



METABOLON®

3<sup>rd</sup> Annual Workshop on Metabolomics

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# Strengthening Genomic Disease Inquiry with Metabolomics

## (& Fundamentals of Successful Study Design)

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Senior Director, Metabolon

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# Metabolon Is the Global Leader in Metabolomics

*Our technology is advancing life sciences research & improving health*



- Founded in 2000
- 150 employees with expertise in biochemistry, mass spectrometry and software development
- 54,000 sq. ft. facility in Research Triangle Park, NC & Sacramento, CA
- CLIA-certified/CAP-accredited lab
- >3,500 studies, >425 publications







# Strengthening Genomic Disease Inquiry with Metabolomics

nature  
genetics

*Nature Genetics* (2014) 46:543-550.

## An atlas of genetic influences on human blood metabolites

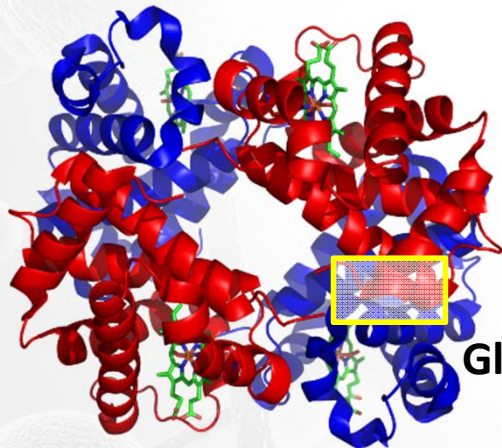
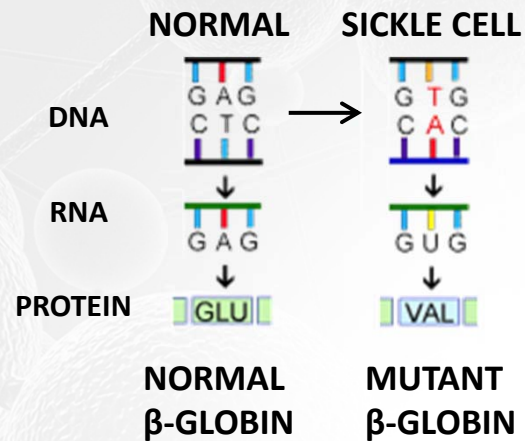
So-Youn Shin<sup>1,21,23</sup>, Eric B Fauman<sup>2,23</sup>, Ann-Kristin Petersen<sup>3,23</sup>, Jan Krumsiek<sup>4,23</sup>, Rita Santos<sup>5</sup>, Jie Huang<sup>1</sup>, Matthias Arnold<sup>6</sup>, Idil Erte<sup>7</sup>, Vincenzo Forgetta<sup>8</sup>, Tsun-Po Yang<sup>1</sup>, Klaudia Walter<sup>1</sup>, Cristina Menni<sup>7</sup>, Lu Chen<sup>1,9</sup>, Louella Vasquez<sup>1</sup>, Ana M Valdes<sup>7,10</sup>, Craig L Hyde<sup>11</sup>, Vicky Wang<sup>2</sup>, Daniel Ziemek<sup>2</sup>, Phoebe Roberts<sup>2,22</sup>, Li Xi<sup>2</sup>, Elin Grundberg<sup>8,12</sup>, The Multiple Tissue Human Expression Resource (MuTHER) Consortium<sup>13</sup>, Melanie Waldenberger<sup>14</sup>, J Brent Richards<sup>7,8,15</sup>, Robert P Mohny<sup>16</sup>, Michael V Milburn<sup>16</sup>, Sally L John<sup>17</sup>, Jeff Trimmer<sup>18,21</sup>, Fabian J Theis<sup>4,19</sup>, John P Overington<sup>5</sup>, Karsten Suhre<sup>6,20,24</sup>, M Julia Brosnan<sup>11,24</sup>, Christian Gieger<sup>3,24</sup>, Gabi Kastenmüller<sup>6,24</sup>, Tim D Spector<sup>7,24</sup> & Nicole Soranzo<sup>1,9,24</sup>

Genome-wide association scans with high-throughput metabolic profiling provide unprecedented insights into how genetic variation influences metabolism and complex disease. Here we report the most comprehensive exploration of genetic loci influencing human metabolism thus far, comprising 7,824 adult individuals from 2 European population studies. We report genome-wide significant associations at 145 metabolic loci and their biochemical connectivity with more than 400 metabolites in human blood. We extensively characterize the resulting *in vivo* blueprint of metabolism in human blood by integrating it with information on gene expression, heritability and overlap with known loci for complex disorders, inborn errors of metabolism and pharmacological targets. We further developed a database and web-based resources for data mining and results visualization. Our findings provide new insights into the role of inherited variation in blood metabolic diversity and identify potential new opportunities for drug development and for understanding disease.



