

# Comparison of approaches for retention prediction Useful in LC-HRMS Nontarget-Screening

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# All candidate structures

#### **Candidate selection**

LC retention

Compare

MS/MS fragmentation observations on unknown peaks & predictions for candidates LC retention prediction

Fragmentation prediction

One for a few for confirmation



Retention time = f (eluent properties (composition, gradient, pH, I), **molecular structure**, stationary phase chemistry, temperature)

#### If we use always the same system, eluent, column:

Retention time = f (molecular structure)

Build a QSRR model!

Many different approaches in the literature

Héberger, 2007, J. Chromatogr. A 1158, 273. (Review)

**Retention prediction models: conceptual view** 



# High accuracy

# "Small domain" models

Alkylic acids RT = f (chain length)

Single parameter

100s of pharmaceuticals  $RT = f (log K_{OW})$ 

Alkylic acids RT = f (chain length, branching, topology...)

#### **Poly-parameter**

100s of pharmaceuticals RT = f (phys.-chem., topological descriptors, ...)

Lower accuracy

# "Large domain" models

**Better accuracy?** 



# "Is my unknown at 12.3 min your unknown at 18.6 min?"

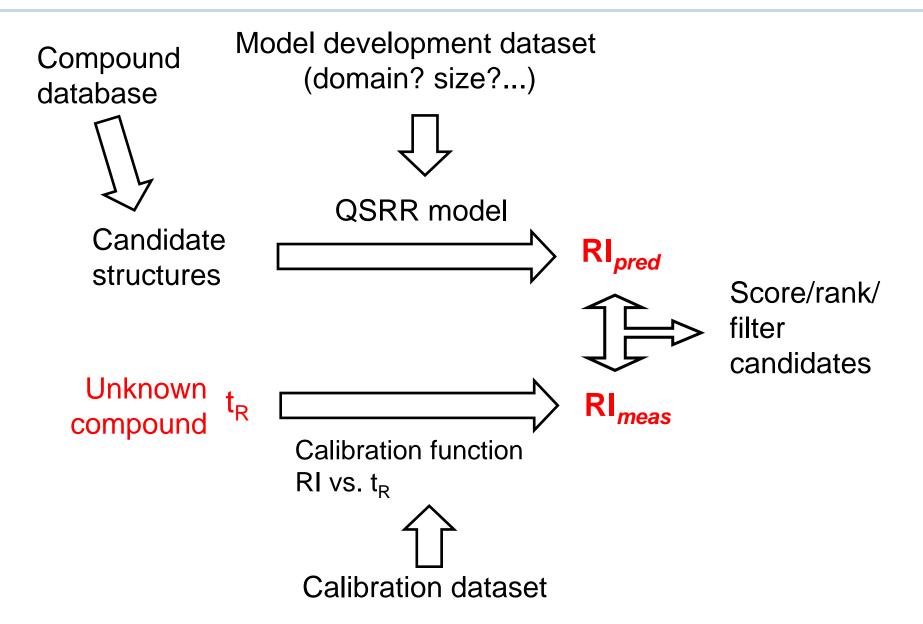
- Comparison among different LC methods, working groups
- Storage in shared databases
- Consistency/validation of LC methods over years

# $\Rightarrow$ Normalizing or indexing retention times RI

GC(-MS) (Kovats') Retention Index: simple & quite accurate! LC(-MS): ???

## **Using retention prediction in practice**







#### **Chromatographic Hydrophobicity Index (CHI)**

Linear Solvation Energy Relationship ("Abraham equation") Dept. Effect-Directed Analysis, UFZ

> Ulrich et al. (2011) J. Chromatogr. A 1218, 8192. based on Valko et al. (1997) Anal. Chem. 69, 2022

#### **Retention time index (RTI)**

Based on similarity of C18 retention and octanol-water partitioning Thomas Letzel & coworkers, TU München

#### Nitroalkane retention index (NARI)

RI on homologue series of n-nitroalkanes Grant Lab, Univ. of Connecticut Hall et al., (2013) J. Chem. Inf. Model 52, 1222 Implemented in MolFind software, Menikarachchi et al., (2013) Anal. Chem. 84, 9388. **CHI: Retention prediction by LSER** 



# CHI = aA + bB + sS + eE + vV + c

Substance descriptors

Regression coefficients (system descriptors)

CHI  $\approx$  Percentage of organic modifier required to elute the analyte in a linear gradient (Valko et al., 1997, Anal. Chem. 69, 2022.

