

# Intact-cell MALDI TOF mass spectrometry for monitoring of stem cell cultures

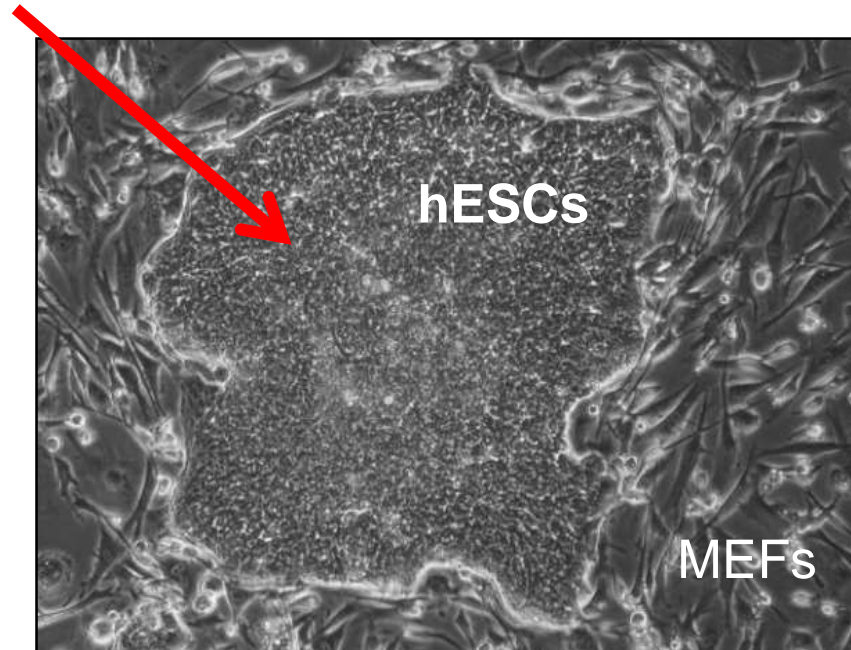
Petr Vaňhara

[pvanhara@med.muni.cz](mailto:pvanhara@med.muni.cz)

# Human embryonic stem cells (hESCs)

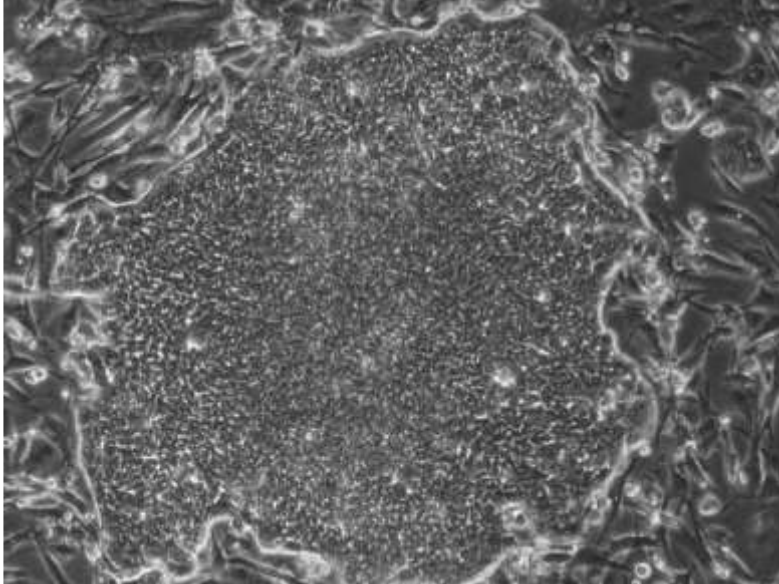


- embryoblast of pre-implantation blastocyst
- pluripotency
- capable of infinite self-renew *in vitro*
- source for cell-based therapy, regenerative medicine and tissue engineering
- 2003: derivation of own hESCs lines by P. Dvorak P and A. Hampl



**... raised hopes and expectations**

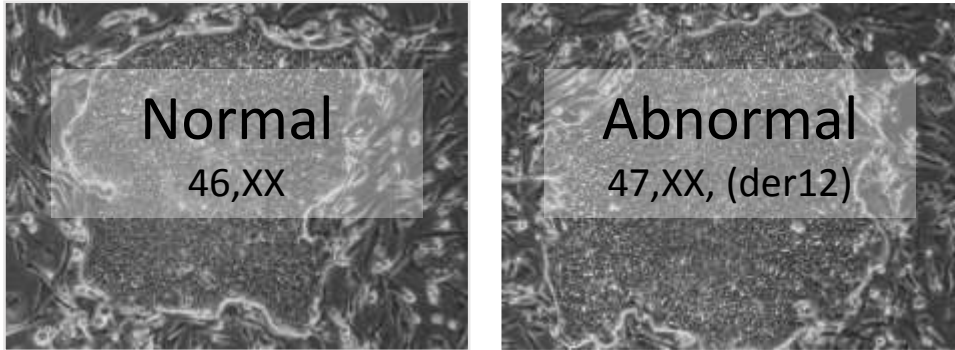
# Long-term hESCs cultures produce aberrant hESCs



