



SCHOOL OF PUBLIC HEALTH
Department of Nutrition



TARGETED LIPIDOMICS (2)

Lipidomic patterns and the risk of T2D



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Fisiopatología de la Obesidad y Nutrición

Lipidomic patterns

- **First step: exploratory analysis:**
 1. PCA
- **Second step: hypothesis based analysis:**
 1. Scores of lipid metabolites
 2. Scores of lipid metabolite changes
- **Third step: Effects of intervention on lipid changes**

Lipidomic patterns

- **First step: exploratory analysis:**
 1. **PCA**
- **Second step: hypothesis based analysis:**
 1. **Scores of lipid metabolites**
 2. **Scores of lipid metabolite changes**
- **Third step: Effects of intervention on lipid changes**

WORKING REPORT

FIRST STEP: PRINCIPAL COMPONENT ANALYSIS (PCA)

-Exploratory analysis

-207 known lipid metabolites were included

PCA

207 factors generated



Eigenvalues > 2



15 factors extracted



**Varimax rotation
(orthogonal)**

PCA

Factor	Eigenvalue	Difference	Proportion	Cumulative
Factor 1	53.35	21.57	0.26	0.26
Factor 2	31.78	7.94	0.16	0.42
Factor 3	23.83	9.59	0.12	0.53
Factor 4	14.24	4.30	0.07	0.59
Factor 5	9.94	1.60	0.05	0.64
Factor 6	8.33	1.96	0.04	0.68
Factor 7	6.37	0.49	0.03	0.71
Factor 8	5.89	1.18	0.03	0.74
Factor 9	4.70	0.93	0.03	0.76
Factor 10	3.77	0.87	0.02	0.78
Factor 11	2.91	0.39	0.01	0.80
Factor 12	2.53	0.109	0.01	0.81
Factor 13	2.48	0.239	0.01	0.82
Factor 14	2.19	0.19	0.01	0.83
Factor 15	2.00	0.37	0.01	0.84

Factors showing inverse association:

	Quartiles of factors				Linear trend	Per SD
	Q1	Q2	Q3	Q4		
Factor 3	Ref.	0.60 (0.36-1.00)	0.74 (0.44-1.25)	0.43 (0.25-0.75)	0.014	0.78(0.66-0.92)
Factor 7	Ref.	0.62 (0.39-0.97)	0.39 (0.23-0.66)	0.37 (0.21-0.65)	<0.001	0.67 (0.57-0.79)
Factor 10	Ref.	0.82 (0.50-1.37)	0.48 (0.28-0.80)	0.56 (0.33-0.96)	0.017	0.81 (0.69-0.95)

Cox model adjusted for: age, sex, intervention group

Additionally adjusted for the rest of factors (1-15)

	Factor	Description	Components	Eigen value	Variance explained (%)
Inverse association with T2D	3	Lysophosphatidylcholines (LPCs) and Lysophosphatidylethanolamines (LPEs); Pcpasmalogens; sphingomyelins (SM); ceramides (CER), and cholesterol esters (CE)*	34:0pc, 18:1lpe, 14:0lpc, 22:6lpe, 20:4lpe, 18:2lpc, 20:5lpc, 16:1lpc, 20:4lpc, 22:6lpc, 16:0lpe, 22:0lpe, 20:0lpe, 18:0lpe, 18:1lpc, 18:0lpc, 20:3lpc, 16:0lpc	23.8	11.5
	7		40:6ps, 36:1peplasmalogen, 20:0lpe, 51:3tag, 34:0pe, 53:2tag, 53:3tag, 55:3tag, 38:2pe	6.4	3
	10		14:0sm, 16:0ce, 16:0cer18:1, 16:0sm, 16:1sm, 18:0ce, 18:0sm, 18:1sm, 18:2ce, 18:2sm, 20:0sm, 22:0cer18:1, 22:0sm, 22:1sm, 24:0cer18:1, 24:0sm, 24:1cer18:1, 24:1sm, 32:0pc, 34:0pc, 34:1pcplasmalogen_a, 34:1pcplasmalogen_b, 34:2pc, 34:2pcplasmalogen, 34:3pc, 34:3pcplasmalogen, 36:0pc, 36:1pcplasmalogen, 36:1psplasmalogen, 36:2pc, 36:2pcplasmalogen, 36:2psplasmalogen, 36:3pc, 36:3pcplasmalogen, 36:4pca, 36:4pcplasmalogen, 38:2pc, 38:2pe, 38:4pcplasmalogen, 38:6pcplasmalogen, 40:7pcplasmalogen, 54:10tag, cholesterol	3.8	1.8