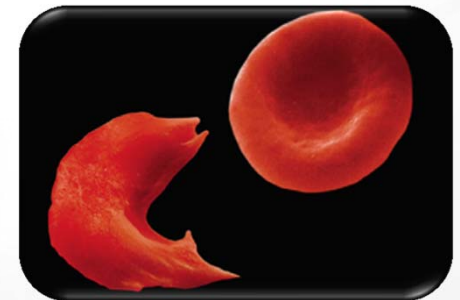


# Genetics Emerges & Biochemistry Is Forgotten



$\text{Glu}_6 \rightarrow \text{Val}_6$

Polymerization

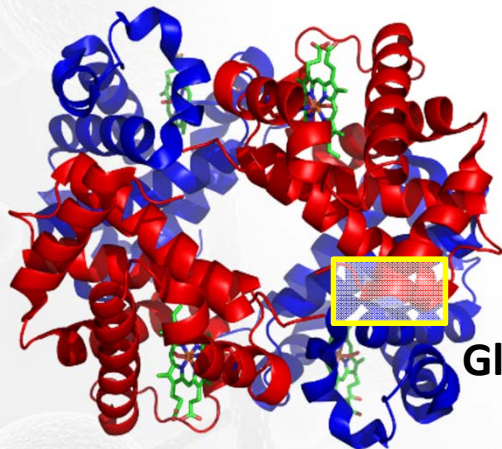
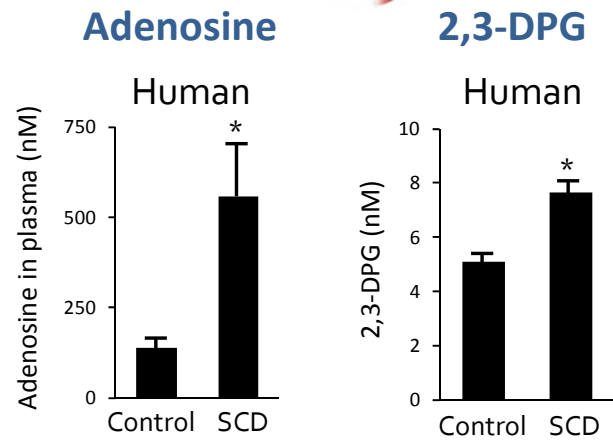
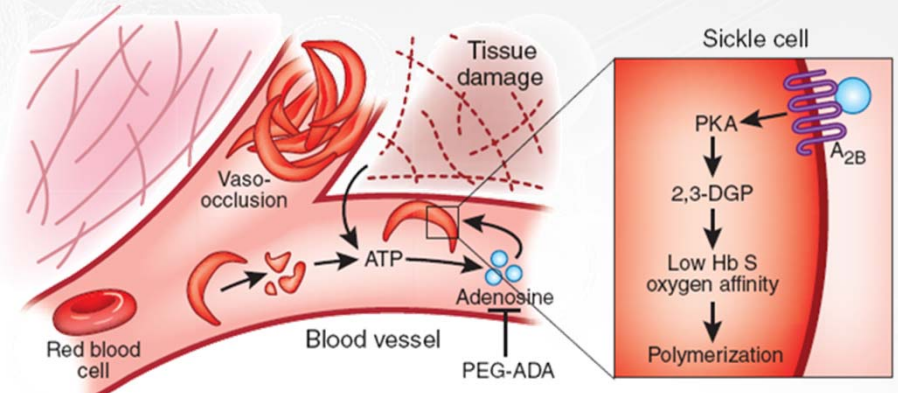
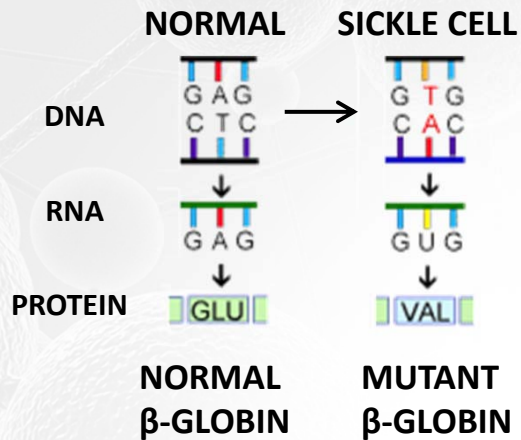


Mutant Gene Product

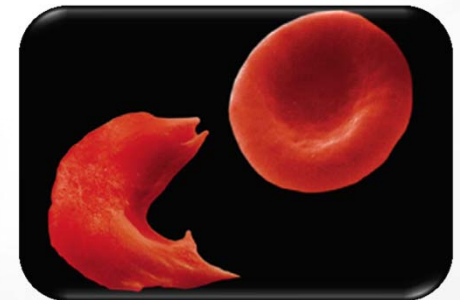
Disease Phenotype



# Global Metabolomics Re-Awakens Biochemistry



**Polymerization** →



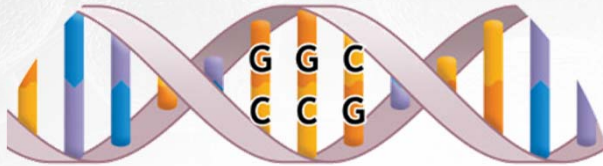
**Mutant Gene Product**

**Disease Phenotype**

Paoli et al., (1996) J. Mol. Biol. 256:775.  
 Zhang et al., (2011) Nature Medicine 17(1):79-86.