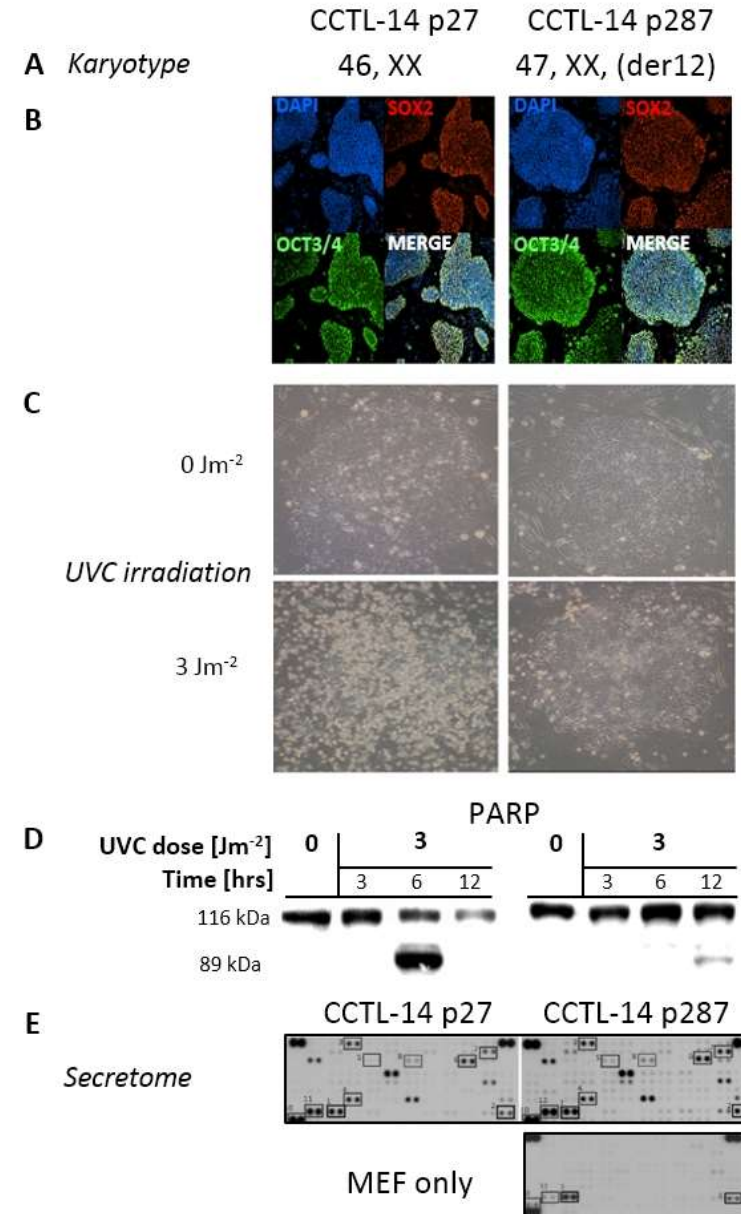
- chromosomal aberrations
- alterations of epigenomic landscape
- gene expression and phenotype shifts
  