*Excluding CE 16:1

Factors showing direct association:

	Quartiles of factors				Linear trend	Per SD
	Q1	Q2	Q3	Q4		
Factor 1	Ref.	1.39 (0.78-2.50)	2.17 (1.26-3.72)	2.70 (1.58-4.59)	<0.001	1.34 (1.16-1.55)
Factor 5	Ref.	1.27 (0.73-2.19)	1.22 (0.71-2.09)	1.92 (1.15-3.23)	0.062	1.16 (0.99-1.35)
Factor 11	Ref.	1.30 (0.75-2.26)	1.80 (1.03-3.13)	2.08 (1.17-3.69)	0.009	1.25 (1.07-1.47)

Cox model adjusted for: age, sex, intervention group

Additionally adjusted for the rest of factors (1-15)

	Factor	Description	Components	Eigen value	Variance explained (%)
Direct association with T2D	1	Triacylglycerides (TAGs) with ≤ 4 double bonds; Diacylglycerides (DAGs); Phosphatidylethanolamines (PEs)	38:2pc, 16:1lpc, 36:1pc, 32:0pc, 38:4dag, 40:6pe, 36:2dag, 38:5dag, 16:1ce, 34:1pc 14:0ce, 52:7tag, 54:2tag, 52:6tag, 36:4pe, 38:3pc, 53:2tag, 51:3tag, 56:2tag, 34:3pc, 36:2pe, 40:6ps, 36:1pe, 34:2pe, 34:3dag 34:4pc, 34:0pe, 52:2tag, 55:2tag, 32:2pc, 50:4tag, 34:2dag, 50:5tag, 14:0lpc, 32:0pe, 34:1dag, 34:0dag, 56:1tag, 36:1dag, 32:1pc, 50:3tag, 48:4tag, 54:1tag, 51:2tag, 30:0pc, 30:1pc, 49:3tag 30:0dag, 52:1tag, 32:1dag, 52:0tag, 51:0tag, 50:2tag, 46:3tag, 48:3tag, 32:0dag, 50:1tag, 49:2tag, 44:2tag, 42:0tag, 49:1tag, 51:1tag, 45:1tag, 47:1tag, 50:0tag, 48:0tag, 47:2tag 44:1tag, 46:2tag, 48:2tag, 46:0tag, 44:0tag, 48:1tag, 46:1tag 18:2ce* 22:4ce* 16:0ce* 22:6ce* 20:4ce* 18:1ce*	53.3	25.8
	5		53:3tag, 34:1pc, 34:1dag, 54:1tag, 36:1dag, 54:4tag, 52:3tag, 36:1pc, 24:1cer181, 36:1pe, 53:2tag, 56:4tag, 55:2tag, 52:2tag, 55:3tag, 56:2tag, 36:2dag, 54:2tag, 56:3tag, 54:3tag	9.9	6.9
	11		40:6pe, 36:2pe, 38:4pe, 38:5pe, 36:3pe, 38:6pe, 34:2pe, 36:4pe	2.9	1.4

*Negative loading factors

Lipidomic patterns

- **First step: exploratory analysis:**
 1. PCA
- **Second step: hypothesis based analysis:**
 1. Scores of lipid metabolites
 2. Scores of lipid metabolite changes
- **Third step: Effects of intervention on lipid changes**

SECOND STEP (1): SCORES OF LIPID SPECIES

- Hypothesis based analysis
- Guided by PCA, metabolites were grouped according to their similar chemical characteristics.

