



## Quantitative and Systems Genetics Analyses of Lipid profiles in a Pig Model for Obesity

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## Outline

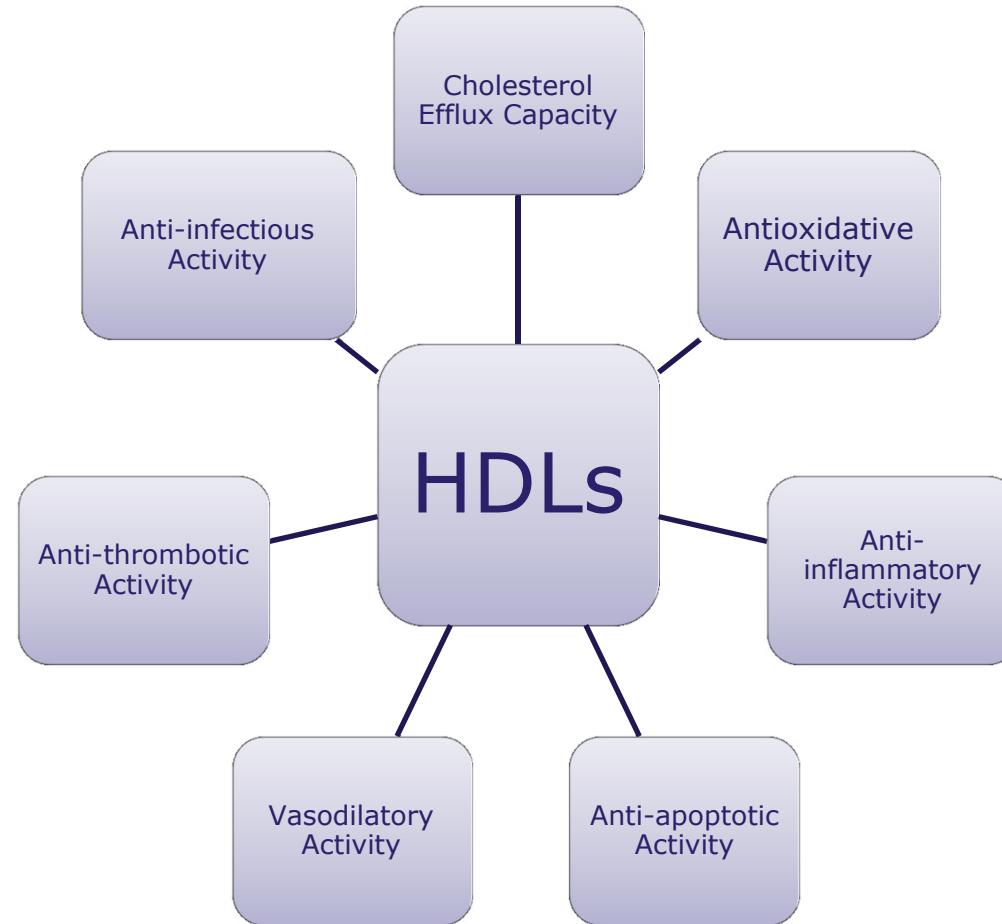
- Background
- Objectives
- Materials and Methods
- Results
- Discussion
- Conclusion
- Acknowledgement



