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## Clinical Application of Liquid Biopsy-Based Circulating Tumor DNA for Follow-Up Care in Breast Cancer Management: Lessons from Other Solid Cancers

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#### ABSTRACT

Early detection of relapse following successful curative-intent breast cancer surgery is an essential strategy for survival. Unfortunately, conventional screening via radiological imaging and tissue biopsies may be confounded by tumor size. Moreover, tissue biopsy is comparably invasive, clinically challenging, and predisposes medical and mental health complications. The use of liguid biopsies for postoperative screening in breast cancer survivors has been explored as a safer and easier alternative. The increasing popularity of the minimally invasive approach is due to its simplicity in accessing and obtaining the analyte and its lower associated costs. Using circulating tumor DNA (ctDNA) as a novel marker, the method enables real-time monitoring of disease-free survival and detection of potential cancer recurrence through cancer-specific alterations in ctDNA release from cancer cells and its short half-life. The promising clinical applications of ctDNA have fueled interest in developing new biomarkers with superior sensitivity for earlier detection of cancer recurrence, leading to the improved efficacy and efficiency of treatments and management. However, establishing this less invasive screening tool remains a challenge. In this review, we discuss the state-of-the-art in ctDNA-based liquid biopsies with a focus on the recent progress, challenges, and future directions of this technique for clinical applications in the follow-up care of breast cancer survivors.

Key words: Circulating tumor DNA, liquid biopsy, breast cancer management

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## INTRODUCTION

Breast cancer is one of the leading causes of death among women<sup>1-3</sup>. In 2020, the total number of new cases of breast cancer worldwide was estimated at 2.3 million<sup>1</sup>. For survivors who undergo primary curative-intent surgical resection, the goals of management are to achieve cancer-free survival and to prevent recurrence. Unfortunately, approximately 30% of these survivors develop recurrence after a primary surgical intervention, with about one-third of them subsequently succumbing to death<sup>4</sup>. Therefore, measures to confirm remission and to detect relapse at the earliest stage are the core strategies to improve prognosis.

Unfortunately, management goals are restricted by the limitations of conventional screening and diagnostic procedures. Tissue biopsy is the diagnostic gold standard and is used for all phases of diagnosis, staging, and prognosis. However, histological examination can be difficult to obtain due to challenges in retrieving the tumor tissue. Tissue biopsy is restricted by the invasive technique needed to access small tumor masses, which may lead to the acquisition of an inadequate sample from which to derive a conclusion. More importantly, when the tumor size is large enough to be detected to warrant a tissue biopsy, the recurrence has most likely metastasized to other parts of the body <sup>5,6</sup>. Therefore, tissue biopsy is a comparably poor measure for the early detection of potential recurrence, impeding the timely evaluation of treatment options and the disease prognosis.

Unlike radiological screening, laboratory investigation remains crucial for diagnosis because breast cancer is highly heterogeneous, with diverse morphological features, molecular factors, and responses to therapy<sup>7,8</sup>. At presentation, patients may be stratified to a specific treatment protocol based on empirical risk and the molecular subtype of cancer<sup>9–11</sup>. For example, anthracycline- (e.g., doxorubicin) and taxane-based agents (e.g., paclitaxel) are administered to patients with triple-negative breast cancer (TNBC) due to the lack of targetable receptors<sup>12–15</sup>. Although these patients exhibit a positive response to therapy compared with non-TNBC patients, more than one-half of TNBC patients have cancer recurrence. These studies highlight that certain patients are not

Cite this article : Ramli R A, Muhamad N, Ibrahim M S. Clinical Application of Liquid Biopsy-Based Circulating Tumor DNA for Follow-Up Care in Breast Cancer Management: Lessons from Other Solid Cancers. *Biomed. Res. Ther.*; 2023, 10(3):5584-5595. responsive to therapies, and many of them experience treatment-related adverse events. Furthermore, a growing body of evidence has demonstrated an association between therapy resistance and the development of recurrence<sup>16–19</sup>. Therefore, parameters from laboratory investigations are fundamental for facilitating the precise planning, intervention, and subsequent follow-up regimens of postsurgical breast cancer patients.

