

# Interplay of physicochemical and structural features in ionic compounds and melts

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# *Why lanthanide halides?*

- Increasing technological importance
- Alloys production
- Lighting industry
- Nuclear waste processing
- Recycling of spent nuclear fuel
- Energy of future
- Electrodeposition of metals etc.

# *Outlines*

- New experimental data on selected divalent and trivalent lanthanide halide mixtures with MX
- Topology of phase diagrams
- Modeling and processing by statistical techniques of large data sets where our original results have been incorporated

# *Experimental techniques*

- High temperature calorimetry – *Calvet* Microcalorimetry
- Differential Scanning Calorimetry (DSC)
- Electrical conductivity measurements
- Reflectance and *Raman* spectroscopy

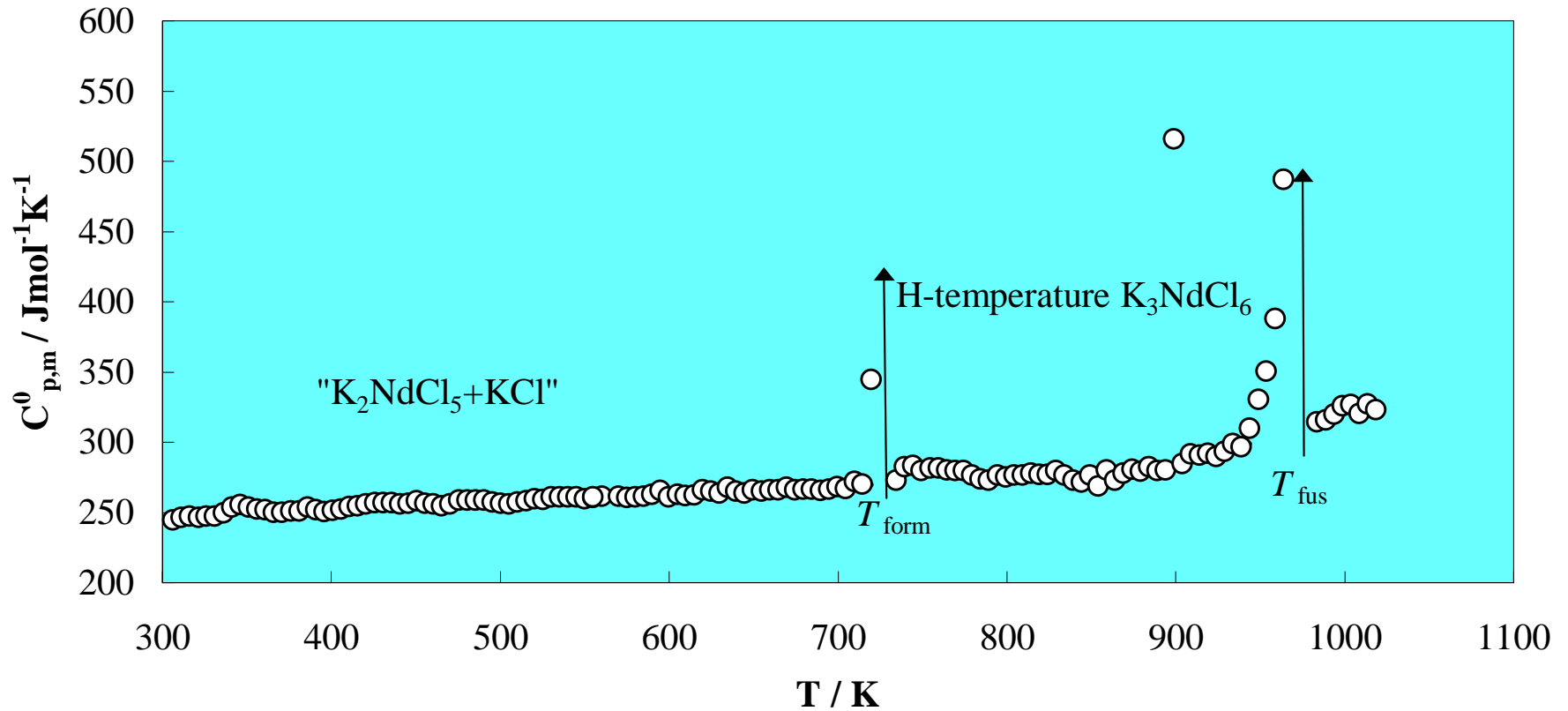
# $M_3LnX_6$ compounds (3:1 compounds)