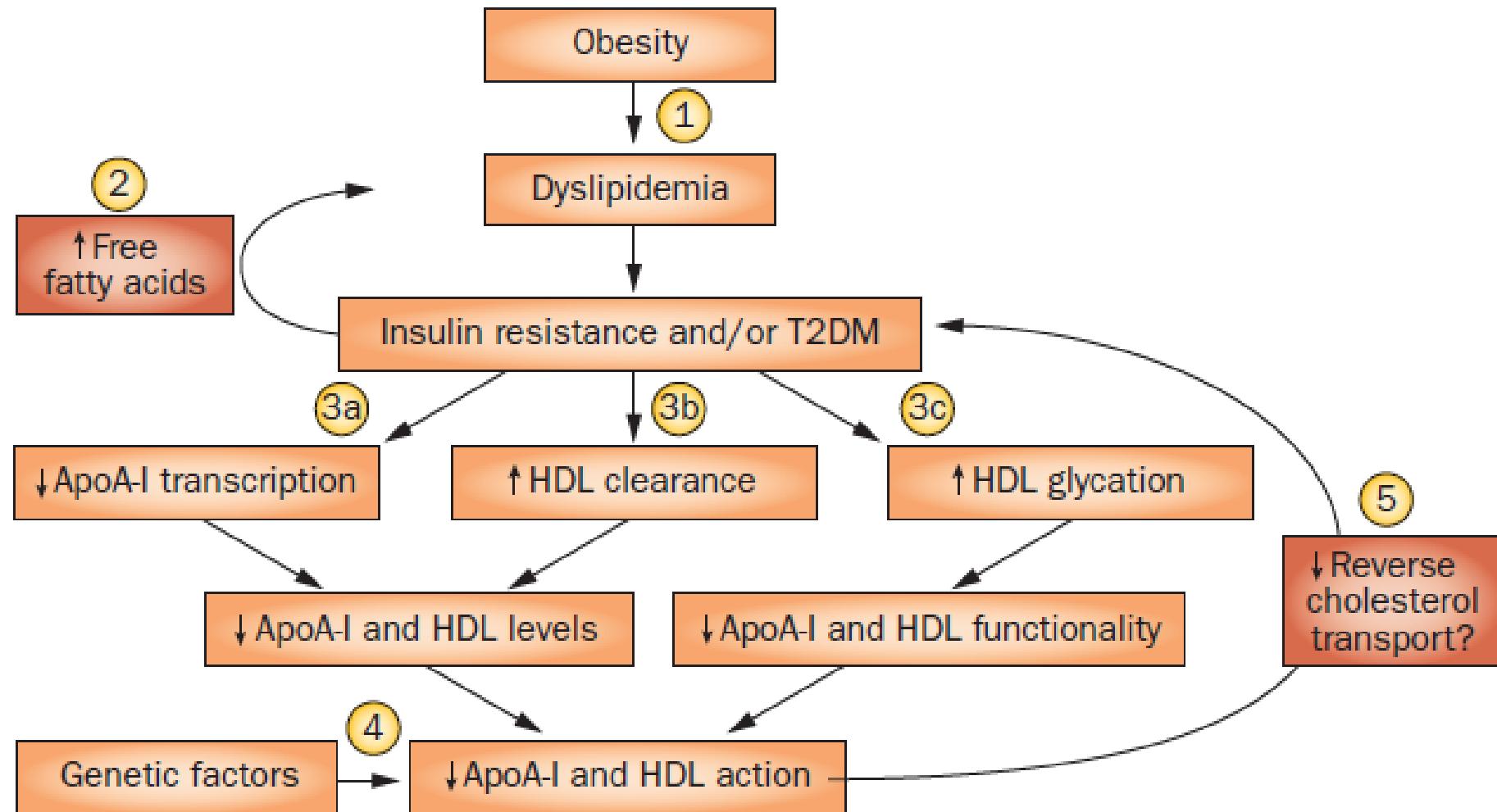
## Model: Pig Population

**Focus:** Obesity and High Density Lipoprotein (HDL) Traits

6 Traits: HDL-CE, HDL-CE/CT, pHDL-CL, pHDL-TG, pHDL-PL and pHDL-CE



## Connection between Obesity and HDLs

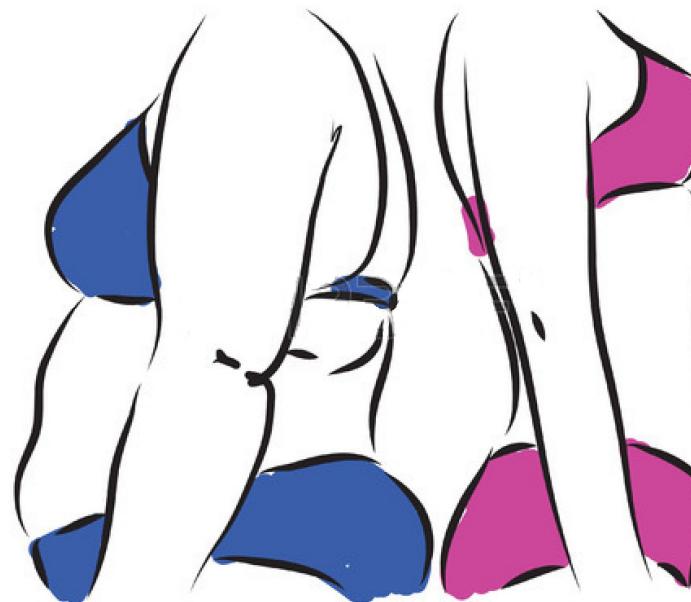


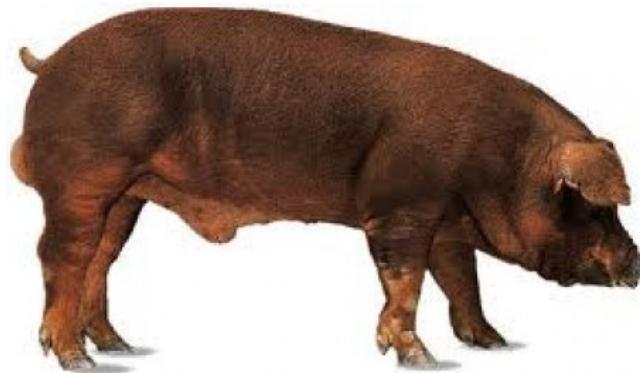
Obesity: ↑HDL-TG and ↓ HDL-C



## Aim:

1. Quantitative Genetics: Estimate heritabilities
2. GWAS: identify genetic variants
3. Systems genetics: WGCNA and pathways