Liquid biopsy has recently emerged as a promising new measure. Compared with conventional tissue biopsy, the practicality, cost efficiency, and the possibility to analyze a wide range of laboratory parameters have fueled interest in this new method. In this review, we will provide an overview of the clinical potential of liquid biopsy based on circulating tumor DNA (ctDNA) as a diagnostic and surveillance tool and highlight the challenges associated with ctDNAbased biomarkers, with an emphasis on perspectives from other solid tumors due to a lack of evidence in breast cancer.

# THE CONCEPT OF LIQUID BIOPSY IN CANCER

Liquid biopsy offers a comprehensive view of the genomics of primary and metastatic tumors<sup>20-23</sup>. This technique allows for the identification and screening of specific mutations in tumors using minimally invasive methods in real time. This is possible because circulating genetic materials derived from tumors can be found in biofluids, such as blood, urine, saliva, cerebrospinal fluid, pleural effusion, pericardial effusion, and ascites effusion  $^{24-26}$ . Because it is possible for sampling to be performed without sedation in a routine clinic setting, liquid biopsy can be obtained during follow-up visits at any cancer stage or in the asymptomatic population <sup>5,27</sup>. These properties allow for more regular, accessible, cost-efficient, and timely screening and surveillance that is comparable regarding quality of care for various members of the breast cancer survivor population.

Therefore, researchers may gain access to circulating genetic materials via liquid biopsy. The most common circulating genetic materials are exosomes, tumor-educated platelets, circulating tumor cells, microRNA, and cell-free DNA (cfDNA). In cancer, liquid biopsies are grouped based on the origin of tumorderived materials, which include ctDNA, circulating tumor cells, tumor-derived exosomes, and other extracellular vehicles (EVs)<sup>6,28</sup>. Early, practical, and regular access to these tumor-derived materials are the key advantages of liquid biopsy over other methods.

## **CTDNA**

## **Biology of ctDNA**

ctDNA may carry discriminatory information for screening and surveilling the presence of active cancer cells. ctDNA is a small fragment of cfDNA. It consists of fragments of double-stranded nuclear and mitochondrial DNA (mtDNA) approximately 40-200 base pairs (bp) in size<sup>24,29</sup>. It has a peak at roughly 166 bp that corresponds to nucleosome-associated DNA fragments. A substantial number of studies have reported that ctDNA is shorter than cfDNA derived from noncancerous cells<sup>29,30</sup>. Of interest, shorter fragments (<100 bp) might be enriched with ctDNA and mtDNA and may preferentially carry tumorderived genomic alterations. The half-life of ctDNA is reported to be less than 2 hours; it is shorter than the half-life of any protein marker in the plasma, which can be several weeks<sup>31,32</sup>. The short half-life of ctDNA makes it viable for the real-time monitoring of tumor burden in cancer patients. These distinguishing features of ctDNA enable researchers to infer the presence or absence of tumor residuals to deduce complete remission post-curative-intent multimodality treatments or to detect an early phase of recurrence.

Further pursuing this interest, numerous studies have investigated the primary mechanism of DNA release from a tumor; apoptosis, necrosis, pyroptosis, and senescence, among other mechanisms, have been suggested based on various research findings<sup>33–37</sup>. Short fragments of ctDNA are believed to be released into the blood or lymphatic circulation during apoptosis or phagocytosis by macrophages. This provides a clue as to why liquid biopsy can provide genetic information about the tumor. In addition, ctDNA can be released into the circulation by living tumor cells, either from primary or metastatic tumors, through EVs that play a role in the transportation of ctDNA between distant tissues. The size of EVs has a significant impact on the enrichment of ctDNA in tumor cells, as reported in prostate cancer patients<sup>24</sup>. More efforts are currently being invested to elucidate the components of ctDNA transported in EVs that are actively released by tumor cells and the effects of different treatments on this ctDNA. Therefore, research on the primary mechanism of DNA release from tumor cells may help to explain certain ctDNA parameters from liquid biopsies to facilitate evidence-informed clinical decision making.

