Non-Invasive Detection of Anastomotic Leakage Following Esophageal and Pancreatic Surgery by Urinary Analysis

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Keywords
Pancreatic surgery · Esophageal surgery · Anastomotic leakage · Volatile organic compounds · Field asymmetric ion mobility spectrometry

Abstract
Background: Esophagectomy or pancreaticoduodenectomy is the standard surgical approach for patients with tumors of the esophagus or pancreatic head. Postoperative mortality is strongly correlated with the occurrence of anastomotic leakage (AL). Delay in diagnosis leads to delay in treatment, which ratifies the need for development of novel and accurate non-invasive diagnostic tests for detection of AL. Urinary volatile organic compounds (VOCs) reflect the metabolic status of an individual, which is associated with a systemic immunological response. The aim of this study was to determine the diagnostic accuracy of urinary VOCs to detect AL after esophagectomy or pancreaticoduodenectomy.

Methods: In the present study, urinary VOCs of 63 patients after esophagectomy (n = 31) or pancreaticoduodenectomy (n = 32) were analyzed by means of field asymmetric ion mobility spectrometry. AL was defined according to international study groups. Results: AL was observed in 15 patients (24%). Urinary VOCs of patients with AL after pancreaticoduodenectomy could be distinguished from uncomplicated controls, area under the curve 0.85 (95% CI 0.76–0.93), sensitivity 76%, and specificity 77%. However, this was not observed following esophagectomy, area under the curve 0.51 (95% CI 0.37–0.65). Conclusion: In our study population AL following pancreaticoduodenectomy could be discriminated from uncomplicated controls by means of urinary VOC analysis, NCT03203434.

Introduction
Anastomotic leakage (AL) is the most dreaded and frequent complication after intestinal surgery, leading to significantly increased morbidity and 30-day mortality [1]. According to the Dutch Institute for Clinical Audit-
ing, leakage occurs in 12.8% of pancreaticoduodenectomies and 20% of esophagectomies carried out in the Netherlands [2].

In current practice, AL is diagnosed based on clinical, biochemical, and radiological findings. In the early postoperative phase, clinical parameters have been shown to be indecisive, requiring additional examination [3]. Primary biochemical predictor is the acute phase C-reactive protein (CRP). However, serum CRP lacks sensitivity and specificity for major infectious complications [4]. In addition, increased levels of amylase in drain fluid have been shown to be predictive for esophageal [5] and pancreatic AL [6]. Nevertheless, early drain removal is favorable for the postoperative recovery, preventing secondary infection and theoretically pancreatitis [7]. This emphasizes the need for the development of novel, non-invasive biomarkers, with high accuracy for predicting and diagnosing AL during the first postoperative days.

Since 2000 BC, ancient physicians have been diagnosing patients based on their own olfactory system [8]. Most gases, either odorous or non-odorous, are composed of volatile organic compounds (VOCs). These compounds have several origins: firstly, environmental or exogenous; secondly, local symptoms from the primary affected disease site in diseased patients which is often inflammation or cancer; and thirdly, the systemic (immunological) response [8]. Assessment of VOCs in breath, feces, and urine has led to the identification of a variety of disease-specific smell prints in, for example, pulmonology, oncology, and gastroenterology [9–14].

The aim of this study was to determine the diagnostic accuracy of analysis of urinary VOCs to detect AL non-invasively after major gastrointestinal surgery.

Methods

Study Design and Participants

This study was conducted in accordance with the World Medical Association Declaration of Helsinki. The local institutional ethical review board of the VU medical center approved the study protocol (2014.543). This project was designed as a single center prospective observational cohort study between March 2015 and April 2016. Eligible participants were diagnosed with (suspected) malignancies of the esophagus, pancreas, distal bile duct, ampulla of Vater, or duodenum and were scheduled for surgery (i.e., esophagectomy or pancreaticoduodenectomy). Patients were aged 18–90 years and had an American Society of Anesthesiologists physical status of 3 or lower. All participants were capable of understanding the study information, and signed written informed consent. Patient, surgery, and pathology data were prospectively registered.