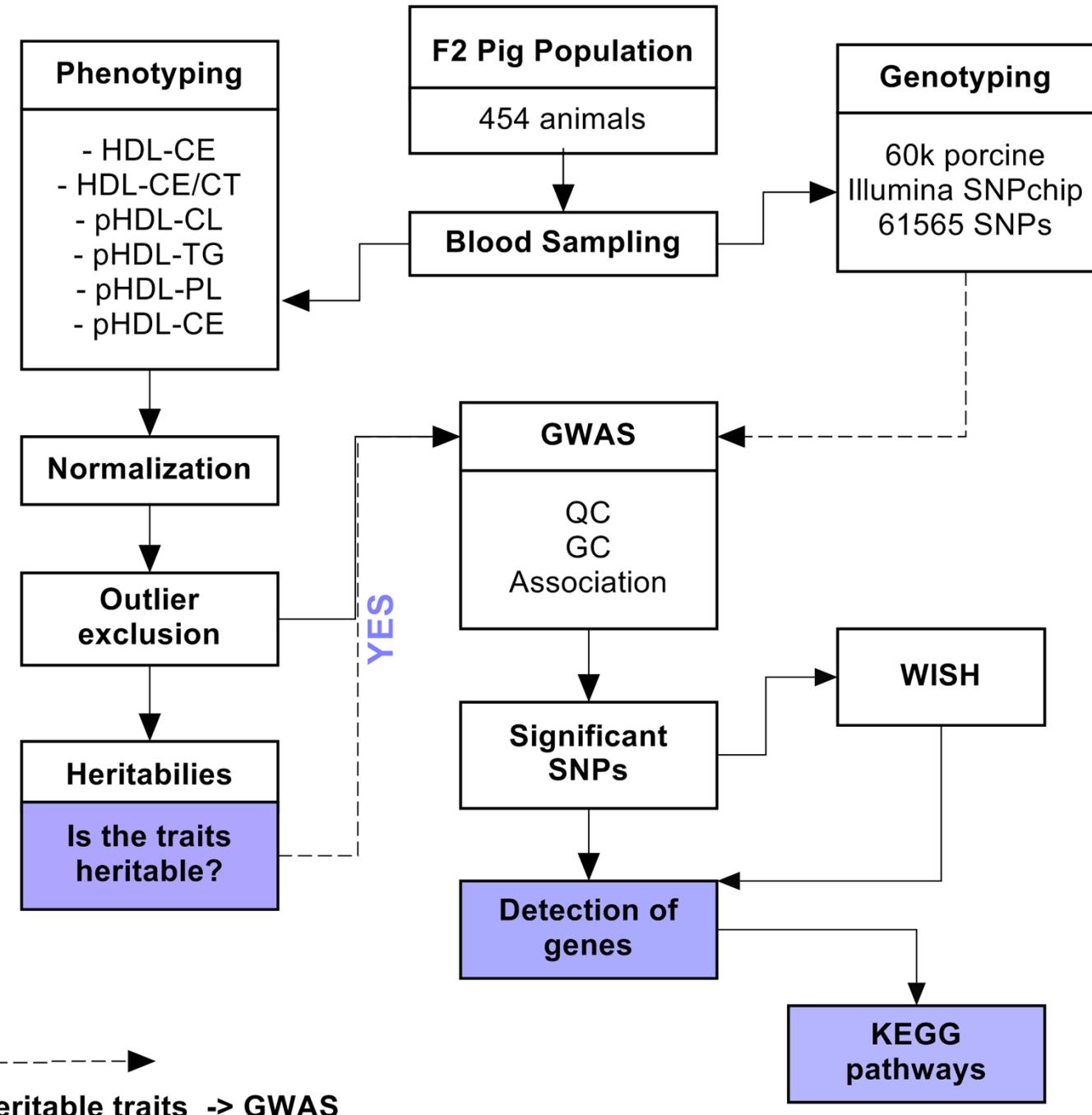


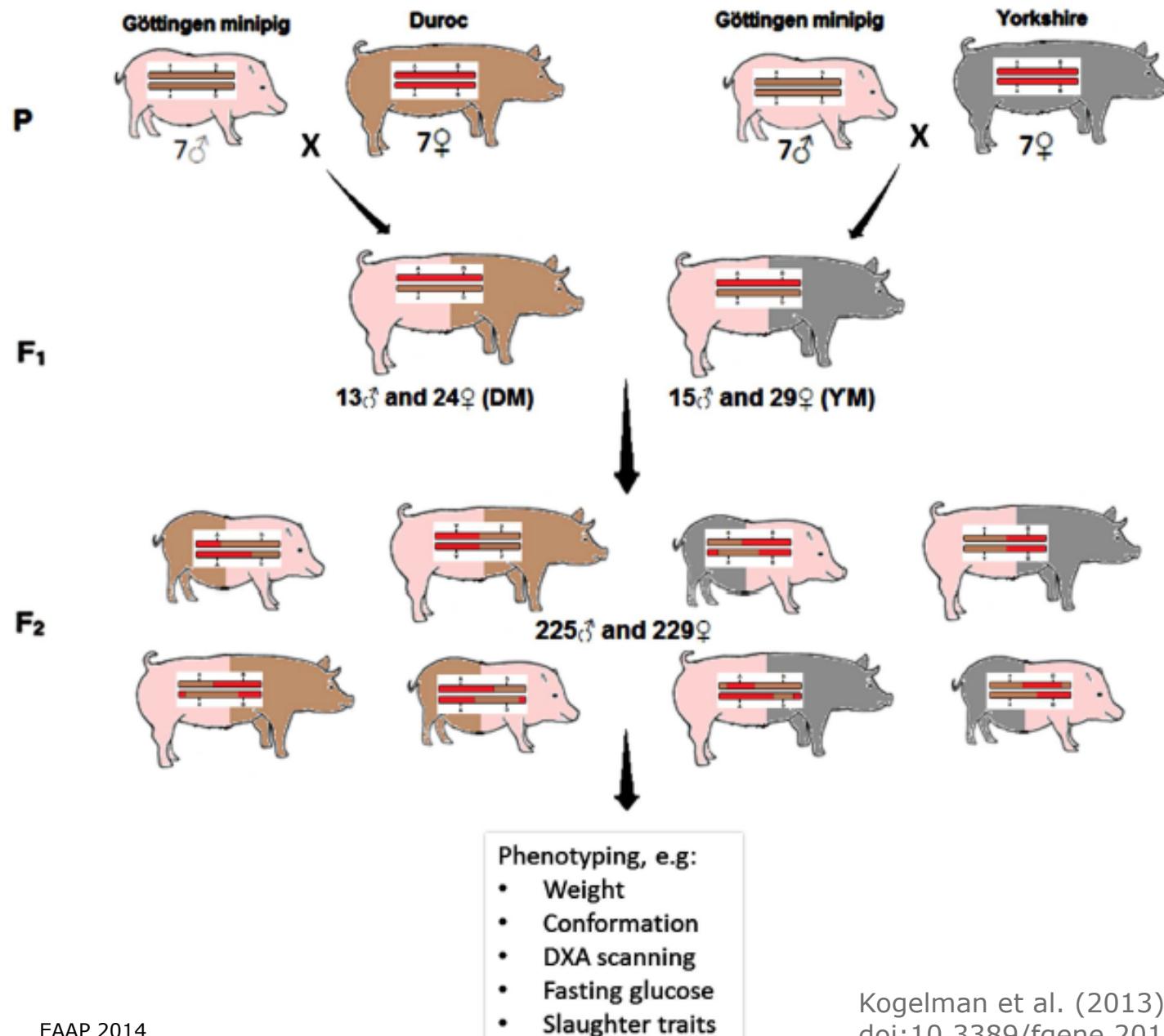


# Materials and Methods



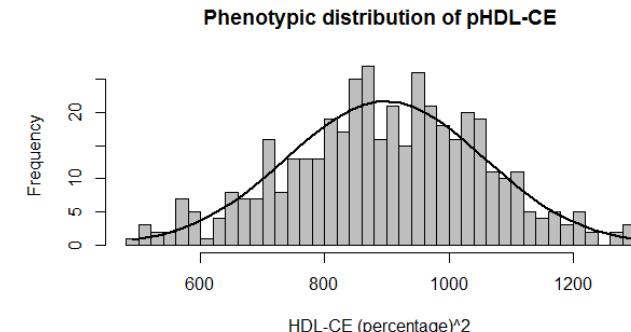