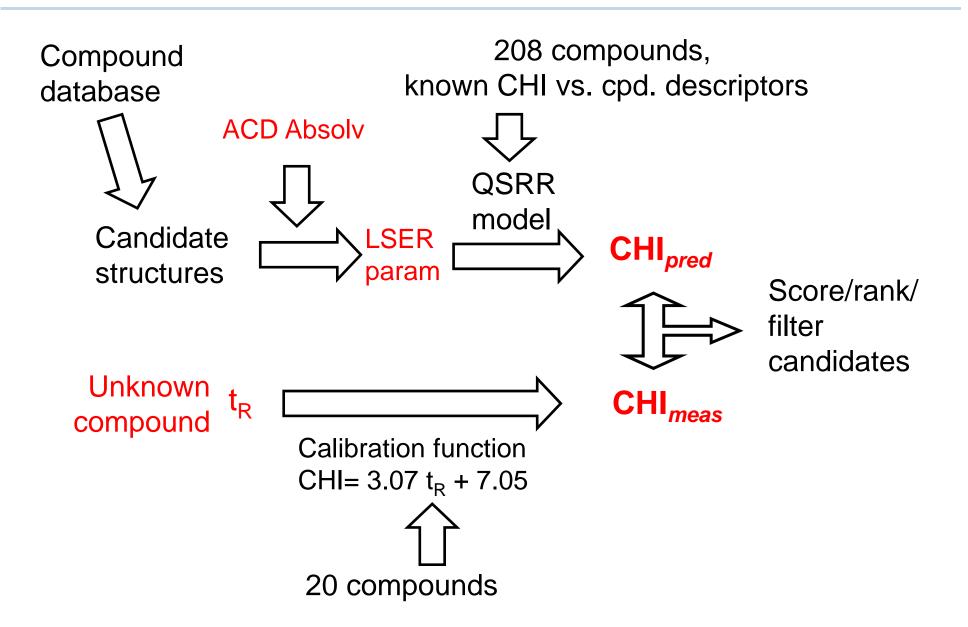
CHI is (nearly) independent from gradient setup and column dimensions, but different for ACN and MeOH

