

# Metabolomic Characteristics of Fatty Pancreas

## Authors

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## ABSTRACT

**Objective** Pancreatic steatosis is associated with impaired beta cell function in patients with prediabetes. The pathomechanisms underlying this association still remain to be elucidated. Recent data show that adipocytes are situated within the pancreatic parenchyma and therefore give rise to hypothesize that pancreatic fat together with known and unknown metabolites such as hepatokines affect insulin secretion. Applying a targeted metabolomic approach we investigated possible circulating markers of pancreatic fat in order to better understand its role in the pathophysiology of impaired beta cell function.

**Methods** We included 361 Caucasians, at increased risk of type 2 diabetes, from the Tübingen Family Study. All participants underwent a frequently sampled oral glucose tolerance test to assess insulin secretion and a magnetic resonance imaging to quantify pancreatic fat content, total body fat and visceral fat. Among the 152 subjects with prediabetes (IFG and/or IGT), two groups each with 20 individuals, having the lowest and highest pancreatic fat content were selected. The groups were matched for sex, age, BMI, total fat content, visceral fat content, liver fat content and insulin sensitivity. Metabolites were analyzed using the AbsoluteIDQ® p400 HR Kit by Biocrates.

**Results** Pancreatic fat content of all 152 subjects with prediabetes was negatively associated with insulin secretion represented by  $AUC_{C-peptide\ 0-120}/AUC_{Glucose\ 0-120}$  ( $p = 0.04$ ;  $\beta = -3.24$ ). Furthermore, pancreatic fat content was positively associated with BMI, total body and visceral fat (all  $p < 0.005$ ). Levels of aminoacids, biogenic amines and monosaccharides were similar between the groups with high/low pancreatic fat content ( $p > 0.90$ ). Also, levels of polar lipids such as lysophosphatidylcholines, phosphatidylcholines, sphingomyelins and ceramides did not differ significantly between the groups ( $p > 0.90$ ). Investigating the levels of neutral lipids such as acylcarnitines, diglycerides, triglycerides and cholesteryl esters also revealed no differences between the groups ( $p > 0.90$ ).

**Conclusion** The amount of pancreatic fat is not associated with the metabolomic pattern in individuals with prediabetes. This might be due to the relatively low pancreatic fat content compared to the total amount of fat stored in other depots. The impact of pancreatic steatosis on insulin secretion might be mediated by paracrine effects which cannot be detected in the circulation.

## ABBREVIATIONS

AU	arbitrary unit
BMI	body mass index
NAFPD	non-alcoholic fatty pancreas disease
NAFLD	non-alcoholic fatty liver disease
VAT	visceral adipose tissue
CT	computer tomography
MRI	magnetic resonance imaging
<sup>1</sup> H-MRS	proton magnetic resonance spectroscopy

## Introduction

The amount of adipocytes in human pancreatic parenchyma varies largely [1]. Recently, pancreatic steatosis has attracted increasing attention in various fields of research since it has been shown to be associated with major diseases such as pancreatic cancer, non-alcoholic fatty liver disease (NAFLD) and type 2 diabetes [2–7]. In this context it has been demonstrated that pancreatic fat content is elevated in subjects with type 2 diabetes and also increases with age [2, 8–10]. However these changes may be reversible [9, 11–13]. Several studies demonstrated that weight loss due to dietary energy restriction, increased physical activity or gastric bypass surgery may lead to a decrease of pancreatic fat [11, 14–16].

Previously, multiple studies including some from our own group revealed that there are associations between pancreatic fat, impaired glucose metabolism [1, 17, 18] and also type 2 diabetes [5, 19–21]. Given these results, several groups have further attempted to examine whether specifically impaired insulin secretion or impaired insulin sensitivity, both hallmarks in the development of type 2 diabetes, are related to these observations [17, 19, 22–25]. Lee et al. examined 293 Caucasian subjects by CT-scans showing that pancreatic fat content correlated positively with insulin resistance represented by HOMA-IR [23, 24]. Furthermore, results of a study carried out by Wong et al., examining 685 healthy Chinese subjects corroborated these findings by showing that fatty pancreas was independently associated with insulin resistance [25]. Regarding the relation of insulin secretion and pancreatic fat content we have previously demonstrated that pancreatic fat content was inversely correlated with insulin secretion in subjects with prediabetes but not in subjects with normal glucose tolerance [17]. Examining a smaller group of subjects without type 2 diabetes, by proton magnetic resonance spectroscopy (<sup>1</sup>H-MRS), Tushuizen et al. also showed that pancreatic fat is correlated with decreased insulin secretion [19]. Further, Wong et al. confirmed in healthy subjects that pancreatic fat content was inversely associated with insulin secretion [25]. However, this association disappeared after adjustment for BMI and liver fat content [25]. Moreover, other groups could not find any association of pancreatic fat with insulin secretion [18, 26, 27]. These divergent results might be due to differences in methodology. The application of various radiologic techniques such as CT, MRI or <sup>1</sup>H-MRS and the lack of evaluation standards regarding the assessment of pancreatic fat might have led to the apparently contradictory results [5, 17, 18, 27–29]. Among the imaging methods MRI currently is the preferable tech-

nique as is its quite precise and does not expose the subjects to radiation [30]. However, determining pancreatic fat accumulation via MRI is costly and time-consuming [29].