- failure to differentiate
- cancer development
- immune rejection

**Development of aberrant cells in culture ...  
... applications in clinics are still hazardous**

# Identification of aberrant hESCs

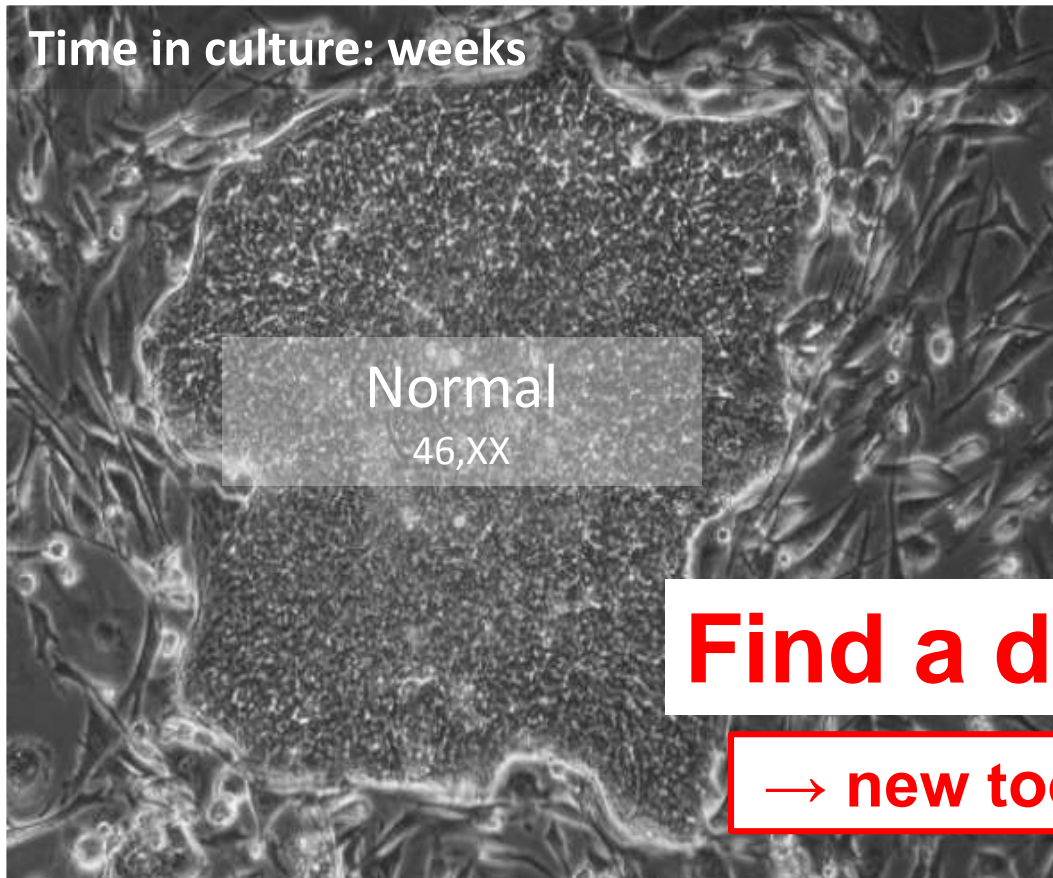


- deregulation of proliferation
- production of cytokines and immunomodulators
- resistance to cell death
- differentiation shifts
- cancer-prone phenotype



# Identification of aberrant hESCs

- at global levels, morphologically and genetically uniform
- high expression of stemness factors
- visual, molecular or STR authentication fails



