

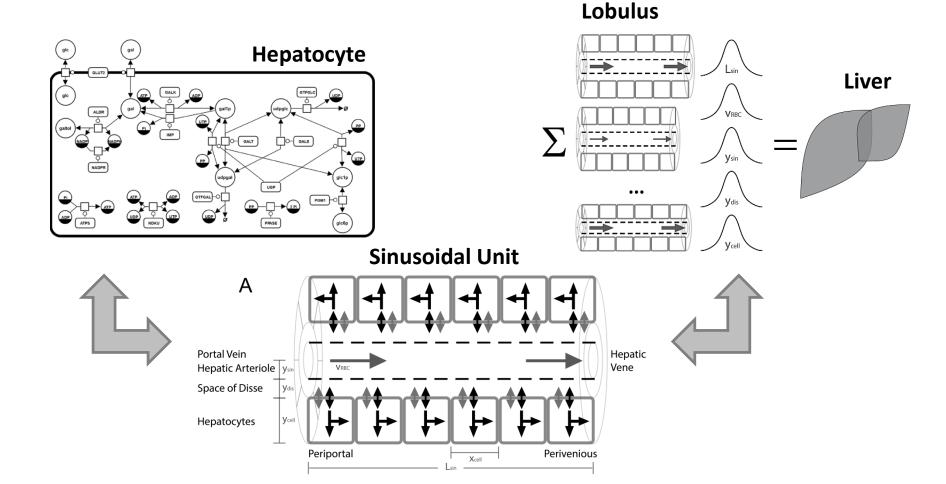






### From Hepatocytes to Whole Liver Function: A Multi-scale Model of Human Galactose Metabolism

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#### **MODEL**

#### **Kinetics for Cellular Processes**

Literature & Database research



#### **Single Cell Model**

Fitting parameters to single cell data (constraints for sinusoidal unit/liver)

**Sampling Sinusoidal** 

Representative

**Unit Architectures** 

samples

**SBML** 

# **WORKFLOW**

#### **SIMULATION**

#### **Algorithm**

- Method (ODE,
- Algorithm parameters
- SED-ML



#### **Simulation**

- **ODE System**
- C++/LSODA
- **COPASI**



#### **Timecourse Events**

Additional boundary conditions (peaks, altered parameters, metabolic effects)

SS, MCA)

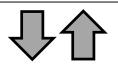
### **DATA MANAGEMENT**

#### **Database storage**

- Model, algorithm, sampling, events
- **Timecourses**
- Reproducibility

#### **Organ/Patient** constraints

Global rates (blood flow, volume, clearance rates, dilution curves)



### **POSTPROCESSING ANALYSIS VISUALIZATION**

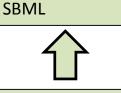
#### Integration

Scaling to whole liver

Visualization





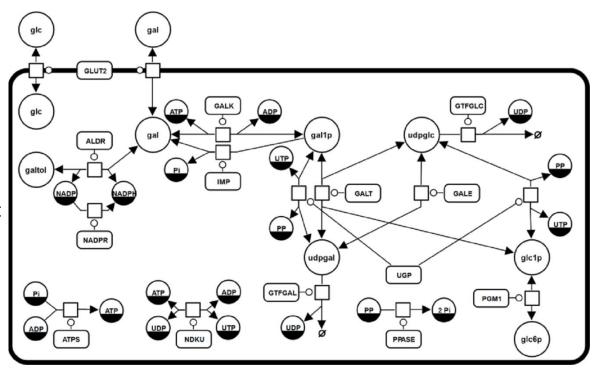


#### **Parameter Distributions**

- Literature research
- Fit to data

# CELLULAR GALACTOSE METABOLISM

- liver most important organ for whole-body metabolism and clearance of galactose (>95%)
- Galactose elimination capacity
   (GEC) measurement for functional liver cell mass
- Galactose clearance altered in most liver diseases (metabolic & structural)
  - Galactosemias
  - Cirrhosis
  - Hepatitis
  - Partial hepatectomy & regeneration
  - Aging
  - ..



