Diagnostic Ability of Volatile Organic Compounds in Digestive Cancer: A Systematic Review With **Meta-Analysis**

Hang Yang^{1*}, Yi Mou^{1*} and Bing Hu¹

¹Department of Gastroenterology, West China Hospital, Sichuan University, Chengdu, China.

Clinical Medicine Insights: Oncology Volume 16: 1-7 © The Author(s) 2022 Article reuse guidelines: sagepub.com/journals-permissions DOI: 10.1177/11795549221105027 (S)SAGE

ABSTRACT

BACKGROUND: Volatile organic compounds (VOCs) have been involved in cancer diagnosis via breath, urine, and feces. We aimed to assess the diagnostic ability of VOCs on digestive cancers.

METHODS: We systematically reviewed prospective clinical trials evaluating VOCs' diagnostic ability on esophageal, gastric, colorectal, hepatic, and pancreatic cancer (PC). Databases including PubMed and Ovid-Medline were searched.

RESULTS: A total of 35 trials with 5314 patient-times qualified for inclusion. The pooled sensitivity of VOCs diagnosing gastroesophageal cancer from healthy controls is 0.89 (95% confidence interval [CI]: 0.82-0.94), the pooled specificity is 0.890 (95% CI: 0.84-0.93), and area under the curve (AUC) of the summary receiver operating characteristic curve is 0.95 (95% CI: 0.93-0.95). The pooled sensitivity of VOCs diagnosing colorectal cancer from heathy controls is 0.92 (95% CI: 0.85-0.96), the pooled specificity is 0.88 (95% CI: 0.77-0.94), and the AUC is 0.96 (95% CI: 0.94-0.97). The pooled sensitivity of VOCs distinguishing gastrointestinal (GI) cancer from precancerous lesions is 0.84 (95% CI: 0.67-0.92), the pooled specificity is 0.74 (95% CI: 0.43-0.91), and the AUC is 0.87 (95% CI: 0.84-0.89). The pooled sensitivity of VOCs diagnosing hepatocellular carcinoma is 0.68 (95% CI: 0.52-0.81), the pooled specificity is 0.81 (95% CI: 0.47-0.96), and the AUC is 0.78 (95% CI: 0.74-0.81). The pooled sensitivity of VOCs diagnosing PC is 0.88 (95% CI: 0.80-0.93), the pooled specificity is 0.82 (95% CI: 0.62-0.93), and the AUC is 0.92 (95% CI: 0.89-0.94).

CONCLUSIONS: Volatile organic compounds have potential role in diagnosing GI cancer with comparatively high sensitivity, specificity, and AUC (PROSPERO registration number: CRD42021260039).

KEYWORDS: Volatile organic compounds, digestive cancer, gas biopsy, diagnosis, meta-analysis

RECEIVED: March 2, 2022. ACCEPTED: May 16, 2022

TYPE: Meta-analysis

FUNDING: The author(s) received no financial support for the research, authorship, and/or publication of this article

Introduction

Volatile organic compounds (VOCs) are carbon-based stable metabolites and generate in physiological and pathophysiological conditions.^{1,2} Exogenous volatiles can be inhaled from the external environment, produced following the oral ingestion of food and derived from smoking cigarettes. Endogenous VOCs are usually produced from the destruction of cells caused by direct or indirect oxidative stress and inflammation.^{3,4} For example, exhaled small-chain hydrocarbons are produced by lipid peroxidation in oxidative stress.³ Sampling and preconcentration by sorbent tubes/traps and solid-phase microextraction, in combination with gas chromatography (GC) or GC-mass spectrometry(MS), are usually used to analyze VOCs. Real-time analysis can be performed using proton transfer reaction-time-of-flight-MS, selected ion flow tube-MS, ion mobility spectroscopy, laser spectrometry, photoacoustic spectroscopy or sensors, and sensor arrays without pre-concentration or storage.5 Raw data further need to be processed using machine learning or deep learning tools

DECLARATION OF CONFLICTING INTERESTS: The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

CORRESPONDING AUTHOR: Bing Hu, Department of Gastroenterology, West China Hospital, Sichuan University, No. 37, Guo Xue Xiang, Wu Hou District, Chengdu 610041, China. Email: hubingnj@163.com

including principal component analysis, canonic discriminant analysis, independent component analysis, discriminant factorial analysis, partial least squares analysis, artificial neural networks, support vector machine, and hierarchical cluster analysis to establish a detecting model after validation.⁶ The VOCs are involved in changed metabolic processes of body cells or colonizing microbiota and may be considered as an individual "odor fingerprint" to identify diseases including infectious diseases, metabolic diseases, genetic disorders, and other kinds of diseases such as cancer, pulmonary diseases, cardiovascular diseases, and digestive diseases.⁷⁻¹⁰ In this article, we systematically reviewed related research on the aspect of cancer of upper and lower digestive tract and 2 main digestive organs (liver and pancreas), and hoped to provide more comprehensive information and status quo of VOCs in this field.