# Searching for the Basis of Phenotype with Genomics

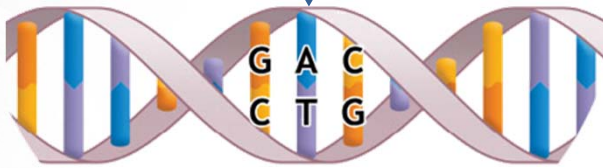
**CONTROL**  
(HEALTHY)



SNP



**CASE**  
(DISEASE)



**GWAS**



**Disease  
Phenotype**

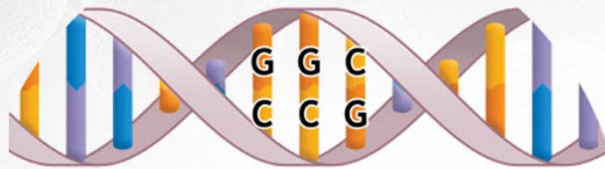
*Functional info linking  
genes to phenotype is  
often weak or absent*





# Can Metabolomics Bolster Findings in Genomics Studies?

**CONTROL**  
(HEALTHY)



SNP

**CASE**  
(DISEASE)

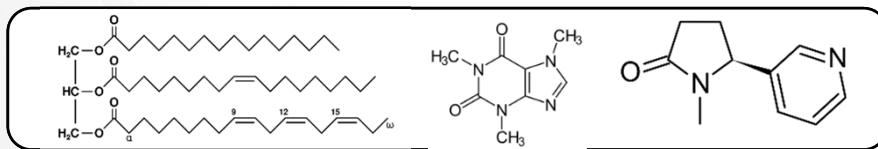


**GWAS**

*Disease  
Phenotype*

**GWAS +  
Metabolomics**

*Functional link and  
biomarkers*



# Study Design & Data Analysis Workflow

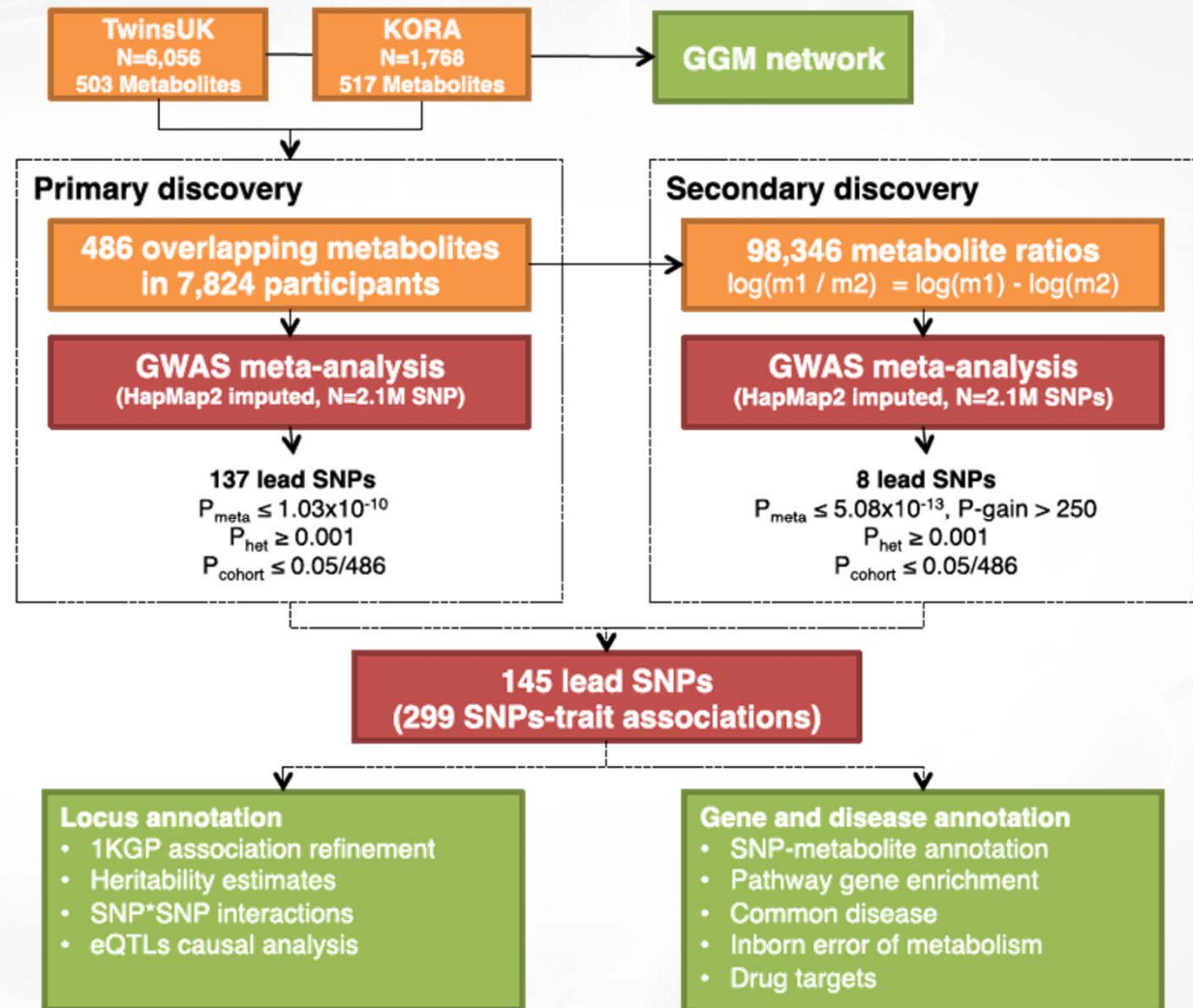
~8,000 subjects

~500 biochemicals,  
~100k traits (conc and ratios)