#### **Detailed kinetic model**

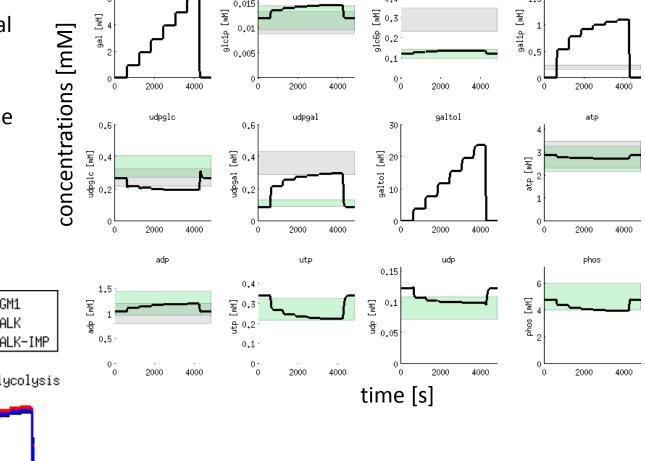
- ODEs for all processes involved in galactose metabolism
- SBML

# HEPATOCYTE MODEL

gal [mM]

### **Reproduces**

- concentrations normal state & in galactose challenge
- saturation of galactose clearance
- effects of galactosemias