## Clinical applications of liquid biopsy-based ctDNA

Different ctDNA parameters from liquid biopsies may communicate the molecular events that underlie breast cancer pathogenesis. With optimal uses and interpretations of biomarkers, clinicians may formulate targeted interventions, monitor treatment response, and sensitively detect any residual active pathologies to address potential recurrence and metastasis. Unfortunately, in the case of tissue biopsy, the need to retrieve adequate tissue samples represents a major obstacle to achieving this goal. For example, it has been documented that epidermal growth factor receptor (EGFR) genetic testing is not conducted in approximately 19% of advanced non-small cell lung cancer (NSCLC) cases for the abovementioned reason<sup>28</sup>. In contrast, as ctDNA carries tumor-specific genetic and epigenetic alterations  $^{38-40}$ ; the abundance and easy access to samples in liquid biopsy make it a remarkable and practical alternative for the diagnosis and monitoring of cancer.

#### ctDNA as a prognostic marker

ctDNA that bears cancer-specific genetic and epigenetic aberrations has also been investigated as a feasible parameter for evaluating prognosis. Elevation of ctDNA in the circulation has been shown to positively correlate with a higher chance of survival. Patients who underwent resection for colorectal cancer shed high concentrations of preoperative ctDNA that correlated with cancer recurrence and poor survival outcomes<sup>29</sup>. In line with this finding, a prospective multicenter study involving 177 patients reported that elevated levels of ctDNA (defined as  $\geq$ 5 ctDNA cells per 7.5 mL of blood) were associated with poor prognosis among patients with metastatic breast cancer<sup>41</sup>. These findings were further corroborated by a study by Parkinson and Gale<sup>42</sup>.

#### ctDNA as a biomarker for tumor burden

Tumor burden is another crucial aspect of breast cancer management. However, regular radiological assessment is limited by the risk of radiation exposure, and it is reliant on tumor size, which must be large enough to be detected by imaging modalities. In comparison, ctDNA can be used to evaluate tumor burden without these drawbacks. An advanced disease is postulated to shed a larger amount of ctDNA than a disease in its early stage or a premalignant lesion<sup>43,44</sup>. In a retrospective study conducted by Parkinson and Gale<sup>42</sup>, ctDNA levels in serially collected liquid biopsy samples from 40 highgrade serous ovarian carcinomas were significantly correlated with lesion volume at the start of treatment. Likewise, Xu and Wei<sup>45</sup> reported a significantly higher combined diagnostic score of ctDNA methylation markers in patients with residual tumors compared with patients with no detectable tumors. Of note, the diagnostic score varied between the early stages (I & II) and advanced stages (III & IV) of hepatocellular carcinoma. Therefore, the use of ctDNA to monitor tumor burden may be extended as a biomarker for cancer progression.

#### ctDNA as a heterogeneity marker

Cancer heterogeneity refers to variations in the characteristics and behavior of a tumor based on different types of cancer cells. Cancer heterogeneity presents a significant challenge to cancer diagnosis, survival prediction, treatment selection, and resistance 46-48. Selective pressure toward a subpopulation within tumor cells may lead to acquired resistance mechanisms and subsequent recurrence<sup>47</sup>. The authors demonstrated that ctDNA may reveal mutations that were not seen in an archived biopsy as a result of either heterogeneity or de novo mutations<sup>47</sup>. Sequencing of ctDNA that bears specific genomic alterations can provide precise information about cancer heterogeneity to guide clinicians and oncologists in developing targeted interventions and optimal management plans.