Other ways of characterizing pancreatic fat accumulation, for example by analyzing potential biomarkers, have yet to be fully established [31]. According to Singh et al. markers such as triglycerides, γGT and HbA1c showed the strongest weighted correlation with pancreatic fat [31]. However these parameters are neither sufficiently sensitive nor specific and therefore not appropriate for characterizing pancreatic fat.

Consequently, more sensitive and more specific circulating biomarkers might help to characterize pancreatic fat in larger cohorts in order to better understand its role in health and disease. Previously we demonstrated that a targeted metabolomic analysis is an appropriate approach to detect circulating biomarkers for characterizing non-alcoholic fatty liver (NAFL) [32]. In detail we showed that lyso-phosphatidylcholines are reliable circulating metabolites enabling one to separate metabolically benign (insulins sensitive) from malignant (insulin resistant) NAFL in humans [32]. Inspired by these findings we addressed the question whether there are also circulating metabolites which enable us to better characterize pancreatic fat since until now its role remains elusive. Therefore we investigated two well-matched groups of participants with prediabetes which differed only in the amount of pancreatic fat [17].

## Methods

### Study population

The basis for our present analysis are data from the Tübingen Family Study (TUEF) which includes individuals with increased risk of type 2 diabetes (n > 3000). Inclusion criteria for the TUEF study were: family history of type 2 diabetes, a BMI > 27 kg/m<sup>2</sup> and a previous diagnosis of glucose intolerance and/or gestational diabetes [33]. Individuals with a history of alcohol abuse and pancreatitis were excluded.

We first identified individuals with MRI measurement of pancreatic fat content in the TUEF database (n = 361). Within this heterogeneous group of participants we differentiated between subjects with normal glucose tolerance, prediabetes (impaired fasting glucose defined as a fasting blood glucose of > 5.6 mmol/l and < 7 mmol/l and/or impaired glucose tolerance defined as a blood glucose of > 7.8 mmol/l and < 11.1 mmol/l after a 2-hour oral glucose tolerance test) and type 2 diabetes. In total we identified 152 subjects with prediabetes. The subject characteristics of these 152 prediabetic individuals are shown in ► **Table 1**.

We further separated the study group by the median (median: 7.67 %, standard deviation: 4.15) in individuals with high and low pancreatic fat content. Then, 20 individuals with maximally high and low pancreatic fat content were matched for sex, age, BMI, total fat content, visceral fat content and liver fat content (► **Table 2**). Due to technical reasons one subject had to be excluded, leaving 39 subjects for the analysis.

### Oral glucose tolerance test and biochemical analysis

All subjects underwent a frequently sampled 75g oral glucose tolerance test. Biochemical variables (glucose, insulin, C-peptide) were measured at 0, 30, 60, 90 and 120 min. Insulin secretion was

assessed by the insulinogenic index (IGI:  $\text{Insulin}_{30\text{min}} - \text{Insulin}_{0\text{min}}$  (pmol/l)/ $\text{Glucose}_{30\text{min}} - \text{Glucose}_{0\text{min}}$  (mmol/l), C-peptide 30min (pmol/l),  $\text{AUC}_{\text{C-peptide (0-30min)}}/\text{AUC}_{\text{Glucose (0-30min)}}$ ,  $\text{AUC}_{\text{C-peptide (0-120min)}}/\text{AUC}_{\text{Glucose (0-120min)}}$ ). Insulin sensitivity was determined using the index of insulin sensitivity proposed by Matsuda and DeFronzo [34].

## Assessment of fat accumulation

Total body fat, visceral adipose tissue (VAT) and pancreatic fat were measured by MRI as described previously [29, 30]. In brief, a T1-weighted fast spin-echo technique was applied for assessment of total body fat and VAT [29] followed by a fuzzy-clustering algorithm for automatic segmentation [35]. Pancreatic fat was quantified applying a spectral-spatial fat selective MR-imaging technique that

selectively excites protons bound to fat by a set of binomial RF-pulses whereas water containing/lean tissue is not influenced [29]. Post-processing was performed by manually drawing circular regions of interest in the caput, corpus and cauda of the pancreas, carefully avoiding inclusion of surrounding VAT. Nearby VAT served as a reference for 100 % fat and the signal intensities were corrected for noise as determined in an object-free part of the image [36]. Mean pancreatic fat content was calculated as the mean value of the three regions of interest and was indicated in %. Total adipose tissue was quantified in liters (l). Liver fat accumulation was assessed by localized magnetic resonance spectroscopy  $^1\text{H-MRS}$  as shown previously [29]. Liver fat content was indicated in liters (l). All imaging techniques were performed by one single experienced researcher, who was not aware of the characteristics of the participants.