glc1p

0.015

glc6p

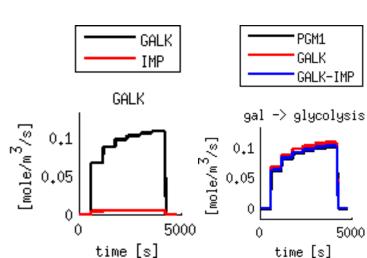
0.4

፱ 0₊3

90 0.2 16

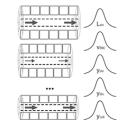
gal1p

1.5

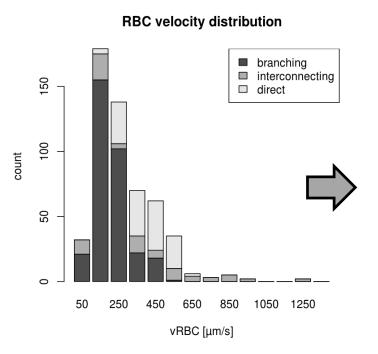


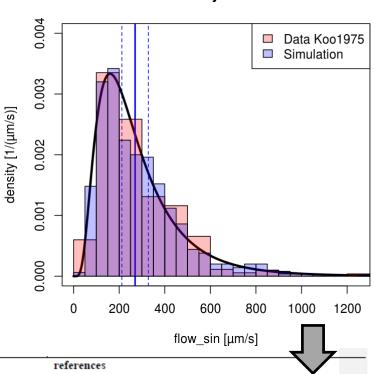
# TISSUE DISTRIBUTIONS

Fitting distribution of tissue parameters
 via maximum-likelihood methods



#### **RBC** velocity distribution

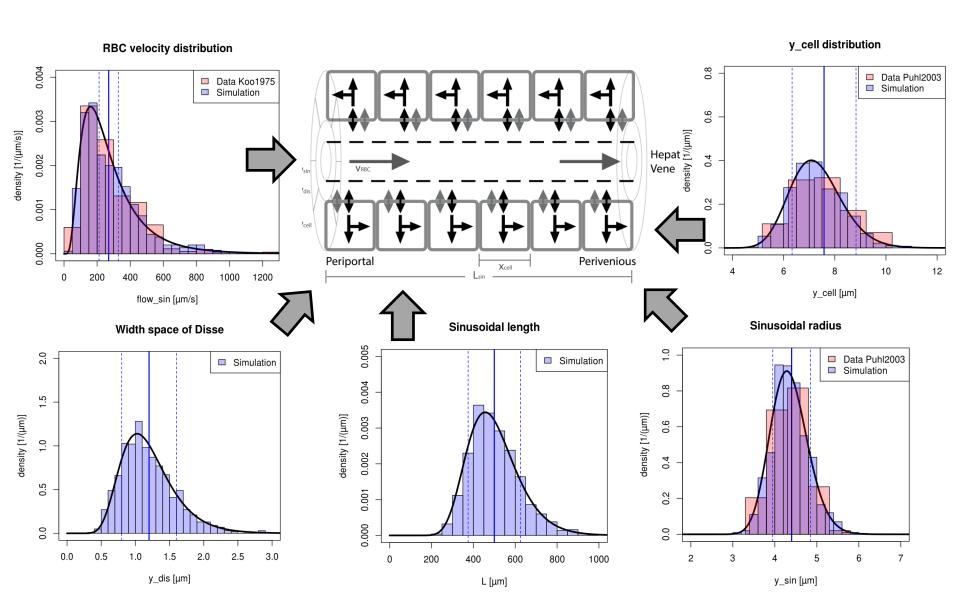




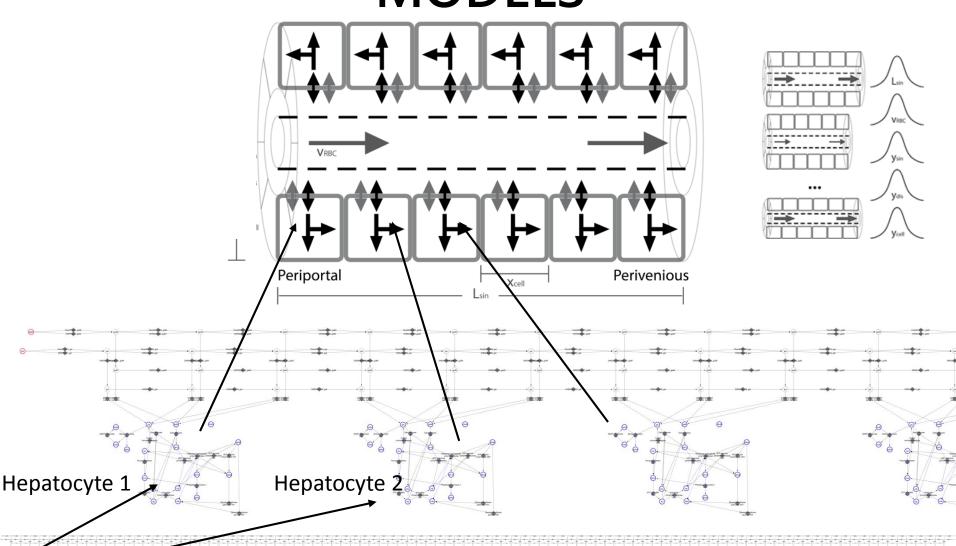
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Parameter		meanlog	stdlog	mean μ (reported)	standard deviation (reported)	SD	references
Sinusoidal length	$L_{ m sin}$	6.184	0.2462	500μm	125μm		based on distance between central veins 809±199µm (SD, n=79, young rat, SEM of corrosion cast) (Warren, et al., 2008) scaled to human sinusoidal length
Sinusoidal radius	$\mathcal{Y}_{\sin}$	1.465 (±0.010)	0.1017 (±0.0073)	4.4µm	0.45µm		Based on distribution of sinusoidal diameter 8.8±0.9μm (SD, n=440 in N=11 human, OPS) (Puhl, et al., 2003)
Width of Disse space	$y_{dis}$	0.1296	0.3246	1.2µm	0.4µm		0.4-1.5μm (human, SEM, estimated from imaged) (Muto, et al., 1977) 0.5-1.2μm (human, SEM, estimated from image) (Burwen, et al., 1982)
Hepatocyte sheet thickness	$y_{cell}$	1.977 (±0.014)	0.1390 (±0.0099)	7.58µm	1.25μm		7.58µm Calculated from functional sinusoidal density FSD FSD 391±30 [1/cm] (SD, n=88, human, OPS) (Puhl, et al., 2003)

