

Liquid biopsy into the clinics: Current evidence and future perspectives

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ABSTRACT

As precision oncology has become a major part of the treatment landscape in oncology, liquid biopsies have developed as a particularly powerful tool as it surmounts several limitations of traditional tissue biopsies. These biopsies involve most commonly the isolation of circulating extracellular nucleic acids, including cell-free DNA (cfDNA) and circulating tumor DNA (ctDNA), as well as circulating tumor cells (CTCs), typically from blood.

The clinical applications of liquid biopsies are diverse, encompassing the initial diagnosis and cancer detection, the application as a tool for prognostication in early and advanced tumor settings, the identification of potentially actionable alterations, the monitoring of response and resistance under systemic therapy and the detection of resistance mechanisms, the differentiation of distinct immune checkpoint blockade response patterns through serial samples, the prediction of immune checkpoint blockade responses based on initial liquid biopsy characteristics and the assessment of tumor heterogeneity. Moreover, molecular relapse monitoring in early-stage cancers and the personalization of adjuvant or additive therapy via MRD have become a major field of research in recent years.

Compared to tissue biopsies, liquid biopsies are less invasive and can be collected serially, offering real-time molecular insights. Furthermore, liquid biopsies may allow for a more holistic evaluation of a patient's disease, as they assess material from all tumor sites and can theoretically reflect tumor heterogeneity. Furthermore, quicker turnaround-time also constitutes an advantage of liquid biopsies. Disadvantages or hurdles include the challenge of detecting low amounts of tumor deposits in peripheral blood or other fluids and the potential of different amounts tumor-shedding from different metastatic sites, as well as potentially false-positive from clonal hematopoietic mutations of indeterminate potential (CHIP) mutations. The clinical utility of liquid biopsies still must be validated in most settings and further research has to be done. Clinical trials including alternate bodily fluids and leveraging AI-technology are expected to revolutionize the field of liquid biopsies.

1. Introduction

In the era of precision oncology, molecular diagnostics have had an immense impact on patient diagnosis and treatment, thus leading to improved patient outcomes [1]. Liquid biopsy has emerged as a particularly powerful tool as it could potentially surmount several limitations of traditional tissue biopsies. Liquid biopsies are minimally to non-invasive and offer an easily-accessible alternative for molecular profiling, especially when tumor tissue is not available. Furthermore, they assess the tumor-derived components across tumor sites, thus having the theoretical potential to serve as a real-time, spatial and temporal cancer monitoring approach [2]. Although there is promising data for the clinical validity of liquid biopsies in various settings including cancer detection and disease monitoring, clinical utility remains to be proven in most settings.

The goal of this review is to provide an overview of the main potential clinical applications of liquid biopsies, including current evidence and recommendations, ongoing research and future perspectives, with a main focus on circulating tumor deoxyribonucleic acid (ctDNA) and circulating tumor cells (CTCs) in solid tumors.

2. Background

The term 'liquid biopsy' refers to the examination of biological fluids through cellular and molecular techniques in order to derive information about cancer biology and dynamics. The most widely examined and most commonly used analyte is definitely blood. However, liquid biopsies have been also explored and delivered promising results in a wide range of alternative –more or less easily accessible– bodily fluids including urine

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[3–5], pleural effusion [6–8], ascites effusion [7,9], cerebrospinal fluid [7,10–12] and saliva [13,14] (Fig. 1).

There are several cellular and molecular techniques that have been studied in the assessment of liquid biopsies, offering different types of information (Fig. 1). The most commonly employed approaches involve the analysis of cell-free (cf) and ctDNA, which is the subset of cfDNA directly derived from tumor.

Two primary methodologies have been explored for analyzing ctDNA/cfDNA: targeted and untargeted strategies. The former concentrate on specific gene rearrangements or mutations, whereas the latter provide a more comprehensive examination and surveillance of the tumor genome, irrespective of prior information about the tumor [16]. Among the techniques applied to assess ctDNA/cfDNA on a genomic level are digital droplet polymerase chain reaction (ddPCR) and BEAMing (beads, emulsions, amplification, and magnetics) as well as sequencing techniques like tagged-amplicon deep sequencing (TAM-Seq), cancer personalized profiling by deep sequencing (CAPP-Seq), whole exome sequencing (WES), and whole genome sequencing (WGS) [15,16]. These approaches range from single-gene testing to large testing panels and can be tumor-informed, i.e. assess specific alterations based on prior molecular profiling of tumor tissue, or tumor-agnostic, which usually involves a wider, less specific panel. Currently used methodologies of cfDNA/ctDNA analysis are facing the challenge of low-shedding cancers, especially in early-stage disease, as well as the potential of confounding by clonal hematopoietic mutations of indeterminate potential (CHIP) and germline mutations. CtDNA assays also tend to have reduced sensitivity for the detection of gene fusions, as compared to tissue RNA testing [2]. These are potential limitations that need to be taken into consideration when interpreting ctDNA results [2]. On an epigenetic level, DNA methylation analyses mainly through bisulfite sequencing have also been explored [15,16]. CfDNA fragmentation analysis is an emerging technology that has already delivered promising results. Another emerging analysis could be the evaluation of nucleosome occupancy of cfDNA by deep sequencing methods [15,16].