► **Table 1** Subject characteristics of 152 participants with prediabetes.

Trait	Mean	Median	Upper/lower 95 % confidence interval
<b>Sex</b>	93 female/59 male		
<b>Age (years)</b>	52	55	54/50
<b>BMI (kg/m<sup>2</sup>)</b>	30.40	30.22	31.1/29.6
<b>VAT (l)</b>	4.58	4.38	4.95/4.21
<b>TAT (l)</b>	37.81	37.81	39.8/35.8
<b>Liver fat (%)</b>	8.65	5.79	9.88/7.43
<b>Mean pancreatic fat (%)</b>	8.87	7.9	9.55/8.18
<b>Triglycerides (mg/dl)</b>	136.63	123	147.9/125.36
<b>FFA (μmol/l)</b>	663.43	649.5	699.49/627.37
<b>Cholesterol (mg/dl)</b>	204.56	205	210.17/198.94
<b>HDL (mg/dl)</b>	53.84	53	55.92/91.76
<b>LDL (mg/dl)</b>	130.89	127	136.21/125.56
<b>AUC C-peptide (0-30)/AUC C-peptide (0-30) (AU)</b>	171.94	172.51	182.11/161.77
<b>AUC C-peptide (0-120)/AUC Glucose (0-120) (AU)</b>	285.22	282.22	299.63/270.8
<b>IGI (AU)</b>	165.38	121.48	187.9/142.86
<b>Lipase (U/l)</b>	40.96	32.64	54.03/27.89

► **Table 2** Group specific characteristics.

Trait	Group 0 = low pancreatic fat		Group 1 = high pancreatic fat		
	mean	SEM	mean	SEM	p-value
<b>Gender</b>	19 women/1 man		15 women/4 men		
<b>BMI (kg/m<sup>2</sup>)</b>	30.75	1.12	29.64	0.90	0.45
<b>Age (years)</b>	48.75	3.09	53.89	1.83	0.16
<b>Visceral fat (l)</b>	3.69	0.21	3.97	0.17	0.30
<b>Liver fat (%)</b>	9.03	1.59	9.72	1.97	0.81
<b>Total adipose tissue (l)</b>	41.30	2.56	37.79	2.99	0.38
<b>Mean pancreatic fat (%)</b>	5.29 *	0.16	12.21 *	1.01	<0.0001
<b>IGI (AU)</b>	183.32	20.38	219.68	59.94	0.57
<b>AUC C-peptide (0-30)/AUC Glucose (0-30) (AU)</b>	191.11	12.01	178.31	16.72	0.54
<b>C-peptide<sub>30</sub> (pmol/l)</b>	2310.1	180.40	2076.4	203.41	0.39
<b>Fasting Glucose (mmol/l)</b>	5.61	0.09	5.89	0.12	0.08
<b>ISI-Matsuda (AU)</b>	5.28	0.65	6.73	0.94	0.21

Shown are the characteristics of the groups with low vs. high pancreatic fat. The two groups differed only significantly for mean pancreatic fat while anthropometric parameters as well as parameters of insulin secretion and insulin sensitivity were similar. Depicted are means, SEM and p-values; \* denotes significant differences ( $p < 0.05$ ) between the two groups applying ANOVA.

## Metabolite profiling

Metabolite profiling was performed by Biocrates® (Innsbruck, Austria) applying their commercial high resolution mass spectrometric-based metabolomic AbsoluteIDQ® p400 HR Kit. This quantitative kit covered 396 metabolites of several classes, including amino acids, biogenic amines, acylcarnitines, glycerophospholipids, sphingolipids, cholesterol esters, glycerides, and monosaccharides. Plasma samples were stored at  $-80^\circ\text{C}$ . For metabolite quantification an aliquot of each sample was briefly centrifuged and the supernatant was used for further analysis. Liquid Chromatography based mass-spectrometry was used for quantifying amino acids and biogenic amines. Liquid chromatography was performed in a positive ion mode. Flow injection based mass-spectrometry was applied in order to assess hexoses, lipids, acylcarnitines and cholesterol esters. For the analysis high resolution, accurate mass (HRAM) Orbitrap™ mass spectrometers were used.