Methods

This systematic review was conducted in accordance with the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) guidelines. The protocol of this study is documented on PROSPERO (CRD42021260039). Two authors independently searched the term combination of

 $(\mathbf{\hat{n}})$

Creative Commons Non Commercial CC BY-NC: This article is distributed under the terms of the Creative Commons Attribution-NonCommercial 4.0 License (https://creativecommons.org/licenses/by-nc/4.0/) which permits non-commercial use, reproduction and distribution of the work without further permission provided the original work is attributed as specified on the SAGE and Open Access pages (https://us.sagepub.com/en-us/nam/open-access-at-sage).

^{*} The first two authors contributed equally to this article.



Figure 1. SROC curve of VOCs diagnosing digestive cancer. The similar diagnostic ability of VOCs on upper GI cancer (E and G cancer) and lower GI cancer (CRC), better than that on precancerous lesions of digestive tract. The AUC on diagnosing HCC is the weakest. AUC indicates area under the curve; CRC, colorectal cancer; E and G, esophageal and gastric cancer; GI, gastrointestinal; HCC, hepatocellular carcinoma; PC, pancreatic cancer; pre-C, precancerous lesion; SROC, summary receiver operating characteristic curve; VOCs, volatile organic compounds.

VOCs and targeted cancer in PubMed and Ovid-Medline (updated to May 25, 2020). The details of search strategy are described in Supplemental File S2.

Inclusion and exclusion criteria

The inclusion criteria of related studies on VOCs diagnosing esophageal, gastric, colorectal, hepatic, and pancreatic cancer (PC) were as follows: (1) the establishment of the diagnosis of esophageal/gastric/colorectal/hepatocellular/PC; (2) clinical trials of VOCs diagnosing these cancers. The exclusion criteria were as follows: (1) no specific experimental details were provided, (2) commentary/review articles rather than research articles, (3) not clinical research articles, (4) non-English research, (5) other cancers or other samples.

Data extraction and quality assessment

Two reviewers independently extracted data from the included trials using prespecified data collection forms. Discrepancies were resolved by discussion. For all trials included in the analysis, we collected and analyzed data relating to the characteristics of the trial, numbers of patients, characteristics of patients and their disease, and outcomes reported. The extracted information of included trials is demonstrated in Supplemental File S1. Cochrane's Review Manager (RevMan) 5.3 was used to generate the general sensitivity and specificity plots (Figure 1) and forest plots (Figure 2). We generated pooled sensitivity, specificity, positive/negative likelihood ratio, diagnostic score, diagnostic odds ratio, area under the curve (AUC) of summary receiver operating characteristic curve (SROC), *I*², and publication bias in Stata 12.1 shown in Figure 3 and Table 1.

Statistical analysis

The statistical analysis was performed using RevMan software version 5.3 (The Nordic Cochrane Centre, The Cochrane Collaboration 2014, Copenhagen) and Stata 12.1 (Stata Corporation, College Station, Texas). We estimated sensitivity, specificity, and AUC of SROC with 95% confidence intervals (CIs) for outcomes. Data were pooled using the random effects model to give a more conservative estimate, allowing for any heterogeneity between studies. Heterogeneity was expressed as the P statistic, and $P \ge 50\%$ indicated significant heterogeneity.

Results

Description of the included studies

There are 35 articles and 5314 patient-times which means VOCs of one patient can be compared with different controls at least one time. (1) In all, 12 papers are about esophageal (E) and gastric (G) cancer, 11 of which are differentiated with non-precancerous lesions, 1 with precancerous lesions. And 1 of the 11 papers contains 2 sets of complete data. (2) Of the 13 colorectal cancer (CRC) articles, CRC in 12 of 13 are differentiated from non-precancerous lesions, 1 of 12 contains 2 sets of complete data, and 4 of 12 contain data on the differentiation of adenomas. And 1 of 13 is on CRC differentiated from adenomas. Therefore, 12 sets of data from 11 E and G articles differentiated with non-precancerous lesions and 13 sets of data from 12 CRC articles differentiated with nonadenoma were included. And 1 G+5 CRC differentiated from precancerous lesions were included. Among 3 hepatocellular carcinoma (HCC) articles, 1 contains 2 sets of data,