CHI is very similar for different (endcapped) C18 columns

Model does not account for ionic interactions and intramolecular H bonding

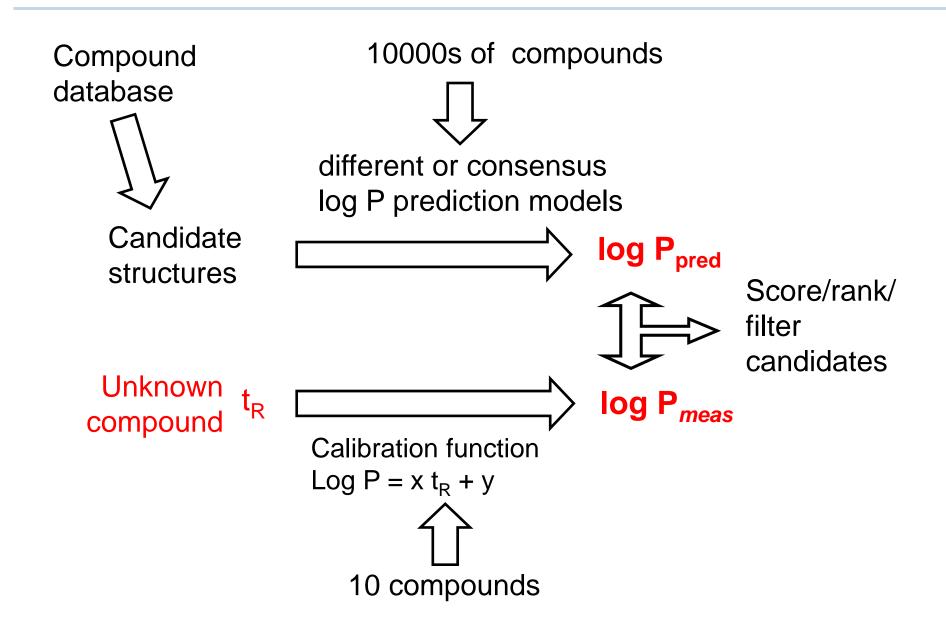
# **CHI: Retention prediction by LSER**





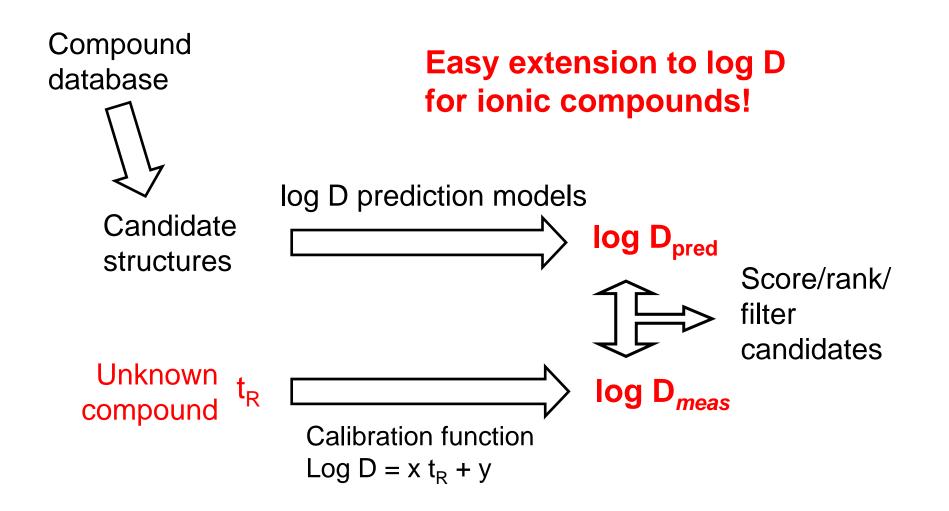
#### **RTI: The beauty of simplicity**





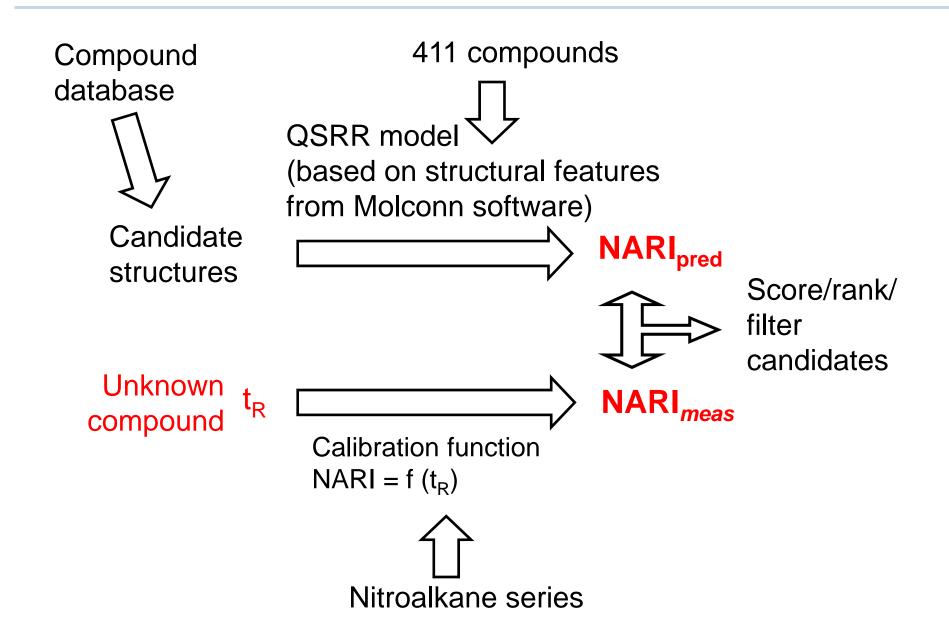