## Statistics

ANOVA was performed analyzing the characteristics of the study population. Stepwise regression models using Pearson correlation were applied to analyze the relationship of continuous variables. Subjects with values  $> 2.5$  standard deviations of the mean for the

► **Table 3** Correlation of pancreatic fat content with metabolic parameters:

Trait	Pancreatic fat content (%)			
	Estimate	Std. beta	p-value	adjusted for
TAT (l)	0.69	0.24	<0.005	sex, age,
VAT (l)	0.10	0.18	<0.001	sex, age, TAT
Liver fat (%)	0.11	0.06	0.48	sex, age, TAT
BMI (kg/m <sup>2</sup> )	0.33	0.29	<0.001	sex, age
Triglycerides (mg/dl)	2.96	0.18	0.0445	sex, age, TAT
Fasting Glucose (mmol/l)	0.02	0.17	0.05	sex, age, BMI
Glucose <sub>120</sub> (mmol/l)	0.09	-0.02	0.84	sex, age, BMI
AUC <sub>Glucose (0–120)</sub> (AU)	0.11	0.16	0.06	sex, age, BMI
AUC <sub>C-peptide (0–120)</sub> /AUC <sub>Glucose (0–120)</sub> (AU)	-3.24	-0.16	0.0424	sex, age, ISI-Matsuda
ISI-Matsuda (AU)	-0.07	-0.06	0.46	sex, age, BMI

Given are the adjusted correlations of pancreatic fat of all subjects with prediabetes with assessed metabolic parameters. Depicted are estimates, std. beta, p-values and adjustments.

assessed parameters were excluded (n = 15) in order to exclude the outliers and improve the power of the study. Effect size estimates from linear regression models are provided as standardized coefficients ( $\beta$ ). Due to technical reasons one subject had to be excluded after matching. Adjustments were performed as demonstrated in ► **Table 3**.

Multiple hypothesis testing was performed applying ANOVA and the model of Benjamini and Hochberg controlling the false discovery rate and reducing probability for type 1 error. A false detection rate (adjusted p-value using the Benjamini Hochberg method) of 0.05 or lower was considered statistically significant. Statistical analysis was performed using the statistical software package JMP 13.0 (SAS Institute, Cary, NC, USA).

Power analysis was performed using G \* Power 3.1.9.4 (Heinrich-Heine Universität Düsseldorf, Germany). Employing an alpha level of 0.00013 as statistical significant after correction for multiple testing (0.05/396) and assuming that there is a 40 % difference with a standard deviation of 20 % in a metabolite level between two groups, one would need 15 subjects with low and 15 subjects with high pancreatic fat in order to reject the null hypothesis with a power of 80 %.

## Results

We first analyzed the correlation of pancreatic fat with anthropometric characteristics, parameters of glucose metabolism and body fat compartments in all 152 subjects with IFG and/or IGT. Pancreatic fat content correlated significantly with BMI ( $p < 0.001$ ,  $\beta = 0.33$ ) and total adipose tissue mass ( $p < 0.005$ ,  $\beta = 0.69$ ) after adjustment for gender and age (► **Fig. 1**, ► **Table 3**). Further, pancreatic fat associated significantly with visceral fat ( $p < 0.001$ ,  $\beta = 0.10$ ) but not with liver fat ( $p = 0.48$ ) after adjusting for gender, age and total adipose tissue. Moreover pancreatic fat correlated independently with levels of serum triglycerides ( $p = 0.04$ ,  $\beta = 0.18$ ) after adjustment for gender, age and total adipose tissue (► **Fig. 1**, ► **Table 3**). Examining glucose metabolism, pancreatic fat correlated significantly with fasting glucose ( $p = 0.05$ ,  $\beta = 0.02$ ) and AUC<sub>C-peptide (0–120min)</sub>/AUC<sub>Glucose (0–120min)</sub> ( $p = 0.04$ ,  $\beta = -3.24$ ) after adjustment for gender, age and BMI (► **Table 3**). Further, there was a trend for an as-

sociation with AUC<sub>Glucose (0–120min)</sub> ( $p = 0.06$ ) after adjustment for gender, age and BMI. Pancreatic fat was not significantly associated with glucose levels at 120 min of the 75g OGTT ( $p = 0.84$ ) and there was no correlation between pancreatic fat and insulin sensitivity represented by ISI-Matsuda ( $p = 0.46$ ) after adjustment for gender, age and BMI.