BASELINE SCORES

1. Lysophosphatidylcholines (LPC) and Lysophosphatidylethanolamines (LPE)
2. Phosphatidylcholine-plasmalogens (PC-pl)
3. Sphingomyelins (SM)
4. Cholesterol esters (excluding ce16:1)
5. Ceramides (CER)

6. Triacylglycerides (TAG) low number of double bounds (≤ 4)
7. Diacylglycerides (DAG)
8. Phosphatidylethanolamines (PE)

Scores showing inverse association

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	0.89 (0.61-1.31)	0.47 (0.30-0.72)	0.48 (0.31-0.74)	<0.001	0.74 (0.63-0.86)
PC-pl	12	Ref.	0.72 (0.48-1.08)	0.70 (0.47-1.05)	0.38 (0.24-0.61)	<0.001	0.75 (0.65-0.87)
SM	11	Ref.	0.49 (0.32-0.75)	0.58 (0.38-0.89)	0.32 (0.19-0.54)	<0.001	0.67 (0.56-0.80)
CE	12	Ref.	0.77 (0.52-1.15)	0.68 (0.45-1.02)	0.30 (0.18-0.48)	<0.001	0.67 (0.58-0.79)
CER	4	Ref.	1.06 (0.69-1.62)	0.96 (0.62-1.47)	1.05 (0.69-1.61)	0.814	1.01 (0.87-1.18)
Inverse score	54	Ref.	0.51 (0.34-0.76)	0.48 (0.33-0.72)	0.25 (0.15-0.40)	<0.001	0.63 (0.53-0.74)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group

Scores showing inverse association

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	0.89 (0.61-1.31)	0.47 (0.30-0.72)	0.48 (0.31-0.74)	<0.001	0.74 (0.63-0.86)
PC-pl	12	Ref.	0.72 (0.48-1.08)	0.70 (0.47-1.05)	0.38 (0.24-0.61)	<0.001	0.75 (0.65-0.87)
SM	11	Ref.	0.49 (0.32-0.75)	0.58 (0.38-0.89)	0.32 (0.19-0.54)	<0.001	0.67 (0.56-0.80)
CE	12	Ref.	0.77 (0.52-1.15)	0.68 (0.45-1.02)	0.30 (0.18-0.48)	<0.001	0.67 (0.58-0.79)
Inverse score w/o CER	50	Ref.	0.55 (0.36-0.82)	0.49 (0.33-0.73)	0.24 (0.14-0.39)	<0.001	0.60 (0.51-0.72)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelines; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group

Scores showing inverse association Multivariable model

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	0.96 (0.65-1.42)	0.48 (0.31-0.76)	0.55 (0.35-0.86)	0.001	0.75 (0.64-0.88)
PC-pl	12	Ref.	0.76 (0.50-1.15)	0.76 (0.50-1.15)	0.43 (0.26-0.71)	0.005	0.80 (0.69-0.94)
SM	11	Ref.	0.47 (0.31-0.74)	0.56 (0.36-0.88)	0.32 (0.19-0.53)	<0.001	0.70 (0.58-0.83)
CE	12	Ref.	0.90 (0.59-1.37)	0.79 (0.52-1.20)	0.37 (0.23-0.62)	0.002	0.72 (0.61-0.85)
Inverse score w/o CER	50	Ref.	0.54 (0.35-0.82)	0.52 (0.34-0.79)	0.27 (0.16-0.46)	<0.001	0.63 (0.52-0.75)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group, BMI, smoking, dyslipidemia and hypertension

Scores showing inverse association Multivariable model + baseline glucose

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	1.32 (0.76-2.30)	0.50 (0.24-1.03)	0.80 (0.43-1.48)	0.122	0.84 (0.66-1.07)
PC-pl	12	Ref.	0.55 (0.29-1.04)	0.71 (0.40-1.29)	0.40 (0.19-0.84)	0.028	0.78 (0.61-0.99)
SM	11	Ref.	0.30 (0.15-0.58)	0.49 (0.25-0.94)	0.25 (0.11-0.55)	0.001	0.70 (0.53-0.93)
CE	12	Ref.	0.54 (0.28-1.05)	0.79 (0.43-1.47)	0.31 (0.15-0.64)	0.010	0.64 (0.50-0.83)
Inverse score w/o CER	50	Ref.	0.46 (0.25-0.88)	0.50 (0.27-0.93)	0.29 (0.14-0.59)	<0.001	0.65 (0.50-0.85)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group, BMI, smoking, dyslipidemia, hypertension, baseline glucose and baseline glucose quadratic term

Scores showing direct association:

	N	Quartiles of factors				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
TAG	45	Ref.	1.73 (1.06-2.82)	2.26 (1.41-3.63)	2.88 (1.82-4.55)	<0.001	1.52 (1.29-1.79)
DAG	14	Ref.	1.19 (0.73-1.94)	2.18 (1.37-3.45)	2.84 (1.81-4.43)	<0.001	1.57 (1.33-1.86)
PE	12	Ref.	1.51 (0.95-2.39)	1.57 (0.98-2.50)	2.55 (1.64-3.95)	<0.001	1.45 (1.23-1.70)
Direct score	71	Ref.	1.26 (0.77-2.07)	2.25 (1.42-3.58)	2.76 (1.76-4.31)	<0.001	1.55 (1.32-1.83)

Cox model adjusted for: age, sex, intervention group

Scores showing direct association Multivariable model

	N	Quartiles of factors				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
TAG	45	Ref.	1.70 (1.04-2.79)	2.08 (1.28-3.36)	2.40 (1.50-3.83)	<0.001	1.41 (1.19-1.66)
DAG	14	Ref.	1.23 (0.74-2.03)	1.92 (1.20-3.07)	2.42 (1.54-3.82)	<0.001	1.48 (1.24-1.76)
PE	12	Ref.	1.45 (0.91-2.32)	1.48 (0.92-2.38)	2.12 (1.35-3.32)	0.002	1.36 (1.16-1.59)
Direct score	71	Ref.	1.28 (0.77-2.10)	2.02 (1.26-3.23)	2.33 (1.48-3.68)	<0.001	1.44 (1.22-1.70)

Cox model adjusted for: age, sex, intervention group, BMI, smoking, dyslipidemia and hypertension

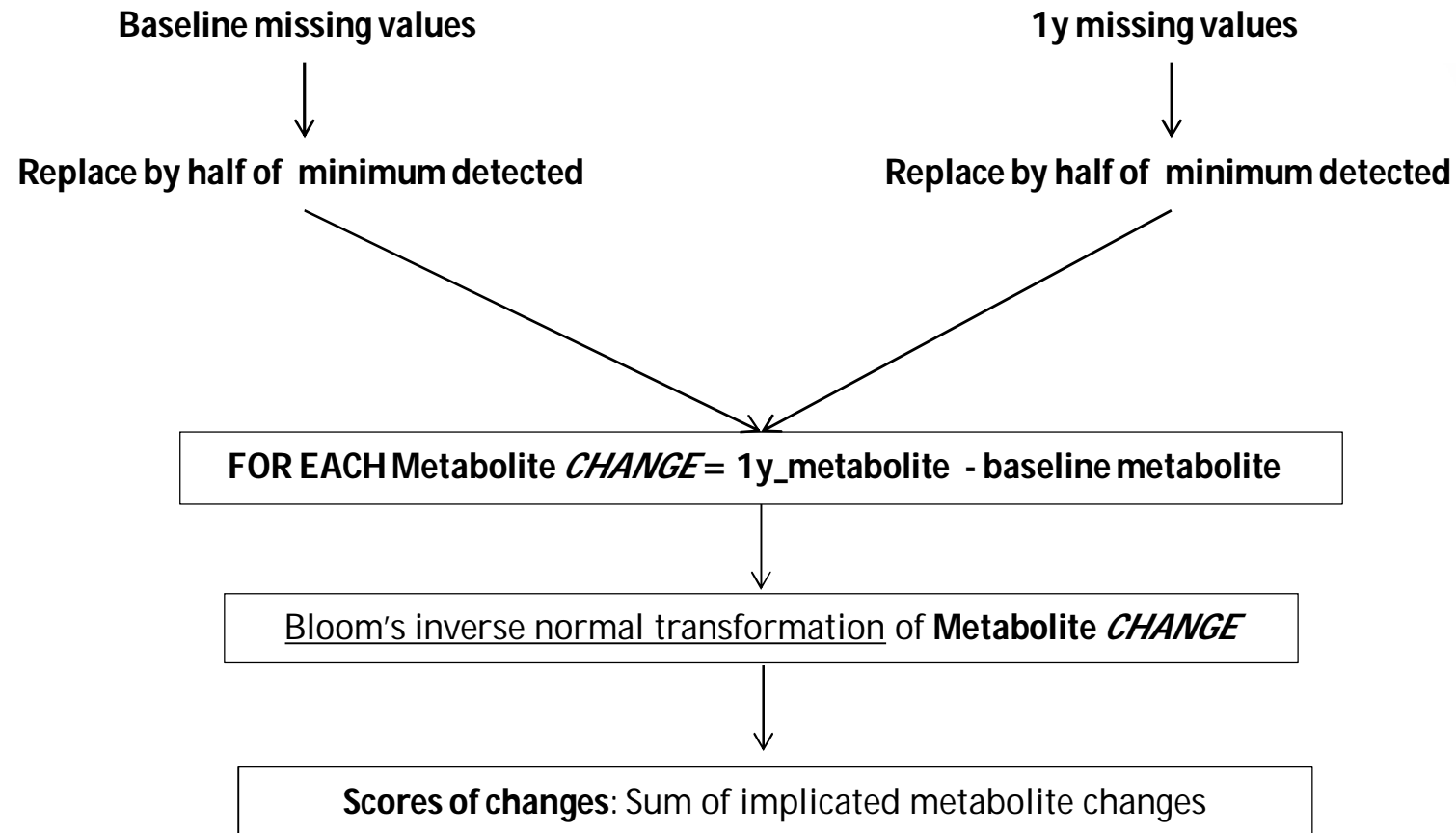
Scores showing direct association Multivariable model + baseline glucose