**RTI: The beauty of simplicity** 



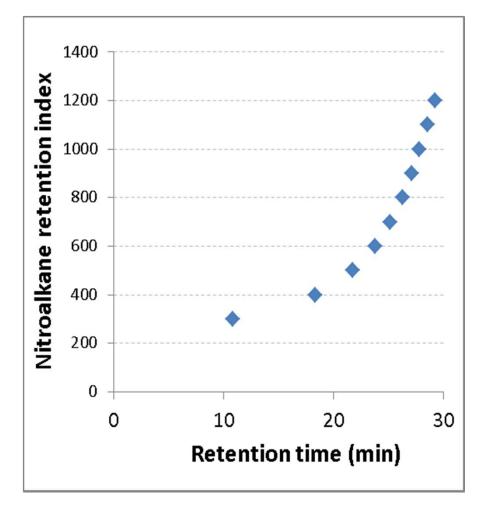




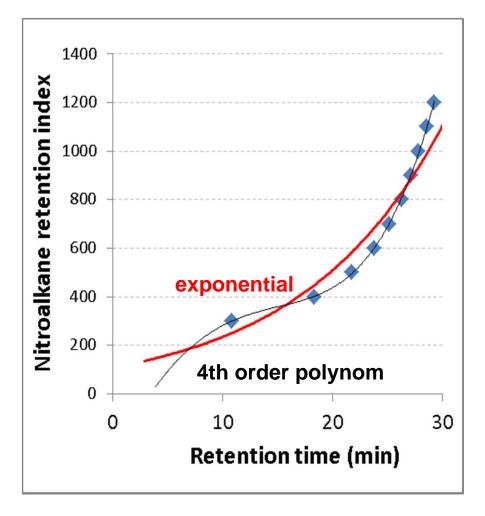




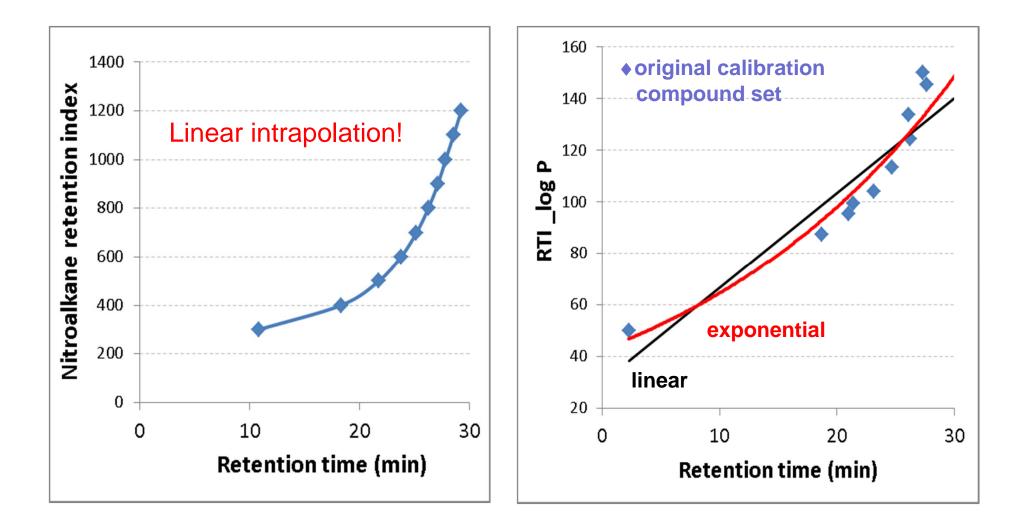






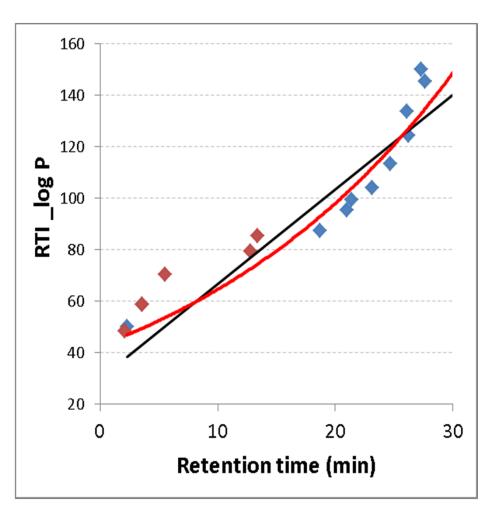






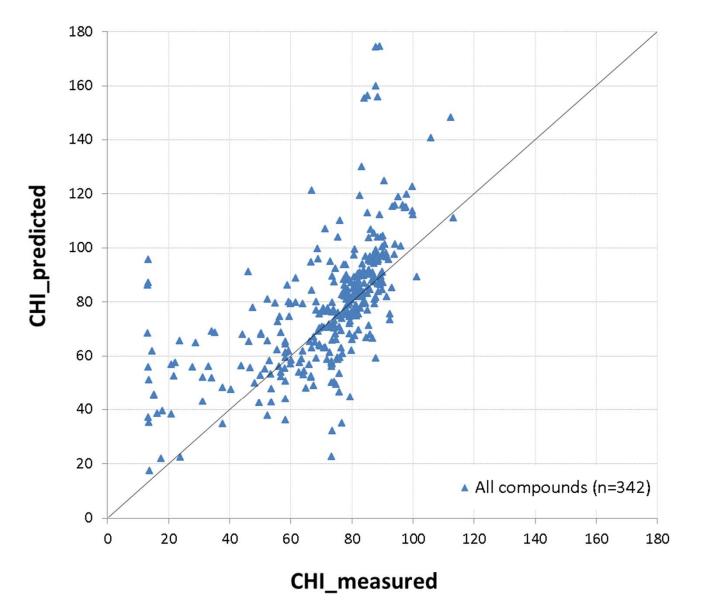


Finding additional calibration compounds might be difficult...



