach (chemical labeling, pull-down, and enrichment of 5hmC-modified DNA fragments) [114] to successfully perform it on 1-10 nanogram quantities of DNA. Nano-hmC-Seal has been applied to cfDNA to develop diagnostic biomarkers in hepatocellular carcinoma (HCC) [66, 121], diffuse large B-cell lymphoma [122], and colorectal [65, 66, 123], gastric [65], lung [66, 124], pancreatic [66], breast [66], and esophageal cancers [125]. Given these extensive cfDNA applications, it is likely that clinical validation studies of these whole-genome or targeted panels of 5hmC-modified loci will emerge.

#### 3.4 Transcriptomic assays

Analogous to cfDNA assays, targeted PCR or broader sequencing approaches can be applied to complimentary DNA (cDNA) synthesized by reverse transcription from RNA templates. In general, targeted quantitative reversetranscriptase PCR (RT-PCR)-based assays are used for detecting specific or multiple transcripts. To expand RT-PCR methodologies to low-input samples, dPCR approaches have been applied to cDNA synthesized from circulating cell-free or exosome/CTC-derived RNA, with efforts focused on improving reverse transcriptase efficiency [67, 126]. The ExoDx® Lung assays (T790M, ALK, or panel EGFR, Exosome Diagnostics), for example, use an RT-dPCR approach on exosomal RNA, combined with analysis of cfDNA, to assess patients with lung cancer for EGFR mutations [60].

To more broadly assess RNA in liquid biopsies, transcript microarrays and whole-transcriptome NGS are used. The transcriptomic analog to WGS, RNA-seq, has been transformational in molecular biology [127, 128]. Methods to expand RNA-seq for biomarker discovery from low-quantity or rare cell populations have been developed. Smart-seq, a single-cell level mRNA-seq method, has been tested on mRNA isolated from CTCs to analyze genome wide expression patterns [58]. Considerable effort has been made to establish workflows and appropriate standards for RNA-seq performed on low-input samples, such as miRNAs from patient plasma samples [129] and other cell-free RNA species [68, 130, 131]. In summary, the analytes available in circulating plasma are myriad, but the technologies to probe these analytes and discovered biomarkers need additional clinical validation prior to universal adoption.

## 4 Applications of liquid biopsy in pediatric solid tumors

## 4.1 Neuroblastoma

Neuroblastoma is the fourth most common pediatric tumor and the most common extracranial solid malignancy in children. As a neural crest cell-derived cancer, it typically presents in the first few years of life and is characterized by phenotypic and biologic heterogeneity. Patients with low-risk disease can often be monitored with observation alone [132], while patients with aggressive high-risk neuroblastoma can expect a three-year event-free survival of 60% despite high-intensity, multimodal therapy [133]. Diagnosis and monitoring of neuroblastoma are typically accomplished through tumor biopsy followed by serial computed tomography scans, <sup>123</sup>Imetaiodobenzylguanidine radionucleotide scanning, urine catecholamines, and bone marrow biopsies and aspirates. Once patients are assigned to high-risk therapy, there are no blood biomarkers to monitor disease or determine response to therapy. Despite the discovery over thirty years ago that neuron specific enolase, gangliosides, and neuropeptide Y were elevated in plasma from patients with neuroblastoma [134–139], these circulating biomarkers have not proven reliable enough to augment or supplant imaging and biopsies (Table 2). Therefore, recent efforts have focused on harnessing the latest technology to identify novel liquid biopsy biomarkers of high-risk neuroblastoma.

Neuroblastoma is known to frequently shed CTCs in the blood both at diagnosis and during therapy [140, 183]. Historically, neuroblastoma CTCs were identified either with RT-PCR of CTC-derived mRNA or immunoprecipitation of cell-surface proteins [141, 184]. While it was determined that the presence or absence of CTCs may serve as a circulating biomarker of treatment response and likelihood of progression [142], immunologic purging of CTCs did not improve the survival of children with high-risk neuroblastoma in a randomized phase III trial [185].