**Find a difference!**

→ new tools required

# Intact-cell MALDI TOF MS

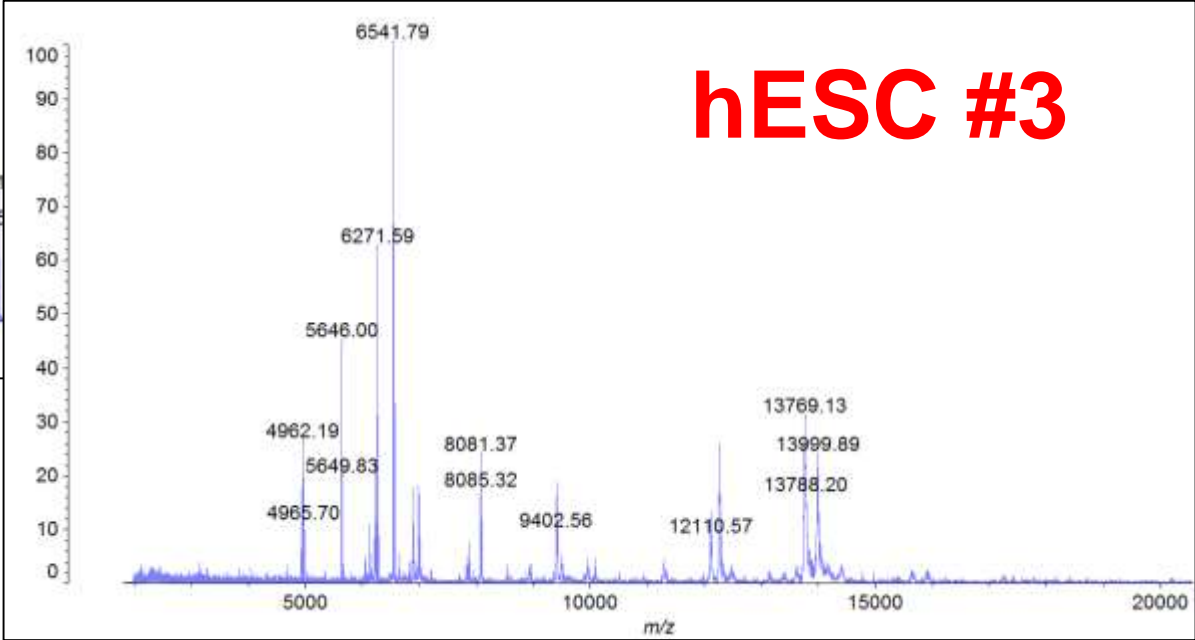
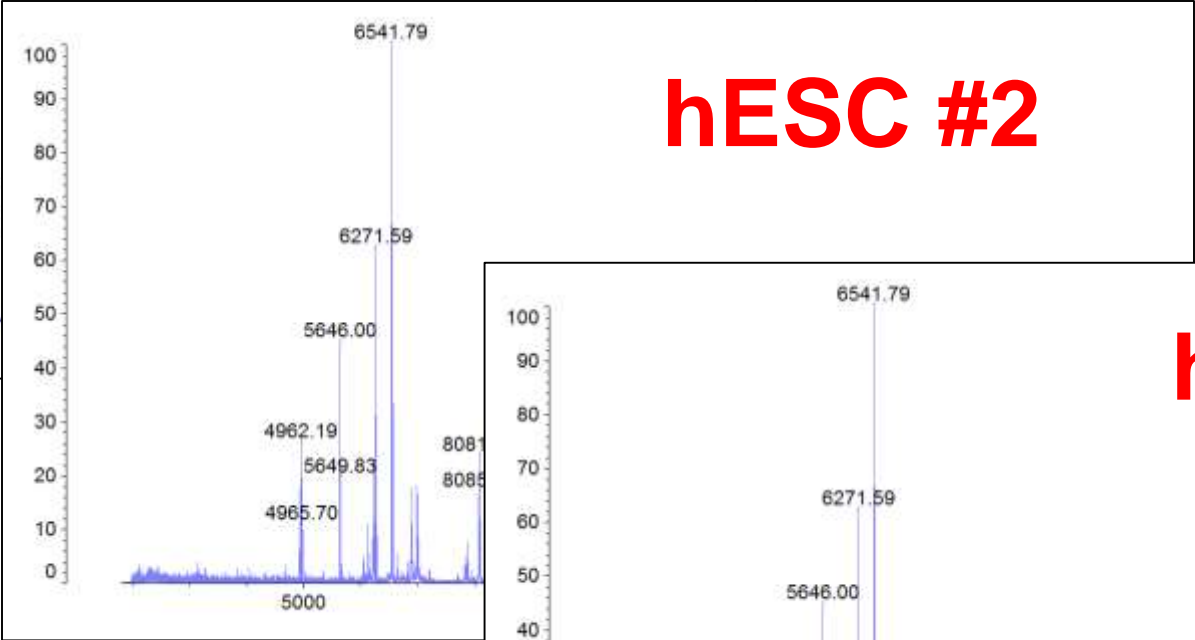
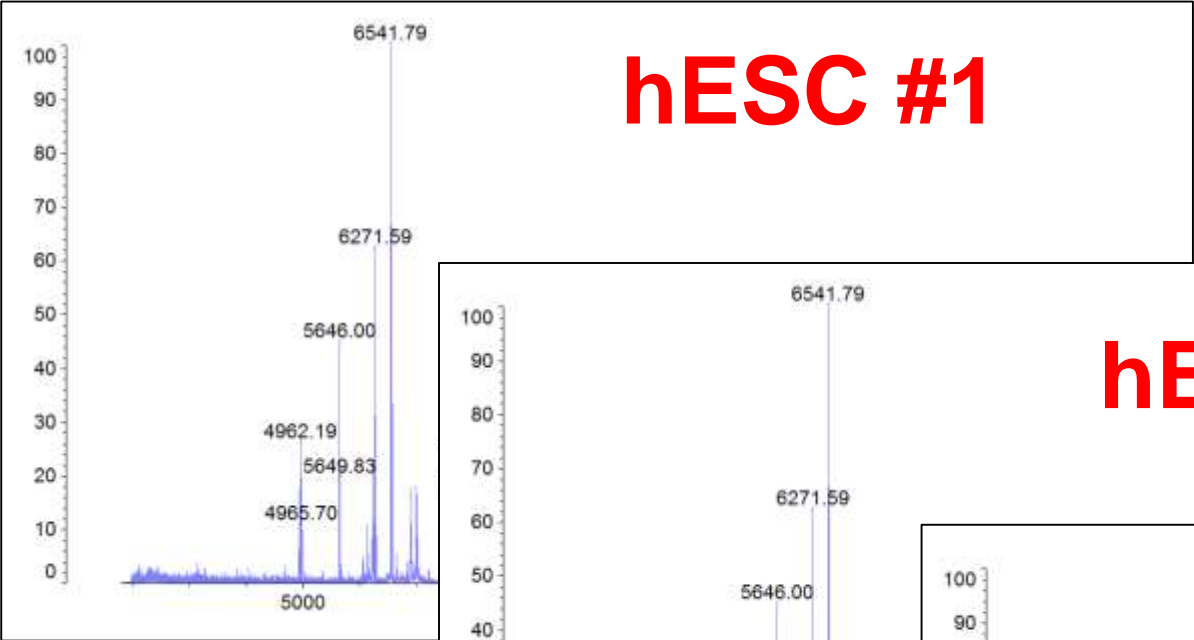
- robust, sensitive, feasible, affordable
- no extraction, fractionation, or compound isolation
- full mass spectrum reflects chemical composition of cells
- similar concept to bacterial biotyping

