

Molecular modelling in compounds series with descriptors families

Lorentz JÄNTSCHI

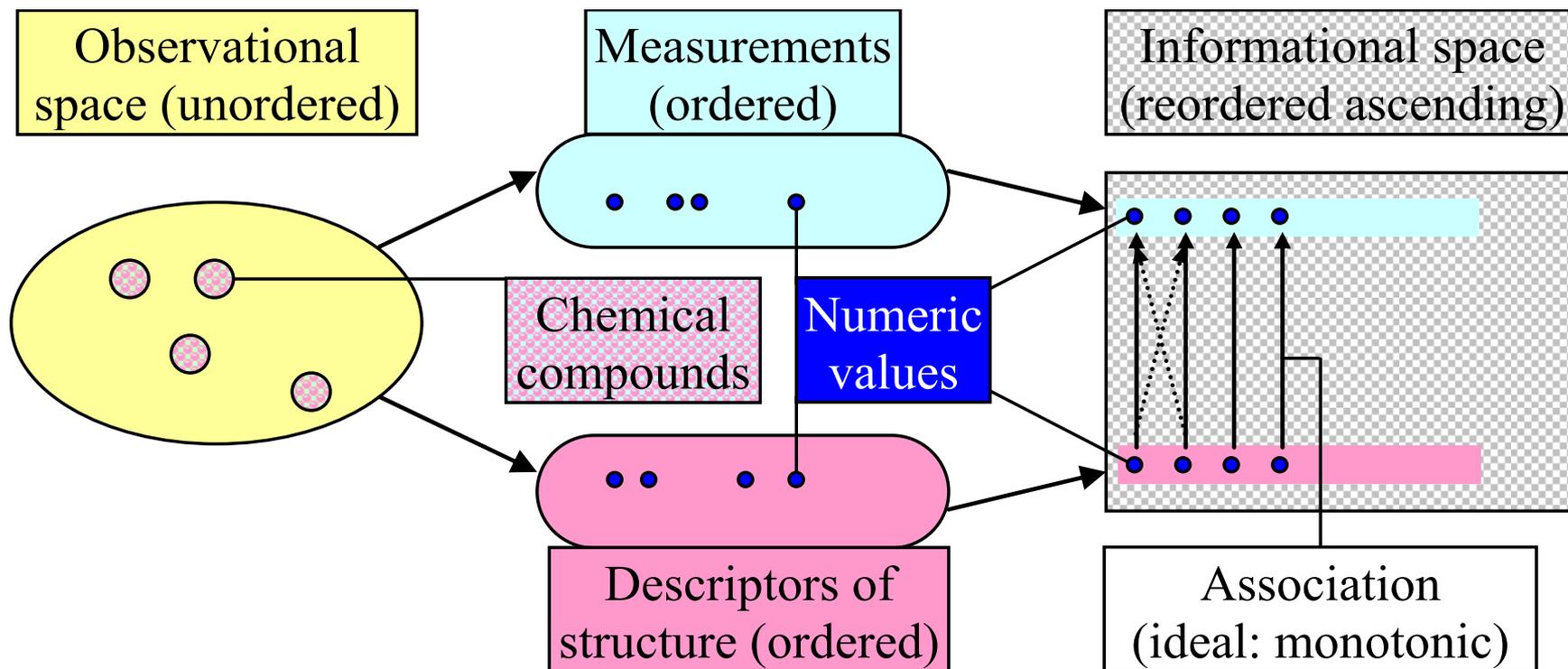
&

Sorana D. BOLBOACĂ

Reference materials

- Jäntschi L, 2000. Predicția proprietăților fizico-chimice și biologice cu ajutorul descriptorilor matematici. Teză de doctorat (Chimie) - coordonator Prof. Diudea MV. Universitatea "Babeș-Bolyai" din Cluj-Napoca, Cluj-Napoca, Ian. 2000.
- Jäntschi L, 2004. MDF - A New QSAR/QSPR Molecular Descriptors Family. Leonardo Journal of Sciences 3(4): 68-85.
- Jäntschi L, 2005. Molecular Descriptors Family on Structure Activity Relationships 1. Review of the Methodology. Leonardo Electronic Journal of Practices and Technologies 4(6): 76-98.
- Jäntschi L, 2012. Structure vs. Properties: Algorithms and Models. Habilitation thesis in Chemistry. Bucharest: CNATDCU (defended in 2013 in Cluj-Napoca: Babeș-Bolyai University). 175 p.
- Jäntschi L, 2014. Szeged Matrix Property Indices. Online calculation software. URL: <http://l.academicdirect.org/Chemistry/SARs/SMPI/>
- Jäntschi L, Bolboacă SD, 2016. Families of molecular descriptors In: Explicative dictionary of nanochemistry (Ed. M.V. Putz). Oakville(ON): AAP & CRC Press, to appear.

Compounds series associations



Challenges:

- Measurement scale
- Value-based encoding of the structure
- Training of the association function