Procedure

Patients were recruited from the department of surgery of the VU University medical center (Amsterdam, The Netherlands). They were admitted to the hospital 1 day prior to surgery and received standard preoperative treatment according to local protocol. Patients diagnosed with esophageal cancer underwent the following procedures: Ivor Lewis, McKeown, or transhiatal esophagectomy. For pancreatic cancer, a pancreaticoduodenectomy was performed according to Whipple or with preservation of the gastroduodenal (pylorus-preserving pancreaticoduodenectomy [PPPD]). All procedures were performed under standardized antibiotic prophylaxis (cefuroxime/metronidazole). In case of a pancreaticoduodenectomy, a prophylactic drain was placed at the pancreaticojunostomy. Postoperatively, all patients were treated according to local protocol, which consisted of admittance to the intensive care unit, medium care, or general ward. Drains were removed when drain amylase content was within normal range on or after postoperative day 3. Patients did not receive additional antibiotics during the first 3 postoperative days.

Endpoints

The primary endpoint of this study concerned clinical postoperative AL. Leakage following esophageal surgery was defined by the Esophagectomy Complications Consensus Group as a full thickness defect involving the esophageal anastomosis. Severity was graded based on required treatment. Grade 1 was a local defect only requiring medical treatment with dietary modification. Grade 2 required interventional but not surgical therapy, and grade 3 AL was surgically treated [15]. Leakage of the pancreaticojunostomy was defined as any measurable volume of drain fluid on or after postoperative day 3, with amylase content more than 3 times the upper normal serum volume. The International Study Group on Pancreatic Fistula graded leakage according to clinical impact. A biochemical leak (formerly grade A) has by definition no clinical impact and was therefore not listed as clinical AL. Grade B requires a change in therapeutic management of the expected postoperative pathway. Grade C consists of AL-related organ failure or clinical instability such that a reoperation was needed [16]. Furthermore, other postoperative complications were prospectively registered. For this study, a 30-day morbidity was determined and all complications were detected using local protocol, consisting of daily physical and routine biochemical examinations. When clinical signs were indicative for AL, radiologic or endoscopic imaging was requested to objectify.

Sample Collection

Urine samples were collected in 4.5 mL containers (Cryo-pure®) on postoperative day 1, 2, and 3. All samples were obtained from urinary catheters while maintaining a sterile system. Subsequently, samples were frozen at −80°C within 2 h of collection for simultaneous batch analysis.

Field Asymmetric Ion Mobility Spectrometry of Urinary Gas

Urine gas analysis was performed using a commercial field asymmetric ion mobility spectrometry (FAIMS) unit (Lonestar, Owlstone, UK). FAIMS utilizes high electric fields to separate different ionized chemicals based on their movement (called mobility) in this high electric field. The unit was fitted with an ATLAS sampling system (Owlstone UK), which heats the urine sample to 38°C and controls the flow of clean air over the top of the sample and into the Lonestar instrument. The flow rate of the carrier gas
(dry clean air) over the sample was 500 mL/min, with a total flow into the Lonestar of 2 L/min. The inlet of the Lonestar was heated to 100 °C to ensure that no condensation occurred. Inside the unit, headspace VOCs are ionized using a NI-63 radiation source and passed between 2 parallel plates. Onto these plates a high-electric field is applied, which attracts, repels, or does not affect the ions. Ions that touch one of the plates lose their charge and are not detected. A compensation voltage is added to one of the plates to counteract this movement. By scanning through a range of compensation voltages (+6 to –6 V in 512 steps), a wide range of different mobilities were measured. Furthermore, the magnitude of the electric field is scanned through a range of levels (called the dispersion field), which was increased in 51 steps. Three scans of the compensation voltage and dispersion field strength were performed for each sample. By measuring positive and negative ions, a total of 156,672 data points were collected per sample. Further details of this analysis have been described previously [17].

Analysis

Samples were stored in the freezer for a maximum of 12 months. Levels of VOCs start to reduce after 9 months of storage [18]. Samples were removed from the freezer to defrost at room temperature for a maximum of 2 h. Before analysis, the 4.5 mL of sample was aliquoted into a 22 mL glass vial, placed in the Lonestar, and heated to 38 °C. All samples were measured in triplicate. Before and after each urine sample, a sample of clean tap water was run 3 times to ensure that the baseline response was returned. Glass vials were sanitized at the department of microbiology after each sample.