**Hypothesis:** Mass spectrum reflects unique chemical composition of highly complex biological samples and thus can provide effective tool for cell technology and clinical applications

# Intact-cell MALDI TOF MS



# Intact-cell MALDI-TOF MS



# Example of dataset

- “whole spectrum“ approach
- multivariate complex dataset

m/z

This screenshot displays a large, dense grid of data representing mass spectrometry results. The vertical axis is labeled 'Cases' and the horizontal axis is labeled 'm/z'. The data is organized into columns, with the first column containing case identifiers and subsequent columns containing numerical values representing relative intensities at specific m/z ratios. The grid is color-coded with a yellow header and a light blue background for the data cells.

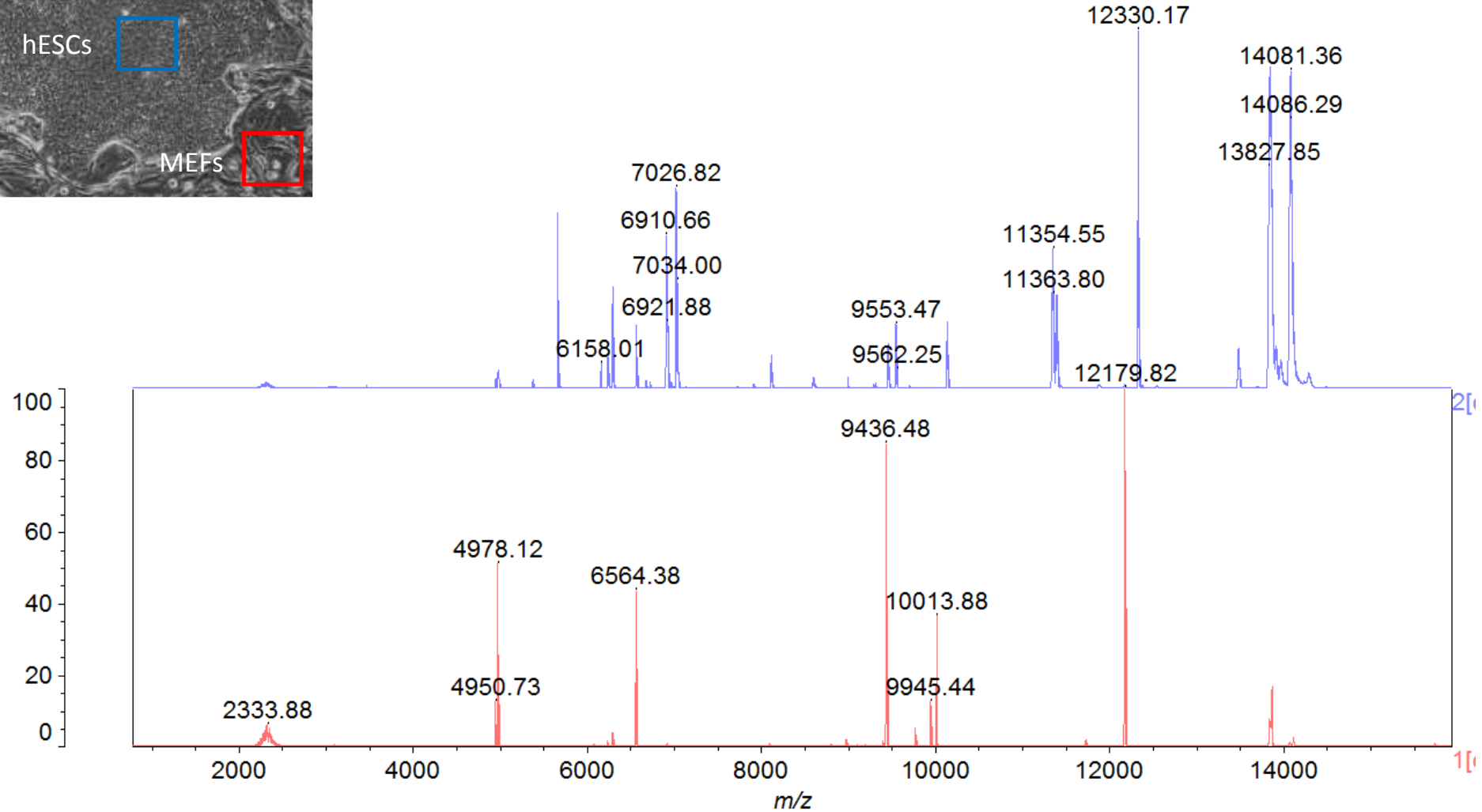
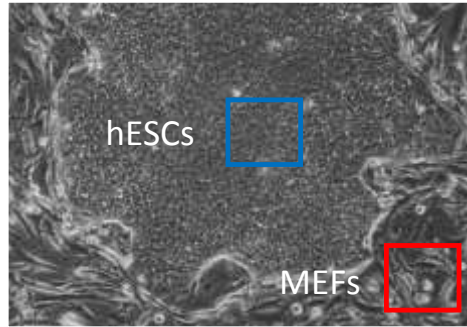
...