Circulating tumor cells (CTCs), which are cells shed by the tumor into the bloodstream, were one of the first widely used liquid biopsy biomarkers. While they facilitate a wide range of analyses including genomic, transcriptomic, proteomic, methylation, functional and single-cell analyses, their amount in blood is usually low and they are more difficult to isolate [15,16]. Several other tumor-derived components that have also been examined, however less widely than ctDNA and CTCs, include cell-free ribonucleic acid (cfRNA), proteins, extracellular vesicles as well as tumor educated platelets (TEP) and particularly tumor educated platelets ribonucleic acid/TEP-RNA [15–17]. The detailed

description of liquid biopsy techniques is beyond the scope of this review. Excellent review papers focusing on this topic have been published in several journals [15–17].

Probably the biggest advantage of liquid biopsies is that they are minimally-to non-invasive and much easier to perform in contrast to traditional tissue diagnostics that require a tumor biopsy and place the patient at a significantly higher risk for procedure-related complications. As a result, multiple liquid biopsies can be performed over time, enabling real-time monitoring of cancer evolution. Furthermore, liquid biopsies may allow for a more holistic evaluation of a patient's disease, as they assess material from all tumor sites and can theoretically reflect tumor heterogeneity. Finally, liquid biopsies tend to be less expensive and have generally quicker turnaround times than tissue molecular diagnostics. One major disadvantage of liquid biopsies is that tumors may shed low amounts of components, making detection in peripheral blood more challenging. Furthermore, shedding of tumor-derived components may differ across various tumor sites and thus hinder the evaluation of tumor heterogeneity. Although there is abundant evidence on the analytical and clinical validity of numerous assays in a wide-range of tumor entities and indications, their clinical utility in most settings has not been validated yet [2,15,17]. (Table 1).

3. Potential clinical applications of liquid biopsies in oncological practice

Liquid biopsies offer a wide range of potential clinical applications, as summarized in Fig. 2. Their common objective is to complement standard clinical, imaging and tissue assessments in order to optimize patient management.

Table 1
Advantages and disadvantages of liquid biopsy.

Advantages	Disadvantages
✓ Minimally- to non-invasive and	– Low shedding of tumor-derived materials may hinder detection
✓ Low organizational effort required	– Tumor-shedding may differ across tumor sites hindering heterogeneity assessment
✓ Multiple assessments over time possible	– Clinical utility remains to be proven (in most settings)
✓ Assessment of tumor heterogeneity	
✓ Lower cost than tissue diagnostics (generally)	
✓ Shorter turnaround times	

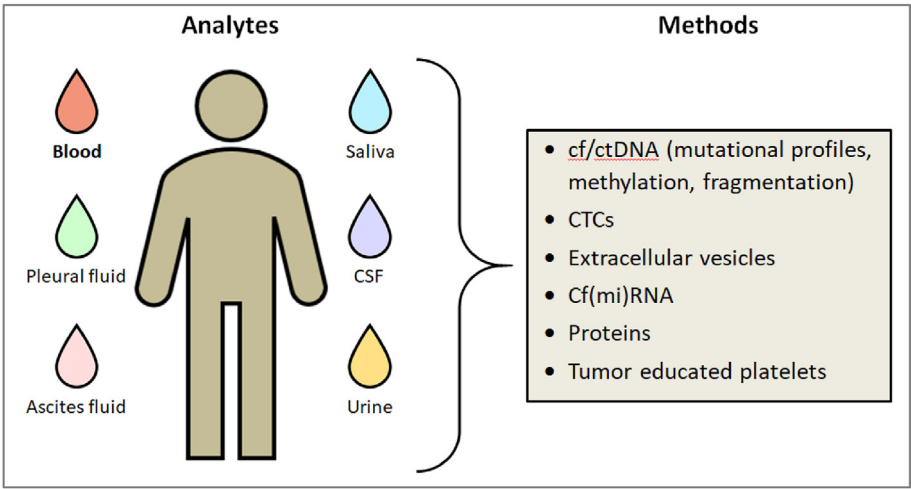


Fig. 1. cfDNA = cell free DNA, CSF = cerebrospinal fluid, CTCs = circulating tumor cells, ctDNA = circulating tumor DNA.