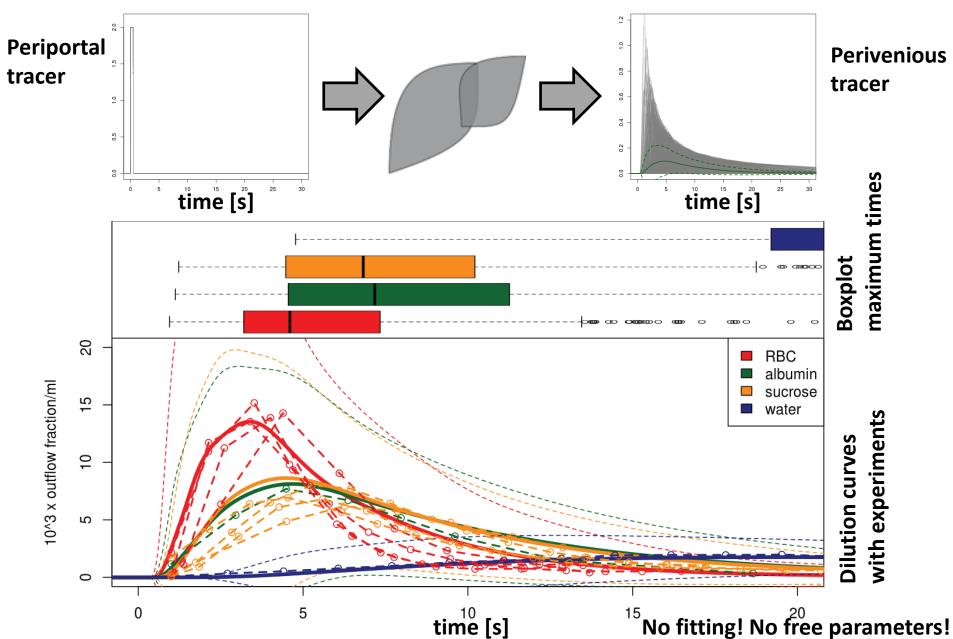
# TISSUE-SCALE SINUSOIDAL UNIT

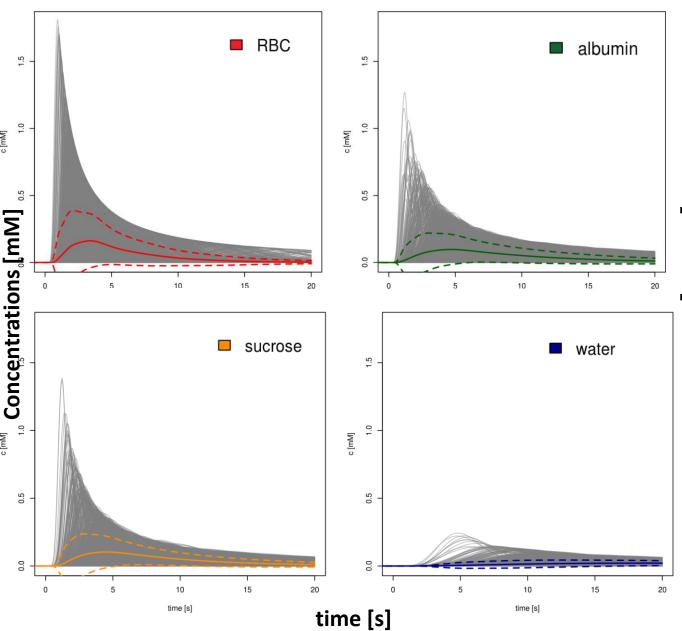


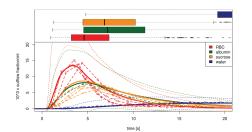
# MULTITUDE OF LARGE-SCALE ODE MODELS



# MULTIPLE INDICATOR DILUTION







### Extreme heterogeneity (!)

 Local blood flow & tissue architecture

### Strong effects on

- Drug clearance
- Metabolic function
- Signalling
- ١ ...

# GALACTOSE ELIMINATION (GE)

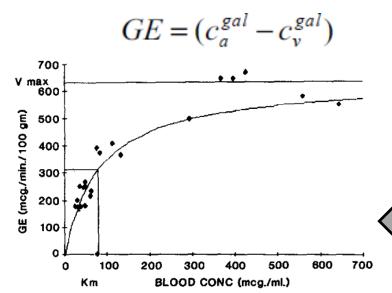
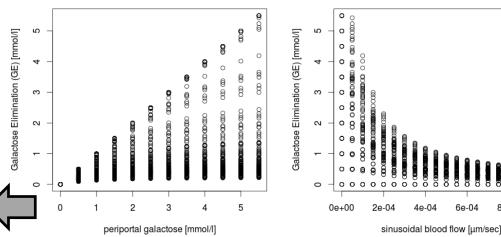
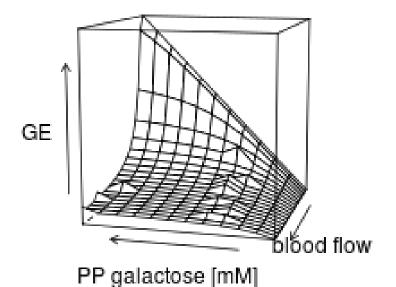


FIG. 1. Galactose elimination kinetics. Points represent individual animals. Superimposed line as determined by the Michaelis-Menten equation using the elimination constants,  $V_{\text{max}}$  and  $K_m$ , from Fig. 2.





# EXTRACTION (ER) & CLEARANCE (CL)

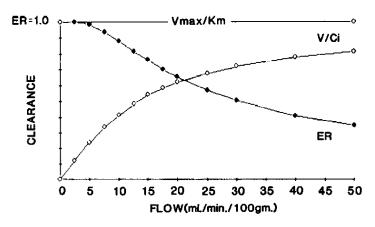
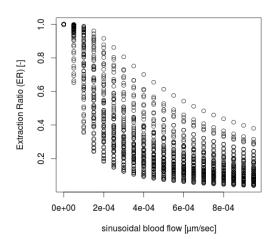
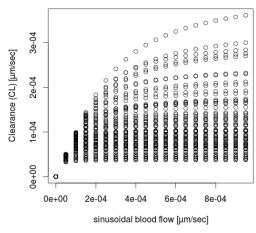
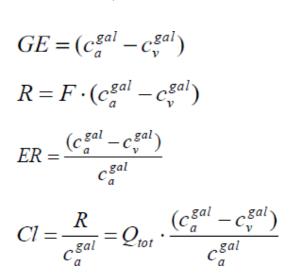
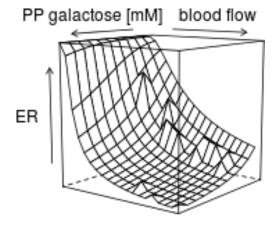


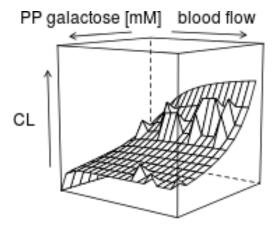
FIG. 6. Clearance and extraction ratio vs flow. Extraction ratio decreases as flow increases. Clearance increases with flow to a maximum of  $V_{\rm max}/K_m$ .