## Workflow





## Animal Model

Fitting univariate mixed linear models:

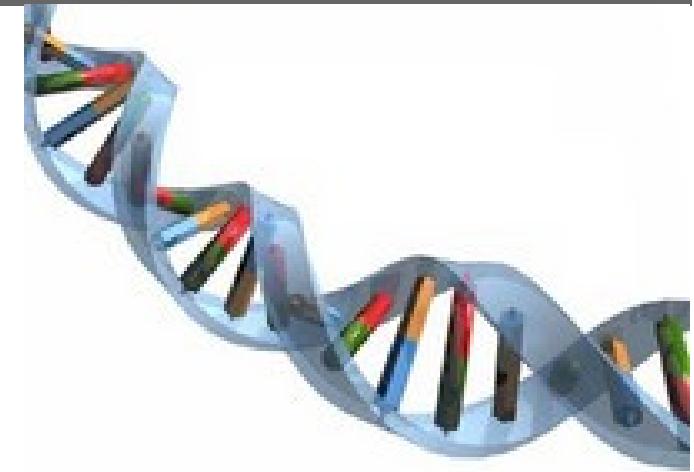


$$y_{ijkl} = \mu + SEX_i + BATCH_j + \gamma(AGE_k) + ANIMAL_l + \varepsilon_{ijkl}$$