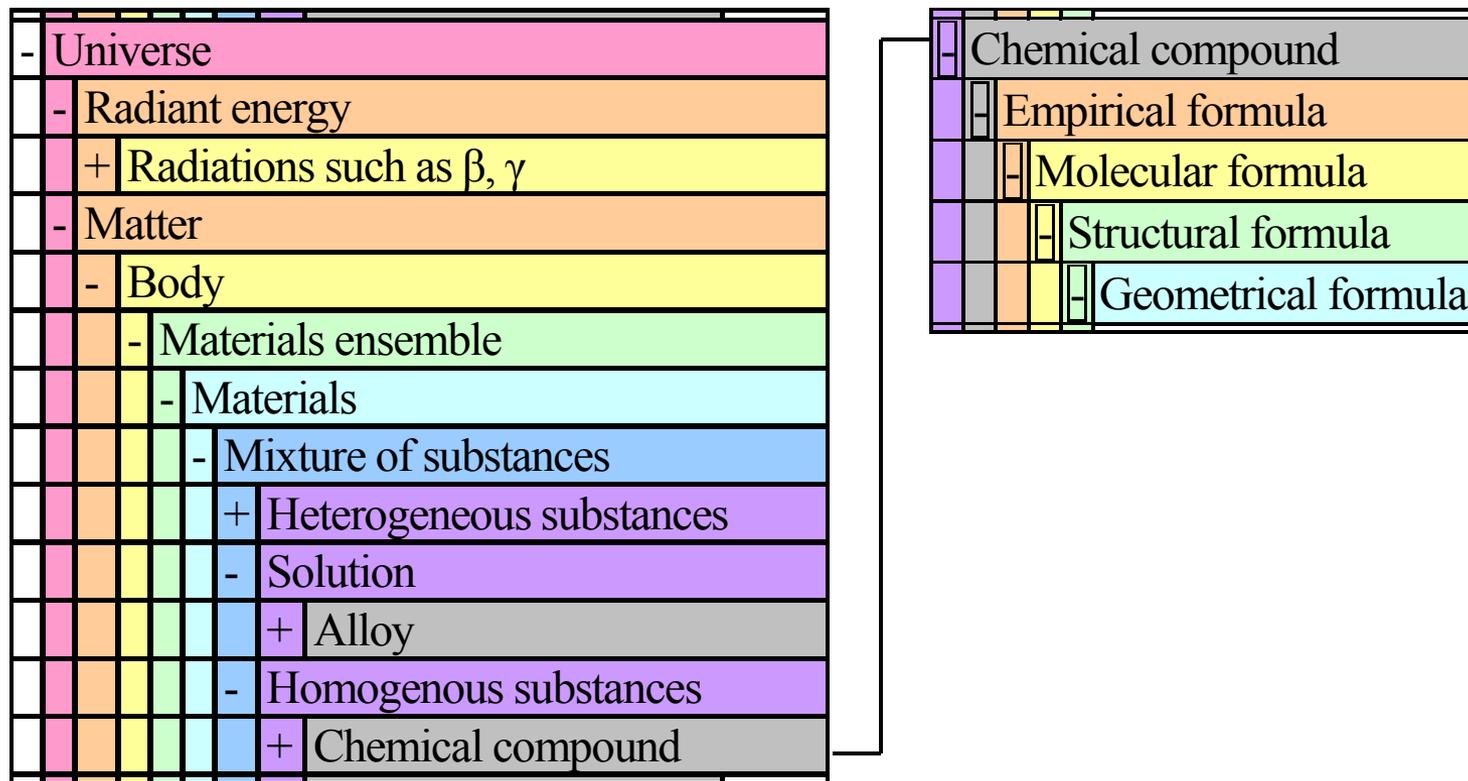
Measurement scales

| Scale | Type | Operations | Structure | Statistics | Examples |
|----------------------|----------|---------------------|-----------------------------------|--|---|
| Binomial | Logical | "=", "!" | Boolean algebra | Mode, Fisher Exact | Dead/Alive Sides of a coin |
| (multi) Nomi(n)al | Discrete | "=" | Standard set | Mode, Chi squared | ABO blood group system Living organisms classification |
| Ordinal | Discrete | "=", "<" | Commutative algebra | Median, Ranking | Number of atoms in molecule |
| Interval | Continue | "≤", "-" | Affine space (one dimensional) | Mean, StDev, Correlation, Regression, ANOVA | Temperature scale Distance scale Time scale Energy scale |
| Ratio | Continue | "≤", "-", "*" | Vector space (one dimensional) | GeoMean, HarMean, CV, Logarithm | Sweetness relative to sucrose pH |

Challenges:

- Resolution of the scale
- Degeneration (lost of the unicity for the observed)

Value-based encoding of the structure



Challenges:

- Translation of the topology (chemical bonds)
- Translation of the geometry (molecular arrangement)
- Treating of the different levels of isomerism

Training of the association function

- Model of association
 - Linear vs. nonlinear or user-defined
- Parameterizing of the model
 - Least squares vs. maximum likelihood
- Objective (constrains) for the association
 - Monotonic associated estimates vs. leverage
- Assessing of the estimating power
 - Leave-one-out vs. training-vs-test
- Assessing of the prediction power
 - Applicability domain vs. external set-test

Molecular geometry

Molecular modelling software

| Name | Provider website |
|------------------|---|
| Abalone | http://biomolecular-modeling.com |
| ADF | http://scm.com |
| ChemBioOffice | http://cambridgesoft.com |
| Gaussian | http://gaussian.com |