- Compounds formed at higher temperatures in reaction between  $M_2LnX_5$  and  $MX$  - (reconstructive phase transition)
- Compounds stable or metastable at low temperatures (non-reconstructive phase transition)

- Compounds formed at higher temperatures have only high-temperature crystal structure (cubic, elpasolite-type)
- Formation of compounds at higher temperatures (reconstructive phase transition) is followed by high molar enthalpy( $\sim 30\text{-}50 \text{ kJ mol}^{-1}$ )

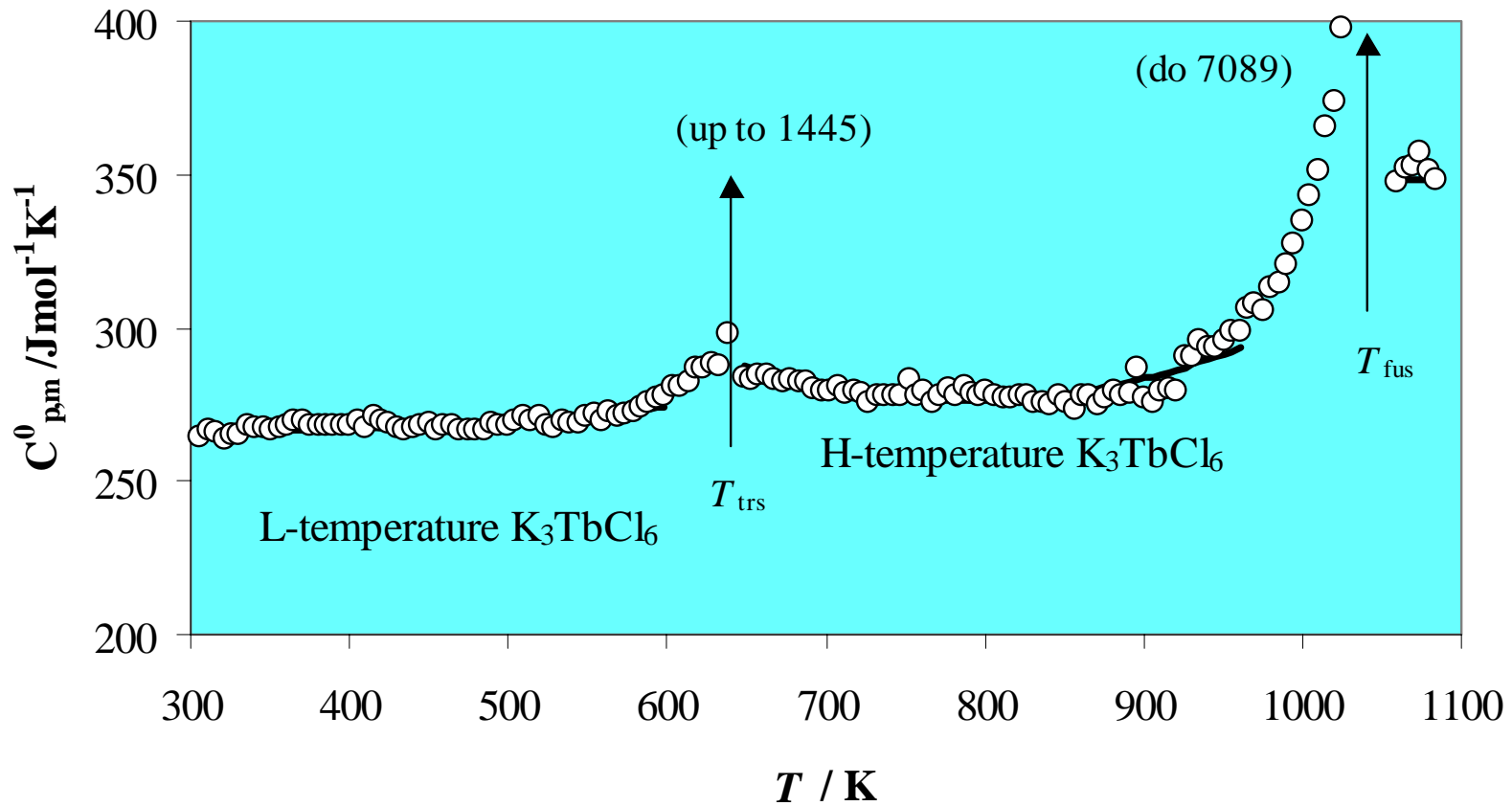
- Compounds stable or metastable at low temperatures have low-temperature (monoclinic,  $\text{Cs}_3\text{BiCl}_6$  - type) and high-temperature (cubic, elpasolite-type) crystal structures
- Transition from low- to high-temperature modification (non-reconstructive phase transition) is followed by significantly lower molar enthalpy ( 6-10  $\text{kJ mol}^{-1}$ )