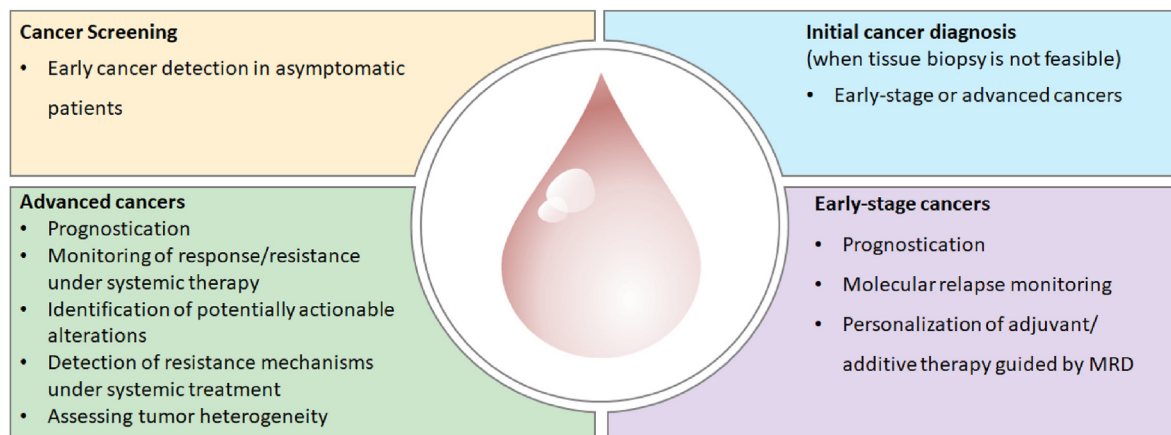


Fig. 2. Overview of clinical applications of liquid biopsies.

3.1. Cancer screening and early cancer detection

One of the potential liquid biopsy applications of highest interest is cancer screening and early cancer detection in asymptomatic populations. Detecting cancer at an early stage, when it is still amenable to curative therapies, may have tremendous impact on patient outcomes and help reduce cancer mortality. As outlined by the European Society for Medical Oncology (ESMO) Precision Medicine Working Group, a reliable liquid biopsy screening tool would require high specificity combined with clinically meaningful sensitivity and would ideally classify the tissue of origin [2]. This is particularly challenging with cf/ctDNA techniques as especially early-stage tumors shed little ctDNA [2]. Several methodological approaches yielding promising results have been explored for this purpose.

Initial approaches for cancer detection through liquid biopsies were cfDNA based. Phallen et al. utilized targeted error correction sequencing to examine cfDNA and were able to detect somatic mutations in the plasma of solid tumor patients with early-stage disease at a rate ranging from 59 to 71% [18]. Analysis of cfDNA in pregnant women who submitted blood for noninvasive prenatal testing showed an abnormal genomic profile not consistent with fetal abnormalities in about 10 of 100,000 cases. In 18 of 43 of these cases, the mother was eventually diagnosed with a malignancy, suggesting that cfDNA can be an early biomarker for cancer detection [19]. Assessment of mutations in cfDNA combined with circulating proteins as performed in CancerSEEK testing has been able to detect non-metastatic, clinically detected solid malignancies with fairly high sensitivity of 69–98% for cancers of the ovary, liver, stomach, pancreas, and esophagus, and specificity greater than 99% [20].

DNA methylation-based approaches have also been extensively explored in this setting. Epi proColon®, which is an FDA approved blood-based test for colorectal cancer (CRC) screening, utilizes real time PCR to detect methylated septin 9 -a biomarker for CRC- in cfDNA. In the prospective PRESEPT Study (NCT00855348), Epi proColon® demonstrated a standardised sensitivity of 48.2% (35%, 63% and 46% for Stage I, II, and III, respectively) with a specificity of 91.5% [21]. The test is currently intended for persons aged 50 and older who are unwilling or unable to be screened by standard methods [22]. Methylation analyses of cfDNA using different methods including targeted and genome-wide bisulfite sequencing have also been employed by different research groups for cancer detection across several malignancies, exhibiting robust performance with high specificity and encouraging sensitivity [23–28]. Methylation analysis has also been shown to be a useful tool in tumor classification through liquid biopsies [25,26,28]. DNA fragmentation analyses have also been employed to detect cancer, including the evaluation of genome-wide fragmentation patterns of cfDNA [29] as well as fragmentation size [30].

Non-ctDNA-based approaches that have been explored for cancer screening include extracellular vesicle analyses. In a case-control study including cancer cases of the pancreas, ovary and bladder, Hinestrosa et al. used an extracellular vesicle protein measurement approach that yielded a specificity of 99.5% with sensitivity of 71.2%. Detection rates for Stage I cancer ranged from 43.8% in bladder cancer to 95.5% in pancreatic cancer [31]. Tumor educated platelet RNA analyses have also been explored in this setting yielding promising results regarding cancer detection and classification [32–34].

This encouraging data of different liquid biopsy approaches as cancer screening tools needs to be further evaluated in large-scale screening studies to assess not only their reliability as screening tools but also their clinical utility and impact on clinical outcome. Currently, the use of multi-cancer liquid biopsy screening tools is not considered part of standard clinical practice by the ESMO Precision Medicine Working Group [2].

3.2. Initial cancer diagnosis and cancer genotyping (when tissue biopsy is not feasible), early stage or advanced cancers

In most cases, a suspected solid cancer diagnosis on imaging is confirmed by tissue biopsy. Nevertheless, identification of pathogenic mutations in ctDNA can assist in the initial cancer diagnosis and cancer genotyping in patients with tumors that are difficult to biopsy or patients with contraindications for tissue sampling [15,35].