VOC for E and G

Study Alaa Gharra 2020 Amit Bhatt 2015 Lyudmila V. Bel'skaya 2020 Marcis Leja 2021 Sacheen Kumar 2015(1) Sacheen Kumar 2015(2) Sheraz R. Markar 2018 Valérie N. E. Schuermans 2018 Xue Zou 2016 Yi Hong 2021 Yoon Ju Jung 2021 Z-q Xu 2013	TP 117 17 29 42 130 13 25 28 17 33	FP 2 2 0 10 13 22 23 33 8 4 1 1 9	FN 0 2 4 4 6 33 3 4 1 9 4	TN Sensi 107 1.0 17 0.3 16 0.3 55 0.4 100 0.3 107 0.3 139 0.3 20 0.6 53 0.9 16 0.3 16 0.3 16 0.4 84 0.3	tivity (95% ()0 (0.97, 1.0)5 (0.62, 0.9)2 (0.48, 0.9)37 (0.70, 0.9)38 (0.72, 0.9)38 (0.75, 0.9)30 (0.73, 0.8)31 (0.54, 0.8)31 (0.54, 0.8)37 (0.82, 1.0)5 (0.44, 0.8)39 (0.75, 0.8	CI) Specificity (95% CI) 00) 0.98 (0.94, 1.00) 07) 0.89 (0.67, 0.99) 1.00 (0.79, 1.00) 0.85 (0.74, 0.92) 08) 1.00 (0.79, 1.00) 06) 0.85 (0.74, 0.92) 07) 0.88 (0.81, 0.94) 08) 0.81 (0.74, 0.92) 08) 0.81 (0.75, 0.89) 06) 0.71 (0.51, 0.87) 06) 0.93 (0.83, 0.98) 00) 0.96 (0.79, 1.00) 03) 0.94 (0.71, 1.00) 037) 0.90 (0.82, 0.95)	Sensitivity (95% Cl)	Specificity (95% Cl)
VOC for CRC								
Study TP Ashley Bond 2019 17 D. F. Altomare 2012 32 D. F. Altomare 2020 74 Donato F. Altomare 2015 48 E. Mozdiak 2019 (1) 12 E. Mozdiak 2019 (2) 8 Haitham Amal 2015 17 Kelly E. van Keulen 2019 39 M. McFarlane 2019 39 Ramesh P. Arasaradnam 2014 74 S. Bosch 2020 14 Sheraz R. Markar 2019 48 Tim G. de Meij 2013 34 VOC for HCC VOC	FP F 14 7 6 1 1 4 2 37 25 1 20 1 0 12 7	N T 4 4 5 8 8 0 1 2 3 3 8 0 1 7 5 1 4 3 0 2 2 3 6 5	FN S 446 334 331 331 331 331 331 331 333 334 357 330 227 338 550	ensitivity (9 0.81 [0.58 0.86 [0.71 0.90 [0.82 1.00 [0.93 1.00 [0.74 0.80 [0.44 0.85 [0.62 0.95 [0.87 0.70 [0.56 0.84 [0.76 1.00 [0.77 0.96 [0.86 0.85 [0.70	5% CI) Spe , 0.95] , 0.95] , 1.00] , 1.00] , 0.97] , 0.97] , 0.99] , 0.93] , 0.91] , 1.00] , 1.00] , 1.00] , 0.94]	ecificity (95% Cl) 0.77 [0.64, 0.87] 0.83 [0.68, 0.93] 0.93 [0.86, 0.97] 0.97 [0.84, 1.00] 0.92 [0.62, 1.00] 0.83 [0.63, 0.95] 0.94 [0.81, 0.99] 0.64 [0.54, 0.74] 0.70 [0.58, 0.79] 0.66 [0.45, 0.74] 1.00 [0.98, 1.00] 0.76 [0.62, 0.87] 0.88 [0.76, 0.95]	Sensitivity (95% CI)	Specificity (95% CI)
Study TD FD	EN	TN (Sonsi	tivity (05%)	1) Specifi	city (95% CI)	Sonsitivity (05% CI)	Specificity (95% CI)
Ayman S. Bannaga (2) 2021 9 0 Ayman S. Bannaga 2021 12 8 Galen Miller-Atkins 2020 67 46 Tao Qin 2010 26 3 VOC for PC 26 3	11 8 25 4	7 23 32 33	0.4 0.1 0.1 0.1	45 [0.23, 0.6 60 [0.36, 0.8 73 [0.63, 0.8 87 [0.69, 0.9	8] 1.00 1] 0.74 2] 0.41 6] 0.92	0 [0.59, 1.00] 4 [0.55, 0.88] 1 [0.30, 0.53] 2 [0.78, 0.98]	0 0.2 0.4 0.6 0.8 1	0 0.2 0.4 0.6 0.8 1
Study	TP F	P FN		Sensitivit	v (95% CI)	Specificity (95% CI)	Sensitivity (95% CI)	Specificity (95% CI)
Andrea Princivalle 2018 Emma Daulton (2) 2020 Emma Daulton 2020 Ramesh P. Arasaradnam 2017 S. R. Markar 2018(1) S. R. Markar 2018(2) Samulii. Nissinen 2019 Udayakumar Navaneethan (1) 2013 Udayakumar Navaneethan 2020 VOC	65 1 32 3 38 74 1 20 26 1 54 4 20 1 61	16 0 31 13 2 7 14 7 2 6 13 6 41 14 13 4 0 4	0 86 3 47 7 31 7 67 5 41 6 19 4 11 4 59 4 33	1.00 (0 0.71 (0 0.84 (0 0.91 (0 0.80 (0 0.81 (0 0.79 (0 0.83 (0 0.94 (0	1.94, 1.00] 1.56, 0.84] 1.71, 0.94] 1.83, 0.96] 1.59, 0.93] 1.64, 0.93] 1.68, 0.88] 1.63, 0.95] 1.85, 0.98]	0.84 [0.76, 0.91] 0.60 [0.49, 0.71] 0.94 [0.80, 0.99] 0.83 [0.73, 0.90] 0.95 [0.84, 0.99] 0.59 [0.41, 0.76] 0.21 [0.11, 0.35] 0.82 [0.71, 0.90] 1.00 [0.89, 1.00]		
Study TP FP	EN T	N Se	nsiti	vity (95% CI)	Specifici	ty (95% CI)	Sensitivity (95% CI)	Specificity (95% CI)
Haitham Amal (P) 2015 IP IP Haitham Amal (P) 2015 15 2 Haitham Amal (P) 2016 22 2 M. M. Widlak (P) 2018 22 35 S. Bosch (P) 2020 14 52 Sheraz R. Markar (P) 2019 45 17 Tim G. de Meij (P) 2013 45 11	1 1 8 9 13 5 0 1 5 3 15 2	4 3 9 2 3 9	0.94 0.73 0.63 1.00 0.90 0.75	(1970, 1.00) (0.54, 0.88) (0.45, 0.79) (0.77, 1.00) (0.78, 0.97) (0.62, 0.85)	0.88 [0.98 [0.63 [0.19 [0.66 [0.72 [(0.62, 0.98) (0.93, 1.00) (0.52, 0.73) (0.10, 0.30) (0.51, 0.79) (0.56, 0.85)		