Early efforts toward the genomic identification of neuroblastoma in liquid biopsies relied heavily on RT-PCR, which identified mRNA transcripts possibly shed by CTCs. Increased steady-state tyrosine hydroxylase mRNA in newly diagnosed neuroblastoma patients [143, 186, 187] is one example of over twenty different transcripts to show potential as a circulating neuroblastoma biomarker [188]. Indeed, multitranscript panels [144–147, 189] and newer NGS approaches to detect miRNA (freely circulating or exosome-derived) [148, 149] demonstrate promise and feasibility, but there have been numerous impediments to clinical implementation including the difficulty of obtaining high-quality RNA in the clinic, prioritizing development of the many gene sets, and a lack of clear understanding of the assays' minimum detection limits.

More recently, advances in parallel genomic sequencing have made it possible to perform assessment of common genomic aberrations from cfDNA, particularly CNVs [150–152], which are well-described as biomarkers of aggressive neuroblastoma [190, 191]. Shallow WGS of cfDNA was evaluated as a relatively economical way to assess CNVs and confirmed that changes identified from liquid biopsies mirrored those from primary tumors [151, 153]. In particular, amplification of the MYCN oncogene, a well-established driver of half of high-risk neuroblastoma tumors [192], can be identified in cfDNA with a variety of technologies [154–159]. Gain of 17q and loss of 11q are also readily detectable [160] in serum at diagnosis [160, 161], and amplifications of the ALK gene has been identified using ddPCR [159]. Researchers have also implemented WES and WGS to identify specific genomic alterations in genes such as TERT, ATRX, and ALK that may have therapeutic implications [152], though it remains unclear how effective such

 Table 2
 Overview of select liquid biopsy studies in patients with pediatric solid tumors

			-		
Citation	Year	Cancer type	Assay	# of patients	Findings
Moss [140]	1990	Neuroblastoma	Immunocytology	23	CTCs were identified by immuno- stains prior to clinical evidence of disease relapse.
Mattano [141]	1992	Neuroblastoma	RT-PCR	18	PGP 9.5 was a blood-based biomarker of disease.
Seeger [142]	2000	Neuroblastoma	Immunocytology	422	The presence of circulating neuroblasts detected with five monoclonal antibodies at different time points was predictive of outcome.
Burchill [143]	2001	Neuroblastoma	RT-PCR	49	Tyrosine hydroxylase mRNA in blood was an independent risk factor for inferior survival, including in children without clinical evidence of disease.
Viprey [144]	2014	Neuroblastoma	RT-qPCR	182	High <i>PHOX2B</i> and tyrosine hydroxylase mRNA expression in blood correlated with highly aggressive disease and inferior survival.
Stutterheim [145]	2009	Neuroblastoma	RT-qPCR	37	A panel of five genes for detection of minimal residual disease was validated in peripheral blood.
Marachelian [146]	2017	Neuroblastoma	RT-qPCR	101	mRNA for five neuroblastoma-associated genes from blood and bone marrow was found to be an independent predictor of progression free survival.
Yanez [147]	2011	Neuroblastoma	RT-qPCR	102	The presence of tyrosine hydroxylase or doublecortin mRNA in the blood or marrow at diagnosis correlated with inferior event-free survival.
Zeka [148]	2018	Neuroblastoma	RT-qPCR	185	A serum-based nine miRNA signature predicted outcome, and quantities correlated with disease burden and treatment response.
Morini [149]	2019	Neuroblastoma	RT-qPCR	52	Exosomal three miRNA signature correlated with response to therapy.
Chicard [150]	2016	Neuroblastoma	OncoScan array chip	70	Chromosomal breakpoints and copy number alterations in cfDNA correlated with tumors.
Van Roy [151]	2017	Neuroblastoma	WGS	37	cfDNA reliably identified CNVs.
Chicard [152]	2018	Neuroblastoma	WES	19	New single nucleotide variants were identified in cfDNA from patients with relapse or progression.
Klega [153]	2018	Wilms, Neuroblastoma, Sarcomas	WGS	45	1q gain could be detected in cfDNA from patients with Wilms tumor.
Kojima [154]	2013	Neuroblastoma	RT-qPCR	50	<i>MYCN</i> copy number in cfDNA correlated with tumor.
Combaret [155]	2009	Neuroblastoma	RT-qPCR	267	<i>MYCN</i> copy number in cfDNA was a sensitive and specific diagnostic biomarker in stage 3/4 disease.
Gotoh [156]	2005	Neuroblastoma	RT-qPCR	87	<i>MYCN</i> copy number in cfDNA was greater in patients whose tumors were <i>MYCN</i> amplified.
Combaret [157]	2005	Neuroblastoma	RT-qPCR	104	MYCN copy number in cfDNA correlated with tumor.
Combaret [158]	2002	Neuroblastoma	RT-qPCR	102	MYCN copy number was determined from cfDNA.
Lodrini [159]	2017	Neuroblastoma	ddPCR	10	