#### **CHI model**

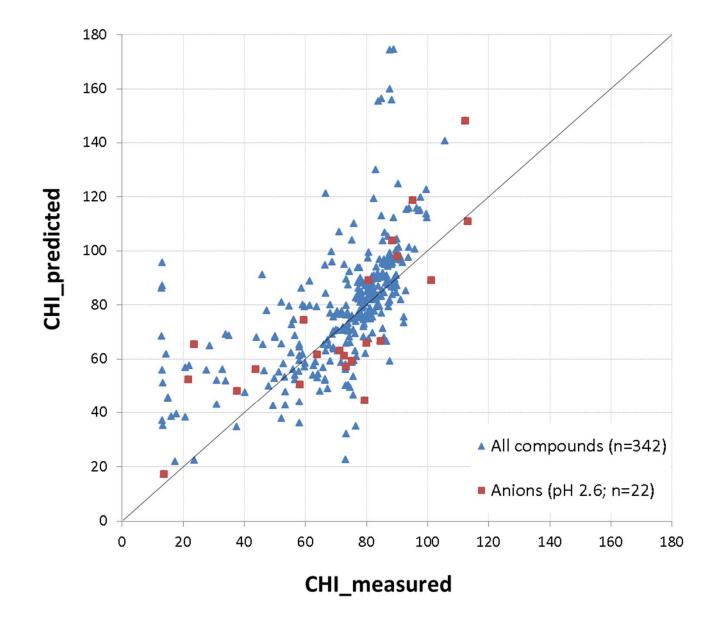




# MAE 15.9 R<sup>2</sup> 0.43

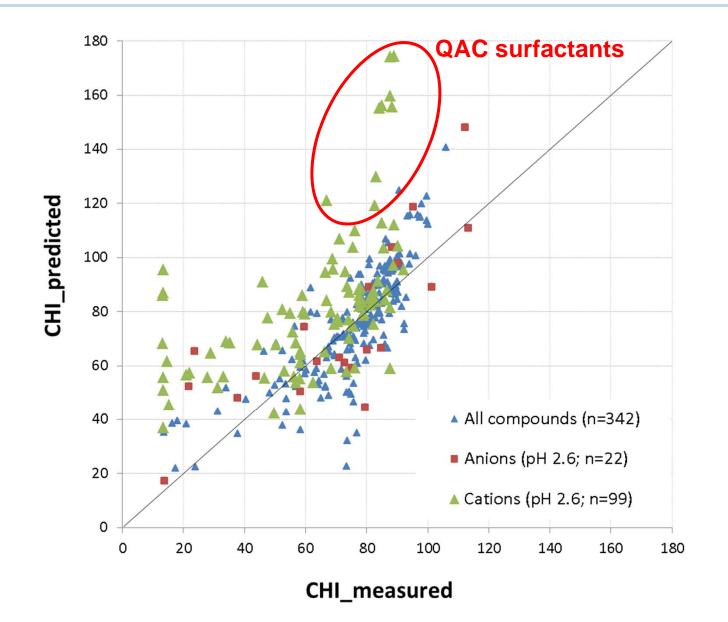
### **CHI model**





### **CHI model**





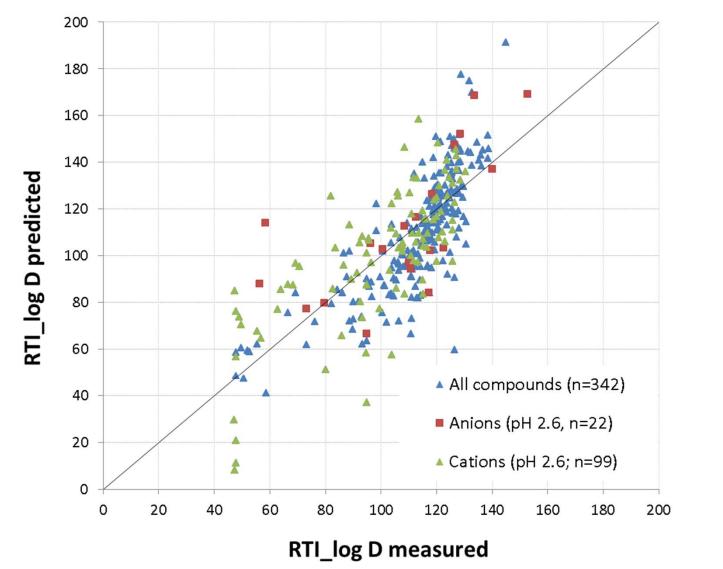
Neutrals MAE 11.9 ( $\approx$  3.9 min) R<sup>2</sup> 0.63