Figure 2. Forest plot of VOCs' diagnostic ability. CRC indicates colorectal cancer; E and G, esophageal and gastric cancer; HCC, hepatocellular carcinoma; PC, pancreatic cancer; VOCs, volatile organic compounds.

so there are 4 sets of data in total. There are 7 PC articles, 2 of which have 2 sets of data, so there are 9 sets of PC in total. A total of 44 sets of complete data from 35 articles were included in the final meta-analysis. The detailed information is shown in Supplemental File S1.

VOCs diagnosing gastrointestinal tract cancer: esophagogastric cancer and CRC

The VOCs were detected from samples of both cancer and noncancer tissue,^{11,12} urine,¹³ plasma,¹⁴ saliva,¹⁵ bacteria culture,¹⁶ and breath¹⁷⁻²² and achieved more than 0.9 AUC of SROC to



Figure 3. SROC curve and publication bias. There is no publication bias. AUC indicates area under the curve; CRC, colorectal cancer; E and G, esophageal and gastric cancer; HCC, hepatocellular carcinoma; SROC, summary receiver operating characteristic curve.

PARAMETER (ESTIMATE/95% CI)	E AND G C	CRC
Consitivity	0 800 (0 80 0 04)	

Table 1. Diagnostic ability of VOCs.

PARAMETER (ESTIMATE/95% CI)	E AND G C	CRC	E/G/CRC FROM PRE-C	HCC	PC
Sensitivity	0.892 (0.82-0.94)	0.92 (0.85-0.96)	0.84 (0.67-0.92)	0.683 (0.52-0.81)	0.88 (0.80-0.93)
Specificity	0.89 (0.84-0.93)	0.88 (0.77-0.94)	0.735 (0.43-0.91)	0.81 (0.47-0.96)	0.82 (0.62-0.93)
Positive likelihood ratio	8.10 (5.08-12.94)	7.82 (3.73-16.36)	3.16 (1.29-7.76)	3.68 (1.02-13.32)	4.91 (2.03-11.89)
Negative likelihood ratio	0.121 (0.07-0.22)	0.10 (0.05-0.19)	0.22 (0.11-0.43)	0.39 (0.24-0.64)	0.15 (0.08-0.27)
Diagnostic score	4.20 (3.21-5.19)	4.40 (3.10-5.70)	2.66 (1.44-3.89)	2.25 (0.63-3.86)	3.48 (2.12-4.84)
Diagnostic odds ratio	66.79 (24.77-180.08)	81.45 (22.281-297.74)	14.33 (4.21-48.79)	9.45 (1.87-47.67)	32.51 (8.34-126.73)
AUC of ROC	0.95 (0.93-0.95)	0.96 (0.94-0.97)	0.87 (0.84-0.89)	0.78 (0.74-0.81)	0.92 (0.89-0.94)
Q (chi-square)	0.64 (P=.364)	11.38 (P=.002)	41.39 (P=.000)	14.54 (<i>P</i> =.000)	24.72 (P=.000)
<i>I</i> ²	0.00	82.42	95.17	86.25	91.91
Pub bias (p>ltl)	0.73	0.33	0.58	0.44	0.67