| HyperChem | http://hyper.com |
| Materials Studio | http://accelrys.com |
| Q-Chem | http://q-chem.com |
| Spartan | http://wavefun.com |
| Others | wiki→ List of software for molecular mechanics modeling |



Challenges:

- Starting geometry
- Theory level
- Vitro vs. vivo
- Convergence threshold

Typical information from modelling

| | | | |
|-----------------------|------------|-----------------------|----------------|
| The list of the atoms | | | |
| Label | Type | Coordinates (x, y, z) | Partial charge |
| The list of the bonds | | | |
| Atom Label | Atom Label | Bond type or order | |

Molecular descriptors families strategy

| Structure | Feed | Genetic code | | | | Breeding | Phenotypes | |
|---|----------------------|--------------|----------|-------|-----|----------|-------------------------------|------------------------------------|
|  | \rightarrow (+) | Gene | A | B | ... | Z | \rightarrow (\times) | $\{P_1, \dots, P_{99.99\dots99}\}$ |
| | | Genome | a_1 | b_1 | ... | z_1 | | |
| | | | a_2 | b_2 | ... | z_2 | | |
| | | | ... | ... | ... | ... | | |
| a_{99} | b_{99} | ... | z_{99} | | | | | |

Set of compounds: S_1, S_2, \dots, S_m

Activities from measurements

| Structures | Activities | Phenotypes | Survival of the fittest | | | | |
|------------|------------|---|--------------------------------|---------|--------------------------------|---------|--|
| S_1 | A_1 | $\{P_1(S_1), \dots, P_{99\dots99}(S_1)\}$ | $\{A_i\} \sim f(P_1(\{S_i\}))$ | \dots | $\{A_i\} \sim f(P_j(\{S_i\}))$ | \dots | $\{A_i\} \sim f(P_{99\dots99}(\{S_i\}))$ |
| S_2 | A_2 | $\{P_1(S_2), \dots, P_{99\dots99}(S_2)\}$ | | | | | |
| ... | ... | ... | | | | | |
| S_i | A_i | $\{P_1(S_i), \dots, P_{99\dots99}(S_i)\}$ | | | | | |
| ... | ... | ... | | | | | |
| S_m | A_m | $\{P_1(S_m), \dots, P_{99\dots99}(S_m)\}$ | | | | | |