Statistical Analysis

Demographic and disease specific data will be tabulated. Urinary VOCs of patients with AL were compared to control patients who had an uncomplicated postoperative course for both types of surgery. Data of the 3 separate days were combined for both groups before comparison. IBM SPSS statistics (version 23) was used for standard statistical analysis. All continuous variables are expressed as median and range; percentages were calculated for dichotomous variables. When appropriate, baseline characteristics were compared with an independent sample t test or Fisher’s exact test. The FAIMS dataset was analyzed using our existing pipeline developed for previous studies (13). In brief, first a denoising step was applied to the FAIMS data, followed by a data compression algorithm to reduce the dimensionality of the data. Ten-fold cross-validation was then used to assess classifier performance. Figure 1 shows urinary VOC data of a patient in the AL group and an uncomplicated patient following pancreaticoduodenectomy. The displayed samples are closest to the mean for their group (AL or uncomplicated) and therefore representative of the average result.

Dimensionality reduction was undertaken using a 2D wavelet transform (specifically Daubechies D4 wavelets) and any resulting variables with zero variance were excluded. A 10-fold cross-validation was then performed, using 90% of the data as a training set, and the remaining 10% as a test set. Within each fold, 64 informative features were identified using a Wilcoxon rank-sum test on the training set. These 64 features were then used to train a random forest classifier and predict the probability of AL for the samples in the test set. A separate initial cross-validation was used for model selection, comparing sparse logistic regression, radial SVM, linear SVM, and stochastic gradient boosting. All models except linear SVM showed statistically significant predictive ability (at a 95% significance level) of AL after pancreaticoduodenectomy and of these, random forest was found to produce the best classification results using area under the receiver operator curve (AUROC) as a metric.

Fig. 1. Urinary VOC data generated using FAIMS from an AL patient (a) and an uncomplicated patient (b) following pancreaticoduodenectomy. FAIMS measures positive and negative ion counts at a range of compensation voltages (–6 to +6 V in 512 steps) and electric field magnitudes (called the dispersion field, 0–100% in 51 steps) to generate 52,224 data points per scan. Three scans are performed per sample. This figure shows the negative ion counts for the final scan. Distinct plumes in the image correlate to the presence of distinct VOCs in the sample. VOCs, volatile organic compounds.
Patient Characteristics

Between March 2015 and April 2016, 66 patients were eligible for inclusion. Three patients were excluded due to intraoperative findings of irresectable tumors or distant metastases. A total of 63 patients were included, undergoing esophagectomy (n = 31) or pancreaticoduodenectomy (n = 32), 14 of whom developed AL (24%) postoperatively. Urine samples were collected on the first 3 postoperative days, resulting in a total of 184 samples as 5 samples were lost.

Esophagectomy

Thirty-one patients undergoing esophagectomy were included, 25 men and 6 women had a median age of 63 years (40–81). Nine patients (29%) developed postoperative AL and median time to clinical presentation was 8 days (interquartile range 17.5). All patients developed AL within the postoperative admission, except for 1 delayed AL, which was diagnosed upon readmission after 30 days postoperatively. Grade 1 and 2 were seen in 1 patient and grade 3 was observed in 7 patients. No statistically significant differences were found. Urinary VOCs were not able to distinguish AL from uncomplicated patients, AUROC 0.51 (95% CIs 0.37–0.65). Results of the random forest analysis for both types of surgery are displayed in Table 2.