## Table 2 (continued)

Citation	Year	Cancer type	Assay	# of patients	Findings
					<i>MYCN</i> and <i>ALK</i> copy number was accurately determined from cfDNA.
Combaret [160]	2011	Neuroblastoma	RT-qPCR	142	There was moderate sensitivity and specificity to detect 17q gain in cfDNA when compared to tumor.
Yagyu [161]	2011	Neuroblastoma	Microsatellite analysis	24	Microsatellite analysis of ctDNA was 100% sensitive and specific for 11q loss.
Misawa [162]	2009	Neuroblastoma	Methylation-specific PCR	68	The methylation status of <i>RASSF1A</i> in cfDNA was prognostic.
Yagyu [163]	2008	Neuroblastoma	Methylation-specific PCR	80	The methylation status of <i>DCR2</i> in cfDNA was prognostic and correlated with primary tumor.
Hayashi [164]	2017	Sarcoma	Flow cytometry	36	CTC burden decreased during treatment; persistent detectable CTCs heralded clinical relapse.
Barris [165]	2018	Sarcoma	Targeted next-generation sequencing	7	Cancer-specific mutations were quantified and tracked in serially collected cfDNA from patients with osteosarcoma.
Shulman [166]	2018	Sarcoma	WGS	166	The presence and burden of ctDNA in patients with Ewing sarcoma correlated with inferior outcome.
Allen-Rhoades [167]	2015	Sarcoma	RT-qPCR	39	A plasma miRNA signature detected osteosarcoma and had prognostic value.
Ma [168]	2014	Sarcoma	RT-qPCR	89	Higher miR-148a expression was associated with metastatic disease and inferior survival in osteosarcoma.
Schleiermacher [169]	2003	Sarcoma	RT-qPCR	172	<i>EWS-FL11</i> and <i>EWS-ERG</i> fusions in the blood and marrow were predictive of inferior survival.
Hayashi [170]	2016	Sarcoma	ddPCR	3	Patient-specific fusion products were detectable in blood and identified prior to clinical relapse.
Krumbholz [171]	2016	Sarcoma	ddPCR	20	<i>EWSR1-FL11</i> burden in cfDNA correlated with radiographic findings during treatment and at relapse.
Allegretti [172]	2018	Sarcoma	RT-qPCR, ddPCR	4	Quantity of the <i>EWS-FLI1</i> fusion from ctRNA tracked with disease status.
Eguchi-Ishimae [173]	2019	Sarcoma	RT-qPCR	1	The <i>PAX3-FOXO1</i> fusion was detected in cfDNA during remission, several months before clinical/radiographic relapse.
Miyachi [174]	2010	Sarcoma	RT-qPCR	8	A six miRNA signature from cfDNA differentiated rhabdomyosarcoma from other solid tumors.
Jimenez [175]	2019	Renal tumors	WES	18	Tumor-specific genetic alterations were identified in cfDNA. Wilms-specific genetic alterations were found in 12 of 14 patients with Wilms tumor.
Murray [176]	2015	Wilms tumor, Hepatoblastoma, Neuroblastoma, Lymphoma Sarcomas	RT-qPCR	33	Specific diagnostic miRNA signatures differentiated tumor types.
Ludwig [177]	2015	Wilms tumor	RT-qPCR	32	A three miRNA signature differentiated patients with Wilms tumor from healthy controls.
Schmitt [178]	2012	Wilms tumor	RT-qPCR	13	A miRNA signature differentiated patients with Wilms tumor from healthy controls but no difference was seen pre- and post-treatment.
Treger [179]	2018	Wilms tumor	ddPCR	4	

Citation	Year	Cancer type	Assay	# of patients	Findings
					<i>TP53</i> mutations were detected in serum of patients with diffuse anaplastic Wilms tumor and ctDNA burden declined post-nephrectomy.
Charlton [180]	2014	Wilms tumor	Methylation analysis of CpG sites	22	Differentially methylated regions can be identified in cfDNA of patients versus healthy controls.
Liu [181]	2016	Hepatoblastoma	RT-PCR	32	Exosomal miR-21 was a more accurate diagnostic marker than serum AFP.
Jiao [182]	2017	Hepatoblastoma	RT-PCR	89	miR-34s family expression was prognostic and a more accurate diagnostic marker than serum AFP.