- $y_{ijkl}$ : Phenotypic measurements of the HDL traits
- $SEX_i$ : Fixed effect ( $i = 0, 1$ )
- $BATCH_j$ : Fixed effect ( $j = 1, 2, 3$ )
- $AGE_k$ : Covariate
- $\gamma$ : Regression coefficient for  $AGE_k$
- $ANIMAL_l$ : Random genetic effect ( $l = 1, \dots, 454$ )
- $\varepsilon$ : Error term



# Results



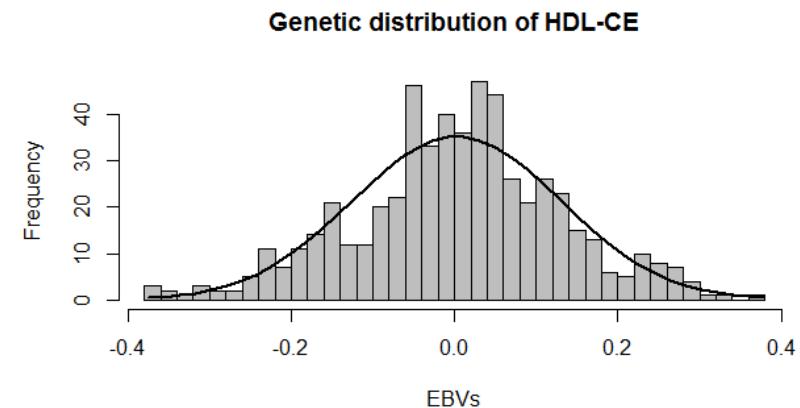
## Heritabilities ( $h^2$ )

**$h^2$ :** Ranging from 0.17 to 0.99

- Variations in the phenotypic values influenced by genetic differences

**EBVs:** Normal distributed

- Genetically predisposed toward different lipid profiles



**Table:** Heritabilities estimated based on the univariate animal models.

	HDL-CE	HDL-CE/CT	pHDL-CL	pHDL-TG	pHDL-PL	pHDL-CE
<b><math>h^2</math></b>	0.98	0.37	0.17	0.77	0.99	0.41
<b>SE</b>	0.14	0.15	0.11	0.15	0.14	0.14