Jensen et al. [36] conducted a study involving patients with tumors deemed arduous to biopsy. They successfully isolated cfDNA and employed low-coverage genome-wide sequencing techniques. Findings from this study, as well as others, underscore the potential of liquid biopsy to offer molecular insights in cases where the acquisition of sufficient tissue for molecular profiling is challenging. The ESMO Precision Medicine Working Group has recommended ctDNA analysis for advanced cancer genotyping in several entities, including breast, gastric, hepatocellular, and non-small cell lung cancer (NSCLC), in cases where tissue analysis is not possible [2].

However, in this context the differentiation of pathogenic and CHIP mutations is of utmost importance, requiring a high level of expertise in the use and interpretation of the applied genomic test. In case of negative liquid biopsy results, the potential of false negatives needs to be taken into consideration and guide further management of the patient on an individualized basis [2]. Also, the use of alternate bodily fluids apart from blood like urine, pleural, ascites and cerebrospinal fluid, needs to be further explored in this setting [15].

3.3. Clinical applications in early-stage cancer

Blood ctDNA is the most widely studied liquid biopsy approach for

the assessment of early-stage cancer. As early-stage cancers are known to shed lower levels of ctDNA compared to metastatic disease, specialized assays with high sensitivity and the ability to detect very low ctDNA levels need to be employed in this setting [2].

3.3.1. Prognostication

Detection of ctDNA by various methodologies including tumor-informed and -agnostic techniques prior or after curative-intent therapy has been consistently shown to have a negative prognostic value and has been linked to high risk of recurrence/relapse in patients with early-stage cancer, with clinical validity shown in many studies [2,37]. Recent meta-analyses demonstrated a fairly high specificity (>90%) but moderate sensitivity in this setting [38–40]. Current evidence suggests that serial ctDNA testing may improve sensitivity in the (post-)adjuvant setting [41–44]. Tumor-informed personalized ctDNA assays like Signatera™ or TARDIS that assess multiple known mutations have been developed in this setting, showing robust testing performance [44–46].

In patients with resectable colon cancer (localized or oligometastatic), several studies as well as a series of recent meta-analyses indicate that detectable ctDNA after surgery as well as after adjuvant chemotherapy are associated with a higher risk of recurrence [47–56]. In early-stage breast cancer, ctDNA detection at baseline and after curative treatment has also been linked to relapse [57–59]. Studies in other solid tumors including pancreatic, bladder, lung, and esophageal cancer as well as melanoma have yielded similar results, indicating the association of ctDNA detection directly after curative-intent therapy or during surveillance with high risk of recurrence across tumor types and ctDNA assays [37,42,43,60–65]. Further observational studies investigating the prognostic role of ctDNA in early-stage cancer are underway in several entities, including NSCLC (ex. NCT05382052, NCT05167604), breast (ex. NCT04353557), gastric (ex. NCT04943406), endometrial (ex. NCT05955079), and pancreatic cancer (ex. NCT04246203, NCT05400681, NCT05853198).

3.3.2. Personalization of adjuvant/additive therapy guided by minimal residual disease (MRD)

Regarding clinical utility, ctDNA positivity directly after curative-intent therapy -also referred to as minimal residual disease (MRD)- is of special interest, as it may have the potential to personalize adjuvant patient management. In a subset analysis of the IMvigor010-trial (NCT02450331), a randomized phase III trial comparing atezolizumab to observation after surgical resection for operable urothelial cancer, clinical benefit of immunotherapy in terms of disease-free survival was shown to be restricted to patients with detectable ctDNA after surgery [66]. Several studies and a meta-analysis in early-stage NSCLC have demonstrated that patients with detectable MRD benefited from adjuvant therapy including chemotherapy, targeted therapy, and immunotherapy in terms of recurrence-free survival while MRD-negative patients did not confer relevant benefit [41,62,65,67,68]. At the same time, MRD negativity could potentially guide de-intensification of adjuvant/additive treatment in a subset of patients, thus avoiding overtreatment and sparing patients of unnecessary toxicity. In the randomized DYNAMIC trial in stage II colon cancer comparing adjuvant treatment decisions guided by ctDNA MRD results vs. standard clinicopathological features, the use of adjuvant therapy was reduced in the MRD-guided group without compromising recurrence-free survival [69]. Although this data is highly suggestive of the potential of MRD-status to refine adjuvant management both through intensification and de-intensification of treatment, further evidence from ideally randomized clinical trials is required to thoroughly evaluate this notion. Currently, several ongoing clinical trials aim to examine MRD-driven adjuvant/additive therapy in different tumor entities (Table 2).

3.3.3. Molecular relapse monitoring

Another clinical application of particular interest in early-stage cancer is ctDNA-based monitoring during surveillance in patients with

Table 2
ctDNA-MRD in early-stage cancer – Ongoing trials.