	N	Quartiles of factors				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
TAG	45	Ref.	1.41 (0.66-3.03)	2.33 (1.11-4.86)	1.86 (0.88-3.91)	0.092	1.34 (1.03-1.74)
DAG	14	Ref.	1.27 (0.60-2.70)	1.94 (0.99-3.80)	2.19 (1.16-4.15)	0.009	1.37 (1.07-1.75)
PE	12	Ref.	1.66 (0.86-3.20)	0.83 (0.41-1.70)	1.48 (0.77-2.85)	0.377	1.23 (0.97-1.56)
Direct score	71	Ref.	0.87 (0.42-1.83)	1.55 (0.78-3.07)	1.82 (0.97-3.42)	0.022	1.35 (1.05-1.74)

Cox model adjusted for: age, sex, intervention group, BMI, smoking, dyslipidemia, hypertension, baseline glucose and baseline glucose quadratic term

Lipidomic patterns

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- **Third step: Effects of intervention on lipid changes**



1y changes

Scores showing inverse association

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	0.92 (0.52-1.64)	0.86 (0.47-1.55)	0.75 (0.40-1.38)	0.311	0.87 (0.69-1.10)
PC-pl	12	Ref.	0.58 (0.33-1.03)	0.63 (0.36-1.09)	0.60 (0.33-1.08)	0.129	0.86 (0.71-1.05)
SM	11	Ref.	0.95 (0.54-1.70)	0.97 (0.55-1.72)	0.63 (0.34-1.19)	0.203	0.86 (0.70-1.06)
CE	12	Ref.	0.79 (0.45-1.38)	0.71 (0.40-1.25)	0.85 (0.47-1.53)	0.616	0.81 (0.64-1.01)
Inverse score w/o CER	50	Ref.	0.70 (0.39-1.23)	0.68 (0.37-1.22)	0.49 (0.26-0.94)	0.039	0.76 (0.61-0.94)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group, **baseline score**

1y changes

Scores showing inverse association Multivariable model

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	1.01 (0.55-1.87)	0.99 (0.53-1.83)	0.73 (0.36-1.44)	0.257	0.86 (0.68-1.10)
PC-pl	12	Ref.	0.52 (0.28-0.95)	0.63 (0.36-1.12)	0.59 (0.33-1.08)	0.185	0.90 (0.74-1.10)
SM	11	Ref.	1.09 (0.59-1.99)	1.03 (0.56-1.88)	0.70 (0.36-1.36)	0.275	0.89 (0.72-1.11)
CE	12	Ref.	0.88 (0.49-1.60)	0.82 (0.45-1.47)	0.96 (0.52-1.78)	0.954	0.84 (0.67-1.06)
Inverse score w/o CER	50	Ref.	0.70 (0.39-1.26)	0.72 (0.39-1.32)	0.53 (0.27-1.04)	0.084	0.78 (0.62-0.98)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group, **baseline score**, BMI, smoking, dyslipidemia and hypertension