Pancreaticoduodenectomy

A total of 32 patients underwent pancreaticoduodenectomy – 23 men and 9 women – who had a median age of 66 years with a range of 45–82 years. Postoperative leakage of the pancreaticojejunostomy was observed in 6 patients (19%), consisting of 3 level B and 3 level C AL, median time to diagnosis was 5 days (interquartile range 14.25). In 1 case, a delayed AL was diagnosed upon readmission on 30 days after surgery. Leakage of the gastrojejunostomy or hepaticojejunostomy was not observed. A single sample was not collected in the AL group, resulting in a total of 95 urine samples. Characteristics of AL patients and uncomplicated patients are depicted in Table 3, no statistically significant differences were found between groups. Urinary VOCs were able to distinguish AL from uncomplicated patients following pancreaticoduodenectomy with a sensitivity of 0.76 (95% CI 0.50–0.93) and specificity of 0.77 (95% CI 0.66–0.86). The AUROC was 0.85 (95% CI 0.76–0.93) and is displayed in Figure 2. For each sample, the predicted probability of AL was determined. Figure 3 shows the difference in predictive probability broken down by surgery type. The predictive probability was

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Table 1. Summary of demographic and clinical characteristics of patients undergoing esophageal surgery

<table>
<thead>
<tr>
<th>Characteristics</th>
<th>AL (n = 9)</th>
<th>Controls (n = 22)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Gender</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Male</td>
<td>9 (100)</td>
<td>16 (73)</td>
</tr>
<tr>
<td>Female</td>
<td>0 (0)</td>
<td>6 (27)</td>
</tr>
<tr>
<td>Age, years</td>
<td>70 (40–81)</td>
<td>61 (46–79)</td>
</tr>
<tr>
<td>Missing urine samples</td>
<td>3 (11)</td>
<td>1 (2)</td>
</tr>
<tr>
<td>Location of the anastomosis</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Cervical</td>
<td>2 (22)</td>
<td>8 (36)</td>
</tr>
<tr>
<td>Thoracic</td>
<td>7 (78)</td>
<td>14 (64)</td>
</tr>
<tr>
<td>Type of carcinoma</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Adenocarcinoma</td>
<td>5 (56)</td>
<td>16 (73)</td>
</tr>
<tr>
<td>Squamous cell carcinoma</td>
<td>1 (11)</td>
<td>5 (23)</td>
</tr>
<tr>
<td>Other</td>
<td>3 (33)</td>
<td>1 (5)</td>
</tr>
<tr>
<td>Location of tumor</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Upper third</td>
<td>0 (0)</td>
<td>0 (0)</td>
</tr>
<tr>
<td>Middle third</td>
<td>0 (0)</td>
<td>0 (0)</td>
</tr>
<tr>
<td>Lower third or gastroesophageal junction</td>
<td>9 (100)</td>
<td>22 (100)</td>
</tr>
<tr>
<td>Neoadjuvant treatment</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Chemoradiotherapy</td>
<td>9 (100)</td>
<td>20 (91)</td>
</tr>
<tr>
<td>None</td>
<td>0 (0)</td>
<td>2 (9)</td>
</tr>
<tr>
<td>Lymph nodes resected</td>
<td>20 (13–32)</td>
<td>19 (6–38)</td>
</tr>
<tr>
<td>Radical surgery</td>
<td>9 (100)</td>
<td>21 (95)</td>
</tr>
<tr>
<td>Comorbidities</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Hypertension</td>
<td>5 (56)</td>
<td>9 (41)</td>
</tr>
<tr>
<td>Heart failure</td>
<td>1 (11)</td>
<td>3 (14)</td>
</tr>
<tr>
<td>Cardiac arrhythmia</td>
<td>1 (11)</td>
<td>0 (0)</td>
</tr>
<tr>
<td>COPD</td>
<td>1 (11)</td>
<td>2 (9)</td>
</tr>
<tr>
<td>Diabetes mellitus</td>
<td>0 (0)</td>
<td>4 (18)</td>
</tr>
<tr>
<td>Chronic kidney disease</td>
<td>0 (0)</td>
<td>3 (14)</td>
</tr>
<tr>
<td>Grading according to ECCG</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Grade 1</td>
<td>1 (11)</td>
<td></td>
</tr>
<tr>
<td>Grade 2</td>
<td>1 (11)</td>
<td></td>
</tr>
<tr>
<td>Grade 3</td>
<td>7 (78)</td>
<td></td>
</tr>
<tr>
<td>Other postoperative complications</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Respiratory failure</td>
<td>2 (22)</td>
<td>1 (5)</td>
</tr>
<tr>
<td>Pneumonia</td>
<td>1 (11)</td>
<td>1 (5)</td>
</tr>
<tr>
<td>Atrial fibrillation</td>
<td>1 (11)</td>
<td>2 (9)</td>
</tr>
<tr>
<td>Other</td>
<td>3 (33)</td>
<td>3 (14)</td>
</tr>
<tr>
<td>Hospital stay, days</td>
<td>31 (18–106)</td>
<td>8 (6–17)</td>
</tr>
<tr>
<td>ICU stay, days</td>
<td>19 (6–89)</td>
<td>1 (0–7)</td>
</tr>
<tr>
<td>30-Day mortality</td>
<td>0 (0)</td>
<td>0 (0)</td>
</tr>
</tbody>
</table>