# Heat capacity of $K_3NdCl_6$

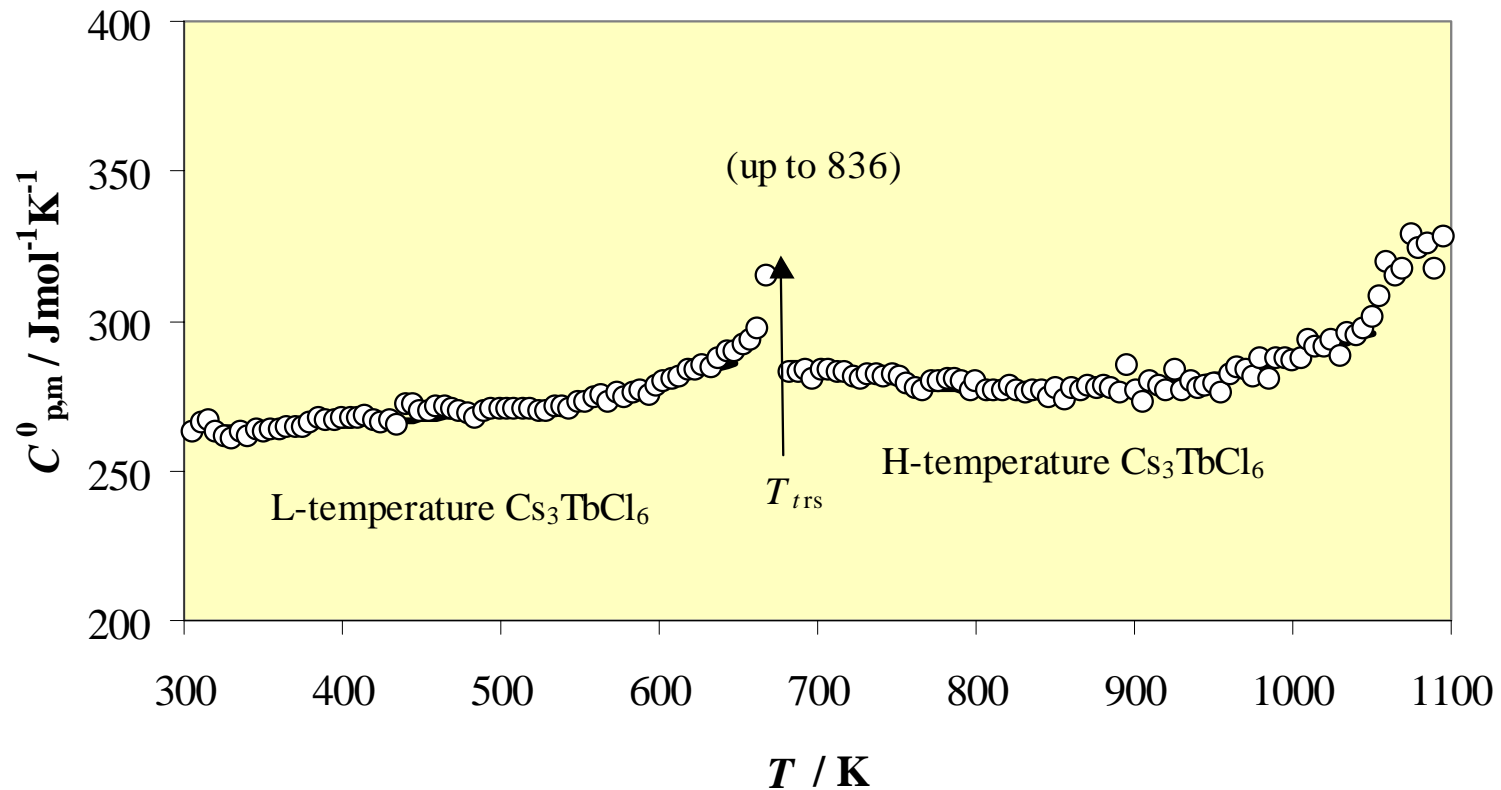




# Heat capacity of $\text{K}_3\text{TbCl}_6$



# Heat capacity of $\text{Cs}_3\text{TbCl}_6$



O 'Keefe and Hyde

«The Solid Electrolyte Transition and Melting in Salts»

