



# The Role of Retention Time in Untargeted Metabolomics

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# From feature to identified compound

Match to authentic standard

Orthogonal data: e.g. spectra + retention time



MSI LEVEL I

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Orthogonal data: e.g. spectra + retention time

Match to public MS library

No orthogonal data: only spectra



MSI LEVEL I

MSI LEVEL II

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Match to authentic standard

Orthogonal data: e.g. spectra + retention time

Match to public MS library

No orthogonal data: only spectra

Compound not in any MS library



MSI LEVEL I

MSI LEVEL II

MSI LEVEL III/IV

# From feature to identified compound

Match to public MS library

No orthogonal data: only spectra



MSI LEVEL II


# MSI LEVEL II: match to public db

You got your match to a database spectra.

But are you sure that the spectra of your unknown couldn't match ***other*** isomers equally well?

## MS search for 163.04 m/z

Show  entries

Compound	 Name
<a href="#">HMDB00205</a>	Phenylpyruvic acid
<a href="#">HMDB01713</a>	m-Coumaric acid
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1) Examine mass spectra → No way to discriminate



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"Piled Higher and Deeper" by Jorge Cham [www.phdcomics.com](http://www.phdcomics.com)

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- 3) Buy all standards (if available) → Expensive!



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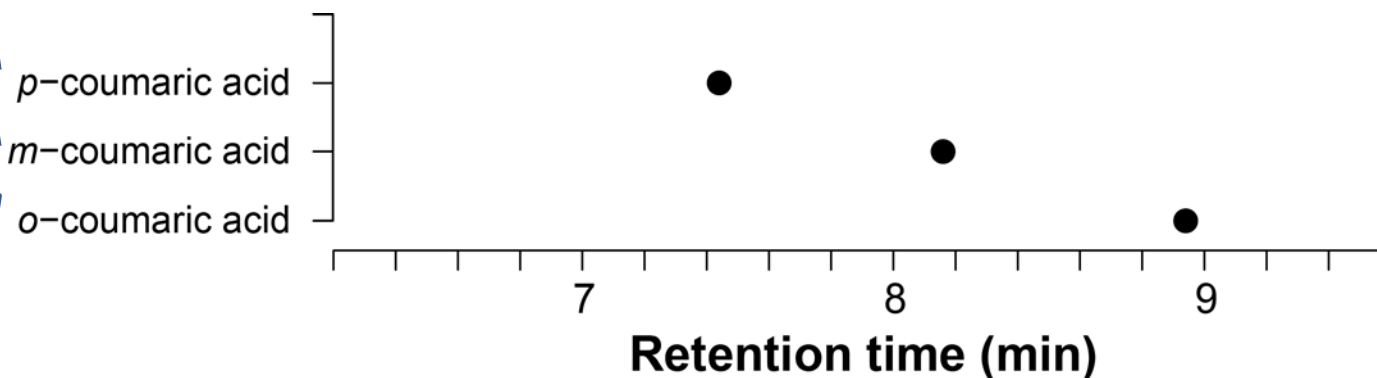
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So can we at least limit the number of isomers by using the information we already have?

# Why retention time information is usually neglected

Retention time is specific to the chromatographic system and there are no RT references



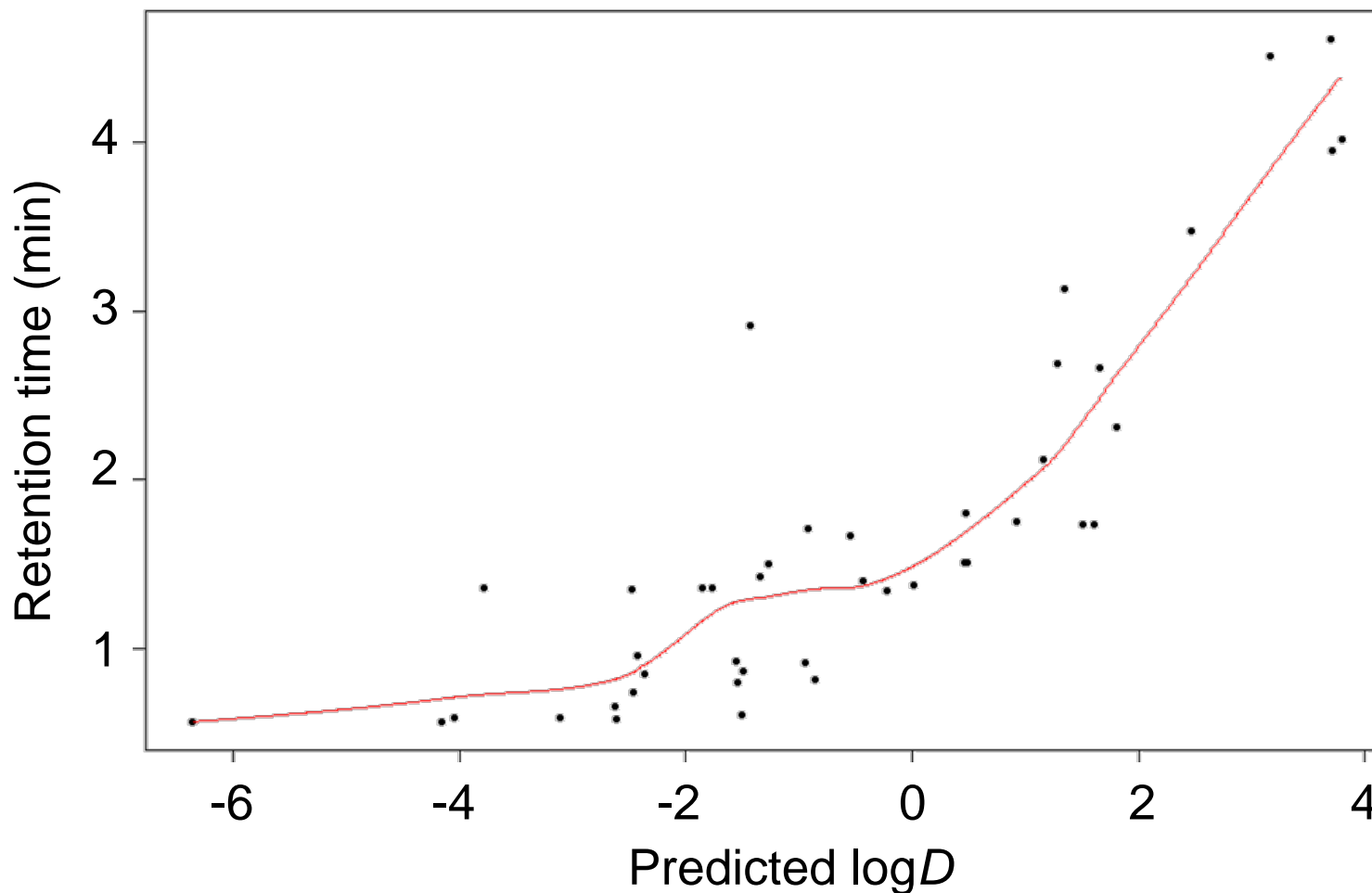
No coordinated efforts to share and exploit RT info.