~2.1M genotyped SNPs

145 metabolic loci associations  
(84 novel)

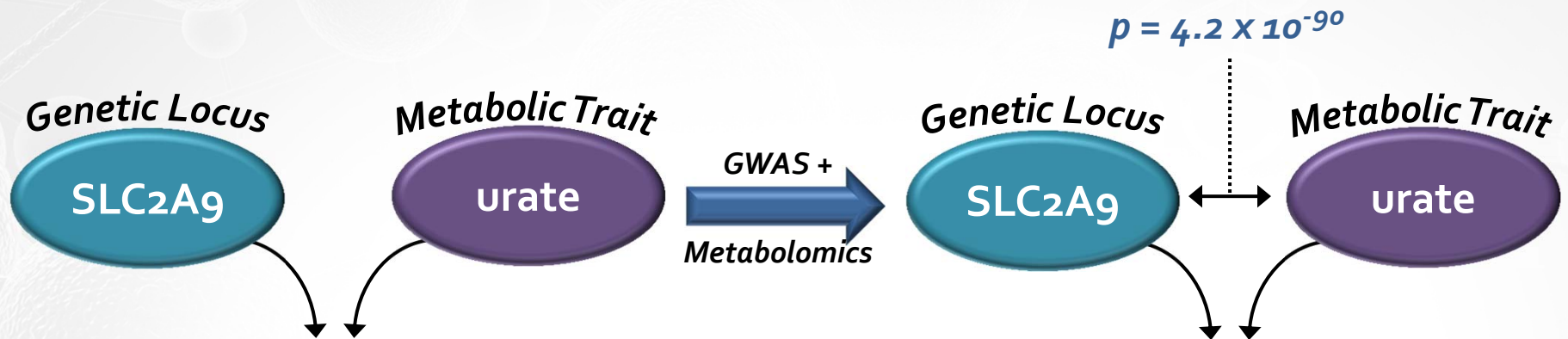
<http://gwas.eu/si>







# Metabolomics Facilitates Validation of Known Associations

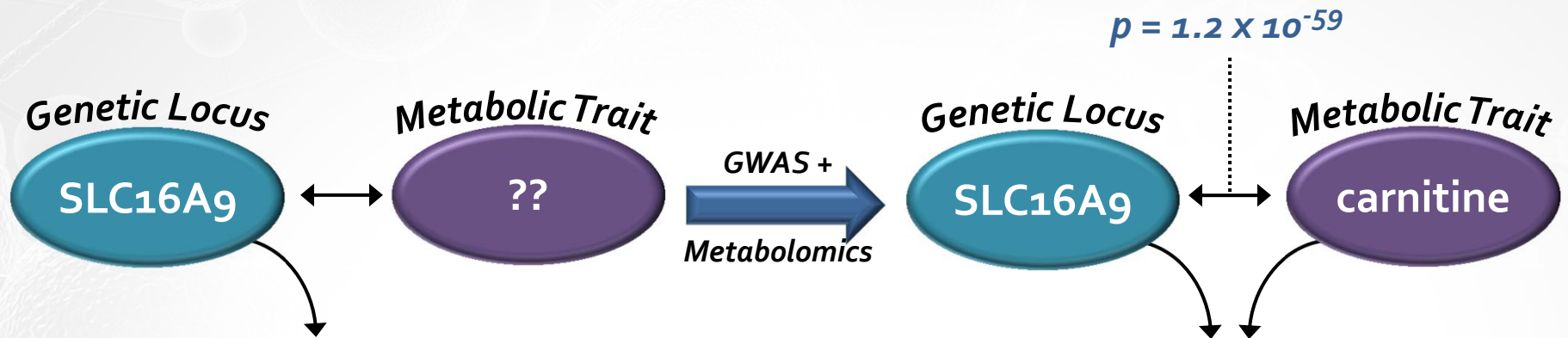


- Glucose transporter family
- Variants associated with gout (a disease of high urate)

*(Archibald Garrod's father was the first to associate high levels of uric acid with gout.)*

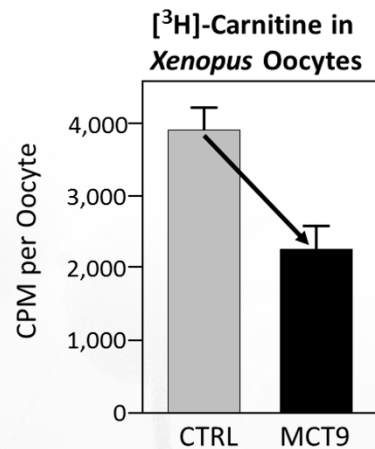
- Strong association reaffirms link
- Emphasizes importance to disease

# ...and Identification of Novel Associations



MCT9: Function?