# **CURRENT WORK**

- Predict alterations
  - GEC in aging
  - Cirrhosis
- Analyse galactosemias
- Use spatially resolved PET data (individual subjects)
  - Normal
  - cirrhosis

FIGURE 1. Transaxial (A) and coronal (B) <sup>18</sup>F-FDGal PET/CT images of mean tissue radioactivity concentration (kBq/mL liver tissue) from PET study without galactose infusion (subject 6). The position of the liver vein catheter inserted via the right femoral vein is seen. Note that the tracer accumulates specifically in liver tissue.

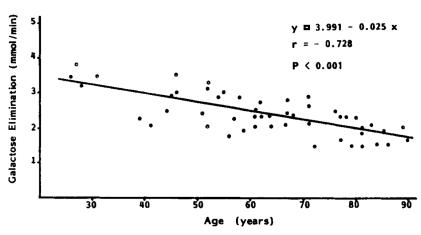
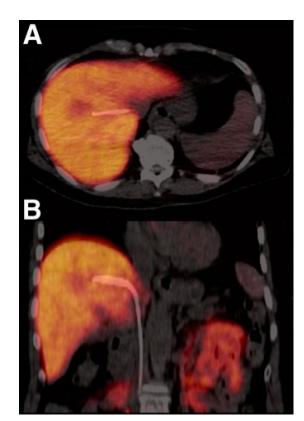


FIG. 1. Correlation between age and galactose elimination capacity in subjects of different age groups.



### WHAT I LEARNED ... SO FAR

- Multiscale requires data management
  - only reproducible results are results
  - Database layer decouples simulation & analysis
  - Structured/standard formats function as model unit tests
- Multiscale relies on units
  - a model without units is no model (what is the meaning of parameters and componets?)
  - automatic unit checks as model unit tests
  - Units do the modelling for you (tell you how the system produces the quantity)
- Multiscale is difficult & more easy
  - Hierarchical constraints fix parameters
  - Every scale provides a new set of experimental data
- Multiscale-errors (!)
  - The more scales the more obscure the errors
  - Visualize everything

# **ACKNOWLEDGEMENTS**

### Concept & Modeling

Prof. Holzhütter

### Experimental Partners

- Prof. Tygstrup
- Prof. Marchesini

### SBML & SED-ML

 Frank Bergmann, Lucian Smith, Mike Hucka, Sarah Keating

### SABIO-RK & data management

- Martin Golibiewski
- Wolfgang Müller
- Renate Wittig

### Funding

- Charité
- Virtual Liver Network











### **PROCESSES**

### SBML Model



http://seek.virtuelle-leber.de/models/138

- Annotations
  - CHEBI, UniProt, KEGG, RHEA
  - kinetic parameters linked to SABIO-RK

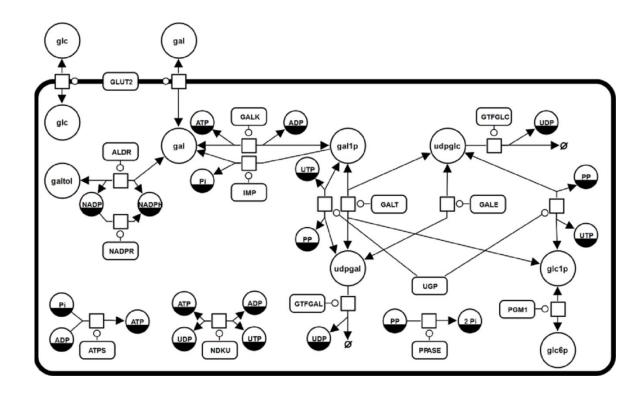
#### Galactokinase

$$V_{\max}^{GALK} = S_f \cdot PA^{GALK} \cdot k_{cat}^{GALK}$$
 
$$v^{GALK} = \frac{V_{\max}^{GALK}}{k_{gal}^{GALK}k_{alp}^{GALK}} \cdot \frac{[gal] [atp] - [gal] [adp]}{k_{eq}^{GALK}} \cdot \frac{[gal] [atp] - [gal] [adp]}{k_{eq}^{GALK}} \cdot \frac{[gal] [atp] - [gal] [adp]}{k_{gal}^{GALK}} \cdot \frac{[gal] [atp] - [gal] [adp]}{k_{eq}^{GALK}} \cdot \frac{[adp]}{k_{gal}^{GALK}} \cdot \frac{[adp]}{k_{gal}^{GALK$$