Anions MAE 15.8 ( $\approx$  5.1 min)

Cations MAE 24.9 (≈ 8.1 min)

#### **RTI model**





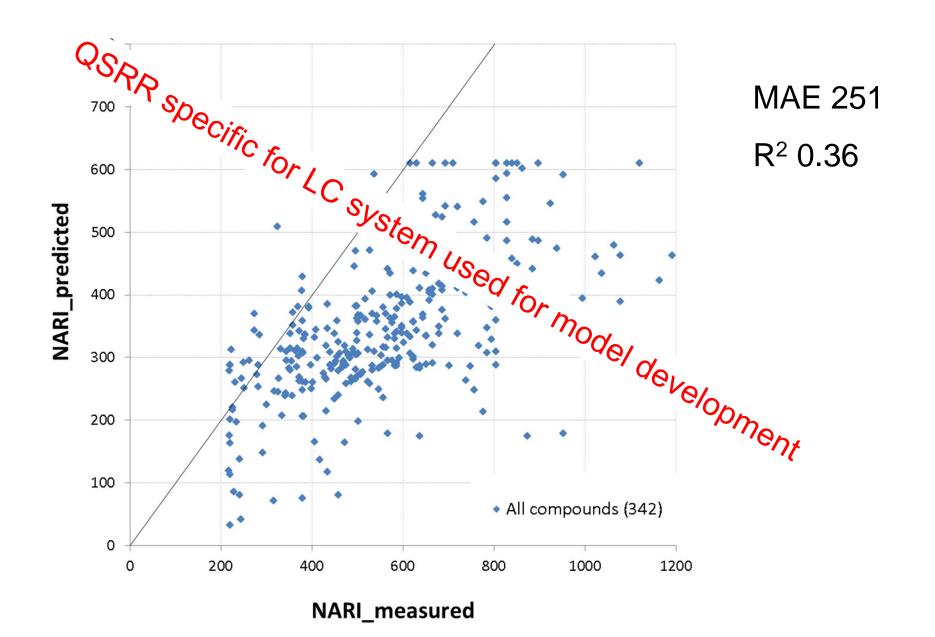
Neutrals MAE 12.3 ( $\approx$  3.9 min) R<sup>2</sup> 0.63

Anions MAE 20.8 (≈ 6.6 min)

Cations MAE 16.4 (≈ 5.2 min)

### NARI model

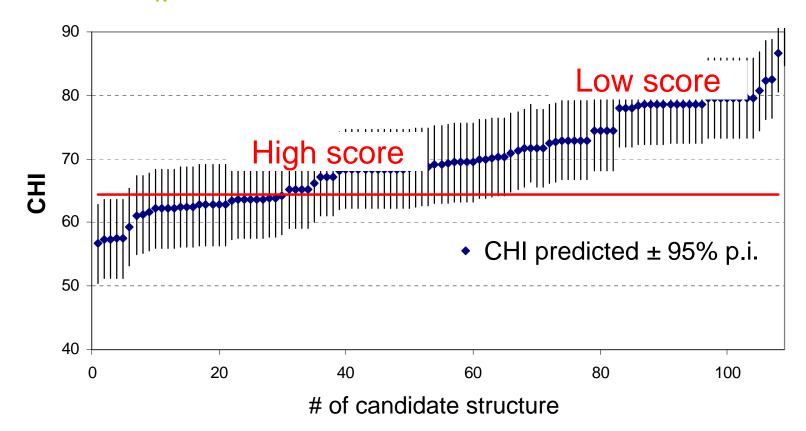




#### **Candidate selection: not all about accuracy**



**Unknown**  $t_{R}$  19.5 min  $\Rightarrow$  CHI 64.4



# Conclusions



#### **Retention prediction models**

- Are often far from accurate (hydrophilic, ionic& tricky compounds)
- Nevertheless provide useful information for confirmation of suspects or candidate exclusion
- A conceptually correct model might not be better than an analogy model
  - $\Rightarrow$  Be aware of compound domains the model is applicable
  - $\Rightarrow$  Be aware of prediction uncertainty
    - We have to develop some guidance on that!