Setting	Disease	Examples of ongoing trials
MRD-guided adjuvant treatment	Bladder cancer	IMvigor011 (NCT04660344)
	Breast cancer	LEADER (NCT03285412)
	Colorectal cancer	MEDOC-CrEATE (NL6281/NTR6455)
		DYNAMIC-Rectal (ACTRN12617001560381)
		CIRCULATE (NCT04089631)
		CIRCULATE- PRODIGE 70 (NCT04120701)
		CIRCULATE JAPAN – VEGA (JRCT1031200006)
		CIRCULATE-US (NCT05174169)
		COBRA (NCT04068103)
		CIRCULATE-Spain (EudraCT 2021-000507-20)
Molecular relapse monitoring	NSCLC	DYNAMIC-III (ACTRN-12617001566325)
		TRACC (Part C) (NCT04050345)
		SYNCOPE (NCT04842006)
		BNT122-01 (NCT04486378)
		PEGASUS (NCT04259944) ^a
		NCT03803553 ^a
		MERMAID-1 (NCT04385368)
		LUN0115 (NCT04585477)
		LUN0114 (NCT04585490)
		NCT03832569 ^a
	Solid tumors, microsatellite instability-high (MSI-H)	DARE (NCT04567420)
		ZEST (NCT04915755)
		TRAK-ER (NCT04985266) c-TRAK-TN (NCT03145961)
		CIRCULATE JAPAN – ALTAIR (NCT04457297)
		IMPROVE-IT2 (NCT04084249)
		NCT04752930
		MERMAID-2 (NCT04642469)
	Breast cancer	
	Colorectal cancer	
	NSCLC	

^a Intervention (also) guided by ctDNA assessment after adjuvant therapy.

Table 3
Monitoring of treatment response and guiding therapy decisions – Ongoing trials.

Setting	Disease	Examples of ongoing trials
Monitoring of treatment response	Breast cancer	MONDRIAN (NCT04720729)
		NCT03947736
		NCT05816642
		NCT04555369
		ELUCID (NCT03926260)
		PRELUCA (NCT05889247)
		LIBERTYLUNG (NCT04790682)
		NCT05415358
		NCT05816642
		NCT05116579
Monitoring of treatment response and guiding therapy decisions	Colorectal cancer	FLUIDO (NCT04793061)
		NCT05770531
		NCT05770531
		RAPID-1 (NCT04786600)
		OPTIMIZE (NCT04680260)
		TACT-D (NCT03844620)
		NCT05816642
		PROTRACT (NCT04015622)
	NSCLC	
	CRPC	

macroscopically no evidence of disease after curative-intent treatment. The prognostic value of ctDNA detection during surveillance has been shown in several studies and has been extensively discussed above. However, how “ctDNA relapse” could meaningfully affect patient management remains unclear. For instance, ctDNA relapse could potentially trigger closer monitoring through clinical and imaging evaluations in order to detect radiographic relapse earlier when the tumor might still be amendable to curative-intent treatment. Furthermore, earlier systemic treatment targeting MRD might potentially delay treatment progression in analogy to the approved hormonal therapies that are routinely applied in biochemically-recurrent prostate cancer. Currently, there is very limited evidence in this field. In the recently published c-TRAK TN study, patients with moderate- and high-risk early-stage triple-negative breast cancer underwent ctDNA surveillance via tumor-informed ddPCR after curative-intent therapy and ctDNA positive patients were randomized 2:1 to pembrolizumab vs. observation. Interestingly, the authors reported a very high rate of metastases in imaging at the time of ctDNA detection (23/32, 72%), highlighting the need for more sensitive testing [70]. Further studies evaluating how molecular relapse monitoring may affect patient management are underway (Table 2).

Due to the absence of robust evidence from prospective clinical trials regarding the clinical utility of MRD-guided decisions after curative-intent treatment and during surveillance, the ESMO Precision Medicine Working Group does not currently recommend the adoption of MRD-testing in the routine clinical practice of early-stage cancer [2].

3.3.4. CTCs

Apart from ctDNA-based approaches, CTC-based approaches have also been studied in the early-stage cancer setting, mainly focusing on prognostication. Most evidence comes from early-breast cancer studies, with many of them using the CellSearch assay, and suggests that high CTC levels and/or a CTC level increase prior, during or directly after curative-intent treatment have a negative prognostic value in terms of relapse-free and/or overall survival [71–77]. Baseline CTCs and maximal CTCs were also shown to be associated with relapse and shorter overall survival in patients with oral and oropharyngeal squamous cell cancer undergoing induction chemotherapy followed by curative surgery combined with postoperative radiotherapy [78].

3.4. Clinical applications in advanced cancer

3.4.1. Evaluation of targetable alterations

Although standard-of-care genomic profiling to detect targetable alterations still includes tissue-based testing, numerous prospective and retrospective studies have proven a high specificity and positive predictive values, ranging from 95% to 99%, when comparing ctDNA liquid biopsy results with those obtained through tissue-based testing in advanced tumors [79–83]. Therefore, its application in this clinical setting has been considered valuable and has led to the approval of several single- and multigene tests by the FDA.