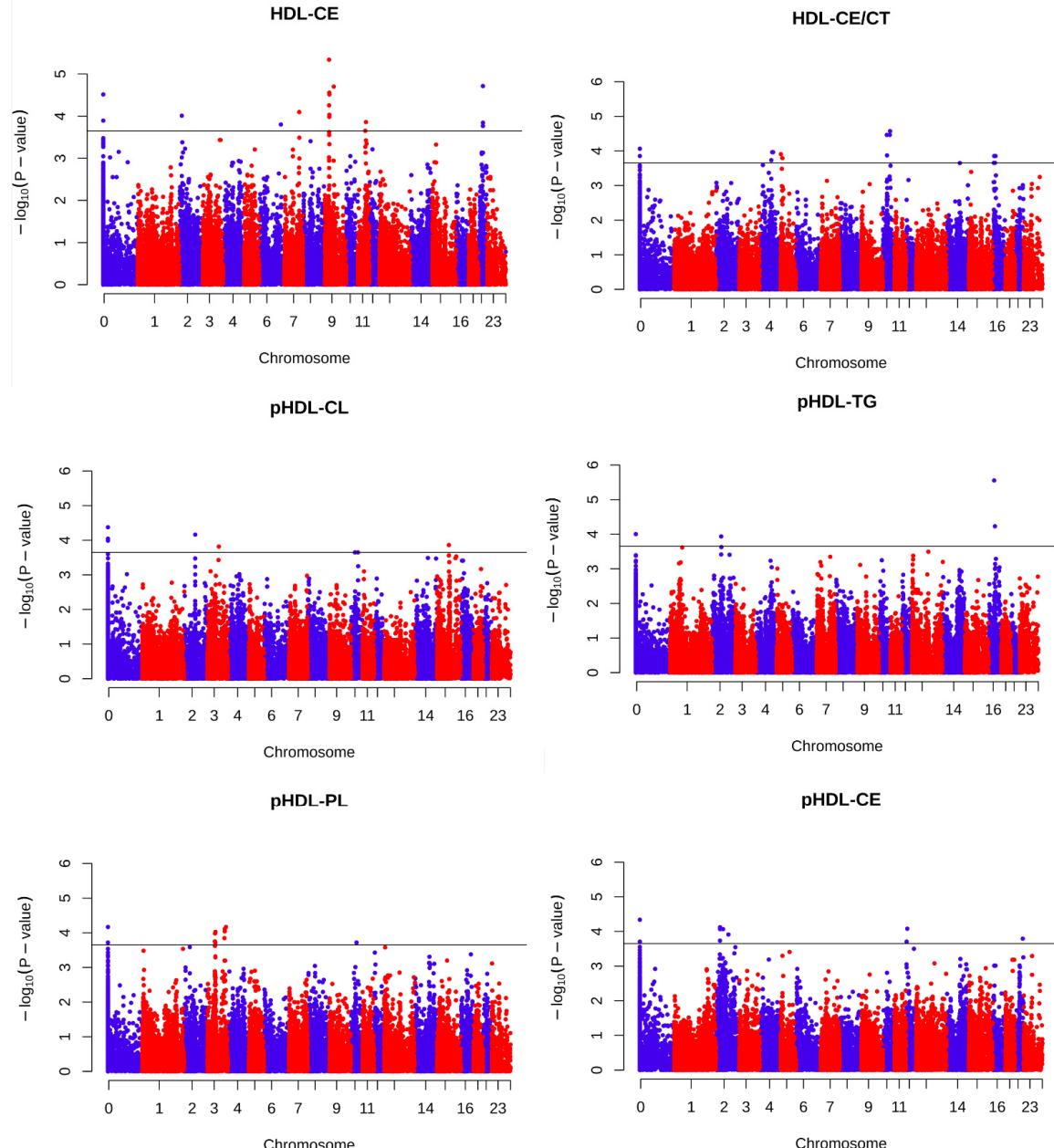
# GWAS

## Manhattan plot

Different QTLs for  
the 6 lipid traits.

P-value cutoff:

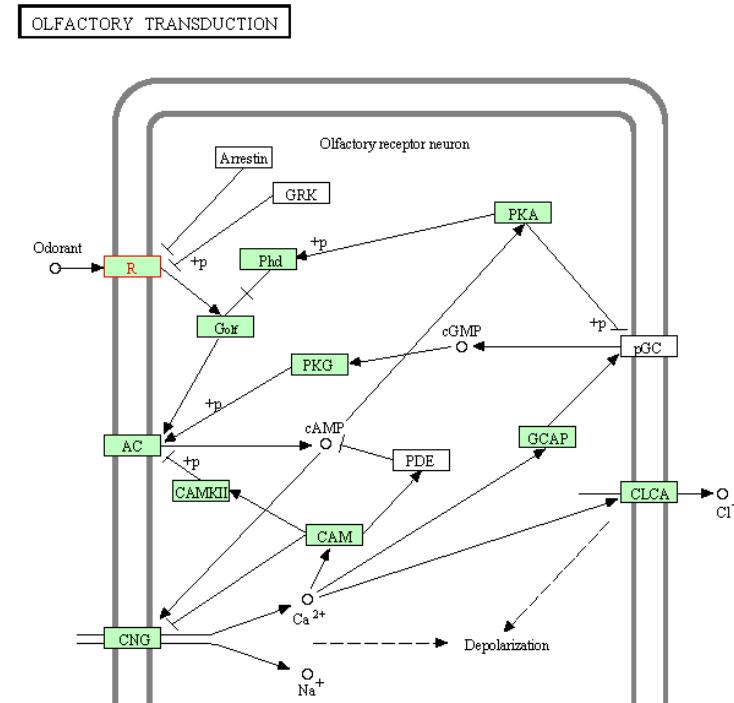
$$p \leq 2.2 \cdot 10^{-4}$$



## HDL-CE: Possible KEGG pathways

**Olfactory Transduction** (Chr 2)  
Olfactory receptors

**Metabolic pathways** (Chr 7 and 9)  
Lipid and AA metabolism



**Table:** KEGG pathways related to the gene sets ( $p < 0.05$ )

Trait	KEGG pathway id	KEGG pathway name	P-value
<b>HDL-CE</b>	04740 01100	Olfactory Transduction Metabolic Pathways	0.04 0.0004



# WISH – HDL-CE

Kogelman and Kadarmideen *BMC Systems Biology* 2014, **8**(Suppl 2):S5  
<http://www.biomedcentral.com/1752-0509/8/S2/S5>



RESEARCH

Open Access

Weighted Interaction SNP Hub (WISH) network method for building genetic networks for complex diseases and traits using whole genome genotype data

Lisette JA Kogelman, Haja N Kadarmideen\*

**frontiers in  
GENETICS**

ORIGINAL RESEARCH ARTICLE  
 published: 09 July 2014  
 doi: 10.3389/fgene.2014.00214

Systems genetics of obesity in an F2 pig model by genome-wide association, genetic network, and pathway analyses