1y changes

Scores showing inverse association Multivariable model + baseline glucose

	N	Quartiles of scores				Linear trend	Per SD
		Q1	Q2	Q3	Q4		
LPC_LPE	17	Ref.	1.99 (0.89-4.75)	1.04 (0.45-2.49)	1.00 (0.38-2.62)	0.703	0.92 (0.67-1.26)
PC-pl	12	Ref.	0.75 (0.31-1.80)	0.80 (0.32-1.95)	0.62 (0.23-1.71)	0.451	0.85 (0.61-1.17)
SM	11	Ref.	1.23 (0.51-2.97)	1.87 (0.79-4.42)	0.68 (0.27-1.69)	0.693	0.89 (0.67-1.19)
CE	12	Ref.	1.13 (0.51-2.51)	0.78 (0.29-2.10)	1.06 (0.42-2.69)	0.916	0.81 (0.56-1.16)
Inverse score w/o CER	50	Ref.	1.16 (0.48-2.78)	1.35 (0.56-3.26)	0.64 (0.23-1.74)	0.474	0.81 (0.59-1.10)

LPC:LysoPhosphatidylCholines; LPE:LysoPhosphatidylEthanolamines; PC-pl:PhosphatidylCholines-plasmalogens; CER:ceramides; SM:sphingomyelins; CE:cholesterol esters.

Cox model adjusted for: age, sex, intervention group, **baseline score**, BMI, smoking, dyslipidemia, hypertension, baseline glucose and baseline glucose quadratic term

1y changes

Scores showing direct association:

		Quartiles of factors				Linear trend	Per SD
	N	Q1	Q2	Q3	Q4		
TAG	45	Ref.	0.88 (0.49-1.60)	1.02 (0.57-1.83)	1.55 (0.89-2.69)	0.102	1.21 (1.00-1.46)
DAG	14	Ref.	1.25 (0.70-2.23)	1.15 (0.66-2.00)	1.58 (0.90-2.78)	0.183	1.20 (0.98-1.45)
PE	12	Ref.	1.20 (0.68-2.10)	1.23 (0.69-2.21)	1.84 (1.04-3.25)	0.068	1.25 (1.02-1.54)
Direct score	71	Ref.	1.10 (0.62-1.97)	1.01 (0.57-1.82)	1.58 (0.90-2.76)	0.136	1.23 (1.01-1.49)

Cox model adjusted for: age, sex, intervention group, **baseline score**

1y changes

Scores showing direct association

Multivariable model

		Quartiles of factors				Linear trend	Per SD
	N	Q1	Q2	Q3	Q4		
TAG	45	Ref.	0.90 (0.50 -1.63)	1.03 (0.57-1.86)	1.46 (0.80-2.65)	0.216	1.19 (0.97-1.46)
DAG	14	Ref.	1.18 (0.65-2.16)	1.22 (0.69-2.15)	1.48 (0.82-2.68)	0.289	1.15 (0.94-1.98)
PE	12	Ref.	1.22 (0.69-2.16)	1.29 (0.71-2.35)	1.84 (1.01-3.33)	0.102	1.25 (1.00-1.56)
Direct score	71	Ref.	1.16 (0.64-2.10)	1.55 (0.55-1.83)	1.55 (0.85-2.84)	0.220	1.21 (0.98-1.48)

Cox model adjusted for: age, sex, intervention group, **baseline score**, BMI, smoking, dyslipidemia and hypertension