AUC, area under the curve; CI, confidence interval; CRC, colorectal cancer; E and G C, esophageal and gastric cancer; HCC, hepatocellular carcinoma; PC, pancreatic cancer; pre-C, precancerous lesion; Pub bias, publication bias; ROC, receiver operating characteristic curve; VOCs, volatile organic compounds.

diagnosing E and G cancer and differentiating them from healthy controls or benign upper gastrointestinal (GI) diseases via different models constructed by different VOC combinations. These combinations achieve the pooled sensitivity 0.89 (95% CI: 0.82-0.94), the pooled specificity 0.890 (95% CI: 0.84-0.93), and the AUC of SROC 0.95 (95% CI: 0.93-0.95).14,15,17,18,20-27 On the aspect of CRC, VOCs diagnosing CRC are mainly based on 3 kinds of sample (feces, urine, and breath and achieve the pooled sensitivity of 0.92 (95% CI: 0.85-0.96), the pooled specificity of 0.88 (95% CI: 0.77-0.94), and the AUC of SROC 0.96 (95% CI: 0.94-0.97).28-40

The pooled sensitivity of VOCs differentiating GI cancer from precancerous lesions is 0.84 (95% CI: 0.67-0.92), the pooled specificity is 0.74 (95% CI: 0.43-0.91), and the AUC of SROC is 0.87 (95% CI: 0.84-0.89).20,28,29,31,33,37 It was found that VOC combinations detected from different samples were different. We took VOCs for esophagogastric cancer as an example. Six VOCs (acetaldehyde, acetone, acetic acid, hexanoic acid, hydrogen sulfide, and methanol) in urine were detected by SIFT-MS to diagnose gastroesophageal cancer, 9 VOCs (acetonitrile, acrylonitrile, carbon disulfide, isoprene, 1-heptene, 3-methylhexane, (E)-2-nonene, hydrogen sulfide, and triethylamine) were detected in plasma, and 12 VOCs (pentanoic acid, hexanoic acid, phenol, methyl phenol, ethyl phenol, butanal, pentanal, hexanal, heptanal, octanal, nonanal, and decanal) were detected in breath sample, as well as 4 VOCs (hexanoic acid, phenol, methyl phenol, and ethyl phenol) and 5 VOCs (butyric acid, pentanoic acid, hexanoic acid, butanal, and decanal) in breath. It can be different in different samples which may reflect the metabolism process of VOCs, as the primary metabolites are absorbed in blood and further excreted as

final stable VOCs after the metabolism of liver, kidney, or lung. However, these metabolic processes are unclear, and further research is needed.

VOCs diagnosing cancer of main alimentary organs: HCC and PC

Included studies on HCC have demonstrated that VOCs detected from breath and urine samples diagnosed HCC and differentiated it from healthy controls, liver cirrhosis, and other cancers with the pooled sensitivity of 0.68 (95% CI: 0.52-0.81), the pooled specificity of 0.81 (95% CI: 0.47-0.96), and the AUC of SROC 0.78 (95% CI: 0.74-0.81). Acetaldehyde, acetone, 3-hydroxy-2-butanone, styrene, and decane were detected in breath samples.^{41,42} And 4-methyl-2,4-bis(p-hydroxyphenyl)pent-1-ene(2TMS derivative), 2-butanone, 2-hexanone, benzene, 1-ethyl-2-methyl-, 3-butene-1,2-diol, 1-(2-furanyl)-, bicyclo(4.1.0) heptane, and 3,7,7-trimethyl- [1S-(1a,3β,6a)]sulpiride were detected in urinary samples.43

The VOCs diagnosing PC based on breath, urine, and bile samples achieved the pooled sensitivity of 0.88 (95% CI: 0.80-0.93), the pooled specificity of 0.82 (95% CI: 0.62-0.93), and the AUC of SROC 0.92 (95% CI: 0.89-0.94). Formaldehyde, pentane, acetone, isopropyl alcohol, n-hexane, 1-(methylthio)-propane, acetoin, benzaldehyde, undecane, tetradecane, amylene hydrate, and 1-butanol were detected in breath samples.44,45 Acetone, ammonia, trimethylamine, isoprene, dimethyl sulfide, and acetaldehyde were detected in biliary samples.^{46,47} 2,6-dimethyl-octane, nonanal, 4-ethyl-1, 2-dimethyl-benzene, and 2-pentanone were detected in urinary samples.48-50