Data are n (%) and median (range).
AL, anastomotic leakage; COPD, chronic obstructive pulmonary disease; ECCG, Esophagectomy Complications Consensus Group; ICU, intensive care unit.

Results

Patient Characteristics

Between March 2015 and April 2016, 66 patients were eligible for inclusion. Three patients were excluded due to
broken down by postoperative day following pancreati-
coduodenectomy in Figure 4 and revealed that there does
not appear to be a tendency for individual postoperative
day samples to be more associated with AL. Samples col-
lected on postoperative day 3 appeared to be more con-
sistently scored as low risk for AL compared to other
postoperative days.

**Discussion**

In the present pilot study, urinary VOCs of patients un-
dergoing pancreaticoduodenectomy could predict AL cor-
rectly at an early stage. Urine samples were collected dur-
ing the first 3 postoperative days, while the median time to
clinical presentation for pancreatic AL was about 5 days.
Preclinical detection could enable early intervention (per-
cutaneous drainage or laparotomy), possibly leading to
clearer outcome and timely start of adjuvant treatment. The
results suggest that non-invasive urine analysis by means
of FAIMS can be of value in the early, preclinical detection
of AL following pancreatic surgery. However, this was not
observed in patients undergoing esophagectomy.

This study is the first to our knowledge to use VOC
analysis to diagnose postoperative AL. Leakage is fre-
quently accompanied by, or the result of, anastomotic
ischemia. This creates localized biochemical and im-
munological changes. These changes consist of decreas-
ing glucose and pyruvate levels and increasing lactate
and glycerol levels. Mediastinal microdialysis has been
shown to be a promising method to detect these bio-
chemical changes before the development of significant
clinical symptoms [19]. Furthermore, during the in-
flammatory response, other endogenous products are
produced and present themselves as VOCs. These
VOCs defuse into the blood, are renally excreted, and
can be detected in urine samples [20, 21]. In current
practice, inflammation markers as serum CRP are fre-
quently used to detect AL. Research has shown that
postoperative CRP levels rise in response to the initial
surgery and show a physiological peak approximately
48–72 h postoperatively. This hampers the use of CRP
in this phase.

Urinary VOCs of patients following esophagectomy
could not predict AL. Median time to clinical presentation
of AL and the leaked content might have been important
factors why the technique appears to be accurate following
pancreaticoduodenectomy but not esophagectomy. The
median time to clinical presentation of esophageal AL was
8 days, compared to 5 days for pancreatic AL. Therefore,
the preclinical biochemical and immunological changes
related to AL were possibly not detectable during the first
3 postoperative days following esophagectomy. Furth-
more, pancreatic AL is associated with leakage of pancre-
atic enzymes. Increased levels of pancreatic enzymes in
drain fluid have shown to be predictive for pancreatic AL
(6). These enzymes might have contributed to the accu-
acy of the technique following pancreatic surgery.

In general, 3 analytical methods are used to detect gas
phase VOCs: gas chromatography combined with mass
spectrometry (GC-MS), electronic nose devices, and IMS.
Urinary VOC analysis was performed using FAIMS,
which has a number of advantages over other techniques.
GC-MS is considered the primary method to detect indi-
vidual VOCs. However, analysis by means of GC-MS is
costly and time consuming, making it less feasible for the
clinical setting. Compared with traditional electronic nos-
es, using an array of nanosensors and pattern recognition,
FAIMS has the advantage of a higher sensitivity (i.e., parts
per billion to parts per trillion) and an absence of sensor
drift over time [22], due to the measurement of physical,
not chemical, properties of the volatile molecules.