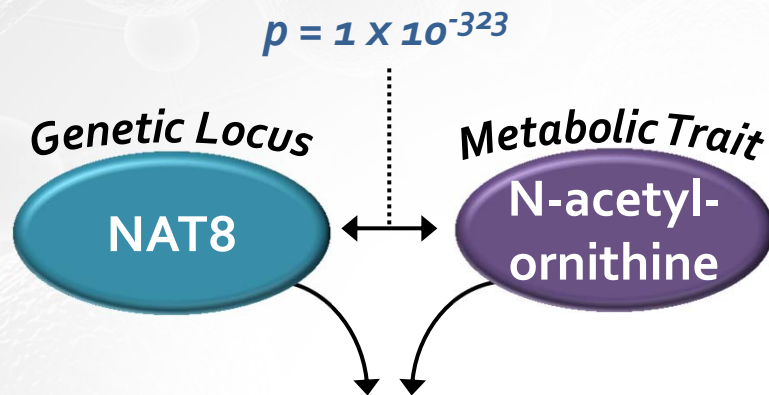
- Metabolite association suggests function as carnitine transporter



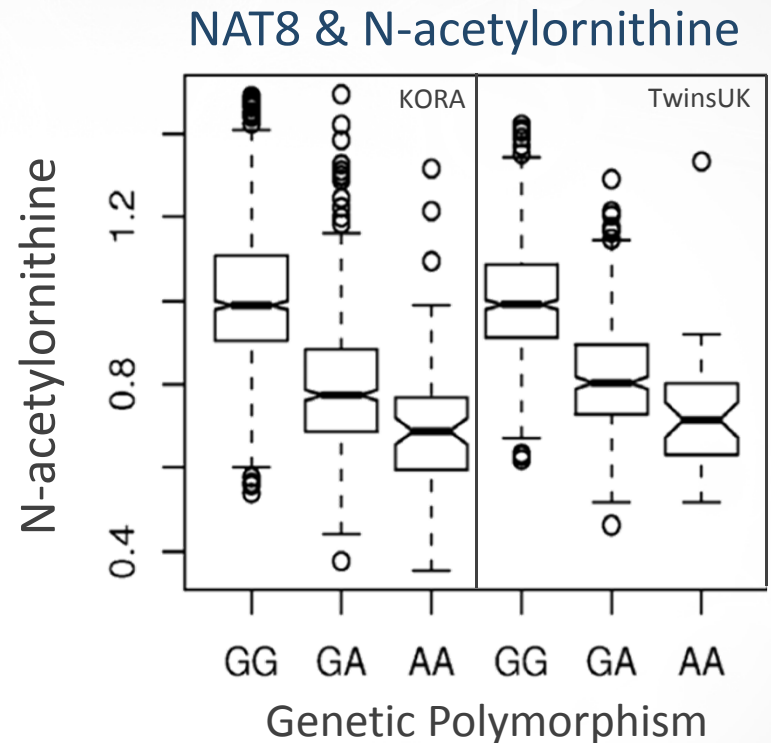
- SLC16A9/MCT9 exports labeled carnitine
- External labeled carnitine not imported (not shown)



# Metabolic Locus Linked to Kidney Disease

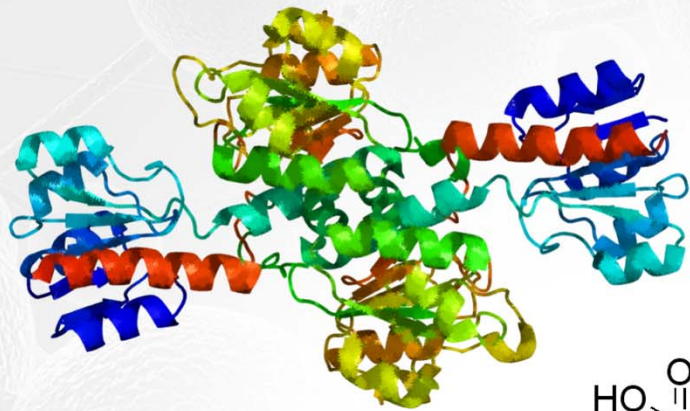


- Gene variants associated with chronic kidney disease
- Here, levels of N-acetylornithine correlated with renal function (eGFR)