Discussion

Screening and diagnosis of digestive cancers currently rely on endoscopy and histopathology. The determination of VOCs, as a need for noninvasive, easy-to-use, and low-cost methods, is under research, although a single VOC as a specific noninvasive biomarker for digestive cancers has not been identified. It has been reported that acetone, ammonia, benzaldehyde, butanal, butyric acid, decane, dimethyl/hydrogen sulfide, dimethyl/ undecane, ethylbenzene, 1,2,3-tri-methylbenzene, 1,2-dimethylbenzene, furfural, hexanoic acid, hexane/hexanal, isoprene, phenol, pentanoic acid, p-xylene, and tetradecane are associated with digestive cancers.⁵¹ Metabolites can be absorbed in the blood and exhaled directly. They may also be absorbed and further metabolized in liver, kidney, and other internal organ systems and their microbiomes and exhaled as final stable states. A total of 2746 VOCs has been identified from healthy humans. The numbers of VOCs found in breath and the other bodily fluids are as follows: blood 379, breath 1488, feces 443, milk 290, saliva 549, semen 196, skin 623, and urine 444.52 These indicate the rich diversity and uncertainty of VOCs in composition and proportion. However, exact metabolic processes are unclear, and there is little related research. Based on machine learning, several combinations of different VOCs have achieved satisfactory accuracy.

In this article, the diagnostic efficiency of all the current studies is acceptable, while the liver is slightly inadequate. From the perspective of VOC generation, it is currently believed that it is related to inflammation and oxidative stress, and VOC generation is greatly affected by metabolic factors. The liver is the main location of VOC metabolism and may affect the diagnosis of HCC, especially with cirrhosis. From the source of VOCs, it can be endogenous and exogenous, which requires very high requirements for the collection process of specimens and is easily affected by the VOCs in the surrounding environment and produced by diseases other than the target disease. The current research is mainly based on small sample size, and specimen collection and processing are also the main influence factors. The VOCs reflect metabolic factors, so the interference factors should be accurately controlled, such as subjects' health status, diet and medication, exercise, environment for specimen collection, container for specimen collection, the cleaning and pollution of real-time monitoring equipment, inter-instrument agreement, and intra-experimenter agreement, which will all become factors affecting the development of the experiment. Therefore, more relevant tests are required to establish the conditions and standards required for different specimens. In addition, for the detection of targeted disease, other background diseases need to be strictly controlled, and large sample tests are an important condition for finding markers and establishing diagnostic models.

There are also limitations. *P* was more than 50% in CRC, HCC, and PC subgroups, maybe due to different specimens and detection methods, etc. Although it cannot be made a

further subgroup analysis, since the small number of recruited research, results from E and G subgroup and other recruited research can still reflect the potential diagnostic role. As the determination of VOCs is noninvasive and easily accessible method with high discernibility, if there is a reliable diagnosis model, it will contribute a lot to the present screening and diagnosing of GI cancer.

Conclusions

The VOCs have potential role in diagnosing GI cancer with comparatively high sensitivity, specificity, and AUC. More research is needed for the clinical application of VOCs in GI cancer diagnosis in the future.

Author Contributions

HY and BH conceived the study. HY and YM collected and analyzed the data. HY drafted the article. All authors approved the final version of this article.

ORCID iD

Bing Hu (D) https://orcid.org/0000-0002-9898-8656

Supplemental Material

Supplemental material for this article is available online.

REFERENCES

- 1. de Lacy Costello B, Amann A, Al-Kateb H, et al. A review of the volatiles from the healthy human body. *J Breath Res.* 2014;8:014001.
- Amann A, Costello Bde L, Miekisch W, et al. The human volatilome: volatile organic compounds (VOCs) in exhaled breath, skin emanations, urine, feces and saliva. *J Breath Res.* 2014;8:034001.
- Ratcliffe N, Wieczorek T, Drabińska N, et al. A mechanistic study and review of volatile products from peroxidation of unsaturated fatty acids: an aid to understanding the origins of volatile organic compounds from the human body. *J Breath Res.* 2020;14:034001.
- Jalal AH, Alam F, Roychoudhury S, et al. Prospects and challenges of volatile organic compound sensors in human healthcare. ACS Sens. 2018;3:1246-1263.
- Kataoka H, Saito K, Kato H, Masuda K. Noninvasive analysis of volatile biomarkers in human emanations for health and early disease diagnosis. *Bioanalysis*. 2013;5:1443-1459.
- Boots AW, van Berkel JJ, Dallinga JW, Smolinska A, Wouters EF, van Schooten FJ. The versatile use of exhaled volatile organic compounds in human health and disease. *J Breath Res.* 2012;6:027108.
- BelizÄ_irio JE, Faintuch J, Malpartida MG. Breath biopsy and discovery of exclusive volatile organic compounds for diagnosis of infectious diseases. *Front Cell Infect Microbiol.* 2020;10:564194.
- Di Lena M, Porcelli F, Altomare DF. Volatile organic compounds as new biomarkers for colorectal cancer: a review. *Colorectal Dis.* 2016;18:654-663.
- Probert CS, Ahmed I, Khalid T, Johnson E, Smith S, Ratcliffe N. Volatile organic compounds as diagnostic biomarkers in gastrointestinal and liver diseases. J Gastrointestin Liver Dis. 2009;18:337-343.
- 10. Shirasu M, Touhara K. The scent of disease: volatile organic compounds of the human body related to disease and disorder. *J Biochem*. 2011;150:257-266.
- Kumar S, Huang J, Cushnir JR, et al. Selected ion flow tube-MS analysis of headspace vapor from gastric content for the diagnosis of gastro-esophageal cancer. *Anal Chem.* 2012;84:9550-9557.
- 12. Mochalski P, Leja M, Gasenko E, et al. Ex vivo emission of volatile organic compounds from gastric cancer and non-cancerous tissue. *J Breath Res.* 2018;12:046005.
- Huang J, Kumar S, Abbassi-Ghadi N, et al. Selected ion flow tube mass spectrometry analysis of volatile metabolites in urine headspace for the profiling of gastro-esophageal cancer. *Anal Chem.* 2013;85:3409-3416.
- Bhatt A, Parsi MA, Stevens T, et al. Volatile organic compounds in plasma for the diagnosis of esophageal adenocarcinoma: a pilot study. *Gastrointest Endosc.* 2016;84:597-603.