*AFP*, alpha fetoprotein; *cfDNA*, cell-free DNA; *ctDNA*, circulating tumor DNA; *CNV*, copy number variations; *CTC*, circulating tumor cells; *ddPCR*, digital droplet PCR; *qPCR*, quantitative PCR; *RT-PCR*, quantitative reverse transcription PCR; *WES*, whole exome sequencing; *WGS*, whole genome sequencing

approaches will be for delineating patients in complete remission from those with minimal disease states.

It is postulated that neuroblastoma is driven in large part by epigenetic modifications due to the combination of few driving somatic mutations [193] and diverse clinical phenotypes [194, 195]. Indeed, focal and genome-wide profiling of cytosine and histone modifications can recapitulate neuroblastoma risk groups and identify drivers of tumor biology [196–203]. The potential for biomarker development by identifying altered methylation patterns on specific genes in cfDNA has been demonstrated for *RASSF1A* and *DRC2* [162, 163] and efforts are ongoing to explore genome-wide 5mC profiling from cfDNA for biomarker development in neuroblastoma.

In contrast to 5mC, 5hmC is associated with open chromatin, and increased deposition on gene bodies has been shown to correlate with gene expression. Thus, assays of genomewide 5hmC have the potential to serve a DNA surrogate for gene expression, particularly of regulatory genes [114]. In neuroblastoma, 5hmC profiles generated by nano-hmC-seal from over a hundred diagnostic tumor samples delineated high-risk from non-high-risk disease [196]. This same profiling technology was recently applied to cfDNA from 129 serially collected samples from mostly high-risk patients during treatment and follow-up [204]. 5hmC profiles were highly correlated with metastatic disease burden in both discovery and validation cohorts regardless of underlying tumor biology, but were also able to identify samples from patients with MYCN-amplification. Furthermore, 5hmC cfDNA profiles differentiated some patients who responded to initial chemotherapy from those who did not and detected minimal amounts of disease in patients who were classified as achieving complete remission using established clinical response criteria. This promising methodology will be prospectively validated in larger, independent cohorts.

## 4.2 Sarcoma

Sarcomas represent 20% of all pediatric solid malignancies [205] and are the most common malignancies of bone diagnosed in the first three decades of life [206]. Tissue biopsy is the gold standard for diagnosis, but because of its invasiveness it is not feasible for serial monitoring of disease prior to surgical resection. No liquid biopsy approaches have been approved for integration into clinical care, and an expanding number of studies are assessing their utility for diagnosis, monitoring, and management. For example, across high-grade sarcomas, Hayashi et. al. showed that CTCs were detectable and quantifiable at the time of diagnosis, decreased with treatment, and correlated with risk of radiographic relapse [164].

When considering circulating cfDNA as an analyte for osteosarcoma, the lack of recurrent translocations limits the application of mutation-detection assays such as ddPCR and WES. In spite of this, McBride et. al. designed patientspecific PCR primers based on DNA mutations found in primary tumor DNA to detect tumor-derived DNA in plasma from one osteosarcoma patient [207]. Additionally, Barris et. al. demonstrated the use of targeted ultra-deep NGS to identify and track ctDNA burden of osteosarcoma patients using common aberrant genes such as TP53 and ATRX [165]. Others have demonstrated that ultra-low-passage WGS of plasma can identify tumor material in a majority of patients with osteosarcoma [166]. Circulating RNA, including miRNA, has also been profiled and shown to be prognostic in patients with osteosarcoma, though validation studies are needed to confirm correlation with outcome [167, 168].