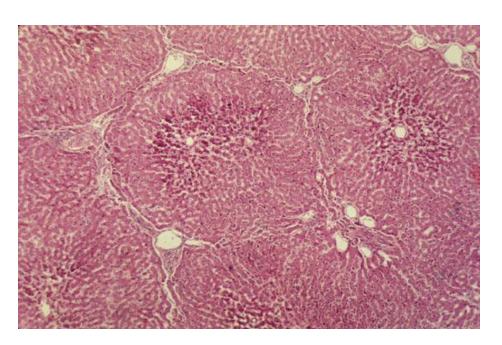
Kinetic data	Reaction	Enzyme			Tissue	Organism	Parameter (besides	Environment		Add to export
		ECNumber	Protein	Variant	IBSUE		concentration)	°C	рН	cart?
•	D-Galactose + ATP = ADP + alpha- D-Galactose 1-phosphate		P51570 기	wildtype	-	Homo saniens	Kcat Kcat/Km Km	37.0	8.0	
	Entry ID: 14785									

Parameter									
name	type	species	start val.	end val.	deviat.	unit	comment		
E	concentration ㅋ	Enzyme	32.0	67.0	-	nM	-		
Α	concentration ㅋ	D-Galactose	0.0	2000.0	-	μМ	-		
kcat	kcat 기	-	8.7	-	5	s^(-1)	-		
kcat_Km	kcat/Km 기	D-Galactose	8900.0	-	2900	M^(-1)*s^(-1)	-		
Km	<u>Km</u> 키	D-Galactose	970.0	-	220	μМ	-		



Reactions: (ALDR) Aldose reductase (galactitol NAD 1-oxidoreductase); (ATPS) ATP synthesis; (GALDH) Galactose 1-dehydrogenase; (GALE) UDP-glucose 4-epimerase; (GALK) Galactokinase; (GALT) Galactose-1-phosphate uridyl transferase; (GLUT2) Facilitated glucose transporter member 2; (GTFGAL) Glycosyltransferase galactose; (GTFGLC) Glycosyltransferase glucose; (NADPR) NADP reductase; (NDKU) Nucleoside diphosphokinase, ATP:UDP phosphotransferase; (IMP) Inositol monophosphatase; (PGM1) Phosphoglucomutase-1; (PPASE) Pyrophosphatase; (UGALP) UDP-galactose pyrophosphorylase; (UGP) UDP-glucose pyrophosphorylase;

Metabolites: (adp) ADP; (atp) ATP; (gal) D-galactose; (gal1p) D-galactose 1-phosphate; (galnat) D-galactonate; (galtol) D-galactitol; (glc) D-glucose; (glc1p) D-glucose 1-phosphate; (glc6p) D-glucose 6-phosphate; (nadp) NADP; (nadph) NADPH; (pi) phosphate; (pp) pyrophosphate; (udp) UDP; (udpgal) UDP-D-galactose; (udpglc) UDP-D-glucose; (utp) UTP;



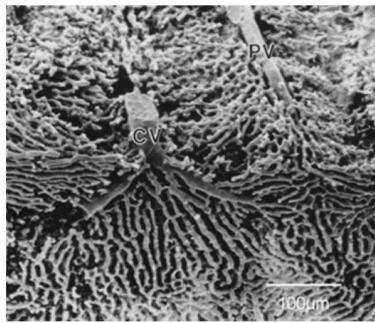


Fig. 2. Vascular cast of the hepatic microvasculature illustrating the tortuous, anastomotic sinusoids adjacent to the portal venule (PV) and the more parallel and larger sinusoids near the central venule (CV) (McCuskey, 1993).

# **SINUSOID**

- principal vessels for exchange between blood and hepatocytes
- ~ 6-8μm diameter
- periportal sinusoids are narrower and more tortuous than the wider and straighter central ones
- Sinusoid network is heterogeneous
  - near portal vene arranged as interconnecting polygonal networks
  - farther away from portal vein organized as parallel vessels terminating in the central vein
  - short intersinusoidal sinusoids connect adjacent parallel sinusoids

Scanning electron micrograph showing fenestrated sinusoids and hepatocytes in a mouse liver.

http://www.easloffice.eu/jhep/contest/website/see\_photos.html



Table 1. Comparison of Measurements on Sinusoids and Blood Cells in Microns ± S.E.