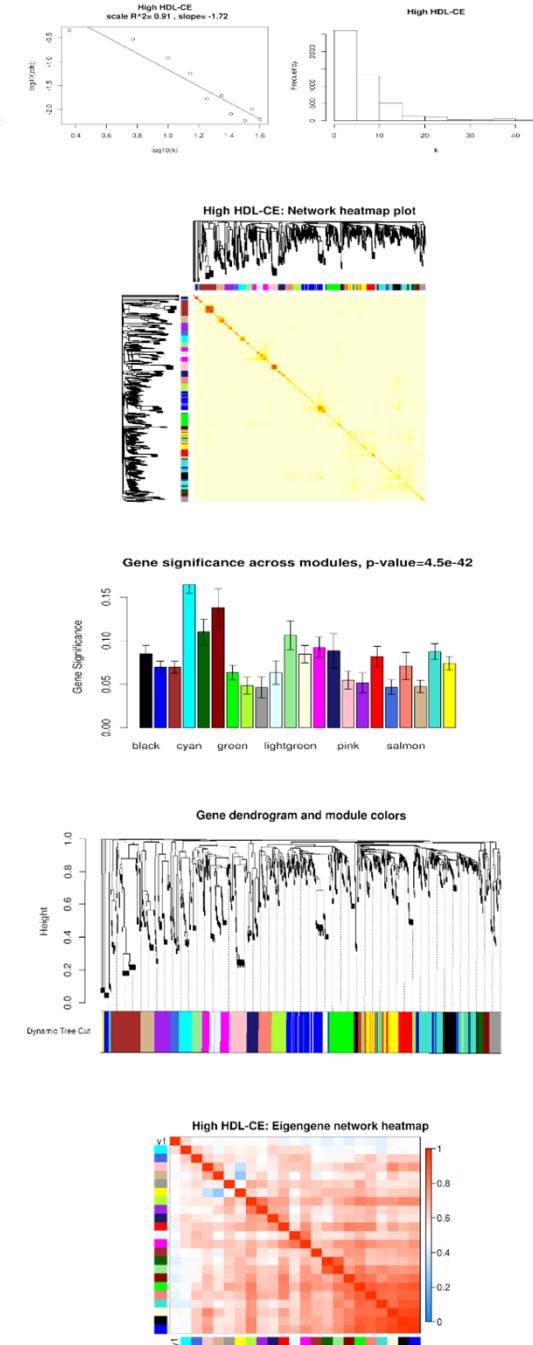
Lisette J. A. Kogelman, Sameer D. Pant, Merete Fredholm and Haja N. Kadarmideen \*

## GMAT: Significant modules

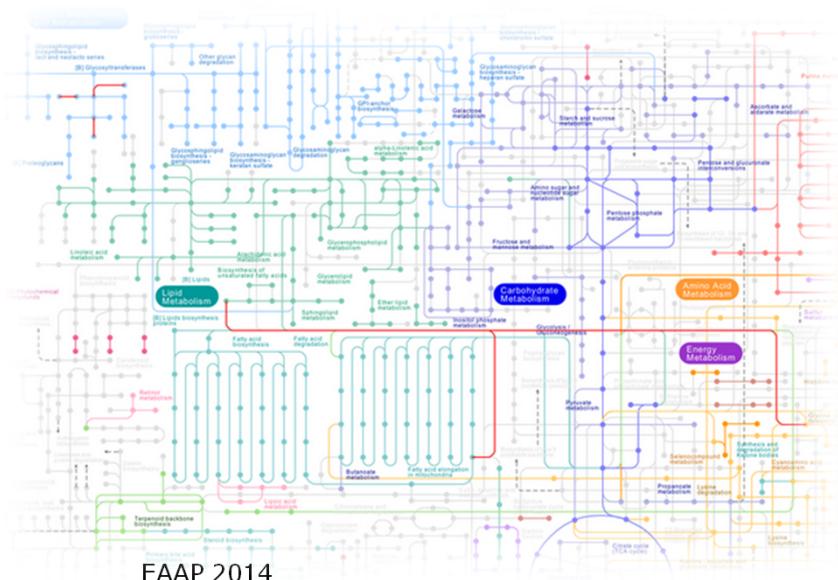
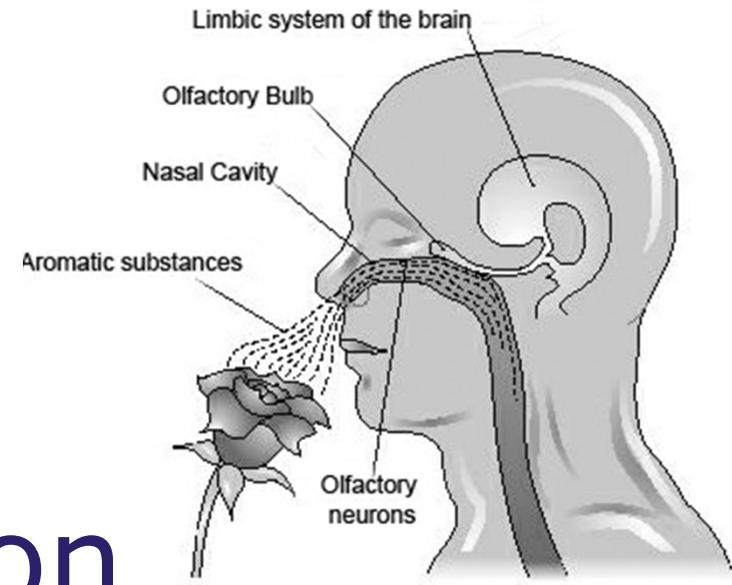
High HDL-CE group