## Current approaches to retention time prediction and their characteristics

	Prediction from structure (QSRR)	Projection from isocratic runs <sup>a</sup>
Accuracy	Low	Very high
Universality (any structure)	High	Low
Additional lab work	None	Lots
Model complexity	High	Low

<sup>a</sup>Abate-Pella D, et al. (2015). Retention Projection Enables Accurate Calculation of Liquid Chromatographic Retention Times Across Labs and Methods. *J Chromatogr.*

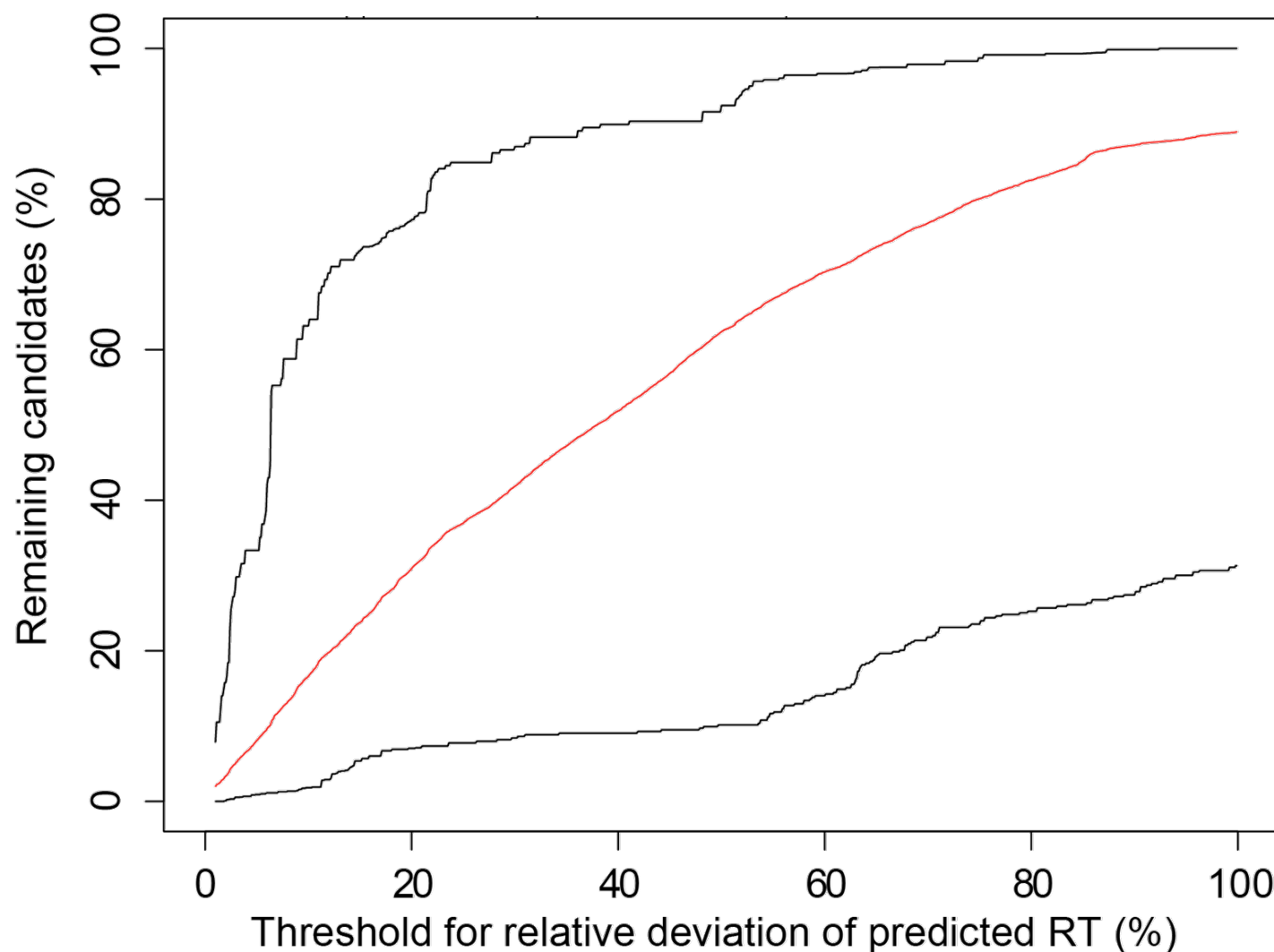
# Simplest QSRR model



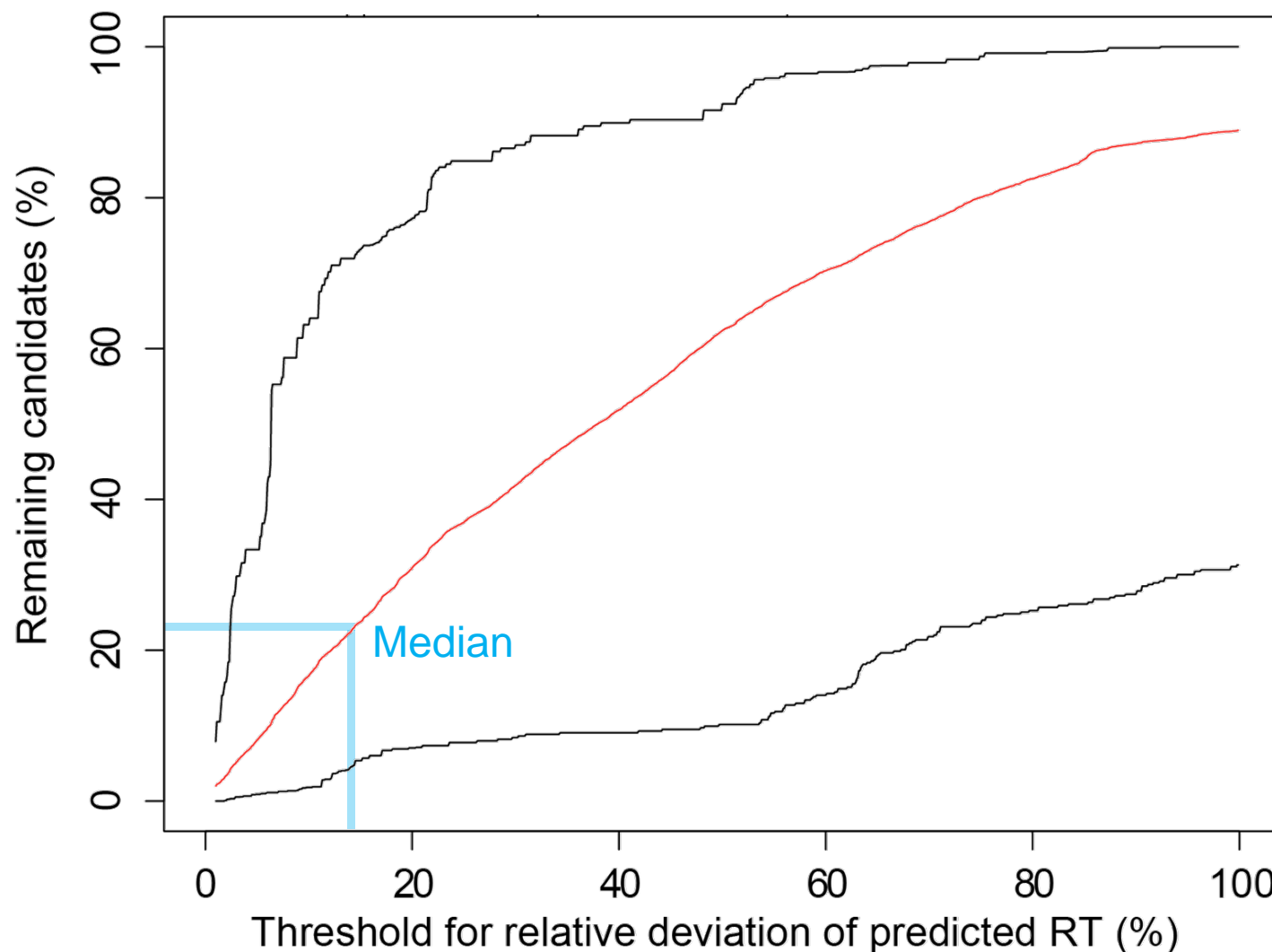
Stanstrup, J., Gerlich, M., Dragsted, L. O., & Neumann, S. (2013). Metabolite profiling and beyond: Approaches for the rapid processing and annotation of human blood serum mass spectrometry data Metabolomics and Metabolite Profiling. *Analytical and Bioanalytical Chemistry*, 405(15), 5037–5048.