FPIF: Fragmental Property Index Family

Code of FPIF descriptors

| Gene | I _M | D _M | A _P | P _D | F _C | S _M | M _I | L _O |
|--------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|
| Genome | R | T | M | <u>p</u> | si | S | P ₋ | I |
| | D | G | E | <u>d</u> | se | P | P2 | R |
| | | | C | <u>1/p</u> | ji | A | E ₋ | L |
| | | | Q | <u>1/d</u> | je | G | E2 | |
| | | | | <u>p*d</u> | fi | H | | |
| | | | | <u>p/d</u> | fe | | | |
| | | | | <u>p/d2</u> | | | | |
| | | | | <u>p2/d2</u> | | | | |

Calculation details:

- in the paper

Major advantage:

- fits on graph theory indices

Major disadvantage:

- complexity of calculation for j* and f* fragments

$$\text{FPIF} = I_M \times D_M \times A_P \times P_D \times F_C \times S_M \times M_I \times L_O$$

Ex.: RGseCp2/d2SE2, DGjeP_p/d2GP_

Ref: Jäntschi & Diudea, 2000

MDF: Molecular Descriptors Family

Code of MDF descriptors

| Gene | D _M | A _P | I _D | | | | I _M | F _C | S _M | | | L _O | |
|--------|----------------|----------------|----------------|---|---|---|----------------|----------------|----------------|---|---|----------------|---|
| Genome | t | C | D | Q | L | F | r | m | m | A | G | H | I |
| | g | H | d | q | l | f | R | M | M | a | g | h | i |
| | | M | O | J | V | S | m | D | n | B | F | I | A |
| | | E | o | j | E | s | M | P | N | b | f | i | a |
| | | G | P | K | W | T | d | | S | P | s | | L |
| | | Q | p | k | w | t | D | | | | | | l |

$$\text{MDF} = D_M \times A_P \times P_D \times I_M \times F_C \times S_F \times L_O$$

Ex: lsPRLGg, IhDDDCt

Ref: Jäntschi, 2004;

Calculation details:

- in the paper

Major advantage:

- fits on physical interactions

Major disadvantage:

- (high diversity in calculation)

MDFV: Molecular Descriptors Family - Vertex

Code of MDFV descriptors

| Gene | D _O | A _P | I _D | | | | | | S _F | S _M | I _T | E _U | L _O | |
|--------|----------------|----------------|----------------|---|---|---|---|---|----------------|----------------|----------------|----------------|----------------|---|
| Genome | T | C | J | R | N | Z | V | I | D | A | A | f | D | I |
| | G | H | j | r | n | z | v | i | d | a | a | F | d | R |
| | | M | O | K | W | S | F | A | 0 | I | I | c | | L |
| | | E | o | k | w | s | f | a | 1 | i | i | C | | |
| | | Q | P | L | X | T | G | B | 2 | F | F | p | | |
| | | L | p | l | x | t | g | b | 3 | P | P | P | | |
| | | A | Q | M | Y | U | H | C | 4 | C | C | a | | |
| | | | q | m | y | u | h | c | 5 | | | A | | |
| | | | | | | | | | 6 | | | i | | |
| | | | | | | | | | 7 | | | I | | |

$$\text{MDFV} = D_O \times A_P \times I_D \times S_F \times S_M \times I_T \times E_U \times L_O$$

Ex.: TEuIFFDL and GLbIAcDR

Ref: Bolboacă & Jäntschi 2009

Calculation details:

- in the paper

Major advantage:

- Descriptors derived for molecules losing one atom

Major disadvantage:

- Family too big

SAPF: Structural Atomic Property Family

Code of SAPF descriptors

| Gene | C _F | D _O | A _P | D _P | P _P | O _M | M _P | L _O |
|--------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|
| Genome | D | T | C | I | I | S | I | I |
| | P | G | H | E | E | M | E | A |
| | C | | M | H | H | | H | S |
| | | | E | G | G | | G | T |
| | | | A | A | A | | A | Q |
| | | | | Q | Q | | Q | R |
| | | | | S | S | | S | L |

$$\text{SAPF} = L_O \times G_M \times O_M \times P_P \times D_P \times A_P \times M_D \times C_F$$