Another pediatric bone malignancy, Ewing sarcoma, has characteristic translocations that can be detected in liquid biopsy samples [153]. In an early study, RT-PCR of fusion gene transcripts *EWS-FLI1* or *EWS-ERG* were used to identify occult tumor cells in plasma, and occult cell presence was associated with

micrometastases and adverse outcomes [169]. However, the prognostic significance of this observation has yet to be validated [208]. More recently, in patients with newly diagnosed Ewing sarcoma, EWSR1 translocations and other mutations such as TP53 and STAG2 were detected in cfDNA using ultra-low-passage WGS [166]. This study also explored the prognostic potential of a translocation-based liquid biopsy, showing that the half of patients with detectable ctDNA at diagnosis had inferior three-year eventfree survival compared to those without detectable ctDNA at diagnosis, an association likely related to increased rates of metastatic disease in those with detectable ctDNA. Hayashi et. al. developed a highly sensitive and targeted approach to detect ctDNA by using PCR primers for tumor-specific EWS-ETS fusion gene breakpoints and subsequently applied ddPCR to detect the fusion gene in patient plasma [170]. ddPCR was also used to assess EWSR1-FLI1 fusion levels in cfDNA. Increased EWSR1-FLI1 levels were associated with disease burden and relapse, while decreased levels were observed in patients who responded to initial chemotherapy [171]. The EWS-FLI1 translocation has also been identified from cfRNA using RT-PCR [172].

Rhabdomyosarcoma, the most common tissue sarcoma, is also associated with fusion genes in a subset of cases. Eguchi-Ishimae et. al. reported that the *PAX3-FOXO1* translocation could be detected by qPCR on cfDNA extracted from serial blood samples of a single patient with alveolar rhabdomyosarcoma. Notably, the translocation was detected in cfDNA during clinical remission, prior to a relapse that was not radiographically evident for several additional months [173]. In addition to fusion gene detection, Miyachi et. al. used RT-PCR to identify circulating miRNAs (miR-1, miR-133a, miR-133b, and miR-206), with miR-206 having the highest sensitivity and specificity to distinguish rhabdomyosarcoma from other solid tumors [174].

## 4.3 Wilms tumor

Wilms tumor, the most common renal malignancy in childhood, is primarily managed with two distinct approaches. In much of Europe, and in some patients for whom upfront resection is contraindicated, neoadjuvant chemotherapy is often initiated without a tissue biopsy, resulting in mismatched treatment in up to 5% of children [209]. In contrast, North American trials have demonstrated prognostic pre-treatment biologic features to stratify higher risk patients for intensified therapy, and upfront resection or tumor biopsy is preferred [12]. The development of liquid biopsies for Wilms tumor diagnosis may help to standardize therapy by providing valuable risk-stratification information. In a biomarker discovery study, WES was performed on cfDNA obtained from prenephrectomy patients at diagnosis and identified tumorspecific mutations across all kidney tumor histologies [175]. A recent study used low passage WGS of ctDNA from eight patients with Wilms tumors and identified four patients with detectable ctDNA, two of whom had 1q gain, a prognostic marker in Wilms tumor [153]. Others have focused on identifying serum miRNAs using RT-PCR. Circulating miR-143-3p and miR-129-5p differentiated Wilms tumors from neuroblastoma [176], whereas miR-130b-3p, miR-100-5p, and miR-143-3p differentiated patients with Wilms tumor from healthy controls with an accuracy of 84.5% [177]. These data are promising, yet additional diagnostic liquid biopsy needs remain, including the ability to reliably differentiate Wilms tumor from benign lesions, nephrogenic rests or nephroblastomatosis, and other pediatric renal pathologies (e.g., clear cell sarcoma of the kidney or rhabdoid tumor). Further, an ideal liquid biopsy will be able to detect prognostic molecular biomarkers of favorable histology Wilms tumors, such as 1p and 16q loss of heterozygosity [12].

Several technologies using cfDNA to monitor disease have been tested with variable success for patients with Wilms tumor. While a signature of 176 circulating miRNAs was diagnostic of Wilms tumor at diagnosis and could distinguish healthy controls, it did not accurately reflect treatment effects [178]. In patients with anaplastic histology Wilms tumor, Treger et al. identified TP53 mutations using ddPCR in matched tumor, blood, and urine samples at various time points during treatment, although the correlation with prognosis has yet to be explored [179]. Finally, as somatic epigenetic drivers are common in Wilms tumors, Charlton et. al. detected tumor-derived methylated loci in cfDNA from patients with Wilms tumor [180]. These methylated sites were successfully identified in cfDNA at the time of diagnosis, and in some cases, during neoadjuvant chemotherapy, after resection, and during adjuvant chemotherapy [180]. Taken together, the genetic, transcriptomic, and epigenetic probing of circulating nucleic acids show promise for liquid biopsies from patients with Wilms tumor.