The first Food and Drug Administration (FDA) -approved liquid biopsy assay, known as the cobas epidermal growth factor receptor (*EGFR*) mutation test v2, utilizes PCR-based technology and was approved as a companion diagnostic test for *EGFR* mutations present in plasma cfDNA from patients with advanced-stage NSCLC who could potentially benefit from the *EGFR* tyrosine kinase inhibitor (TKI) erlotinib [46]. The second PCR-based assay to be approved as a companion diagnostic test was the Therascreen phosphatidylinositol-4,5-bisphosphate 3-kinase catalytic subunit alpha (*PIK3CA*) RGQ PCR kit. The underlying data for approval was retrieved from the phase III SOLAR-1 trial. The test is designed to assess the eligibility for treatment with the *PIK3CA* inhibitor apalisib in combination with fulvestrant in hormone receptor-positive advanced breast cancer [84]. For both PCR-tests, reflex testing of tumor tissue is advised in case of negative test results [46,84].

Concerning next-generation sequencing (NGS)-based multigene liquid biopsy tests, Guardant360® as well as FoundationOne® Liquid

CDx have been approved as companion diagnostics for general molecular profiling and for several targeted therapies in recent years [85,86]. Guardant360® was primarily intended for the detection of *EGFR* mutations for eligibility assessment for Osimertinib [87]. FoundationOne® Liquid CDx was first approved for patients with advanced prostate cancer and NSCLC. The approval was extended to breast and ovarian cancer [88].

Apart from the approved tests and indications, the detection of actionable alterations has been studied in several other entities, such as cancer of unknown primary (CUP), gastroesophageal and colorectal cancer as well as gynecological tumors, with a percentage of at least 1 pathogenetic alteration detected ranging from 68 to 82% [89–94]. These high detection rates support the assessment of alterations using liquid biopsy testing.

The ESMO Precision Medicine Working Group has stated that the degree of supporting evidence regarding the clinical validity of ctDNA assays is substantial enough that validated and suitably sensitive ctDNA testing can be incorporated into standard clinical practice for the purpose of genotyping in advanced disease [2].

3.4.2. Prognostication

As for early-stage cancers, liquid biopsies have been assessed for potential prediction of outcome in various tumor entities [90–95]. Predictors of poorer outcome were shown to include the following: concordance between tissue and liquid ctDNA alterations, elevated levels of ctDNA (in %) and higher numbers of ctDNA alterations [96–98].

3.4.3. Assessment of baseline tumor mutational burden (TMB) and microsatellite status to predict checkpoint inhibitor (CPI) response

Response to CPI therapy has been shown to be associated with TMB and high microsatellite instability (MSI) detected by tumor tissue-based tests [99–101]. Several studies have been performed to assess this association also for blood-derived TMB and MSI status. Georgiadis et al. as well as Gandara et al. both detected a positive correlation [102,103]. For the validation of MSI detection using the cfDNA-based Guardant360® test, Willis et al. performed a study with 1145 samples of cfDNA that were correlated with tissue samples. The overall accuracy found was 98.4 % [104].

For TMB detection via liquid biopsy, the ESMO acknowledges its importance as a highly relevant field of research, but does not currently recommend the selection of patients for CPIs based solely on its result [2].

3.4.4. Assessment of response and prediction outcome of CPI-based therapy

Early assessments under CPI are needed in the clinical routine in order to better differentiate tumor response. Especially pseudo-progression, the initial increase in tumor size in radiographic images probably fueled by immune inflammation, can be frequently detected at the beginning of CPI treatment, in spite of overall clinical response. Cf/ctDNA have therefore been examined as a potential tool for assessing therapy response under CPI in several trials.

In a study performed by Kato et al. [90] that employed serial cfDNA-assessments for patients undergoing CPI-treatment in various tumor entities, patients were divided into a cohort with high or low cfDNA-derived average adjusted changes in variant allele frequency (VAF). The factor served as an independent predictor of clinical benefit rate, PFS and OS. Zhang et al. assessed ctDNA-levels in patients receiving durvalumab ± tremelimumab and could detect a correlation of on-treatment reductions of VAF with longer PFS, OS and objective response rate [105]. Ricciuti et al. assessed the % change in ctDNA in patients treated with pembrolizumab ± platinum/pemetrexed. A reduction of detectable ctDNA correlated with higher response rates, progression-free survival (PFS) and median overall survival (mOS) [106].

Together with imaging tools, the usage of quantitative ctDNA and VAF assessment could hence offer additional information especially for early response assessment and prediction of outcome.

3.4.5. Serial sampling for monitoring treatment response for targeted therapy and chemotherapy

Apart from CPI-treatment, additional tools for the assessment of treatment response in patients receiving targeted therapy or chemotherapy are also in demand. Several studies have therefore analysed the use of ctDNA or CTCs in this setting. In a study by Tie et al., 53 metastatic colorectal cancer (mCRC) patients receiving standard first-line chemotherapy were included. (25851626) ctDNA was assessed before treatment initiation and before the second cycle. Significant ctDNA reduction was found to be associated with responses in the staging imaging examination after 8–10 weeks. Cao et al. evaluated mutational changes in ctDNA in patients with advanced CRC and could detect that dynamic changes could predict disease progression [107]. Concerning CTCs, a phase II trial performed by Punnoose et al. showed that a reduction of CTCs was in accordance with radiographic response and longer PFS [108].