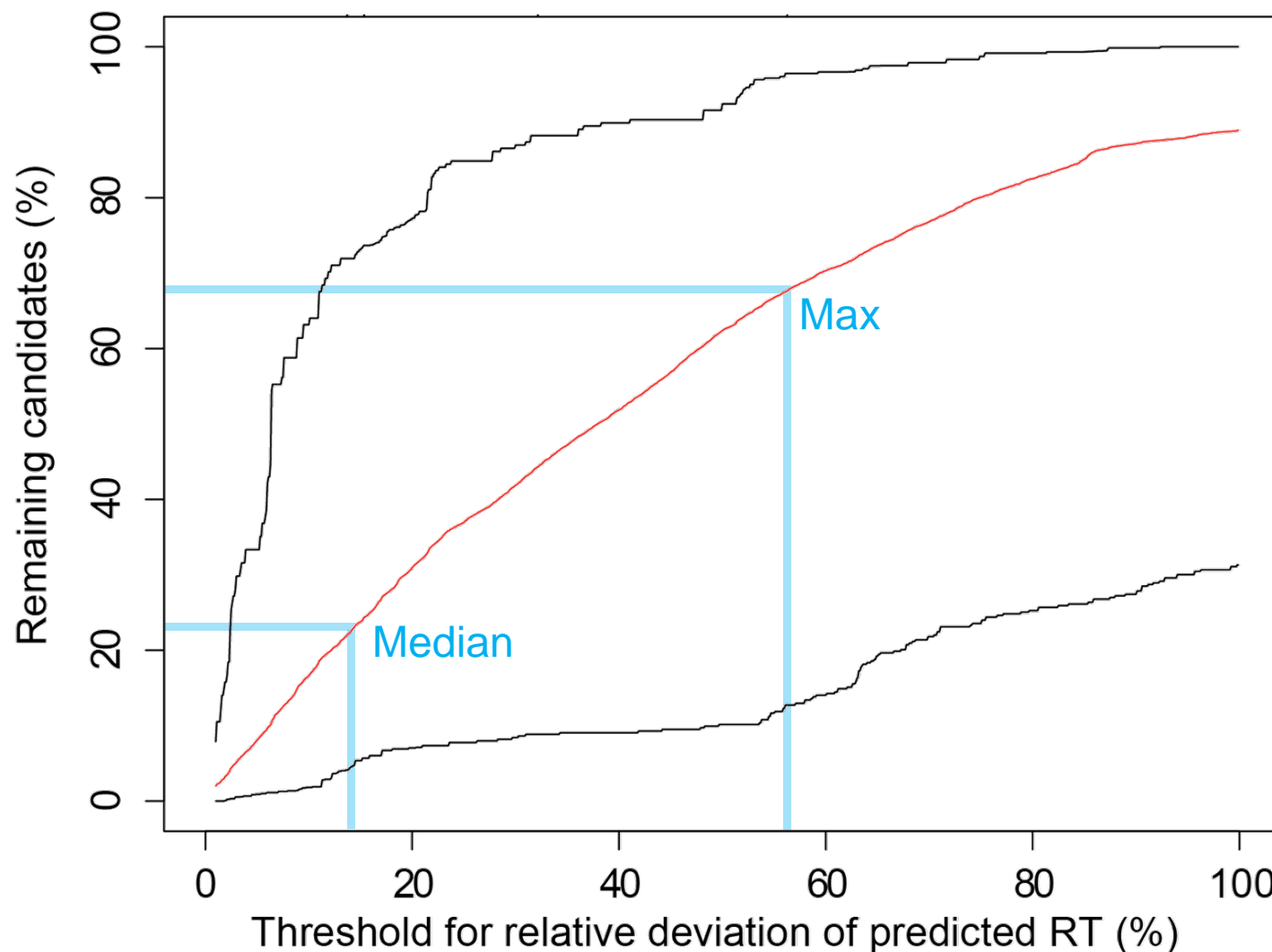
# Candidates after filtering as a function of prediction accuracy