- Bel'skaya LV, Sarf EA, Shalygin SP, Postnova TV, Kosenok VK. Identification of salivary volatile organic compounds as potential markers of stomach and colorectal cancer: a pilot study. J Oral Biosci. 2020;62:212-221.
- Buszewski B, Ulanowska A, Ligor T, et al. Identification of volatile organic compounds secreted from cancer tissues and bacterial cultures. J Chromatogr B Analyt Technol Biomed Life Sci. 2008;868:88-94.
- Zou X, Zhou W, Lu Y, et al. Exhaled gases online measurements for esophageal cancer patients and healthy people by proton transfer reaction mass spectrometry. *J Gastroenterol Hepatol.* 2016;31:1837-1843.
- Kumar S, Huang J, Abbassi-Ghadi N, et al. Mass spectrometric analysis of exhaled breath for the identification of volatile organic compound biomarkers in esophageal and gastric adenocarcinoma. *Ann Surg.* 2015;262:981-990.
- Kumar S, Huang J, Abbassi-Ghadi N, et al. Selected ion flow tube mass spectrometry analysis of exhaled breath for volatile organic compound profiling of esophago-gastric cancer. *Anal Chem.* 2013;85:6121-6128.
- Amal H, Leja M, Funka K, et al. Detection of precancerous gastric lesions and gastric cancer through exhaled breath. *Gut.* 2016;65:400-407.
- 21. Leja M, Kortelainen JM, Polaka I, et al. Sensing gastric cancer via point-of-care sensor breath analyzer. *Cancer*. 2021;127:1286-1292.
- Hong Y, Che X, Su H, et al. Exhaled breath analysis using on-line preconcentration mass spectrometry for gastric cancer diagnosis. J Mass Spectrom. 2021;56:e4588.
- Markar SR, Wiggins T, Antonowicz S, et al. Assessment of a noninvasive exhaled breath test for the diagnosis of oesophagogastric cancer. JAMA Oncol. 2018;4:970-976.
- Schuermans VNE, Li Z, Jongen A, et al. Pilot study: detection of gastric cancer from exhaled air analyzed with an electronic nose in Chinese patients. *Surg Innov.* 2018;25:429-434.
- Jung YJ, Seo HS, Kim JH, Song KY, Park CH, Lee HH. Advanced diagnostic technology of volatile organic compounds real time analysis analysis from exhaled breath of gastric cancer patients using proton-transfer-reaction time-offlight mass spectrometry. *Front Oncol.* 2021;11:560591.
- Gharra A, Broza YY, Yu G, et al. Exhaled breath diagnostics of lung and gastric cancers in China using nanosensors. *Cancer Commun (Lond)*. 2020;40: 273-278.
- Xu ZQ, Broza YY, Ionsecu R, et al. A nanomaterial-based breath test for distinguishing gastric cancer from benign gastric conditions. *Br J Cancer*. 2013;108: 941-950.
- Amal H, Leja M, Funka K, et al. Breath testing as potential colorectal cancer screening tool. *Int J Cancer*. 2016;138:229-236.
- Bosch S, Bot R, Wicaksono A, et al. Early detection and follow-up of colorectal neoplasia based on faecal volatile organic compounds. *Colorectal Dis.* 2020;22: 1119-1129.
- Altomare DF, Picciariello A, Rotelli MT, et al. Chemical signature of colorectal cancer: case-control study for profiling the breath print. *BJS Open.* 2020;4: 1189-1199.
- de Meij TG, Larbi IB, van der Schee MP, et al. Electronic nose can discriminate colorectal carcinoma and advanced adenomas by fecal volatile biomarker analysis: proof of principle study. *Int J Cancer*. 2014;134:1132-1138.
- McFarlane M, Millard A, Hall H, et al. Urinary volatile organic compounds and faecal microbiome profiles in colorectal cancer. *Colorectal Dis.* 2019;21:1259-1269.
- Widlak MM, Neal M, Daulton E, et al. Risk stratification of symptomatic patients suspected of colorectal cancer using faecal and urinary markers. *Colorectal Dis.* 2018;20:O335-O342.