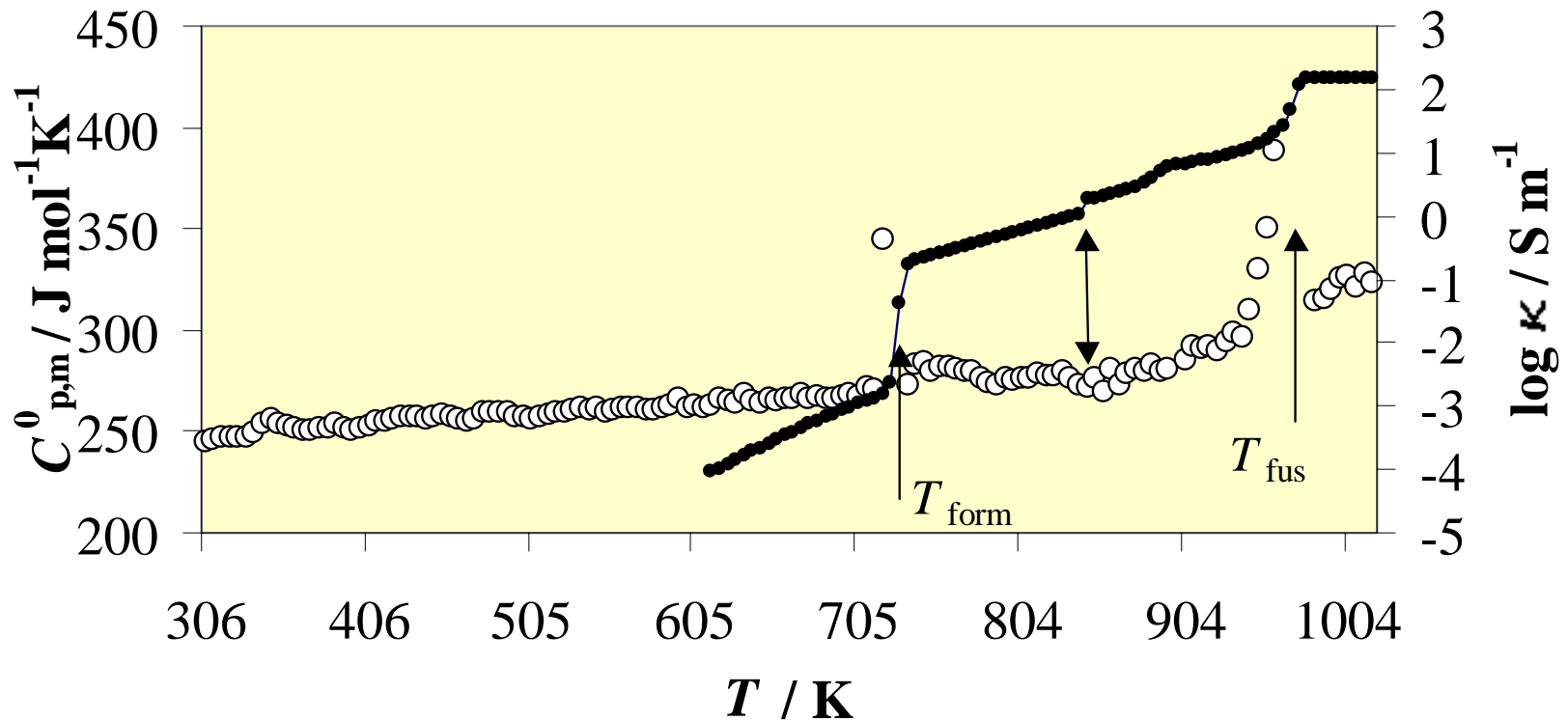
- Simple, quantitative model of solid electrolyte - electrolyte properties are the result of existing of disordered phase with ionic conductivity
- Crystals with solid electrolyte phases pass, either gradually, or through a series of phase transitions, from normal ionic conductivity ( $0.1 \text{ Sm}^{-1}$ ) to liquidlike values while still solid.