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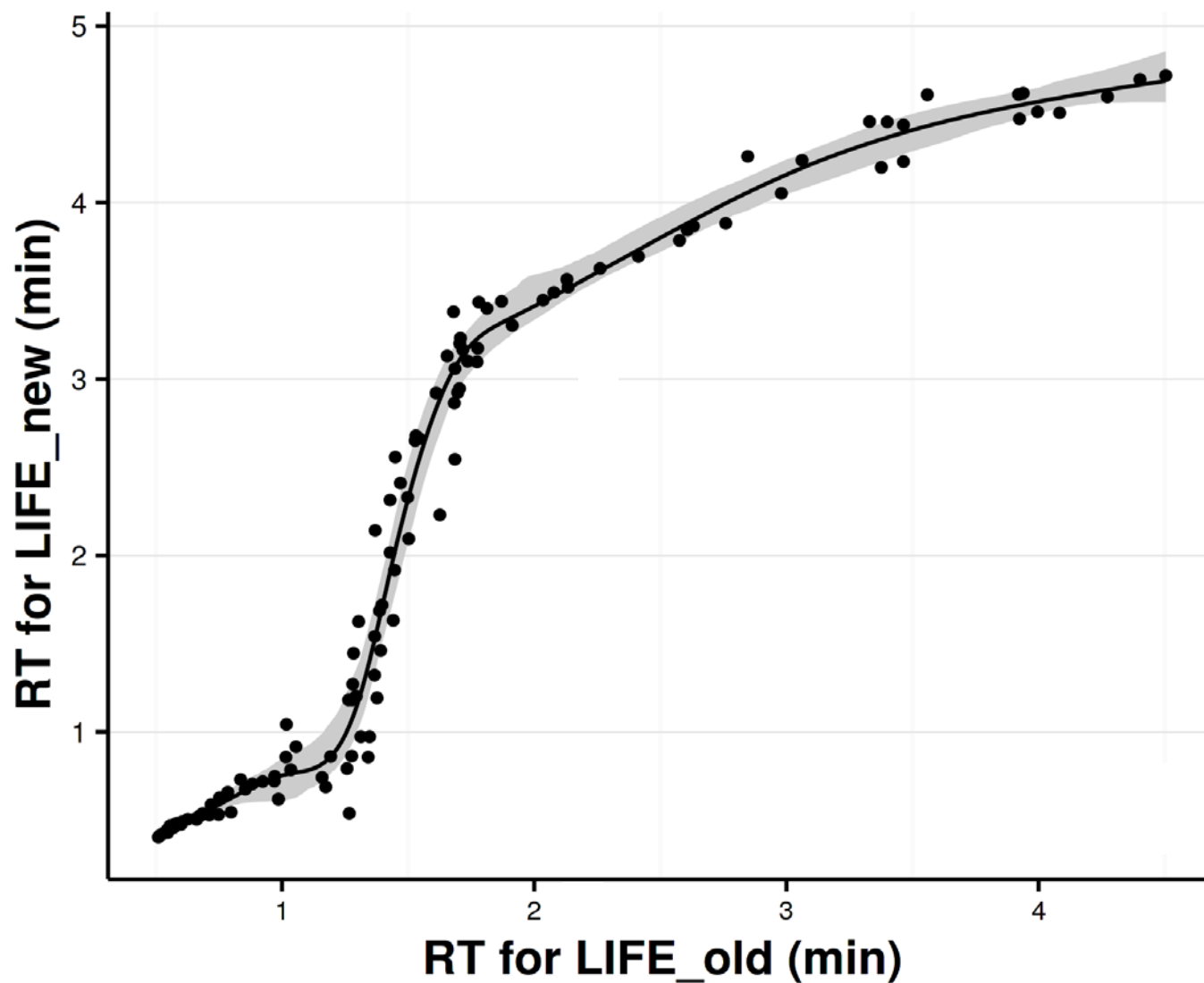
# Previous approaches to retention time prediction

	Prediction from structure (QSRR)	Projection from isocratic runs <sup>a</sup>	PredRet <sup>b</sup>
Accuracy	Low	Very high	Medium to high
Universality (any structure)	High	Low	Low to medium
Additional lab work	None	Lots	None
Model complexity	High	Low	Low

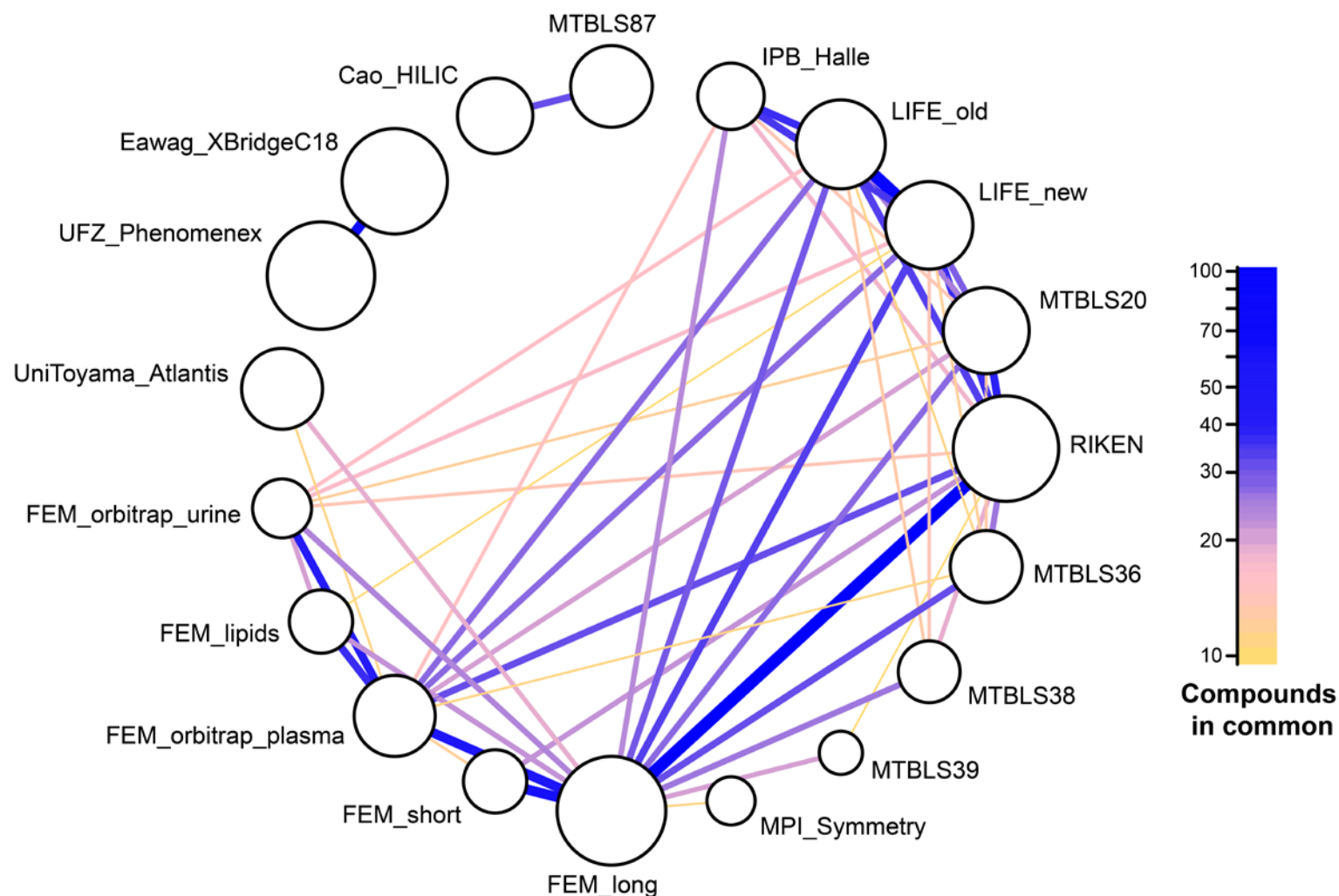
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<sup>b</sup>Stanstrup, J., Neumann, S., & Vrhovsek, U. (2015). PredRet: Prediction of Retention Time by Direct Mapping between Multiple Chromatographic Systems. *Analytical Chemistry*.