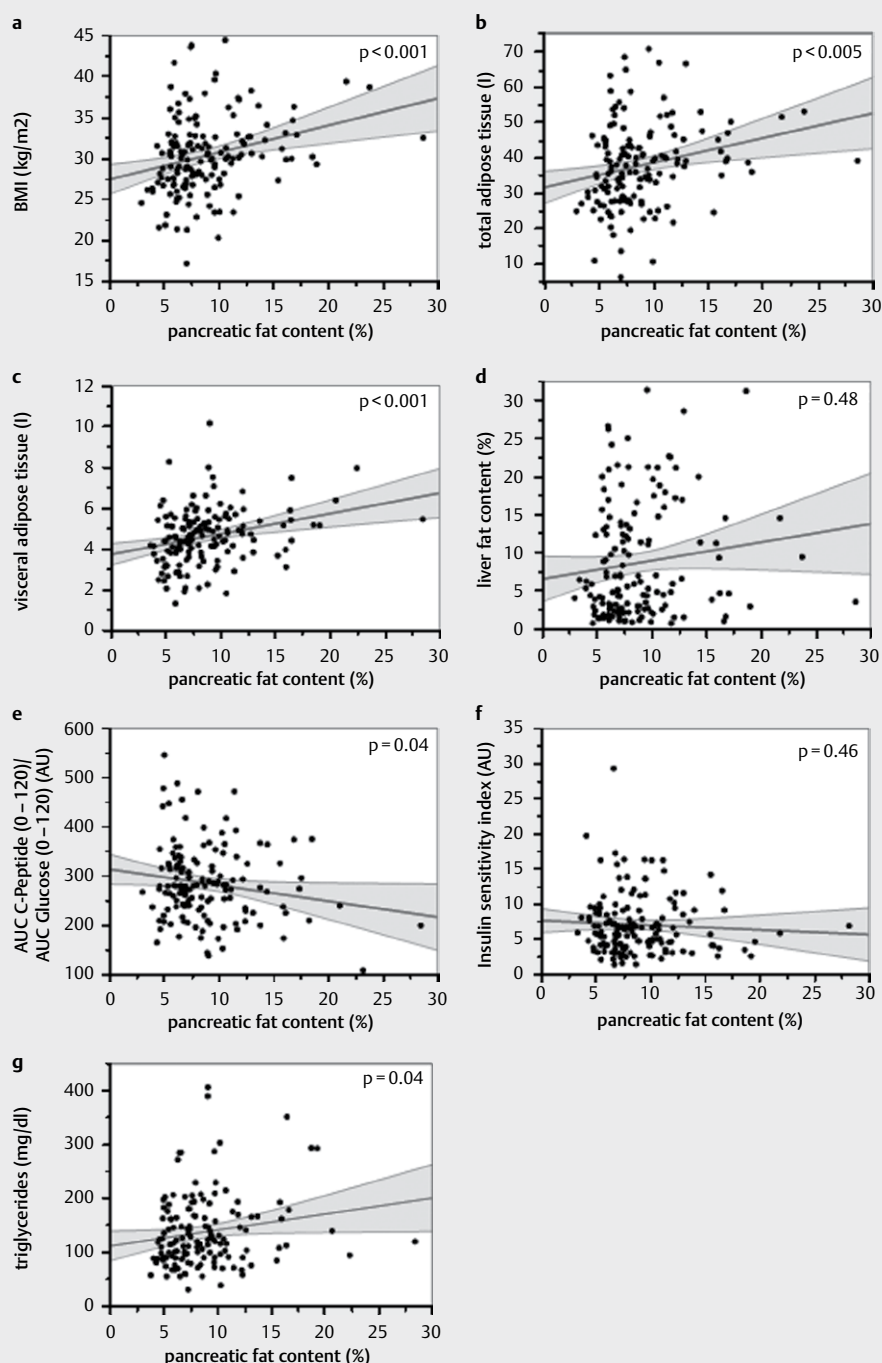
Next, we analyzed matched groups with extremes of pancreatic fat content. As presented in ► **Table 2**, the groups were comparable in gender, age, BMI, visceral fat content, liver fat content, total adipose tissue, fasting glucose, insulinogenic index and insulin sensitivity. The groups only differed significantly in mean pancreatic fat content ( $p < 0.0001$ ). The mean pancreatic fat content in the low pancreas fat group was  $5.3 \pm 0.16$  (SEM), whereas in the other group it amounted to  $12.2 \pm 1.01$  (SEM).

Levels of aminoacids, biogenic amines and monosaccharides showed no significant difference between the groups with high and with low pancreatic fat content ( $p > 0.90$ ; (► **Supplementary ► Table 1S**). Also levels of polar lipids such as lysophosphatidylcholines, phosphatidylcholines, sphingomyelins and ceramides did not differ significantly between the groups ( $p > 0.90$ ; (► **Supplementary ► Table 1S**). Furthermore, the levels of acylcarnitines, diglycerides, triglycerides, cholesteryl esters were also not different between the group with high and with low pancreatic fat content ( $p > 0.90$ ; (► **Supplementary ► Table 1S**).

## Discussion

In the present study, we investigated possible associations of circulating metabolites with pancreatic fat by searching for potential new biomarkers for pancreatic steatosis in individuals with prediabetes. We could confirm several associations of pancreatic fat with glucose metabolism, insulin secretion, and body fat distribution. However, our broad targeted metabolomic approach did not reveal new circulating biomarkers for pancreatic steatosis.