O 'Keefe and Hyde

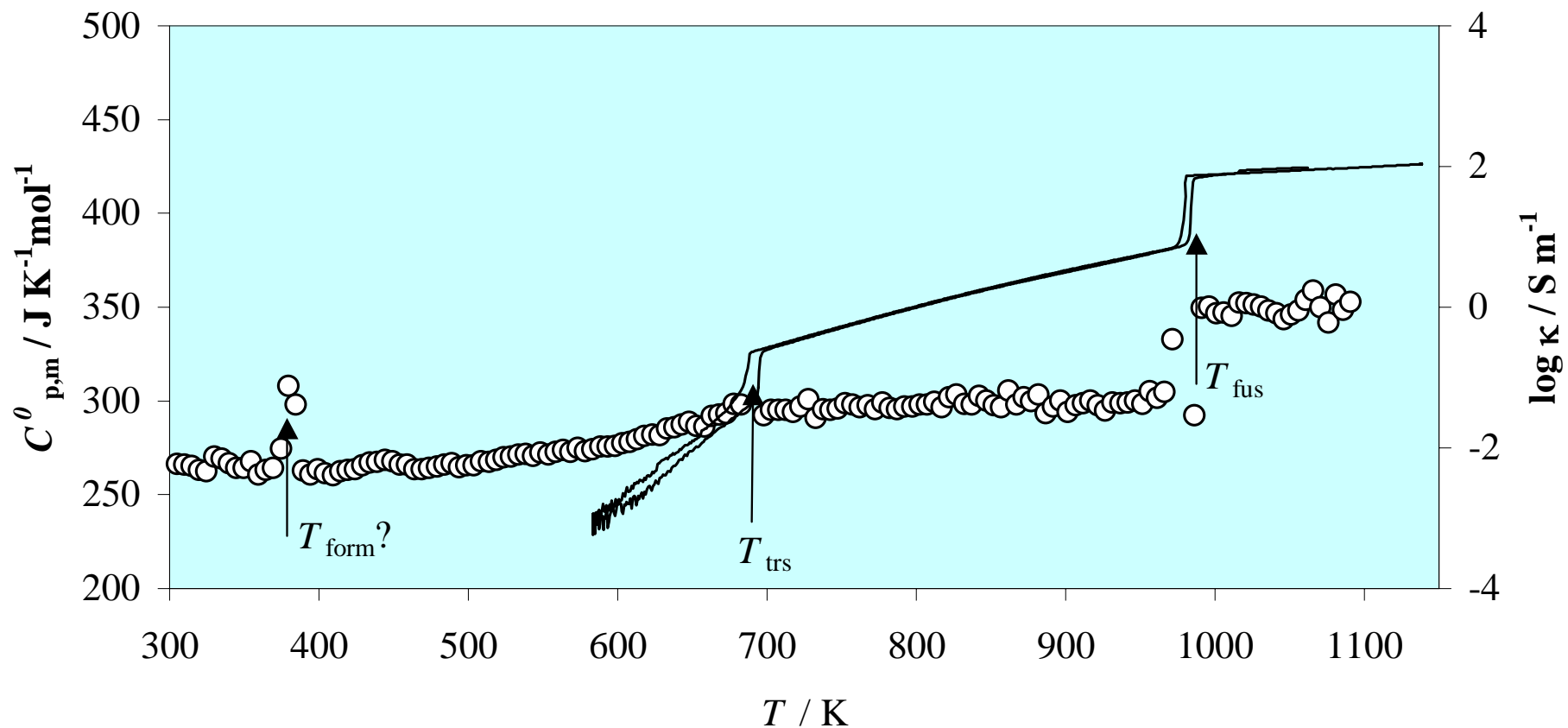
«The Solid Electrolyte Transition and Melting in Salts»

- Superionic phase is a result of sublattice « melting », that is, atoms on a certain set of lattice positions become mobile, almost liquidlike, while the remaining atoms retain their normal lattice positions

# Heat capacity and electrical conductivity of $K_3NdCl_6$



# Heat capacity and electrical conductivity of $\text{K}_3\text{TbBr}_6$



- Characteristic dependence of heat capacity and electrical conductivity of solid phase of  $M_3LnX_6$  compounds on temperature is a result of disordering of cationic sublattice formed by alkali metal cations
- Disordering of cationic sublattice in compounds that have only high-temperature modification takes place in a discontinuous way at compound formation temperature
- Disordering of cationic sublattice of compounds that have low- and high-temperature modifications takes place in a continuous way

# Phase diagram topology

- Ionic potential (IP):  $IP = z/r$  - for the systems with common anion
- $IP_M/IP_{Ln}$  essential for classification
- Approach valid for trivalent Ln halides
- Divalent Ln halides – less investigated – approach gives only general trends
- Influence of common ion?
- $\text{EuBr}_2\text{-MBr}$  compared with  $\text{SrBr}_2\text{-MBr}$  binaries