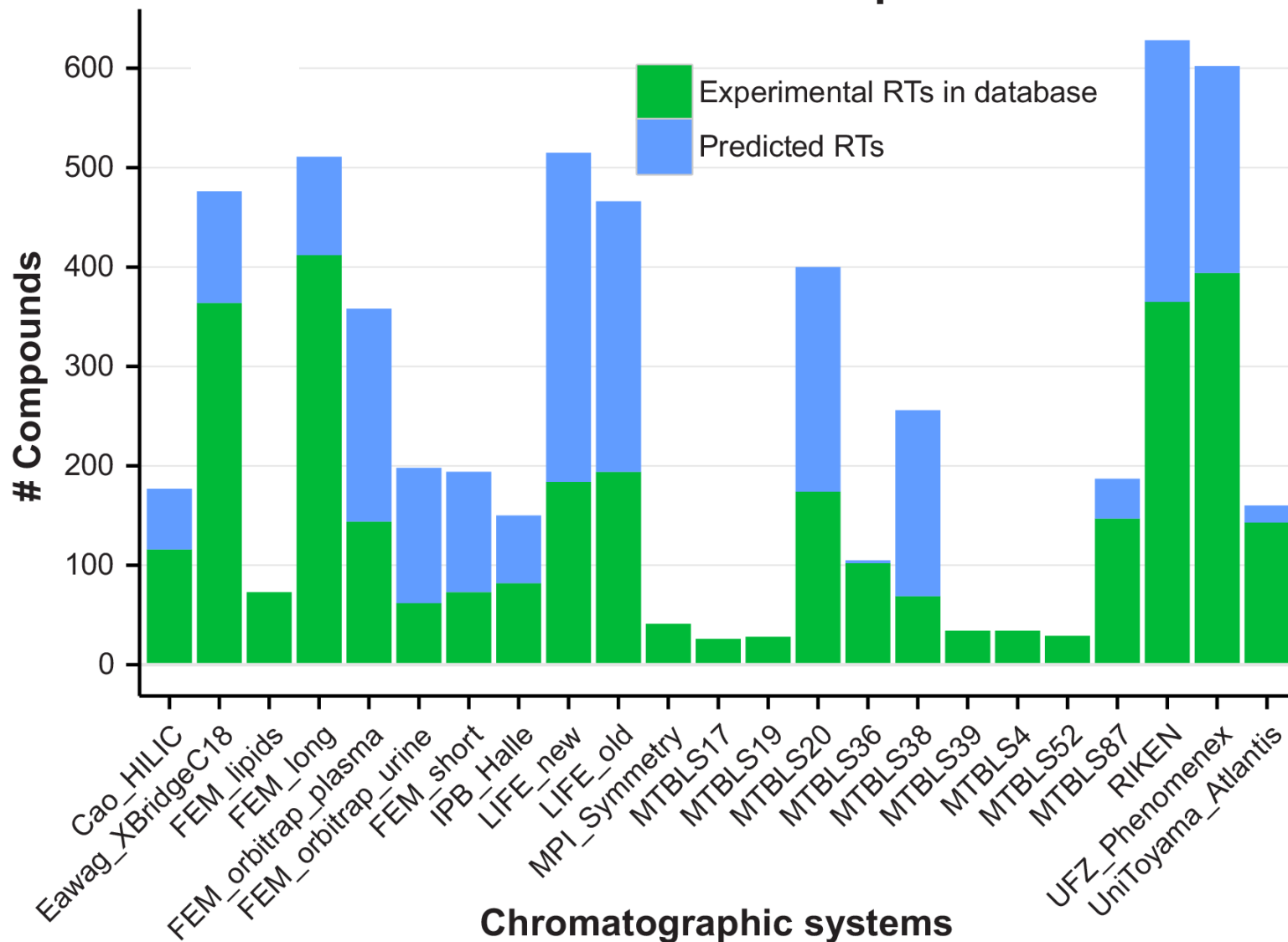
# PredRet models



# Compound overlap between systems in PredRet




## Number of RTs in database and predictions made





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*p*-coumaric acid

*m*-coumaric acid

*o*-coumaric acid

Retention time (min)