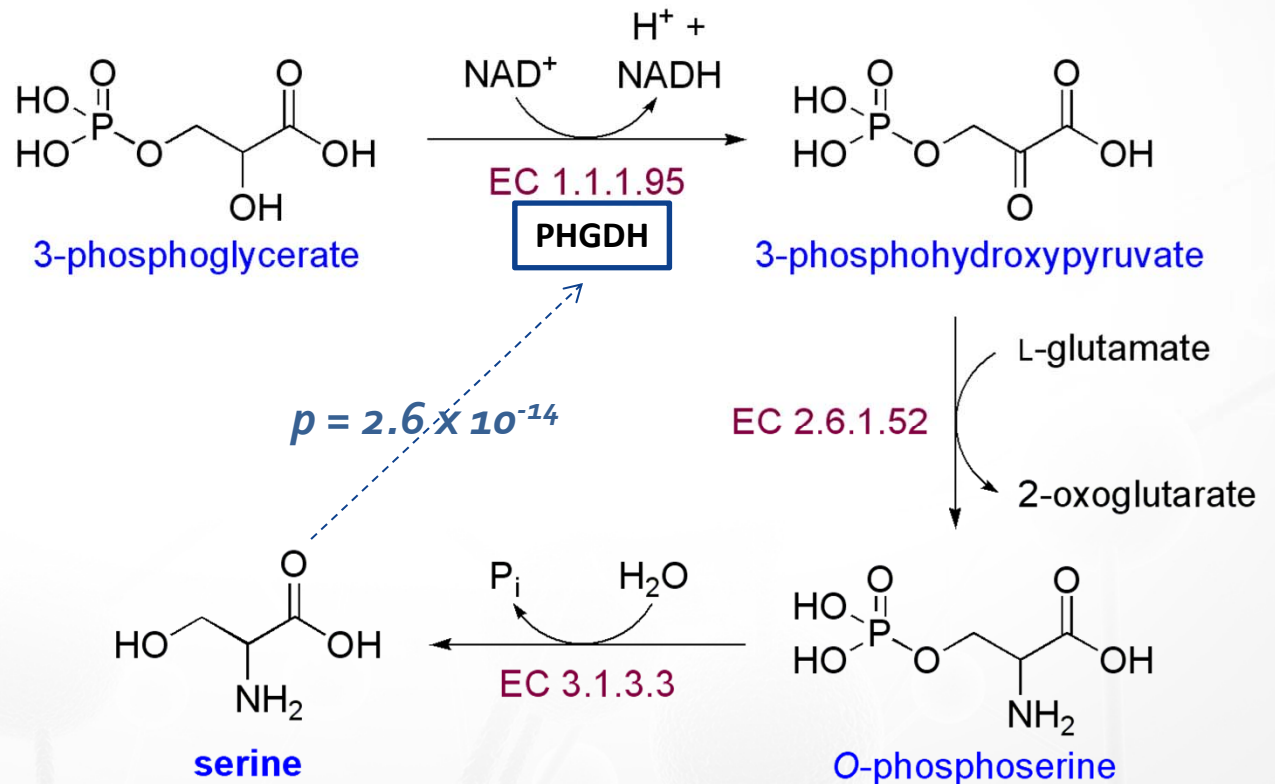
Role of N-acetylation in CKD warrants exploration.  
Serum N-acetylornithine may represent a biomarker for kidney function.

# Genetic Variant Affects Key Intermediates in Metabolic Pathways (Cancer Link)

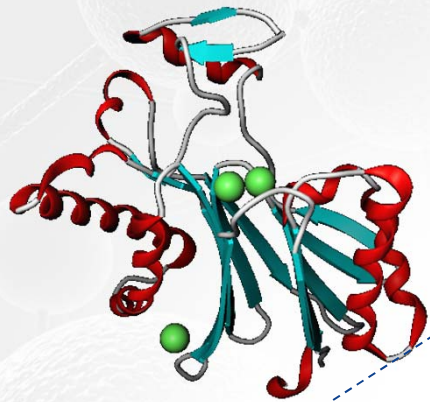


**PHGDH**

Serine biosynthesis contributes a significant amount of anaplerotic flux into the TCA cycle. Thus, PHGDH is a cancer target.