# *Ionic potential ratio and CeBr<sub>3</sub>-MBr phase diagrams ( $r_{\text{Ce}}=103 \text{ pm}$ )*

	$r_{\text{M}}$	$\text{IP}_{\text{M}}/\text{IP}_{\text{Ce}}$	Type of system
CeBr <sub>3</sub> -LiBr	74	0.464	Eutectic
CeBr <sub>3</sub> -NaBr	102	0.336	Eutectic
CeBr <sub>3</sub> -KBr	138	0.249	K <sub>3</sub> CeBr <sub>6</sub> , K <sub>2</sub> CeBr <sub>5</sub>
CeBr <sub>3</sub> -RbBr	149	0.230	Rb <sub>3</sub> CeBr <sub>6</sub> , Rb <sub>2</sub> CeBr <sub>5</sub> , <i>RbCe<sub>2</sub>Br<sub>7</sub>*</i>

\* Incongruently melting compound (in italic)

# SrBr<sub>2</sub>-MBr and EuBr<sub>2</sub>-MBr phase diagrams ( $r_{Sr}=140$ pm; $r_{Eu}=139$ pm )

System	$IP_M/IP_{Eu, Sr}$	Type of system	References
SrBr <sub>2</sub> -LiBr	0.946	LiSr <sub>2</sub> Br <sub>5</sub>	Belyaev1962
SrBr <sub>2</sub> -NaBr	0.686	Eutectic	Belyaev1962
SrBr <sub>2</sub> -KBr	0.507	K <sub>2</sub> SrBr <sub>4</sub> , KSrBr <sub>3</sub> , KSr <sub>2</sub> Br <sub>5</sub>	Bukhalov1966
SrBr <sub>2</sub> -RbBr	0.470	Rb <sub>2</sub> SrBr <sub>4</sub> , RbSrBr <sub>3</sub> , RbSr <sub>2</sub> Br <sub>5</sub>	Shurginov1969
SrBr <sub>2</sub> -CsBr	0.412	CsSrBr <sub>3</sub>	Riccardi1970
EuBr <sub>2</sub> -LiBr	0.939	EuSr <sub>2</sub> Br <sub>5</sub>	This work
EuBr <sub>2</sub> -NaBr	0.681	Eutectic	This work
EuBr <sub>2</sub> -KBr	0.504	K <sub>2</sub> EuBr <sub>4</sub> , KEuBr <sub>3</sub> , KEu <sub>2</sub> Br <sub>5</sub>	This work
EuBr <sub>2</sub> -RbBr	0.466	Rb <sub>2</sub> EuBr <sub>4</sub> , RbEuBr <sub>3</sub> , RbEu <sub>2</sub> Br <sub>5</sub>	This work
EuBr <sub>2</sub> -CsBr	0.408	CsEuBr <sub>3</sub>	Unpublished
SrCl <sub>2</sub> -LiCl	0.946	Eutectic	Belyaev1962
SrCl <sub>2</sub> -NaCl	0.686	Eutectic	Tokarev1956
SrCl <sub>2</sub> -KCl	0.507	K <sub>2</sub> SrCl <sub>4</sub> , KSr <sub>2</sub> Cl <sub>5</sub>	Belyaev1962
SrCl <sub>2</sub> -RbCl	0.470	RbSrCl <sub>3</sub> , RbSr <sub>2</sub> Cl <sub>5</sub>	Bukhalova1967
SrCl <sub>2</sub> -CsCl	0.412	CsSrCl <sub>3</sub>	Bergman1965
EuCl <sub>2</sub> -LiCl	0.939	Eutectic	Sun2002
EuCl <sub>2</sub> -NaCl	0.681	Eutectic	Rycerz2004c
EuCl <sub>2</sub> -KCl	0.504	K <sub>2</sub> EuCl <sub>4</sub> , KEu <sub>2</sub> Cl <sub>5</sub>	Fink1980
EuCl <sub>2</sub> -RbCl	0.466	RbEuCl <sub>3</sub> , RbEu <sub>2</sub> Cl <sub>5</sub>	Fink1980
EuCl <sub>2</sub> -CsCl	0.408	CsEuCl <sub>3</sub>	Fink1980

- The complete experimental investigation of all properties for the whole lanthanide series of bromides, either in the (III) and (II) valence state would be of course of unrealistic duration.
- Need for such data was claimed in a number of modern technologies
- This context was the trigger of the second part of this work, with the ultimate goal of predictions being the global properties of these materials

- Several informatic and statistical techniques play a significant role in data analysis and estimation of missing properties
- *Chemometrics* (data-based sub-discipline of chemistry)
- Molten salt systems are multivariate – data collected by *Janz* can be transformed by multivariate analysis into dynamic dataset for analysis and intercorrelation of the properties

- Two techniques:
  - Principal Component Analysis (PCA) and
  - Partial Least Squares (PLS)