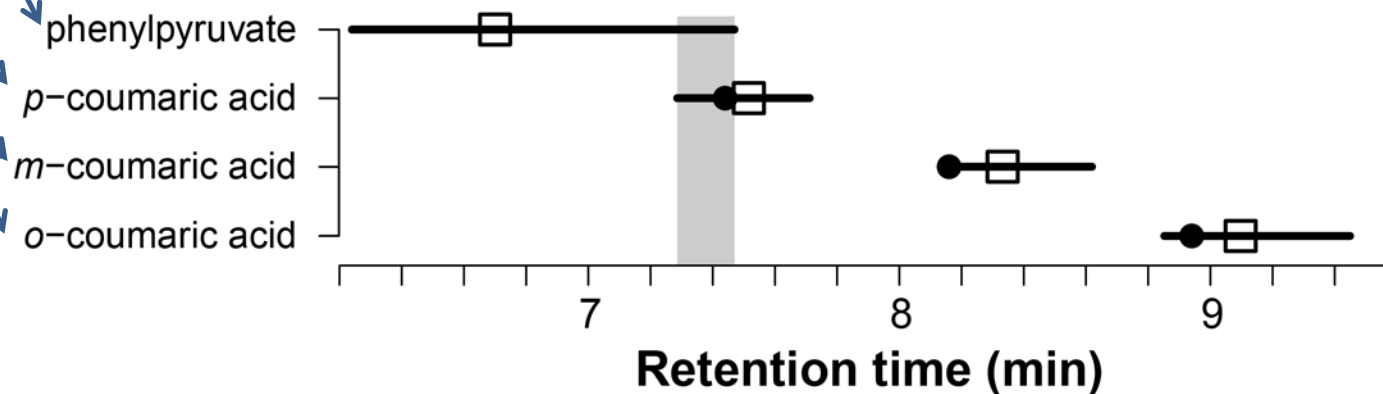
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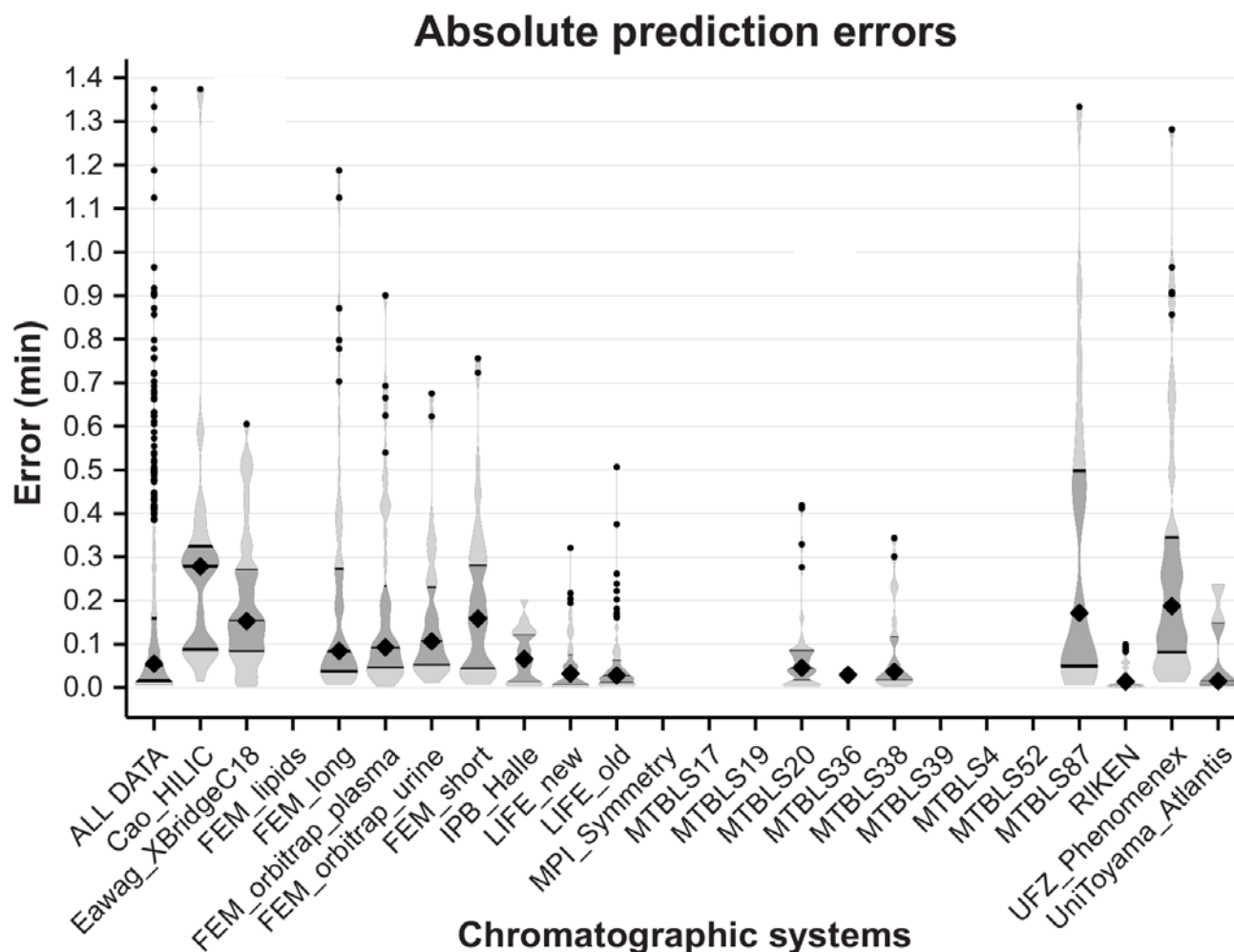
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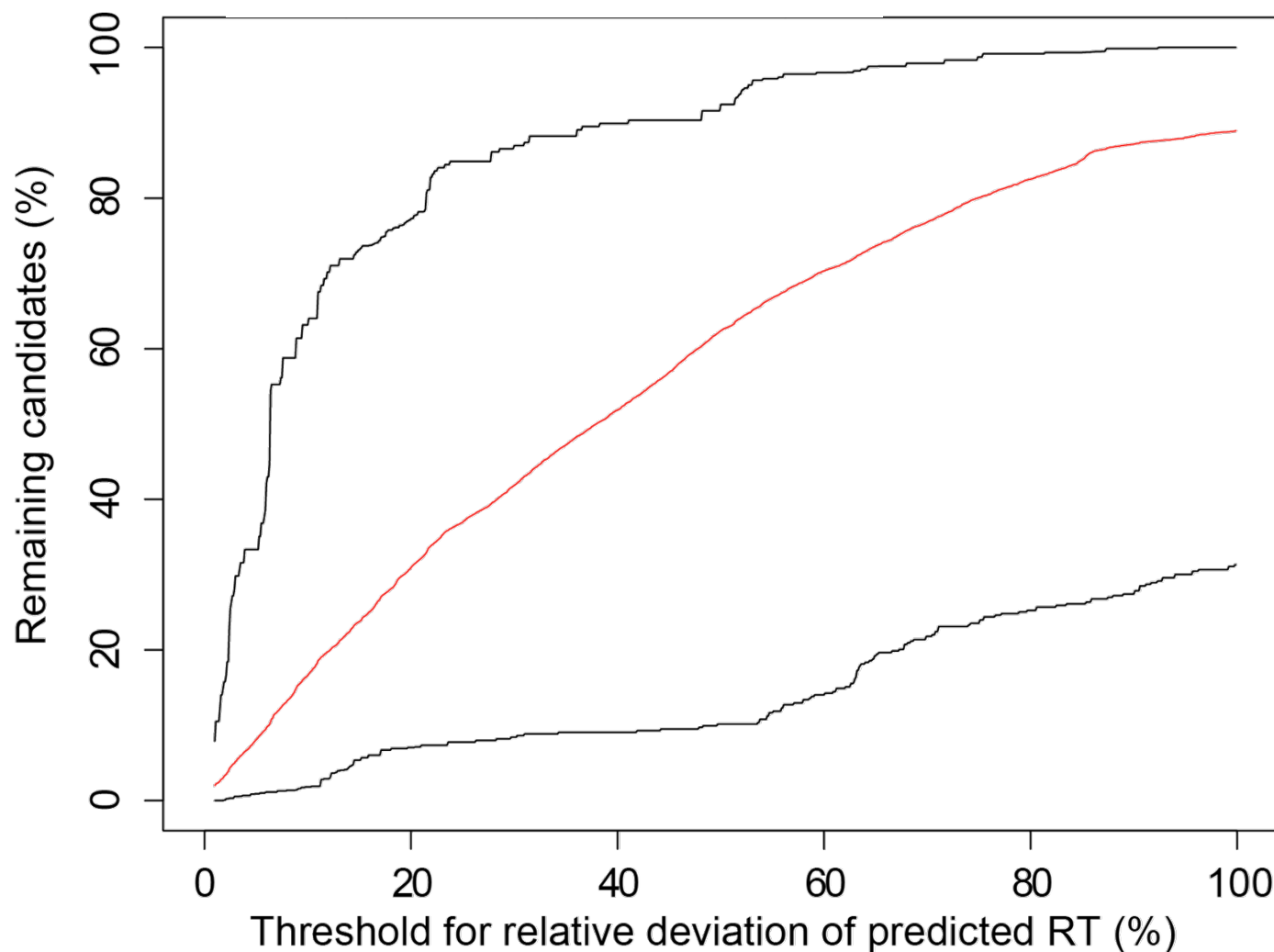
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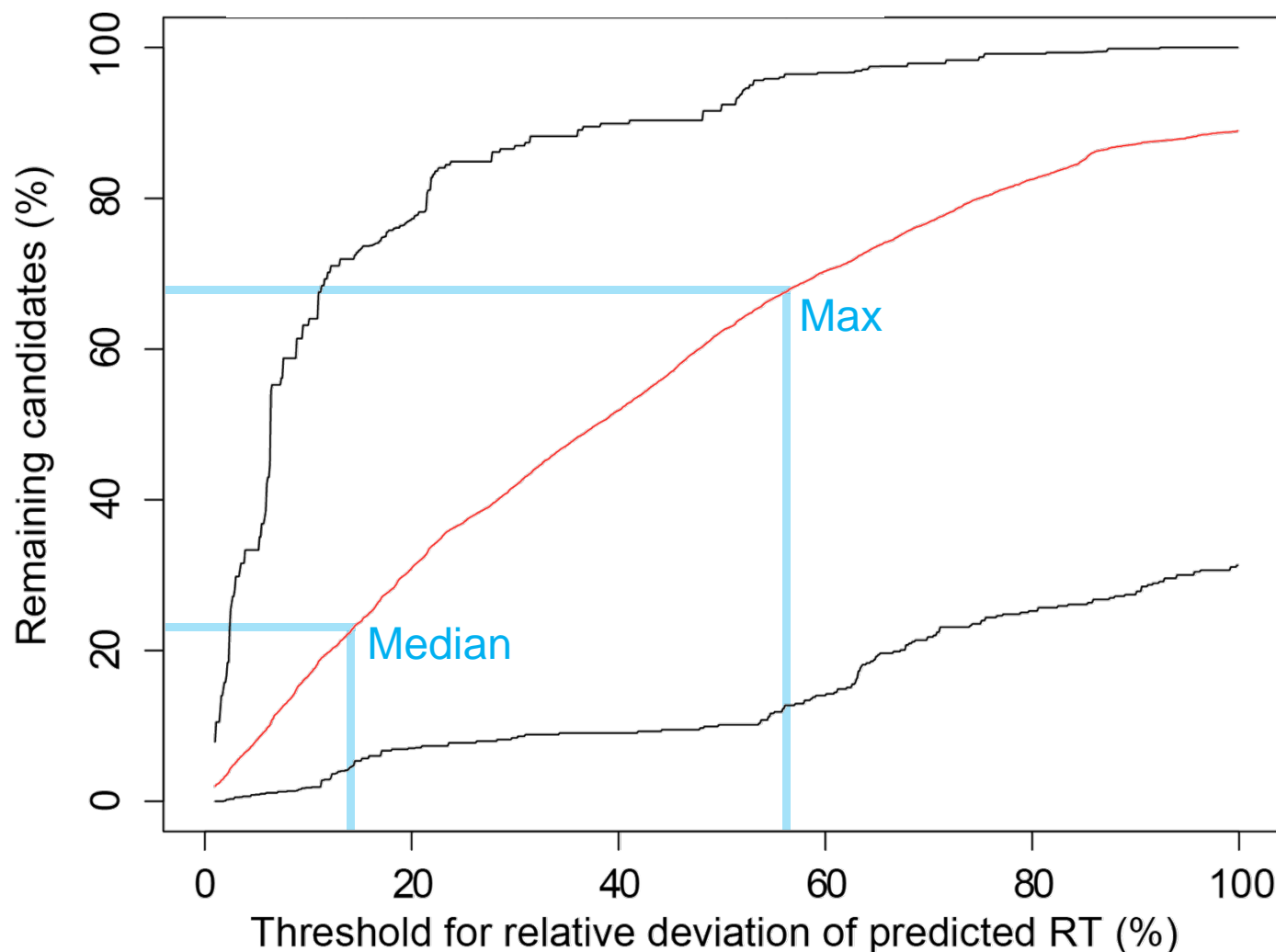
# Accuracy of PredRet predictions