We demonstrated that total and visceral fat content are positively associated with pancreatic fat content. These findings are in line with several previous studies which show that pancreatic fat is positively correlated to BMI [6, 10, 18] and the metabolic syndrome [23]. Taking into account that NAFLD is known to be associated with the



► **Fig. 1** Association of pancreatic fat content with anthropometric and metabolic parameters in 152 subjects with prediabetes: Plots show correlation of pancreatic fat with BMI \*, total adipose tissue content \*, visceral adipose tissue content \*, liver fat content \*\*, AUC<sub>C-peptide</sub> (0–120)/AUC<sub>Glucose</sub> (0–120) \*\*\*, insulin sensitivity index (ISI-Matsuda) \*\*\*\* and triglycerides \*\*. P-values are shown. Lines represent model correlation, red areas are CI. N = 152. \* adjusted for sex, age; \*\* adjusted for sex, age, TAT; \*\*\* adjusted for sex, age, ISI-Matsuda; \*\*\*\* adjusted for sex, age, BMI.

metabolic syndrome [37, 38] we also examined the association of liver fat accumulation and pancreatic fat. After adjustment for sex, age and total visceral adipose tissue there was no association between liver fat and pancreatic fat in our cohort which is, however, contradictory to other studies [39, 40]. Our results therefore suggest

that pancreatic steatosis might play an independent role in the pathogenesis of impaired insulin secretion and type 2 diabetes.

The association of pancreatic fat with impaired glucose metabolism still remains controversial. Among current studies there are some pointing out that pancreatic fat may be related to type 2 diabetes [5, 11, 19, 21]. However, other studies could not confirm



such an independent association [8, 10]. Further, the underlying mechanisms behind that possible relationship remain obscure since the studies are purely observational. In order to further elucidate the situation, several studies investigated the effects of pancreatic fat content on insulin sensitivity and insulin secretion, both hallmarks in the pathophysiology of type 2 diabetes. Regarding insulin sensitivity some of those studies detected a significant negative correlation between insulin sensitivity and pancreatic fat in cohorts without diabetes [23, 25]. In contrast, investigating the role of pancreatic fat in obese Hispanics and Afro-Americans without diabetes, Lê et al. did not show a relation to insulin sensitivity [26]. This is in accordance to our present and previous findings which also demonstrated no association of pancreatic fat with insulin sensitivity measured during a 5-point OGTT [17]. Regarding these divergent results, they might be due to the different ethnicities, different subject characteristics and varying radiographic techniques applied to assess pancreatic fat content.

Concerning potential implications on insulin secretion, we previously demonstrated that there is an inverse correlation between pancreatic fat and insulin secretion in subjects with prediabetes but not in subjects with normal glucose tolerance [17]. The present study corroborates this finding within a different prediabetic cohort. In accord, Tushuizen et al. also found an inverse relationship of pancreatic fat and insulin secretion, but within a group of non-diabetic subjects [19]. This leads to the speculation that during development of type 2 diabetes, pancreatic fat might play a role in the state of prediabetes, but that later on other factors could become more important superimposing the role of pancreatic fat so that this association is no longer seen in overt type 2 diabetes anymore. On the contrary, some groups did not detect any association of pancreatic fat with insulin secretion by investigating subjects with prediabetes or normal glucose tolerance [6, 18, 26, 27]. Among the studies which confirmed or negated a relationship between pancreatic fat content and insulin secretion, there is a big heterogeneity concerning the ethnicities of the individuals and radiological techniques which both make an objective comparison difficult.

Inspired by our previous findings which suggested that pancreatic fat affects beta-cell function in subjects with prediabetes we now specifically investigated the influence of pancreatic fat content on the metabolome in prediabetic subjects. Application of targeted metabolomics represents an appropriate method to detect circulating biomarkers for certain specific adipose tissue as we previously showed in subjects with fatty liver [32]. Hence we formed two groups with low versus high pancreas fat content and matched the two groups precisely for sex, age, BMI, total fat content, visceral fat content, liver fat content and insulin sensitivity in order to rule out possible confounding variables. Our data demonstrate that pancreatic fat is not associated with the various levels of the investigated metabolites such as sphingomyelins, lysophosphatidylcholines, phosphatidylcholines, ceramides, diglycerides, specific triglycerides, cholesteryl esters, acylcarnitines, monosaccharides, aminoacids, and biogenic amines in individuals with prediabetes. One explanation for missing differences in the metabolome is that the amount of pancreatic fat in relation to the total body fat may be too low to have an impact on the systemic plasma metabolites measured in the current study.

Moreover, other factors may influence insulin secretion in subjects with impaired fasting glucose and/or glucose tolerance, which are not assessed with a targeted metabolomic approach. Previously we showed that adipocytes are situated within the human pancreatic parenchyma [1]. We further demonstrated in vitro that there might be a metabolic crosstalk between liver fat and pancreatic fat related to the hepatokine Fetuin A which leads to impaired insulin secretion [1]. This potential paracrine signaling between pancreatic fat cells and beta cells in islets is probably not mirrored by plasma metabolites. Lastly, it has to be mentioned that we applied a targeted metabolomic investigation. By performing an untargeted metabolomic approach one might find unexpected biomarkers which could help to better understand the role of pancreatic fat.