## ctDNA as a biomarker for therapeutic response

Response to treatment is the main focus of curativeintent breast cancer therapy. Easy access to liquid biopsy throughout the treatment period allows realtime monitoring of therapeutic response and disease progression. Chabon and Simmons<sup>49</sup> demonstrated the utility of ctDNA in evaluating resistance mechanisms in 43 patients with NSCLC treated with the third-generation EGFR inhibitor rociletinib<sup>49</sup>. The findings suggest that the pattern of resistance following treatment with EGFR tyrosine kinase inhibitors is drug specific. Of note, type of therapy, radiation and chemotherapy dose, and exposure to the therapy can affect the ctDNA shedding mechanism and the level of ctDNA in the biofluids of cancer patients. Assessment of response to immunotherapy in NSCLC patients revealed high concordance between ctDNA and radiographic analyses. Interestingly, median time to initial therapy response measured using ctDNA was shorter than radiographic analysis (24.5 days vs 72.5 days, respectively), suggesting the highly sensitive clinical utility of ctDNA as a biomarker for therapeutic efficacy <sup>50</sup>. Furthermore, ctDNA levels in patients were used to assess the efficacy of combined therapies in the CheckMate 816 clinical trials. The study reported that ctDNA clearance was higher among patients who received neoad-juvant nivolumab plus chemotherapy than those who only received chemotherapy. Although more studies are required to establish the consistency of these findings, they indicate the promising utility of ctDNA as a surrogate marker of therapeutic efficacy.

ctDNA as a biomarker for monitoring minimal residual disease and recurrence

Cancer recurrence may not be clinically detectable for an extended period after curative surgical resection. Detection of biomarkers specific to residual cancer cells is important because they are the most likely source of cancer recurrence. The use of ctDNA for this purpose has been reported<sup>51,52</sup>. For example, Kwok and Wu<sup>53</sup> and Scherer and Kurtz<sup>54</sup> reported that ctDNA was detectable in diffuse large B-cell lymphoma patients at the time of recurrence. Of note, ctDNA was detectable in minimal residual disease (MRD) before clinical recurrence in 73% of the patients. Another study by Reinert and Henriksen<sup>55</sup> demonstrated early detection of MRD using longitudinal ctDNA data in patients with stage I-III colorectal cancer. Plasma analysis revealed that ctDNApositive patients had remarkably shorter recurrencefree survival (RFS) compared with ctDNA-negative patients. A separate study reported shorter RFS in patients who received adjuvant chemotherapy with positive ctDNA status<sup>56</sup>. Increased ctDNA level in liquid biopsy has consistently been shown to be useful as an indicator of potential early recurrence.

## CHALLENGES OF CTDNA-BASED BIOMARKERS

Despite the potential uses and applications of ctDNA, there are three key limitations to using ctDNA. The main challenge is that the method relies on a single type of analyte—ctDNA. Therefore, the amount of ctDNA, either in blood or urine, must be sufficient for analysis<sup>5,6</sup>. In asymptomatic patients, a concentration of 1–10 ng/mL is required for the detection of ctDNA in a plasma sample<sup>34</sup>. A study by Haque and Elemento<sup>57</sup> reported that a large volume of plasma is required to sufficiently detect the copy number of a ctDNA mutation in early-stage cancer. In breast cancer patients, a cutoff plasma DNA concentration was set at 120 ng/mL to achieve 100% sensitivity in early screening of the disease<sup>58</sup>. Achieving this sensitivity requires approximately 150–300

mL of blood sample per screening test. Furthermore, the percentage of ctDNA derived from cfDNA varies widely (0.01–90%), which complicates the mutational detection process. To circumvent the issue, technology platforms should adopt genome-wide technologies that can detect mutations at single loci with frequencies below 1% ctDNA<sup>25</sup>.

Second, for ctDNA to be utilized as a biomarker in clinical settings, the technology and technique for its detection and analysis must be accessible and practical to conduct in clinics or hospitals. Quantification or detection technologies, such as polymerasechain reaction (PCR)-based methods (e.g. digital PCR, BEAMing) are highly sensitive and are able to detect ctDNA at very low allele frequencies (<1%); however, only specific and predetermined gene alterations can be detected<sup>26</sup>. In contrast, massively parallel sequencing, or next-generation sequencing, provides an extensive range of genetic alterations of the tumor. However, the technique requires dedicated bioinformaticians to analyze the results. Furthermore, the analysis must be carefully performed as low allele frequency variants are not distinguishable from background noise, which is often due to DNA polymerase errors.