Although traditional tumor markers find widespread application for treatment monitoring in current clinical practice, ctDNA has been shown to be superior in this setting in different tumor entities. Dawson et al. evaluated the correlation of imaging results with cancer antigen 15-4 (CA15-4) compared to ctDNA results in patients with breast cancer. ctDNA was found to more precisely correspond to tumor burden and to establish a greater dynamic range [15,109]. Parikh et al. showed that a decrease in ctDNA after 4 weeks of chemotherapy more accurately predicted partial response and clinical benefit than carcinoembryonic antigen (CEA) [110]. It was furthermore evaluated by Parkinson et al. that the decrease of ctDNA more precisely predict time to progression than cancer antigen 125 (CA-125) levels in patients with ovarian cancer [111] (Table 3).

3.4.6. Detection of resistance mechanisms under systemic treatment

Another important field of interest in the application of ctDNA is the potential detection of resistance mechanism that evolve under treatment. Plasma ctDNA analysis allows for the monitoring of various resistance mechanisms to targeted therapy [46]. These resistance mechanisms include co-mutations that can influence treatment decisions across multiple cancer types, with particular significance observed in patients with NSCLC and colorectal cancer (CRC) [112,113]. The appearance of kirsten rat sarcoma virus (*KRAS*) mutations has proven to be of particular interest in this regard, serving as a resistance mechanism to *EGFR*-targeted therapy in patients with CRC. This mutation can be detected via plasma cfDNA analysis [114,115]. In a recent trial, Topham et al. compared the acquisition of different alterations between patients with refractory mCRC with or without prior anti-*EGFR*-based therapy [116]. The result showed a higher significant mutation frequency among the anti-*EGFR*-cohort than the control-group (12 vs. 2). *KRAS* and *EGFR* mutations were detected in 56% and 58% of patients having received anti-*EGFR*-therapy. Similarly, cfDNA analysis can also identify *EGFR* resistance mutations in patients with *EGFR*-mutant NSCLC, aiding in the selection of the most appropriate subsequent treatment option [117].

It has been shown in prior studies that acquired *RAS* and *EGFR* mutations are not statically detectable but may decay after the withdrawal of anti-*EGFR*-therapy [116,118]. Therefore, ctDNA may prove to be an important tool when considering a re-challenge with anti-*EGFR*-treatment. Several trials have been performed to assess this issue, among them the CHRONOS trial that could detect clinical benefit in cases of a re-challenge without ctDNA-based detection of rat sarcoma (*RAS*), V-Raf Murine Sarcoma Viral Oncogene Homolog B (*BRAF*) or *EGFR*-extracellular domain (*ECD*) mutations [118–121]. The ESMO has acknowledged ctDNA-guided anti-*EGFR* rechallenge in mCRC [2].

In a phase I/II trial of the PI3K-alpha inhibitor alpelisib, administered alongside an aromatase inhibitor for patients with hormone receptor-positive breast cancer, Razavi et al. [122] used ctDNA analysis and identified that the development of resistance was associated with the presence of loss-of-function Phosphatase and tensin homolog deleted on chromosome 10 (*PTEN*) mutations and activating mutations in estrogen

receptor 1 (*ESR1*). Serial ctDNA assessment in patients with human epidermal growth factor receptor 2 (*HER2*) -positive metastatic breast cancer treated with oral anti-*HER1/HER2* tyrosine kinase inhibitors showed a correlation of *HER2*-amplification and disease progression [123]. Other clinical trials have further highlighted the potential of serial ctDNA evaluation for detection of progression [109,111].

Next to assessing known resistance mechanisms, detecting unknown mechanisms through cfDNA has been studied in several trials, either using large panels or a targeted approach in cases where some probable association with resistance to a specific treatment is known [124,125]. However, CHIP mutations may limit tumor agnostic-strategies [2].

CTC-based assessments have also been applied for identifying mechanisms of resistance during therapy. An important variant to highlight in this context is the androgen receptor splice variant 7 (AR-V7). Detection of this variant in CTCs has been associated with worse prognosis in patients with metastatic castration-resistant prostate cancer, as demonstrated by Antonarakis et al. [126] and Scher et al. [127]. The PROPHECY study, a prospective, multicenter trial, further showed it to be linked to lower PFS and OS [46,128].

3.4.7. Assessment of ctDNA/CTCs originating from multiple metastatic sites and tumor heterogeneity

Heterogeneity of tumor cells, especially in the metastatic setting, may play an important role in treatment approaches. Tissue-derived tumor samples can only provide the assessment of a limited amount of tumor material at a specific timepoint. Liquid biopsies could therefore potentially act as an additional tool for complementing the genetic landscape of the tumor, as ctDNA/CTCs can originate from the shedding of several tumor sites and can be evaluated serially [15,96]. However, different tumor sites may shed variable amounts of tumor-derived components, which may be a limiting factor [2].