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# *Principal Component Analysis (PCA)*

- Useful tool for data compression
- Data compressed into more compact space
- To identify patterns among the data and connections between variables

# *Partial Least Squares (PLS)*

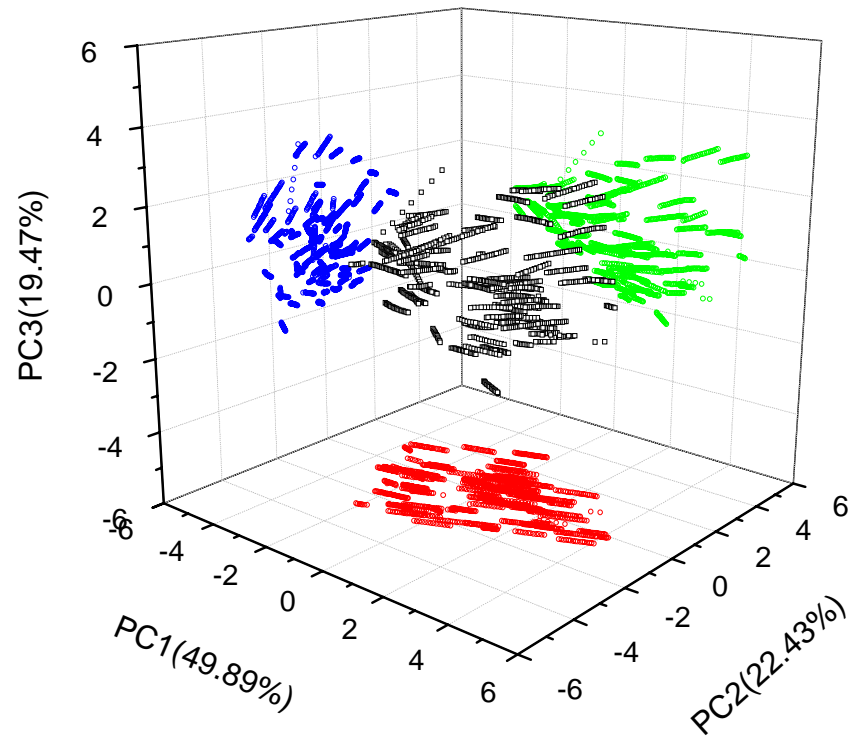
- Recent technique that generalizes and combines features from PCA
- Useful to make predictions
- In this work, two essential thermodynamic properties were predicted for the set of 14 lanthanide halides

# *PCA results*

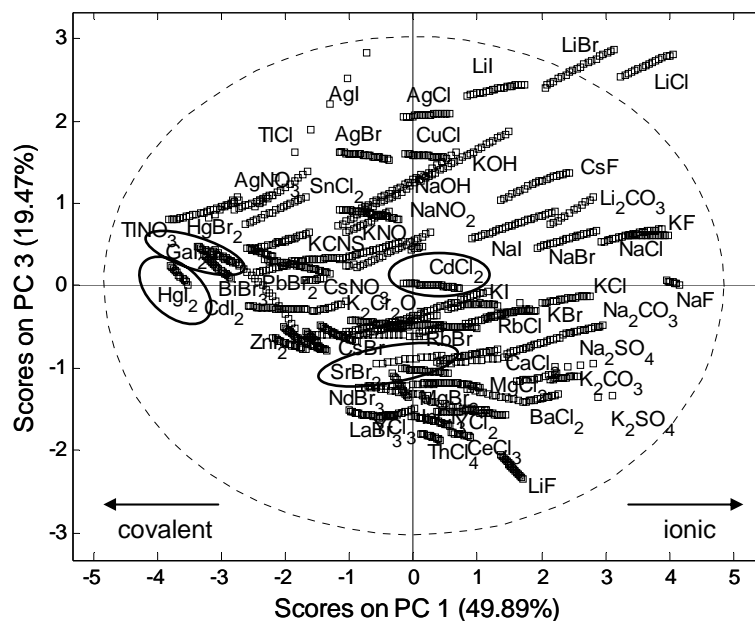
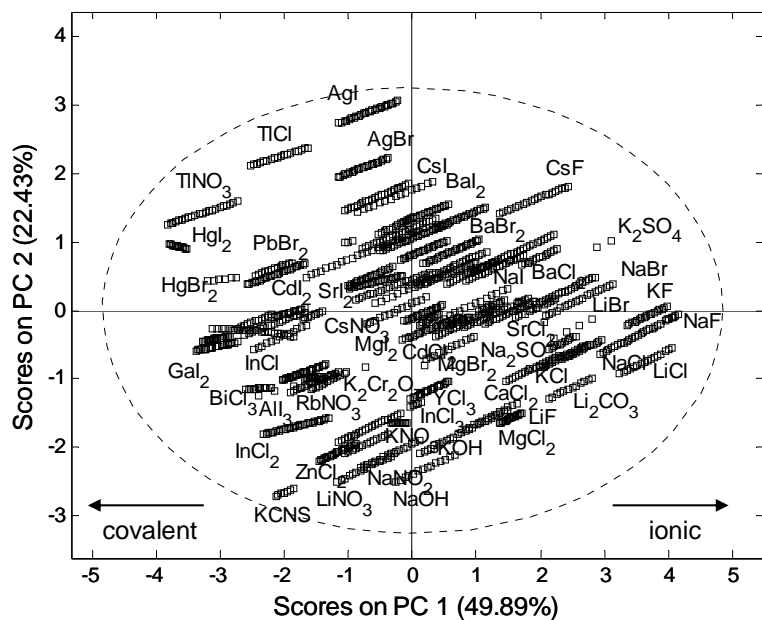
- Used data set derived from Janz, composed of seven variables for 1658 samples
- Results are PCs – linear combination of 7 descriptors (Equivalent weight, melting point, temperature, equivalent conductivity, specific conductivity, density and viscosity)
- Data from the matrix are compressed and visualized in three dimensional space
- This helps to identify compound/property relationship in a dataset of molten salts