Third, because the field is still growing, standard approaches to liquid biopsy have yet to be developed. These standards include methods for analyte extraction, confirmation of sample integrity, quantification, and analysis. For example, in sample processing, the presence of additional materials in serum derived from leukocyte lysis during clotting can dilute the ctDNA content<sup>25</sup>. The use of a stabilizer to increase the available blood processing window also requires attention, as certain components, such as heparin, can interfere with PCR processing activity. Moreover, techniques for processing plasma to extract plasma ctDNA, such as a magnetic bead, affinity column, and phenol-chloroform methods, vary in their ability to purify ctDNA. Consequently, the total quantity of isolated ctDNA can be skewed, leading to false negative or positive outcomes. Establishing standards for these aspects of liquid biopsy will ensure the quality of results to support valid interpretations and confidence in decision-making.

	Table	1: ctDNA-based clinical trials in solid cancers			
Type of cancer	Title	Aim	Stage of clinical trial	Results	References
Glioma, Intrahepatic Cholangio- carcinoma or Chondrosarcoma	Metformin And Chloroquine in IDH1/2-mutated Solid Tumors (MACIST)	To determine the occurrence of dose- limiting toxicities (DLTs) and the max- imum tolerated dose (MTD).	Phase Ib	Detection of tumor specific IDH1 hotspot mutations in ctDNA of patients with solid tumours treated with metformin and choloroquine.	NCT02496741 59
BRAF mutant melanoma	CAcTUS Circulating Tumour DNA GuidedSwitch	- To determine whether switching from targeted therapy to immunotherapy based on a decrease in levels of circu- lating tumour DNA in the blood, will improve the outcome in melanoma patients.	Phase II	ctDNA decrease prompts switch to immunotherapy (nivolumab + ipilimumab)	NCT03808441 <sup>60</sup>
Breast cancer	BOLERO-2	Assessed the prevalence of ESR1 mu- tations (Y537S and D538G) by digi- tal droplet PCR (ddPCR) in ctDNA from 541 metastatic BRCA patients treated with exemestane combined with everolimus or a placebo.	Phase III	Suggest that ESR1 mutations emerge in ctDNA from metastatic BRCA patients with prior aromatase in- hibitors (AI) treatment, which can be detected by ddPCR, their presence is related with more aggressive tumours, and might be used as biomarkers for predict- ing outcome.	NCT00863655 61
	PALOMA-3	To demonstrate the superiority of pal- bociclib in combination with fulvestrant (Faslodex) over fulvestrant alone to pro- long PFS in women with HR+, HER2– metastatic BRCA, with disease progres- sion after a previous endocrine therapy.	Phase III	Data have shown that patients with a high fraction of ctDNA have an overall worse PFS.	NCT01942135 <sup>62</sup>

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Table 1 continued					
Type of cancer	Title	Aim	Stage of clinical trial	Results	References
Lung cancer	MILD	To measure the levels of cfDNA as a biomarker to assess whether this anal- ysis can identify individuals at higher risk of cancer, improve the sensitivity and specificity of imaging techniques or both.	NA	The findings demonstrated that lung cancer, regard- less of stage, is substantially related with high levels of cfDNA. The ctDNA level was unable to distinguish between healthy controls and patients with other tumours in small lung malignancies. ctDNA levels were found to be associated with disease aggression and a poor prognostic predictor for sur- vival. For tumours in Stage II–IV, ctDNA levels tended to be significantly greater both at baseline and follow- ing surgery.	NCT02837809 <sup>63</sup>
	BENEFIT	To validate gefitinib response in lung adenocarcinomas bearing EGFR muta- tions	NA	imply that patients who would not benefit from EGFRTKI treatment can be identified through the analysis of EGFR mutation dynamics through ctDNA evaluation.	NCT02282267 <sup>64</sup>
Non-small cell lung cancer (NSCLC)		To assess dynamic changes in ctDNA levels in three treatment populations containing patients with NSCLC.	NA	<ul> <li>ctDNA levels rise within hours to days of starting treatment.</li> <li>ctDNA testing during the acute post-treatment phase can reveal results that were not visible during the pretreatment phase.</li> <li>ctDNA can be used as an alternative to tissue-based testing and can improve sensitivity for detecting treatment-resistant clones.</li> </ul>	NCT03986463 <sup>65</sup>