	In vivo/LM°	In plastic/LM	After CPD/SEM
Portal sinusoid	$5.9 \pm 0.17$ (n = 545, 6 rats)	$6.42 \pm 0.12$ (n = 696, 2 rats)	$4.09 \pm 0.06$ (n = 1, 452, 10 rats)
Central sinusoid	$7.1 \pm 0.29$ (n = 498, 6 rats)	$7.62 \pm ND^b$ (n = 696, 2 rats)	$5.67 \pm ND$ (n = 1, 452, 10 rats)

Scanning electron microscope observations on the structure of portal veins, sinusoids and central veins in rat liver. Wisse, E.; De Zanger, R. B.; Jacobs, R. & McCuskey, R. S.; Scan Electron Microsc, 1983, 1441-1452

The liver sieve: considerations concerning the structure and function of endothelial fenestrae, the sinusoidal wall and the space of Disse. Wisse, E.; De Zanger, R. B.; Charels, K.; Van Der Smissen, P. & McCuskey, R. S. Hepatology, 1985, 5, 683-692

# **BLOOD FLOW**

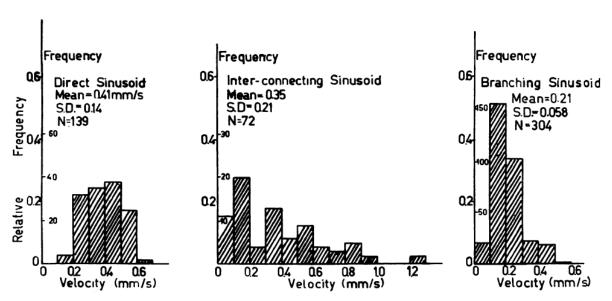
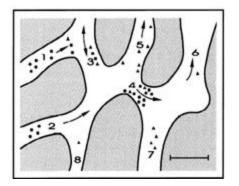


Fig. 1. Frequency distribution of the velocity of the erythrocytes in the direct sinusoids, the branching sinusoids and the interconnecting sinusoids.



The terminal hepatic microcirculation in the rat.

Koo, A.; Liang, I. Y. & Cheng, K. K.; *Q J Exp Physiol Cogn Med Sci,* **1975**, *60*, 261-266 Intermittence of blood flow in liver sinusoids, studied by high-resolution in vivo microscopy. MacPhee, P. J.; Schmidt, E. E. & Groom, A. C.; **1995**, *269*, G692-G698

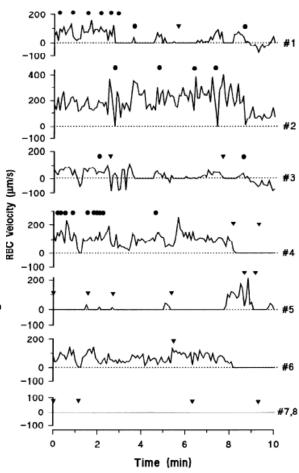


Fig. 3. Temporal overview of RBC velocity fluctuations over a 10-min period, in sinusoidal network from zone 1 of mouse liver (shown in Fig. 2). Measurements in each sinusoid were made every 5 s. Changes of flow in one sinusoid often produced changes in others. Instants are indicated at which a migrating Kupffer cell obstructed flow ( $\blacktriangledown$ ) or a circulating leukocyte slowed or stopped temporarily ( $\blacktriangledown$ ). Sinusoids 7 and 8 had no flow throughout the 10-min period. Kupffer cells are seen in sinusoid 7, and in sinusoid 8 one Kupffer cell blocked flow throughout.

# **GALACTOSEMIAS**

- caused by deficiencies in either GALK, GALT or GALE
- untreated as well as treated patients with galactosemia show accumulation and/or depletion of specific metabolites, and often abnormalities of glycosylation