Ex.: SISHQEGC and TESHIMGP

Ref: Sestraş et al., 2012

Calculation details:

- in the paper

Major advantage:

- fits on physical interactions

Major disadvantage:

- low diversity in calculation

SMPI: Szeged Matrix Property Indices

FMPI: Fragments Matrix Property Indices

Code of SMPI descriptors

| Gene | A _P | D _M | I _D | M _O | L _O |
|--------|----------------|----------------|----------------|----------------|----------------|
| Genome | A | T | E | m | I |
| | B | G | U | M | R |
| | C | U | D | I | L |
| | D | | P | J | |
| | E | | | E | |
| | F | | | F | |
| | G | | | | |
| | | | | | |

$$\text{SMPI} = L_O \times M_O \times I_D \times D_M \times A_P$$

Ex.: ImETA (first), LFPUG (last)

Ref: Bolboacă & Jäntschi 2016

Code of FMPI descriptors

| Gene | F _C | A _P | D _M | I _D | M _O | L _O |
|--------|----------------|----------------|----------------|----------------|----------------|----------------|
| Genome | S | A | T | E | m | I |
| | M | B | G | U | M | R |
| | N | C | U | D | I | L |
| | | D | | P | J | |
| | | E | | | E | |
| | | F | | | F | |
| | | G | | | | |
| | | | | | | |

$$\text{FMPI} = L_O \times M_O \times I_D \times D_M \times A_P \times F_C$$

Ex.: ImETAS (first), LFPUGN (last)

Ref: SMPI + F_C → FMPI

Calculation details: in the paper

Major advantage: fits on physical interactions

Major disadvantage: small sized families

Unique feature: freely online available for calculations

Software & data analysis (v.2016)

- [01_generate]
 - [mdf]
 - mdf_2004.php
 - mdf_2015.php
 - mdfv2008.php
 - [other]
 - chfp2015.pas
 - fmpi2015.php
 - sapf2011.pas
 - smpi2014.php
 - [compactize]
 - mdfx_compactize.php
 - otherscompactize.php
- [02_filter]
 - sort_all.php
 - families_join.php
- [03_properties]
 - gen_property_files.php
 - chi_distribution.php
- [04_regressions]
 - r1v_all.pas
 - $Y \sim aX + (b)$
 - r2f_all.pas
 - $Y \sim aX_1X_2 + (b)$
 - $Y \sim aX_1 + bX_2 + (c)$
 - $Y \sim aX_1 + bX_2 + cX_1X_2 + (d)$

Analysis steps

- Molecular modeling of structure with dedicated software
 - Topology, geometry & partial charges required from
- Generation of the molecular descriptors
 - [01_generate]Software from {[mdf] or [other]} & [compactize] → {fam_name}_r.asc file
- Filtering (no identical responses allowed)
 - [02_filter] → {fam_name}_t.asc file
- Structure-property association files
 - [03_properties] & properties.asc → {fam_name}_{prop_name}.txt file
- Regression
 - r1v_all.exe & {all}.txt → r1_{all}.txt
 - r2f_all.exe & r1_{all}.txt → rX_r1_{all}.txt

Features (2016)

- Revising of the molecular modeling strategy to import partial charges from post-HF and DFT calculations & to use Spartan i/o files (in preliminary stage)
- Standardization of the input & output for each family calculation (at stage [01_...])
- Possibility to join the pools of families descriptors (at stage [02...])
- Parallelization of all software (all stages) to use any arbitrary CPU number value (very useful for multi-core computers)

Conclusions – take away issues

- The estimating (& predicting) power of a model depends on the pool from which was extracted ('the family' here).
- Both diversity & size of the pool counts.
- Prerequisites (tests on the sampled data) and post-requisites (tests on the obtained association models) are both essential for the outcome of the analysis
- Applicability domain of a model is to be obtained from external sets by feeding the model with it and assessing the outcome

Thank you for your attention!

- Questions?