## 4.4 Hepatoblastoma

Hepatoblastoma, the most common liver tumor of childhood, is often diagnosed in association with underlying cancer predisposition syndromes such as Beckwith-Wiedemann syndrome. Early detection of malignancies is especially important for these children [210], and screening typically involves periodic imaging and measuring of serum alpha fetal protein (AFP) [210]. Thus, advanced liquid biopsies could be combined with imaging/AFP to improve screening sensitivity. To begin to address this, Murray et. al. performed RT-PCR of miRNA isolated from whole blood samples collected from patients with hepatoblastoma compared to healthy controls and children with other tumors and identified that miR-122-5p, miR-483-3p, and miR-205-5p could be used to differentiate patients with hepatoblastoma from those with neuroblastoma [176]. Liu et. al. performed RT-PCR to measure the expression levels of miR-21 in the plasma and the exosomes of hepatoblastoma patients and demonstrated that exosomal miR-21 was able to diagnose hepatoblastoma more accurately than serum AFP levels [181]. In this study, miR-21 was an independent predictor of event-free survival for hepatoblastoma patients [181]. In contrast, Jiao et. al. found that circulating miR-34a, miR-34b, and miR-34c was not diagnostically superior to AFP, but the presence of these miRNAs were the significant predictors of outcome, even when controlled for PRETEXT stage IV, presence of metastases, and presence of vascular invasion [182]. The potential application of liquid biopsies in hepatoblastoma requires additional effort to identify optimal analytes and assays for further development.

## **5 Future directions**

The applications reviewed above include those for cancer diagnostics, risk stratification, and predictive modeling to guide pediatric personalized medicine. There remains a significant unmet need in children with solid tumors to titrate the intensity and duration of therapy based on clinical and biologic features of disease, including risk of recurrence. Liquid biopsies offer potential to track tumor burden complementary or independent of radiologic or surgical findings. For example, when treatment for rhabdomyosarcoma is completed, a portion of patients may have persistent circulating tumor analytes, and the detection of this through liquid biopsy may justify maintenance-like chemotherapy for these patients [211]. Serially collected liquid biopsies could also provide insight about the association between disease burden and chemosensitivity, i.e., a liquid biopsy indication of rising tumor burden while on conventional therapy could trigger clinical decisions to augment or shift treatment. Additional applications of liquid biopsies will likely focus on monitoring patients at high risk of developing cancer (including children with genetic predisposition or cancer history) without exposure to ionizing radiation or anesthesia.

Assaying circulating tumor material offers unique opportunity to expand our understanding of cancer biology and pathogenesis through the study of tumor heterogeneity and evolution. While a tissue biopsy provides cellular and molecular insight about the sampled region, a liquid biopsy captures the diverse landscape of a tumor [212], and therefore deep sequencing, for example, may identify disease-causal and persistent subclones that are chemo-resistant. Serial liquid biopsies may facilitate the application of spatiotemporal genomics and gene expression profiling, or the study of how tumors evolve over time, which will allow for the identification of the most highly relevant disease-associated genes and pathways, potentially enabling personalized medicine approaches. The addition of whole-genome epigenetic profiling may also complement genomic approaches, as will evolving technologies to profile metabolites.

Childhood cancer researchers are poised to advance the study of liquid biopsies and circulating biomarkers. While clinical validation of new assays through randomized controlled trials will be necessary for clinical adoption, the process will be supported by the nearly universal cooperation of providers and patients for clinical trial enrollment, and the increased emphasis on developing robust, clinically annotated biorepositories. Well established, centralized infrastructure to handle sample processing, storage, and distribution can aid in the comprehensive study of these rare diseases, and this should remain a priority amongst researchers and funding organizations.

The technologies supporting liquid biopsies in pediatric solid tumors continue to expand and the clinical applications are being refined by many independent research groups. Robust biorepositories will help ensure that as novel technologies to probe circulating analytes emerge, the use of patient sample and patient information will be maximized for comprehensive validation and clinical adoption.

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#### Compliance with ethical standards

**Conflict of interest** CH is a shareholder of Shanghai Epican Genetech Co. Ltd. that licensed 5hmC-Seal from The University of Chicago. CH is a scientific founder and scientific advisory board member of Accent Therapeutics, Inc.

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