4. Future perspectives

Although several liquid biopsy assays have demonstrated clinical validity in various settings, clinical utility remains to be proven. In order to generate robust evidence of clinical utility, a prospective randomized design or in some cases a prospective-retrospective design, using archival blood samples from a previously conducted prospective trial, needs to be applied [2]. In early-stage cancer, numerous randomized clinical trials are currently investigating the clinical utility of MRD-guided adjuvant treatment and molecular relapse monitoring, while in the advanced disease setting, the focus of ongoing trials is serial liquid biopsy testing to monitor disease response and resistance. Emerging evidence of these studies is expected to address the question how liquid biopsies can inform treatment decisions in a meaningful way and thus improve patient outcome.

The studies on liquid biopsy testing in alternative analytes other than blood such as urine, pleural/ascites effusion or saliva have provided preliminary yet very promising evidence with regard to cancer diagnosis [5,129–131], monitoring of treatment response and relapse [3,132], as well as molecular profiling [6,9]. Ongoing trials in this field are expected to deepen our understanding on the potential of these analytes. Some examples of ongoing trials include NCT05453591 (urine, breast cancer), NCT05141383 and NCT04079699 (urine, prostate cancer), NCT05122507 (saliva, head and neck cancer), and NCT05461430 (ascites and pleural fluid, tumoragnostic).

Artificial intelligence (AI) has many clinical applications and is expected to play an integral role in medical scientific development, including biomolecular research. AI has been already widely employed in liquid biopsy assay development and has thus contributed substantially to the evolution of this field. For instance, machine learning has been used to improve the performance for CTC assessment [133] as well as for early cancer detection and differentiation of cancer origin through several techniques including cf/ctDNA, methylation, RNA, extracellular vesicle and protein analyses [28,134,135]. The Lung-CLiP algorithm is

an example of a machine-learning approach that integrates targeted sequencing of plasma cfDNA and matched leukocyte DNA to robustly discriminate early-stage lung cancer patients from risk-matched controls [136]. Furthermore, machine learning has also been applied to incorporate molecular liquid biopsy with clinical and radiological patient data in order to assist clinical decisions [137]. Several machine-learning platforms dedicated to analyze liquid biopsy data have been developed, with the potential to further improve their performance as they receive additional information input [138,139]. Overall, AI is expected to be an integral part of liquid biopsy analytics and facilitate integration into clinical decision making.

5. Conclusion

Liquid biopsies constitute a modern and promising technology with increasing usage that can potentially further facilitate the integration of precision medicine into clinical routine. Both ctDNA/cfDNA and CTCs allow for serial collection and provide real-time molecular and response data, especially for patients in which tissue biopsies are not recommended. Numerous trials have shown promising results in various fields, such as for predicting CPI response, monitoring response and detecting resistance under chemotherapy or targeted therapy as well as MRD-detection and monitoring, suggesting a valuable prognostic and potentially predictive tool in early and advance cancer settings. In numerous cases, liquid biopsies could therefore be used as a complementary tool to standard tissue biopsies during the course of the disease or for more detailed analysis. Moreover, in patients for whom tissue biopsies are not feasible, liquid biopsies already play an important role for genotyping and guiding therapy decisions.

Several FDA-approved liquid biopsy companion diagnostics are already available, such as those for *EGFR* and *PIK3CA* alterations as well as multigene panels. These authorizations signify a turning point in the extensive adoption of liquid biopsy within clinical settings, particularly among patients with advanced-stage cancer. The subsequent horizon for employing liquid biopsy in clinical practice is anticipated to focus on the systemic treatment of individuals with MRD. Further trials are needed to gain approval by health technology authorities and be granted reimbursement.

However, several potential limitations, especially false-positive results from ctDNA assessments due to CHIP mutations as well as low shedding of tumor-derived materials that potentially hinder detection of ctDNA/CTCs, still have to be taken into account. Challenges for the integration of liquid biopsies into clinical practice include standardization, analyte validation and demonstration of clinical utility as well as regulatory considerations. Emerging data from ongoing clinical trials in various setting, also including alternate bodily fluids than blood and leveraging AI-technology, are expected to revolutionize the liquid biopsy field in the near future.

Declaration of competing interest

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

Victoria Probst reports a relationship with Nordic Pharma UK that includes: travel reimbursement. C. Benedikt Westphalen reports a relationship with Roche that includes: board membership, funding grants, speaking and lecture fees, and travel reimbursement. C. Benedikt Westphalen reports a relationship with Amgen Inc that includes: board membership and speaking and lecture fees. C. Benedikt Westphalen reports a relationship with Bayer AG that includes: board membership, speaking and lecture fees, and travel reimbursement. C. Benedikt Westphalen reports a relationship with Bristol-Myers Squibb Co that includes: board membership and speaking and lecture fees. C. Benedikt Westphalen reports a relationship with Chugai Pharmaceutical Co Ltd that includes: speaking and lecture fees. C. Benedikt Westphalen reports a relationship with Celgene GmbH that includes: board membership,

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Myrto Boukova reports a relationship with Servier Deutschland GmbH that includes: current employment at the company.

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