# Genetic Variant Affects Regulator of Key Enzymes, Rather than the Enzyme Itself

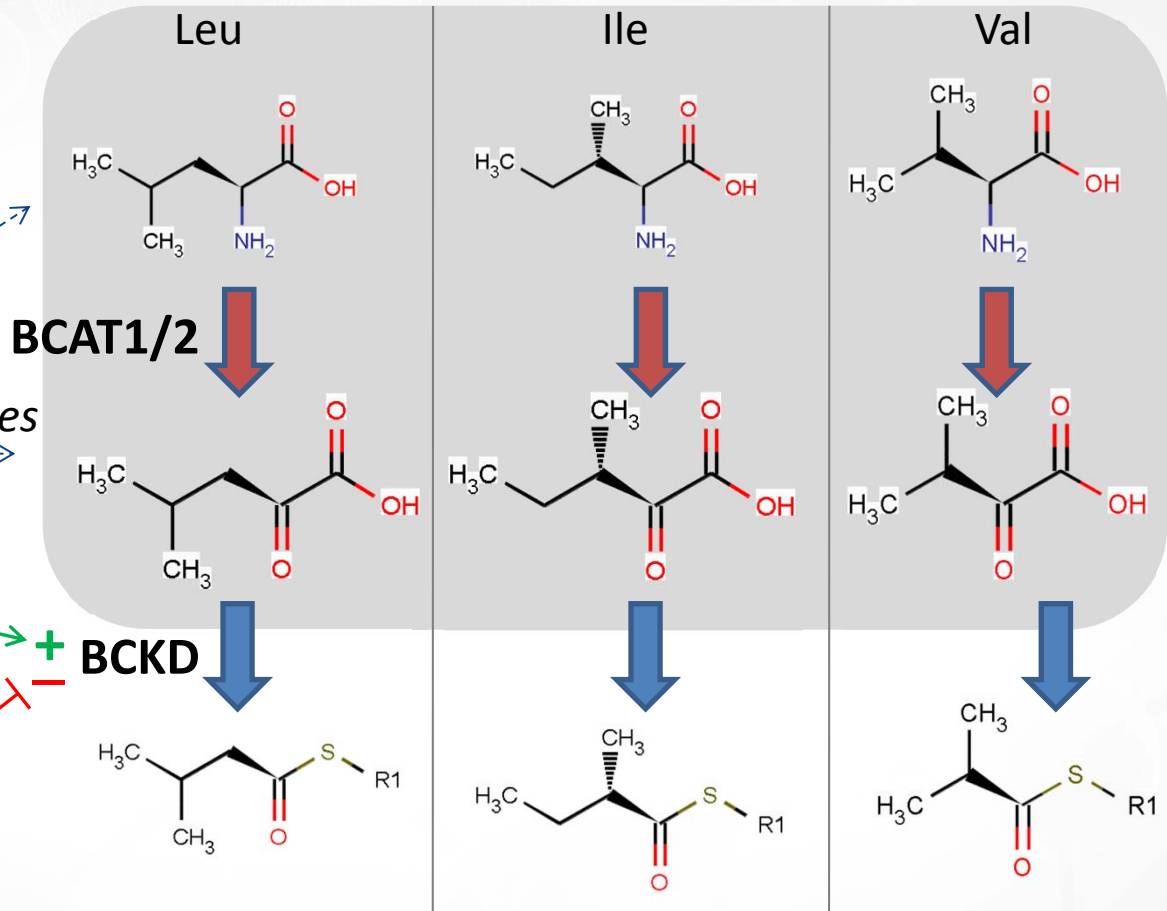


**PPM1K**

(Protein Phosphatase, Mg<sup>2+</sup>/Mn<sup>2+</sup>-dependent, 1K)

*strong p-values*

**BCKDK**

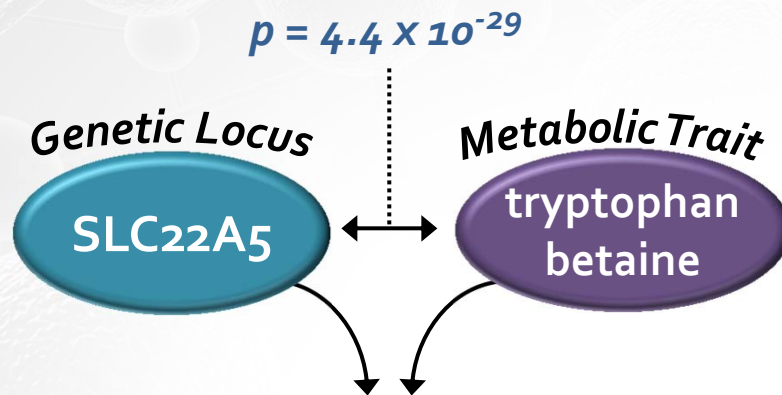


IEM: PPM1K mutations result in Maple Syrup Urine Disease, Mild Variant

Diabetes: Variants in PPM1K also associated with T2D in other GWAS.



# Metabolic Locus Linked to Crohn's Disease



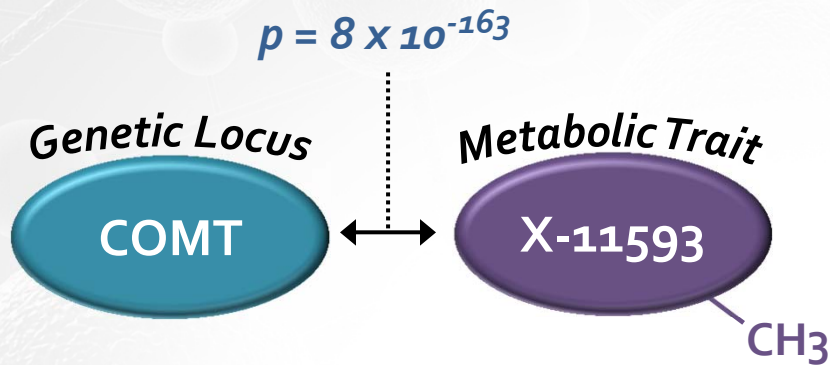
- Encodes OCTN2 (a Na<sup>+</sup>-dependent transport of carnitine into cells and removal of cationic drugs from intestine)
- Actively expressed in the intestinal epithelium, macrophages and T cells
- Trp betaine is diet-derived (legumes)



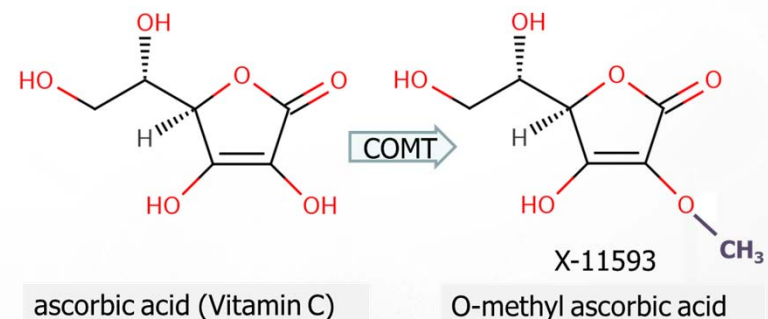
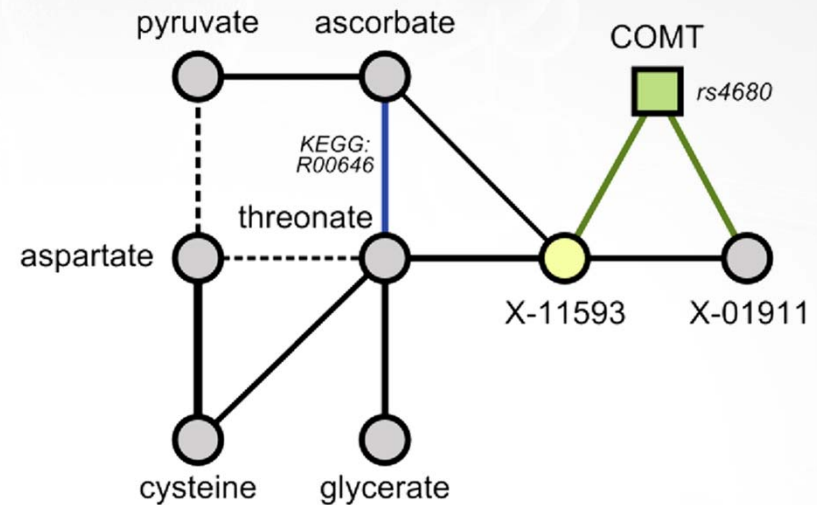
<http://healthmaven.blogspot.com>