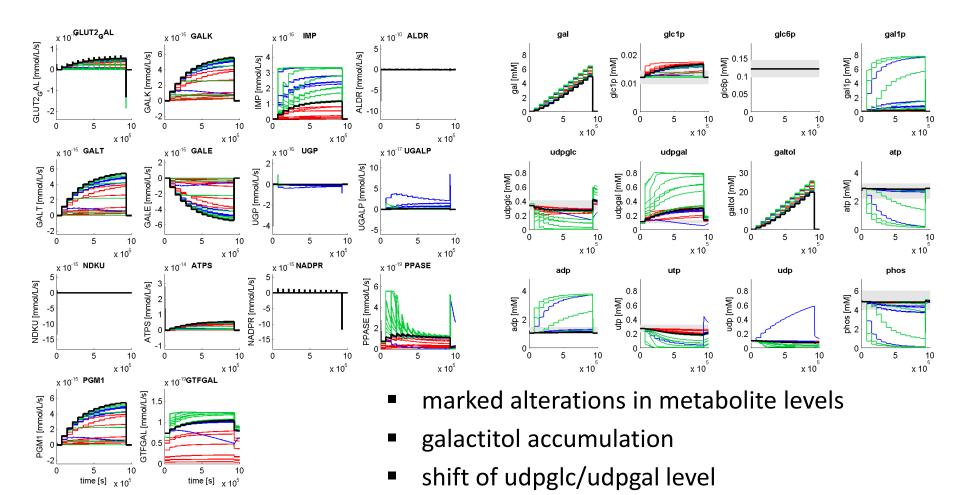
### implementation

 via measured alterations in kinetic properties in human protein mutations

Table 4 - Kinetic parameters in GALK, GALT and GALE deficiencies.

	Enzyme	Variant	k <sub>cat</sub> [1/s] (%wt)	K <sub>m</sub> (gal) [mM] (%wt)	K <sub>m</sub> (atp) [mM] (%wt)	Reference
	GALK	Wild 8.7±0.5 (100)		0.97±0.22 (100)	0.034±0.004 (100)	[51]
		Type				
1	GALK	H44Y	$2.0\pm0.1$ (23)	7.70±4.40 (794)	0.130±0.009 (382)	[51]
2	GALK	R68C	3.9±0.8 (45)	0.43±0.15 (44)	0.110±0.035 (324)	[51]
3	GALK	A198V	5.9±0.1 (68)	$0.66\pm0.22$ (68)	0.026±0.001 (76)	[51]
4	GALK	G346S	0.4±0.04 (5)	1.10±0.16 (113)	0.005±0.002 (15)	[51]
5	GALK	G347S	1.1±0.2 (13)	13.0±2.0 (1340)	0.089±0.034 (262)	[51]
6	GALK	G349S	1.8±0.1 (21)	1.70±0.48 (175)	0.039±0.004 (115)	[51]
7	GALK	E43A	6.7±0.02 (77)	1.90±0.50 (196)	0.035±0.0003 (103)	[100]
8	GALK	E43G	$0.9\pm0.02(10)$	0.14±0.01 (14)	0.0039±0.0006 (11)	[100]
	Enzyme	Variant	V <sub>max</sub> [nmol/mg/s] (% wt)	K <sub>m</sub> (gal1p) [mM] (%wt)	K <sub>m</sub> (udpglc) [mM] (%wt)	Reference
	GALT	Wild	804±65 (100)	1.25±0.36 (100)	0.43±0.09 (100)	[22]
		Type				
9	GALT	R201C	396±59 (49)	1.89±0.62 (151)	0.58±0.13 (135)	[22]
10	GALT	E220K	253±53 (31)	2.34±0.42 (187)	0.69±0.16 (160)	[22]
11	GALT	R223S	297±25 (37)	1.12±0.31 (90)	0.76±0.09 (177)	[22]
12	GALT	I278N	45±3 (6)	1.98±0.35 (158)	1.23±0.28 (286)	[22]
13	GALT	L289F	306±23 (38)	2.14±0.21 (171)	0.48±0.13 (112)	[22]
14	GALT	E291V	385±18 (48)	2.68±0.16 (214)	0.95±0.43 (221)	[22]
	Enzyme	Variant	k <sub>cat</sub> [1/s] (%wt)	K <sub>m</sub> (udpglc) [mM] (%wt)		Reference
	GALE	Wild	36±1.4 (100)	0.069±0.012 (100)		[59]
		Type				
15	GALE	N34S	32±1.3 (89)	0.082±0.015 (119)		[59]
16	<b>GALE</b>	G90E	$0.046\pm0.0028$ (0)	0.093±0.024 (135)		[59]
17	GALE	V94M	1.1±0.088 (3)	0.160±0.038 (232)		[59]
18	<b>GALE</b>	D103G	5.0±0.23 (14)	0.140±0.021 (203)		[59]
19	<b>GALE</b>	L183P	11±1.2 (31)	$0.097\pm0.040$ (141)		[59]
20	<b>GALE</b>	K257R	5.1±0.29 (14)	0.066±0.015 (96)		[59]
21	<b>GALE</b>	L313M	5.8±0.36 (16)	0.035±0.011 (51)		[59]
22	<b>GALE</b>	G319E	30±1.3 (83)	0.078±0.013 (113)		[59]
23	GALE	R335H	15±0.48 (42)	$0.099\pm0.012$ (143)		[59]

# GALACTOSEMIA (GALK, GALT, GALE)



reduced galactose clearance

energetically challenged