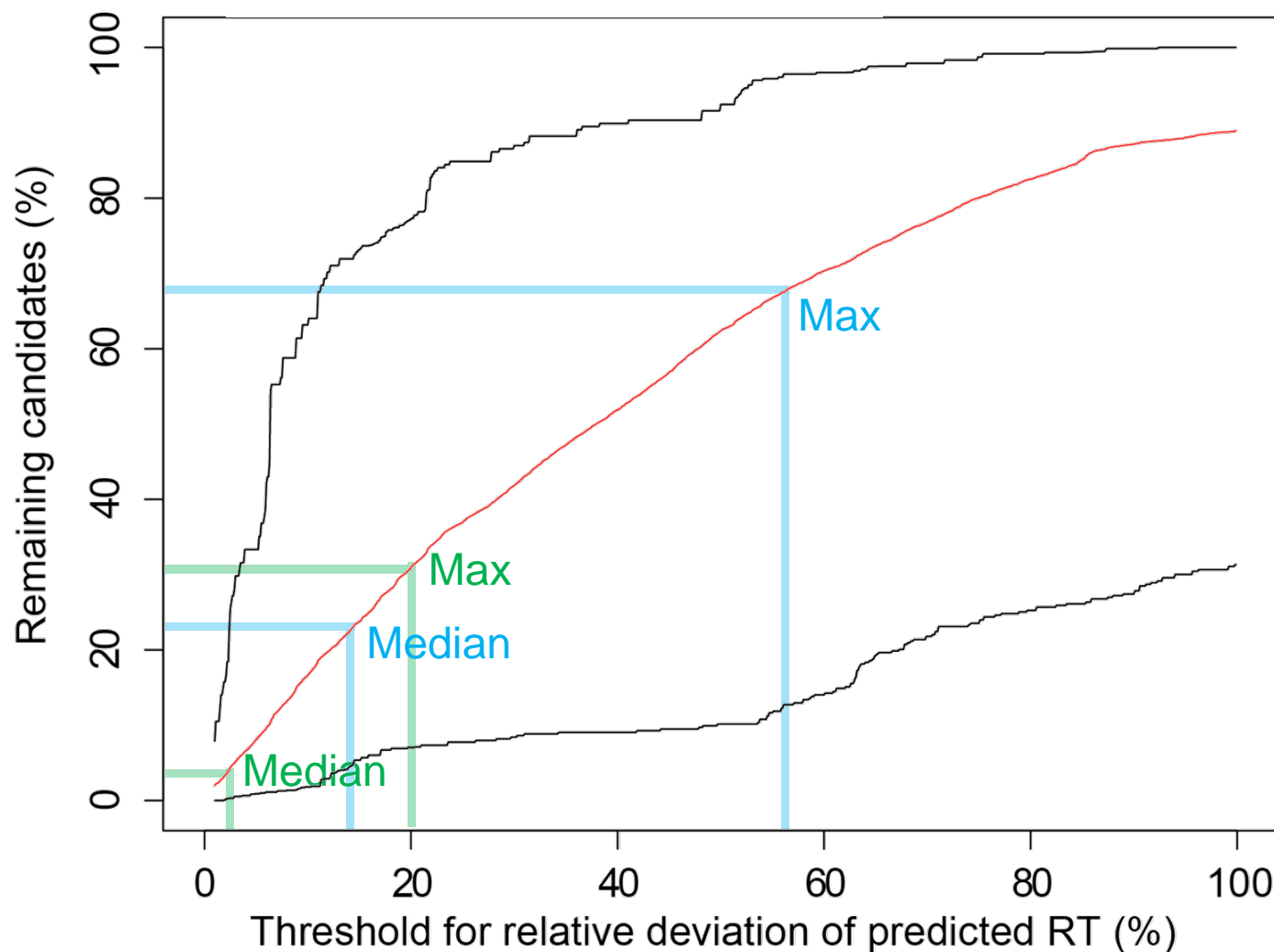
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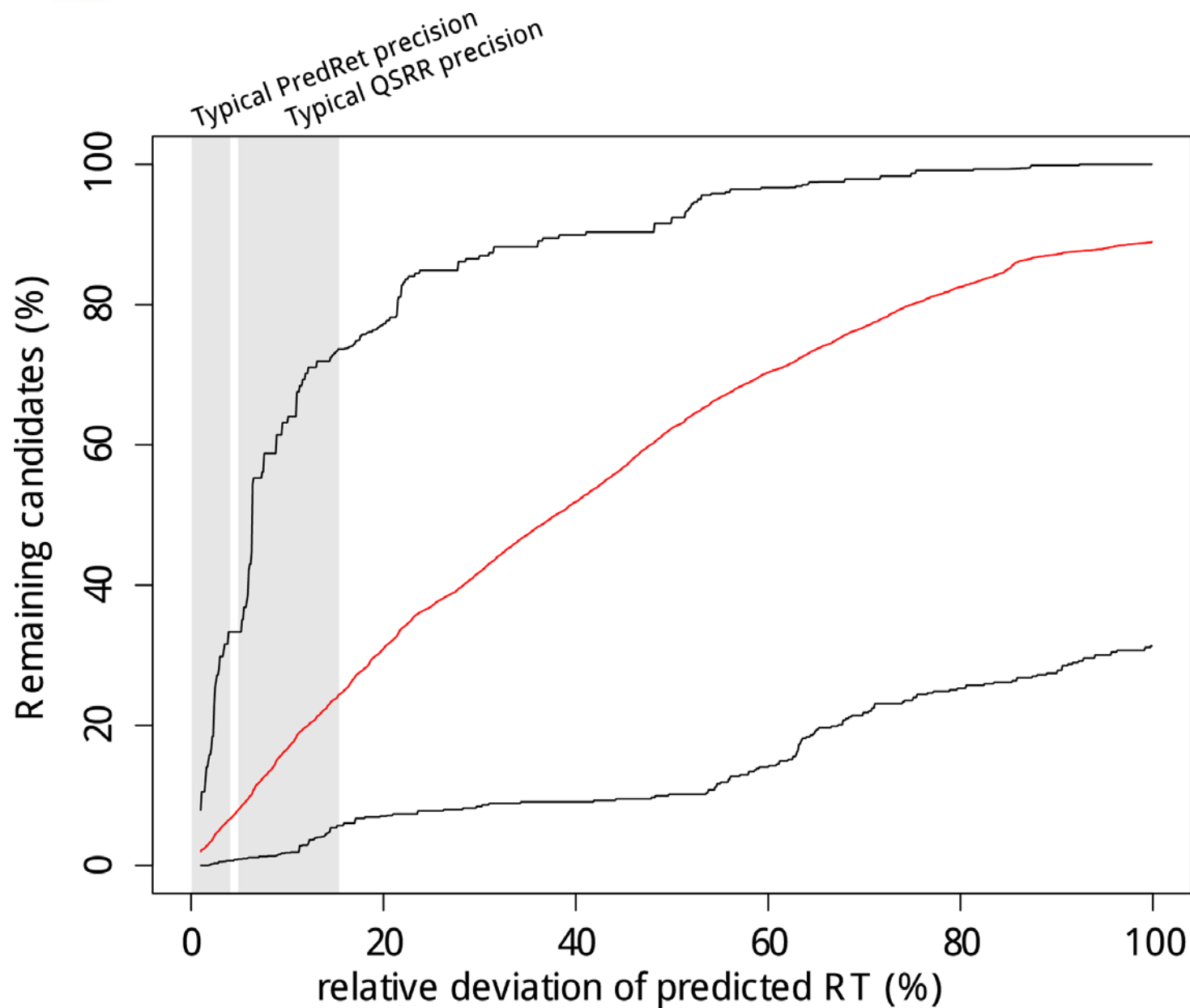