- Arasaradnam RP, McFarlane MJ, Ryan-Fisher C, et al. Detection of colorectal cancer (CRC) by urinary volatile organic compound analysis. *PLoS ONE*. 2014;9:e108750.
- van Keulen KE, Jansen ME, Schrauwen RWM, Kolkman JJ, Siersema PD. Volatile organic compounds in breath can serve as a non-invasive diagnostic biomarker for the detection of advanced adenomas and colorectal cancer. *Aliment Pharmacol Ther.* 2020;51:334-346.
- 36. Bond A, Greenwood R, Lewis S, et al. Volatile organic compounds emitted from faeces as a biomarker for colorectal cancer. *Aliment Pharmacol Ther.* 2019;49:1005-1012.
- Markar SR, Chin ST, Romano A, et al. Breath volatile organic compound profiling of colorectal cancer using selected ion flow-tube mass spectrometry. *Ann* Surg. 2019;269:903-910.
- Altomare DF, Di Lena M, Porcelli F, et al. Exhaled volatile organic compounds identify patients with colorectal cancer. *Br J Surg*. 2013;100:144-150.
- Altomare DF, Di Lena M, Porcelli F, et al. Effects of curative colorectal cancer surgery on exhaled volatile organic compounds and potential implications in clinical follow-up. *Ann Surg.* 2015;262:862-866; discussion 866.
- Mozdiak E, Wicaksono AN, Covington JA, Arasaradnam RP. Colorectal cancer and adenoma screening using urinary volatile organic compound (VOC) detection: early results from a single-centre bowel screening population (UK BCSP). *Tech Coloproctol.* 2019;23:343-351.
- 41. Qin T, Liu H, Song Q, et al. The screening of volatile markers for hepatocellular carcinoma. *Cancer Epidemiol Biomarkers Prev.* 2010;19:2247-2253.
- Miller-Atkins G, Acevedo-Moreno LA, Grove D, et al. Breath metabolomics provides an accurate and noninvasive approach for screening cirrhosis, primary, and secondary liver tumors. *Hepatol Commun.* 2020;4:1041-1055.
- Bannaga AS, Tyagi H, Daulton E, et al. Exploratory study using urinary volatile organic compounds for the detection of hepatocellular carcinoma. *Molecules* (*Basel, Switzerland*). 2021;26.
- Markar SR, Brodie B, Chin ST, Romano A, Spalding D, Hanna GB. Profile of exhaled-breath volatile organic compounds to diagnose pancreatic cancer. *Br J Surg.* 2018;105:1493-1500.
- Princivalle A, Monasta L, Butturini G, et al. Pancreatic ductal adenocarcinoma can be detected by analysis of volatile organic compounds (VOCs) in alveolar air. BMC Cancer. 2018;18:529.
- Navaneethan U, Spencer C, Zhu X, Vargo JJ, Grove D, Dweik RA. Volatile organic compounds in bile can distinguish pancreatic cancer from chronic pancreatitis: a prospective observational study. *Endoscopy*. 2021;53:732-736.
- Navaneethan U, Parsi MA, Gutierrez NG, et al. Volatile organic compounds in bile can diagnose malignant biliary strictures in the setting of pancreatic cancer: a preliminary observation. *Gastrointest Endosc.* 2014;80:1038-1045.
- Arasaradnam RP, Wicaksono A, O'Brien H, Kocher HM, Covington JA, Crnogorac-Jurcevic T. Noninvasive diagnosis of pancreatic cancer through detection of volatile organic compounds in urine. *Gastroenterology*. 2018;154:485-487.
- Nissinen SI, Roine A, Hokkinen L, et al. Detection of pancreatic cancer by urine volatile organic compound analysis. *Anticancer Res.* 2019;39:73-79.
- Daulton E, Wicaksono AN, Tiele A, et al. Volatile organic compounds (VOCs) for the non-invasive detection of pancreatic cancer from urine. *Talanta*. 2021;221:121604.
- Dima AC, Balaban DV, Dima A. Diagnostic application of volatile organic compounds as potential biomarkers for detecting digestive neoplasia: a systematic review. *Diagnostics (Basel, Switzerland)*. 2021;11:2317.
- Drabińska N, Flynn C, Ratcliffe N, et al. A literature survey of all volatiles from healthy human breath and bodily fluids: the human volatilome. *J Breath Res.* 2021;15:034001.