- Cyan:  $p < 0.05$  and  $\text{cor} = 0.19$

KEGG pathways: Metabolic pathways ( $p = 2.94E-05$ )



# Discussion



## Olfactory Transduction

**Pig model:** Largest repertoire of olfactory receptor genes



**Smell:** Odorants bind to various receptors (one or more) → different responses

**Obesity:** E.g. due to impaired olfactory detection



**Obese vs. lean humans**  
Sensitivity or responsiveness of OR??

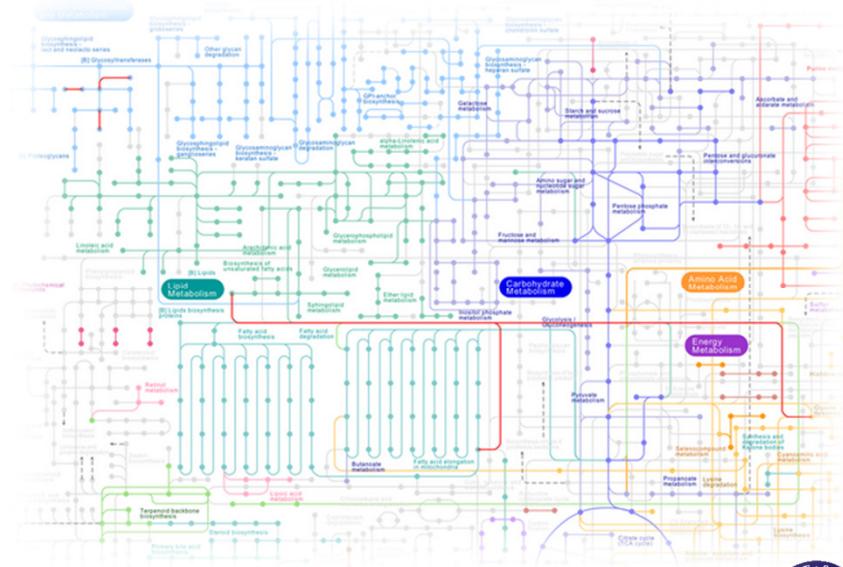
Palouzier-Paulignan et al. (2012): doi:10.1093/chemse/bjs059  
Groenen et al. (2012): doi:10.1038/nature11622  
Young & Trask (2002): doi: 10.1093/hmg/11.10.1153



# Metabolic pathways

## Impact of genes - Broad Overview

- Role against oxidative damage
  - Obesity → oxidative stress
- Influence on glucose tolerance and development of insulin resistance
- Level of free FFA and TG
- Role in atherosclerosis
- Role in weight gain/loss



Bhandari (2014): <http://www.scholarly-journals.com/SJSRE>

Li et al. (2014): doi: 10.1128/MCB.05893-11.

Homeister et al. (2004): doi: 10.1161/01.ATV.0000141844.28073.df

Bikman & Summers (2011): doi:10.1172/JCI57144

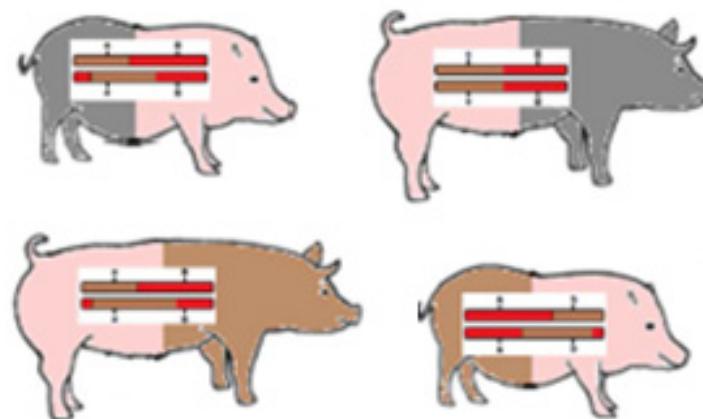


## Conclusion

**Indication** of significant genomic variation in lipid profiles in our porcine model.

### Possible reasons:

Genomic variation → Phenotypic differences possibly due to differences in olfaction and metabolism pathways



## Acknowledgement

### **BioChild Consortium**

(<http://biochild.ku.dk/>)



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#### **Supervisors and co-authors:**

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- Sameer D. Pant

*Professor & AQS Group Leader  
Adjunkt*

#### **Co-authors:**

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- Merete Fredholm

*PhD  
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#### **Other staff:**

- Duy N. Do

*PhD*



THANKS FOR YOUR ATTENTION ☺



# Questions?