In conclusion, we did not detect plasma metabolites predicting pancreatic fat content as it is possible in the case of liver fat. However, investigating the role of pancreatic fat is still important since there is sufficient data that let one hypothesize that pancreatic fat plays a relevant role in the development of insulin secretion failure and type 2 diabetes. Therefore, clarifying the part of pancreatic steatosis in impaired glucose metabolism could also bring up new potential therapeutic targets for the treatment of type 2 diabetes.

## Author Contributions Statement

B.A.J. and A.F. analyzed the data and wrote the manuscript. M.H., R.W., J.M., R.L. and N.S. contributed to the interpretation of data and edited the manuscript. H-U.H. edited and reviewed the manuscript.

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## Conflict of interest

The authors declare no conflict of interest.

## Literature

- [1] Gerst F, Wagner R, Kaiser G et al. Metabolic crosstalk between fatty pancreas and fatty liver: Effects on local inflammation and insulin secretion. *Diabetologia* 2017; 1–12
- [2] Khoury T, Asombang AW, Berzin TM et al. The clinical implications of fatty pancreas: A concise review. *Dig Dis Sci* 2017; 62: 2658–2667
- [3] Takahashi M, Hori M, Ishigamori R et al. Fatty pancreas: A possible risk factor for pancreatic cancer in animals and humans. *Cancer Sci* 2018
- [4] Hori M, Takahashi M, Hiraoka N et al. Association of pancreatic fatty infiltration with pancreatic ductal adenocarcinoma. *Clin Transl Gastroenterol* 2014; 5: e53
- [5] Gaborit B, Abdesselam I, Kober F et al. Ectopic fat storage in the pancreas using 1H-MRS: Importance of diabetic status and modulation with bariatric surgery-induced weight loss. *Int J Obes* 2014; 39: ijo2014126
- [6] Dong Z, Luo Y, Cai H et al. Noninvasive fat quantification of the liver and pancreas may provide potential biomarkers of impaired glucose tolerance and type 2 diabetes. *Medicine (Baltimore)* 2016; 95: e3858. doi:10.1097/MD.00000000000003858
- [7] Patel NS, Peterson MR, Lin GY et al. Insulin resistance increases mri-estimated pancreatic fat in nonalcoholic fatty liver disease and normal controls. *Gastroenterol Res Pract* 2013; 2013: 498296
- [8] Saisho Y, Butler AE, Meier JJ et al. Pancreas volumes in humans from birth to age one hundred taking into account sex, obesity, and presence of type-2 diabetes. *Clin Anat* 2007; 20: 933–942
- [9] Gaborit B, Abdesselam I, Kober F et al. Ectopic fat storage in the pancreas using 1H-MRS: Importance of diabetic status and modulation with bariatric surgery-induced weight loss. *Int J Obes* 2015; 39: 480–487
- [10] Murakami R, Saisho Y, Watanabe Y et al. Pancreas fat and  $\beta$  cell mass in humans with and without diabetes: An analysis in the Japanese population. *J Clin Endocrinol Metab* 2017; 102: 3251–3260
- [11] Steven S, Hollingsworth KG, Small PK et al. Weight loss decreases excess pancreatic triacylglycerol specifically in type 2 diabetes. *Diabetes Care* 2016; 39: 158–165
- [12] Taylor R, Al-Mrabeh A, Zhyzhneuskaya S et al. Remission of human type 2 diabetes requires decrease in liver and pancreas fat content but is dependent upon capacity for  $\beta$  cell recovery. *Cell Metab* 2018; 28: 547–556.e3
- [13] Umemura A, Sasaki A, Nitta H et al. Pancreas volume reduction and metabolic effects in Japanese patients with severe obesity following laparoscopic sleeve gastrectomy. *Endocr J* 2017; 64: 487–498
- [14] Lim EL, Hollingsworth KG, Aribisala BS et al. Reversal of type 2 diabetes: Normalisation of beta cell function in association with decreased pancreas and liver triacylglycerol. *Diabetologia* 2011; 54: 2506–2514
- [15] Hannukainen JC, Borra R, Linderborg K et al. Liver and pancreatic fat content and metabolism in healthy monozygotic twins with discordant physical activity. *J Hepatol* 2011; 54: 545–552
- [16] Heiskanen MA, Motiani KK, Mari A et al. Exercise training decreases pancreatic fat content and improves beta cell function regardless of baseline glucose tolerance: A randomised controlled trial. *Diabetologia* 2018; 1–12
- [17] Heni M, Machann J, Staiger H et al. Pancreatic fat is negatively associated with insulin secretion in individuals with impaired fasting glucose and/or impaired glucose tolerance: A nuclear magnetic resonance study. *Diabetes Metab Res Rev* 2010; 26: 200–205