**Table 2.** AUC, sensitivities, and specificities of FAIMS technique for distinguishing AL from uncomplicated con-
trols for both types of surgery

<table>
<thead>
<tr>
<th>Type of surgery</th>
<th>AUC (95% CI)</th>
<th>Sensitivity (95% CI)</th>
<th>Specificity (95% CI)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Pancreaticoduodenectomy</td>
<td>0.85 (0.76–0.93)</td>
<td>0.76 (0.50–0.93)</td>
<td>0.77 (0.66–0.86)</td>
</tr>
<tr>
<td></td>
<td>(p &lt; 0.00001)</td>
<td>(p &lt; 0.001)</td>
<td>(p &lt; 0.001)</td>
</tr>
<tr>
<td>Esophagectomy</td>
<td>0.51 (0.37–0.65)</td>
<td>0.54 (0.33–0.74)</td>
<td>0.55 (0.42–0.67)</td>
</tr>
<tr>
<td></td>
<td>(p = 0.88)</td>
<td>(p = 0.48)</td>
<td>(p = 0.48)</td>
</tr>
</tbody>
</table>

\(p\) values are calculated by means of the Mann-Whitney U test for AUC, and with the Fisher’s exact test for
sensitivity and specificity.

AUC, area under the curve; FAIMS, field asymmetric ion mobility spectrometry; AL, anastomotic leakage.
In previous gastrointestinal research, feces and exhaled breath have frequently been used for VOC analysis [14, 23]. Metabolites of infectious processes in the gastrointestinal tract, such as AL, are discharged in feces. Therefore, it could be hypothesized that the analysis of fecal VOCs is more appropriate to detect AL compared to urine. However, collection of feces was considered less feasible, due to possible temporary impairment of bowel motility in patients undergoing major gastrointestinal surgery during the early postoperative phase. Furthermore, urine was preferred over exhaled breath, due to the costs and logistical challenges of collection, storage, and analysis of exhaled breath.

The greatest limitation of this explorative study is the small sample size. However, despite low numbers and a substantial heterogeneity within the study population, VOC analysis by FAIMS allowed for discrimination between AL and uncomplicated patients following pancreaticoduodenectomy. Due to the small cohort, it was necessary to pool the data across days for each type of surgery when performing the analysis. Since each patient in the study contributed multiple urine samples, and all samples from a given patient have the same AL status, this introduces a potential bias to the results: if the training data contains samples 1 and 2 from patient A, and the test data contains sample 3 from patient A, then there is a danger that instead of detecting a VOC signature for AL, a VOC signature for each patient is detected and that signature is used to assign AL status to the samples in the test data. However, if this effect were causing erroneous positive results a positive result would have been seen for both the esophageal and pancreatic cohorts. Since a positive result was only observed for the pancreatic cohort, it can be inferred that the bias introduced by this method is not sufficient to invalidate the positive result observed. Furthermore, the small sample size prevented us from assessing the potential influence of comorbidities, other postoperative complications,
In conclusion, in our study population, urinary VOC analysis allowed for discrimination between AL and controls following pancreaticoduodenectomy on all 3 postoperative days combined. VOC analysis could not distinguish AL from controls following esophagectomy.

In conclusion, in our study population, urinary VOC analysis allowed for discrimination between AL and controls following pancreaticoduodenectomy on all 3 postoperative days combined. VOC analysis could not distinguish AL from controls following esophagectomy.

Fig. 3. Analysis of the urinary VOCs resulted in a predicted probability of AL for each sample. This figure shows the predicted probability of AL broken down by surgery type and true AL status. AL, anastomotic leakage.

Fig. 4. Predicted probability of AL following pancreaticoduodenectomy broken down by postoperative day and true AL status. AL, anastomotic leakage.
References