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Table 1 continued					
Type of cancer	Title	Aim	Stage of	Results	References
			clinical trial		
	Therapeutic Resis- tance and Clonal Evolution Assessed With Liquid Biopsy of NSCLC Patients in China	To evaluate the concordance of clonal mutations in ctDNA, using a 1021 gene targeted panel in plasma coupled with tumour tissue from patients with advanced-stage (IIB or IV) non-small- cell LC.		EGFR gene dominant clones were present in 72 pa- tients, and multivariate analysis revealed that these clones constitute a distinct prognostic indication of the effectiveness of EGFR-TKI first-line therapy. Genomic data from tissue and ctDNA provide a more comprehensive picture of new and current actionable mutations that patients may benefit from additional therapeutic targets that may improve illness progno- sis.	NCT03059641 <sup>66</sup>
Colorectal cancer	AI-EMERGE	Focus on development of a non-invasive blood test for the early detection of can- cer. Implemented automated machine learning (ML) to find and learn asso- ciations between cfDNA profiles and cancer 'status' to detect early-stage CRC. To evaluate the sensitivity and speci- ficity of their test between CRC stages and compare them with current standard screening methods.		With 85% sensitivity and 85% specificity in CRC, it was shown that ML-based analysis is beneficial for de- termining the connection between a patient's cfDNA profile and cancer diagnosis.	NCT03688906 <sup>67</sup>

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Type of cancer	Title	Aim	Stage of	Results	References
			clinical trial		
	ECLIPSE (Evaluation	To evaluate the performance character-		Epigenomic technique dramatically improved ctDNA	NCT04136002 <sup>68</sup>
	of the ctDNA LUNAR	istics of a blood-based ctDNA LUNAR-		identification compared to somatic mutational anal-	
	test in an Average	2 test to detect colorectal cancer in		ysis alone, with a 94% specificity for early-stage CRC	
	Patient Screening	a screen-relevant, average-risk popula-		patients (I-III).	
	Episode)	tion.		Future CRC incidence and mortality rates may be sig-	
				nificantly affected by the usefulness of ctDNA testing	
				as a non-invasive approach for early identification of	
				CRC.	

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## **FUTURE DIRECTIONS**

Considerable progress has been made in the liquid biopsy field. There is increasing evidence to demonstrate the exemplary promise of ctDNA as a biomarker for the real-time monitoring of recurrence during the asymptomatic period. To provide a more precise estimation of recurrence risk, a better understanding of the origin and biology of ctDNA is needed. Further exploration of the association between ctDNA and cell apoptosis, necrosis, and shedding mechanisms may prove beneficial. To achieve this, more financial commitments, expertise sharing, and academic interest must be invested to advance our understanding of ctDNA release and clearance mechanisms for better interpretation of existing results, especially because ctDNA is already being used in clinical trials and clinical settings (Table 1). Studies in this direction may validate the consistency of findings. In addition, at the time of authoring this article, several clinical trials are being conducted to evaluate the clinical utility of ctDNA as a surrogate marker for treatment response, disease diagnosis, and risk of recurrence. Future randomized trials comparing ctDNA-guided decision-making to the standard of care may provide better insight into the utility of ctDNA in clinical oncology. Increasingly advanced genome sequencing technology for the analysis of ctDNA will highlight the applications of the liquid biopsy approach as an accurate and timely cancer biomarker.

#### ABBREVIATIONS

**BC**: Breast cancer, **cfDNA**: cell free DNA, **ctDNA**: Circulating tumor DNA, **CTC**: circulating tumor cells, **EGFR**: epidermal growth factor receptor, **EVs**: extracellular vehicles, **TNBC**: triple negative breast cancer, **MRD**: minimal residual disease, **mtDNA**: mitochondrial DNA, **NSCLC**: non-small cell lung cancer, **RFS**: recurrence-free survival

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Ramli RA contributed to conceptualization, data collection, writing-original draft preparation and review. Muhamad N and Ibrahim MS contributed to data collection, edited the first draft and review. All the authors potentially contributed, and approved the final version for publication.

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Not applicable.

## ETHICS APPROVAL AND CONSENT TO PARTICIPATE

Not applicable.

### **CONSENT FOR PUBLICATION**

Not applicable.

## **COMPETING INTERESTS**

The authors declare that they have no competing interests.

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