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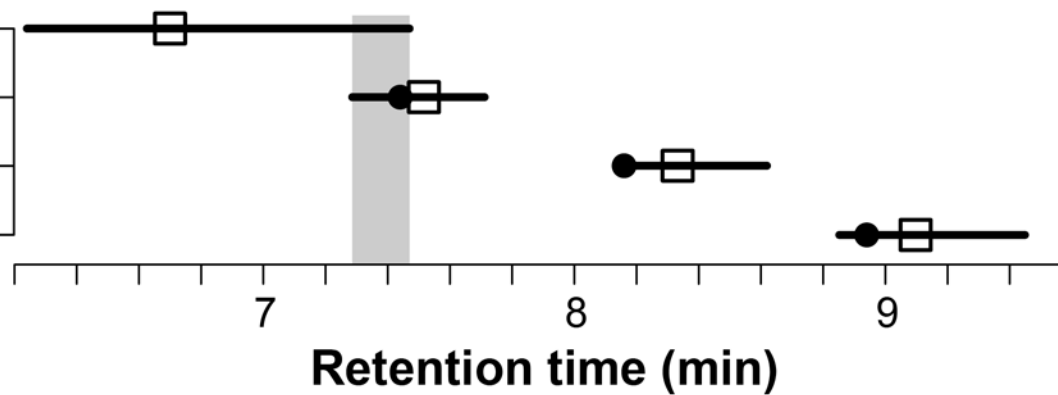
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HMDB12225	Enol-phenylpyruvate
HMDB30677	cis-p-Coumaric acid
HMDB31629	2-Oxo-3-phenylpropanoic acid (Mixture oxo and keto)
HMDB41592	Coumaric acid
HMDB62148	Phenacyl formate

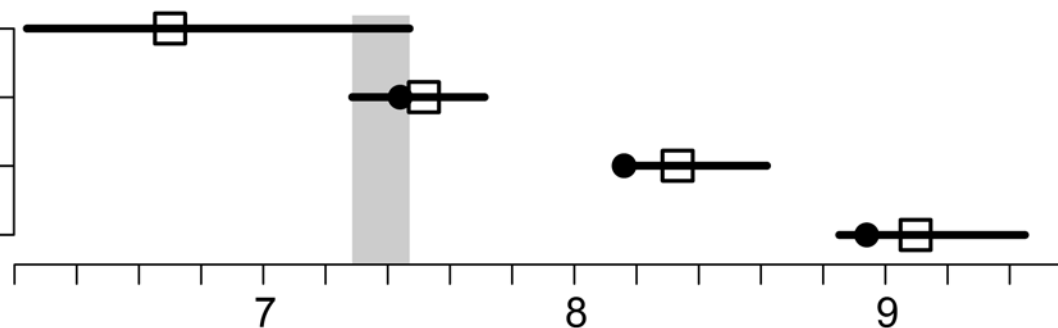
Showing 1 to 9 of 9 entries

phenylpyruvate

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Retention time (min)

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- The accuracy of PredRet can differentiation of isomers
- Compound need to be in the database (*someone* need to record it)
- Chromatography needs to be *similar* (e.g. acidic C18-based)
- When people use PredRet the database expands

# Thank you for your attention

**Share the RTs!**