Variants of OCTN2 are linked to inflammatory bowel diseases like CD.

# Identification of Unknown Biochemicals



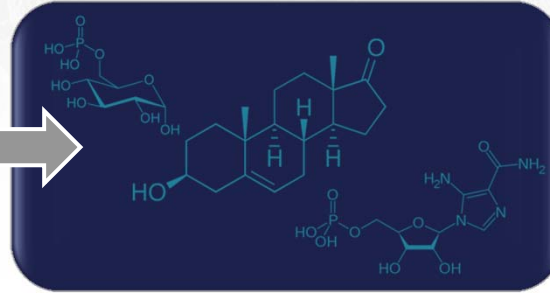
- COMT methylates catecholamine neurotransmitters (DA, Epi, NE), thereby leading to their degradation
- Strong association with a methylated unnamed metabolite



# Genomics + Metabolomics Summary



Genes (SNPs) + Environment



Metabotype



Phenotype

Metabolites are sensitive and strong links between genes and disease phenotypes.

Metabolomics facilitates discovery of biomarkers that mechanistically bridge genetics and phenotype.

Combining metabolomics with population genetics can provide new biological insights into human health and disease, therapeutic response, etc.



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# Fundamentals of Successful Study Design



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# Define a Clear Objective

**The first and most critical step in any successful scientific study is to clearly define the study's objective.**

**Are you seeking general information to help you form a hypothesis?**

**Do you have a hypothesis in mind that you wish to validate?**

**Are you hoping to discover biomarkers for a disease?**

**Do you want to understand the MOA of a potential drug candidate?**

## **The Metabolon Advantage:**

Metabolon offers every investigator study design assistance from an experienced Ph.D. scientist.



# Utilize Strong Study Design Elements

**Strong study design elements are central to uncovering biologically significant results.**

**Select the appropriate sample matrix (or combination of matrices)**

**Collect adequate exposures (dose and time of collection)**

**Employ controls for each tested variable – don't skimp!**

**Take steps to minimize excess variation – maintain consistency!**



**A Tip from Metabolon:** The more inherent variation you can control for, the fewer samples that are required for the study.



# Power Your Metabolomics Study for Success

**Strong study design can deliver biologically significant results, but a well-powered study can provide statistically significant results.**

|            | Cell Culture | Small Animals | Human Studies |
|------------|--------------|---------------|---------------|
| Optimal    | >7           | >10           | >50           |
| Rigorous   | 6-7          | 8-10          | 40-50         |
| Acceptable | 4-5          | 6-7           | 25-40         |

## Fewer Required

- Strong phenotype or treatment effect (toxicology study)
- Repeated sampling from the same subject
- Multiple time points
- Multiple doses of a drug/inhibitor

## More Required

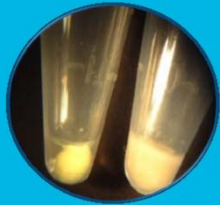
- Subtle phenotype or treatment effect (diet- or exercise-induced changes)
- Mixed populations of subjects (mixed gender, wide-ranging age or BMI)
- Multiple-site collections

# Considerations of Sample Type, Amount, & Power

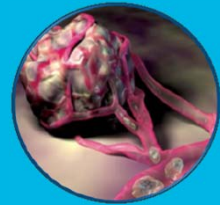
## Sample Quantities Recommended for Optimal Results:



**Biological Fluids:**  
100 ul



**Cells:**  
100 ul pellet



**Tissues:**  
100 mg

### Cell-Based Studies



|                 | t1 | t2 | t3 |
|-----------------|----|----|----|
| Vehicle Control | 5  | 5  | 5  |
| Drug Dose 1     | 5  | 5  | 5  |
| Drug Dose 2     | 5  | 5  | 5  |

### Small Animal Studies



|                | Chow | HFD |
|----------------|------|-----|
| WT             | 8    | 8   |
| KO             | 8    | 8   |
| Overexpression | 8    | 8   |

### Human Studies



|         | ♂  | ♀  |
|---------|----|----|
| Control | 30 | 30 |
| Case    | 30 | 30 |



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**Thank you!**

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Senior Director, Metabolon