1y changes

Scores showing direct association

Multivariable model + baseline glucose

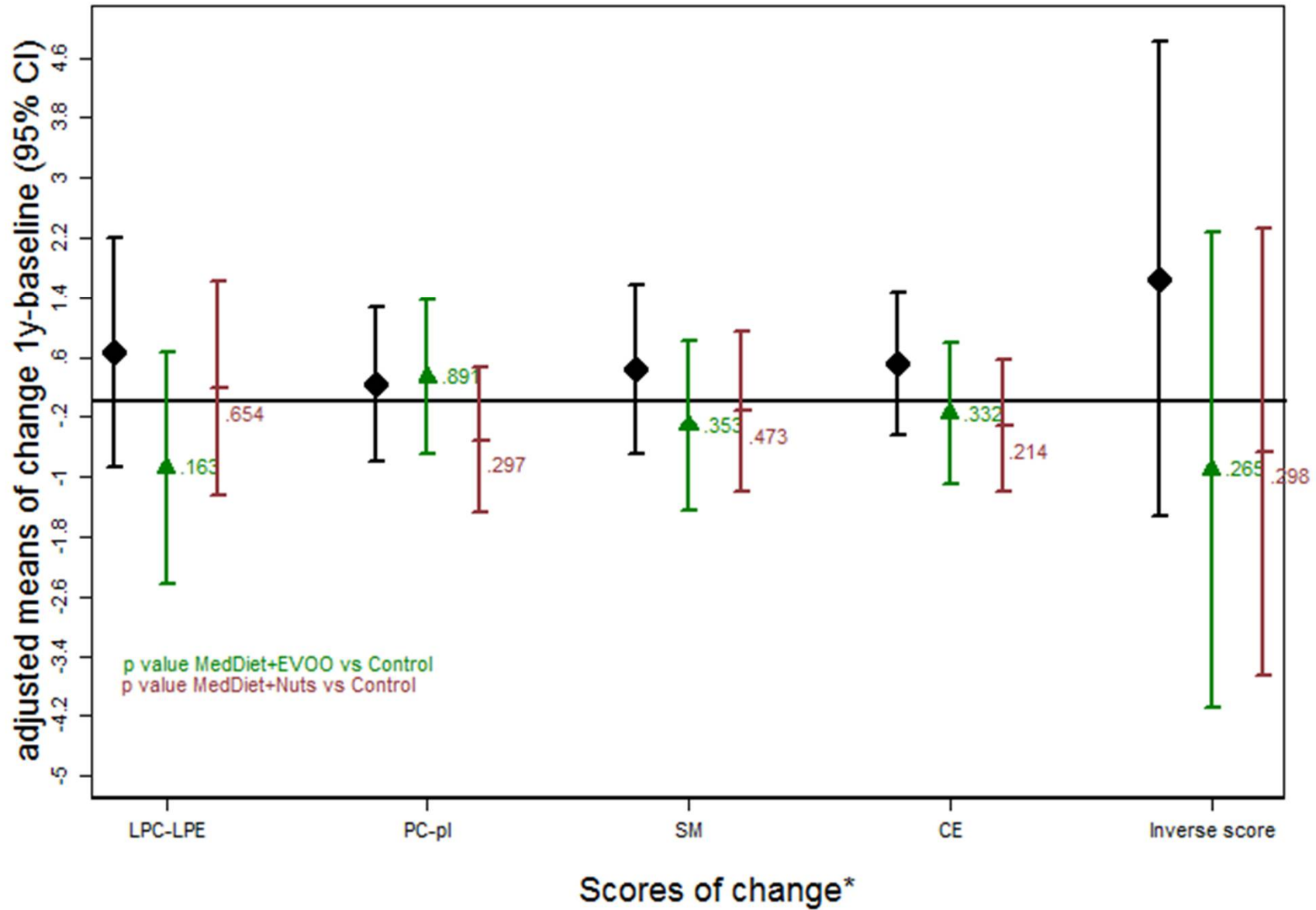
	Quartiles of factors					Linear trend	Per SD
	N	Q1	Q2	Q3	Q4		
TAG	45	Ref.	0.99 (0.42-2.32)	1.22 (0.54-2.77)	1.58 (0.65-3.86)	0.331	1.22 (0.91-1.62)
DAG	14	Ref.	2.07 (0.85-5.04)	2.25 (0.91-5.57)	1.89 (0.75-4.77)	0.180	1.20 (0.91-1.57)
PE	12	Ref.	1.44 (0.65-3.23)	1.65 (0.68-3.96)	1.59 (0.64-3.98)	0.250	1.24 (0.91-1.67)
Direct score	71	Ref.	1.68 (0.72-3.89)	1.44 (0.64-3.26)	1.90 (0.75-4.79)	0.330	1.30 (0.93-1.64)

Cox model adjusted for: age, sex, intervention group, **baseline score**, BMI, smoking, dyslipidemia, hypertension, baseline glucose and baseline glucose quadratic term