- [18] Zijl van der JN, Goossens GH et al. Ectopic fat storage in the pancreas, liver, and abdominal fat depots: Impact on  $\beta$ -cell function in individuals with impaired glucose metabolism. *J Clin Endocrinol Metab* 2011; 96: 459–467
- [19] Tushuizen ME, Bunck MC, Pouwels PJ et al. Pancreatic fat content and  $\beta$ -cell function in men with and without type 2 diabetes. *Diabetes Care* 2007; 30: 2916–2921
- [20] Garcia TS, Rech TH, Leitão CB. Pancreatic size and fat content in diabetes: A systematic review and meta-analysis of imaging studies. *PLOS ONE* 2017; 12: e0180911
- [21] Wang C-Y, Ou H-Y, Chen M-F et al. Enigmatic ectopic fat: Prevalence of nonalcoholic fatty pancreas disease and its associated factors in a Chinese population. *J Am Heart Assoc* 2014; 3: e000297
- [22] Kahn SE. The relative contributions of insulin resistance and beta-cell dysfunction to the pathophysiology of Type 2 diabetes. *Diabetologia* 2003; 46: 3–19
- [23] Lee JS, Kim SH, Jun DW et al. Clinical implications of fatty pancreas: Correlations between fatty pancreas and metabolic syndrome. *World J Gastroenterol WJG* 2009; 15: 1869–1875
- [24] Haffner SM, Miettinen H, Stern MP. The Homeostasis Model in the San Antonio Heart Study. *Diabetes Care* 1997; 20: 1087–1092
- [25] Wong VW-S, Wong GL-H, Yeung DK-W et al. Fatty pancreas, insulin resistance, and  $\beta$ -cell function: A population study using fat-water magnetic resonance imaging. *Am J Gastroenterol* 2014; 109: 589–597
- [26] Lê K-A, Ventura EE, Fisher JQ et al. Ethnic differences in pancreatic fat accumulation and its relationship with other fat depots and inflammatory markers. *Diabetes Care* 2011; 34: 485–490
- [27] Begovatz P, Koliaki C, Weber K et al. Pancreatic adipose tissue infiltration, parenchymal steatosis and beta cell function in humans. *Diabetologia* 2015; 58: 1646–1655
- [28] Yamazaki H, Tsuboya T, Katanuma A et al. Lack of independent association between fatty pancreas and incidence of type 2 diabetes: 5-Year Japanese cohort study. *Diabetes Care* 2016; 39: 1677–1683
- [29] Machann J, Thamer C, Stefan N et al. Follow-up whole-body assessment of adipose tissue compartments during a lifestyle intervention in a large cohort at increased risk for type 2 diabetes. *Radiology* 2010; 257: 353–363
- [30] Schwenzer NF, Machann J, Martirosian P et al. Quantification of pancreatic lipomatosis and liver steatosis by MRI: Comparison of in/opposed-phase and spectral-spatial excitation techniques. *Invest Radiol* 2008; 43: 330–337
- [31] Singh RG, Yoon HD, Poppitt SD et al. Ectopic fat accumulation in the pancreas and its biomarkers: A systematic review and meta-analysis. *Diabetes Metab Res Rev* 2017; 33:
- [32] Lehmann R, Franken H, Dammeier S et al. Circulating lysophosphatidylcholines are markers of a metabolically benign nonalcoholic fatty liver. *Diabetes Care* 2013; 36: 2331–2338
- [33] Wagner R, Hakaste LH, Ahlqvist E et al. Nonsuppressed glucagon after glucose challenge as a potential predictor for glucose tolerance. *Diabetes* 2017; 66: 1373–1379
- [34] DeFronzo RA. Insulin resistance, lipotoxicity, type 2 diabetes and atherosclerosis: the missing links. The Claude Bernard Lecture 2009. *Diabetologia* 2010; 53: 1270–1287
- [35] Würslin C, Machann J, Rempp H et al. Topography mapping of whole body adipose tissue using a fully automated and standardized procedure. *J Magn Reson Imaging JMRI* 2010; 31: 430–439
- [36] Miller AJ, Joseph PM. The use of power images to perform quantitative analysis on low SNR MR images. *Magn Reson Imaging* 1993; 11: 1051–1056
- [37] Stefan N, Kantartzis K, Häring H-U. Causes and metabolic consequences of fatty liver. *Endocr. Rev* 2008; 29: 939–960
- [38] Stefan N, Schick F, Häring H-U. Causes, characteristics, and consequences of metabolically unhealthy normal weight in humans. *Cell Metab* 2017; 26: 292–300
- [39] van Geenen EM, Smits MM, Schreuder m a TC et al. Nonalcoholic fatty liver disease is related to nonalcoholic fatty pancreas disease. *Pancreas* 2010; 39: 1185–1190
- [40] Targher G, Rossi AP, Zamboni GA et al. Pancreatic fat accumulation and its relationship with liver fat content and other fat depots in obese individuals. *J Endocrinol Invest* 2012; 35: 748–753