# The 3 dimensional score plots for complete data



# Two interesting projections



# *PLS results*

- Data set for 19 different lanthanide halides obtained during our thermodynamic investigations was used for a multivariate analysis on  $\Delta H^0_{\text{form}}$  and  $\Delta G^0_{\text{form}}$  behavior
- Descriptors: equivalent weight, atomic number, electronegativity difference, cationic charge/radius ratio, melting temperature,  $\Delta H^0_{\text{form}}$  and  $\Delta G^0_{\text{form}}$

- In other words, without any information on  $\Delta H_{\text{form}}^0$  and  $\Delta G_{\text{form}}^0$  in the test set, it was possible to predict these quantities using the prediction model for training set
- The large  $R^2$  values 90.26% and 77.83% were obtained, indicating a high level of confidence for these predictions
- Experimental  $\Delta H_{\text{form}}$  values -856 and -811 kJ/mol for  $\text{CeBr}_3$  and  $\text{GdBr}_3$  were obtained. They are in good agreement with those obtained using the predictive model (-834.49 and -831.07 kJ/mol respectively)

# Results

Compound	Eq. weight	Atomic number	$\Delta E$	$Z_c/r_c$	$T_{\text{melt}}$ (K)	Temp. range (K)
<b>YbBr<sub>2</sub></b>	166	70	1.75	0.0172	1050	1100-1300
<b>YbI<sub>2</sub></b>	213	70	1.49	0.0172	1053	1100-1300
<b>EuI<sub>2</sub></b>	203	63	1.58	0.0153	853	900-1300
<b>SmCl<sub>2</sub></b>	111	62	1.99	0.0142	1132	1150-1300
<b>SmBr<sub>2</sub></b>	155	62	1.79	0.0142	973	1000-1300
<b>SmI<sub>2</sub></b>	202	62	1.53	0.0142	793	900-1300
<b>CeBr<sub>3</sub></b>	127	58	1.84	0.0261	995	1000-1300
<b>PrBr<sub>3</sub></b>	127	59	1.83	0.0267	966	1000-1300
<b>SmBr<sub>3</sub></b>	130	62	1.79	0.0273	937	1000-1300
<b>EuBr<sub>3</sub></b>	131	63	1.84	0.0276	975	1000-1300
<b>GdBr<sub>3</sub></b>	132	64	1.79	0.0278	1058	1100-1300
<b>DyBr<sub>3</sub></b>	134	66	1.76	0.0285	1152	1180-1300
<b>TmBr<sub>3</sub></b>	136	69	1.71	0.0285	1227	1240-1300
<b>YbBr<sub>3</sub></b>	138	70	1.75	0.0298	1229	1240-1300

# Conclusion

- Statistical approaches for identifying chemistry-property relationships in a classic materials database (molten salts) have been provided
- Results show that the original molten salts database is a good partial template for a modern data-mining base to be used for virtual materials design and analysis
- To complete this transformation, it is necessary to include structural and thermodynamical data in this database or closely relate it to other databases through well-designed linkages