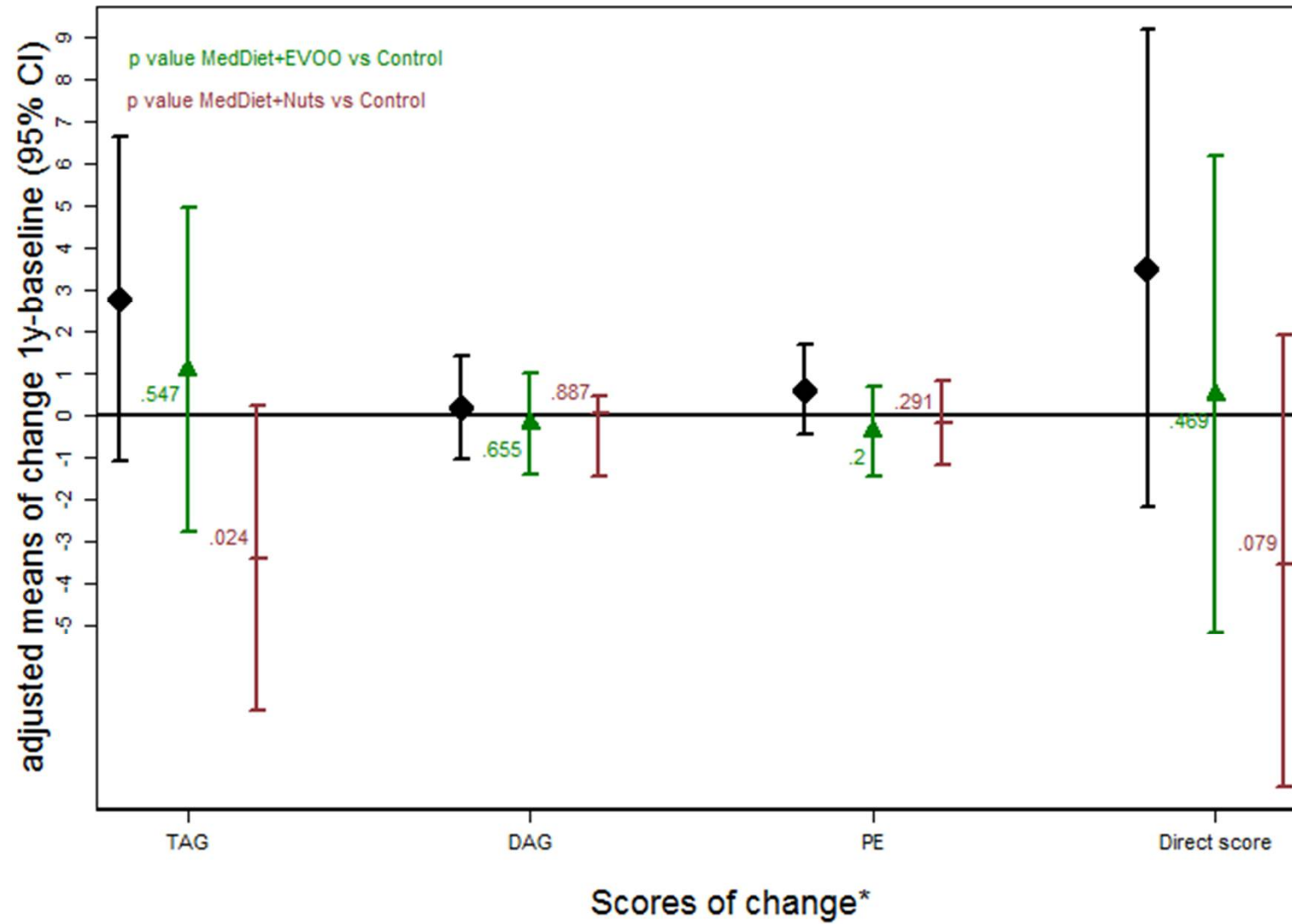
Lipidomic patterns

- **First step: exploratory analysis:**
 1. PCA
- **Second step: hypothesis based analysis:**
 1. Scores of lipid metabolites
 2. Scores of lipid metabolite changes
- **Third step: Effects of intervention on lipid changes**

Inversely associated scores



Directly associated scores





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TARGETED LIPIDOMICS (2)

Lipidomic patterns and the risk of T2D



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