This screenshot shows the continuation of the mass spectrometry dataset grid, following the same structure as the first screenshot. It displays a dense array of numerical values for various cases across a range of m/z values.

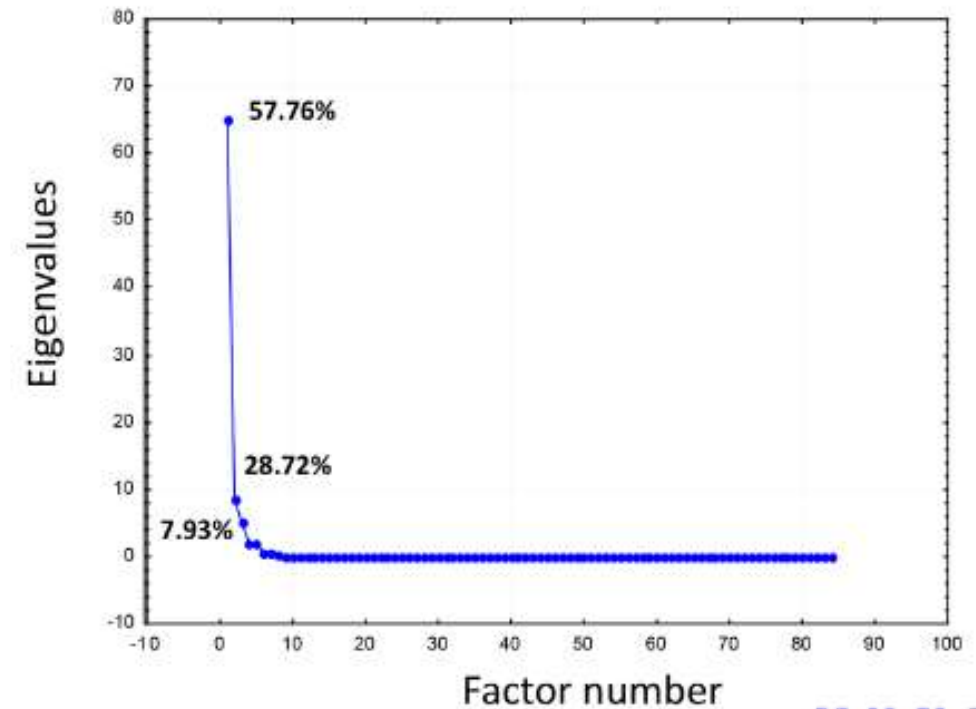
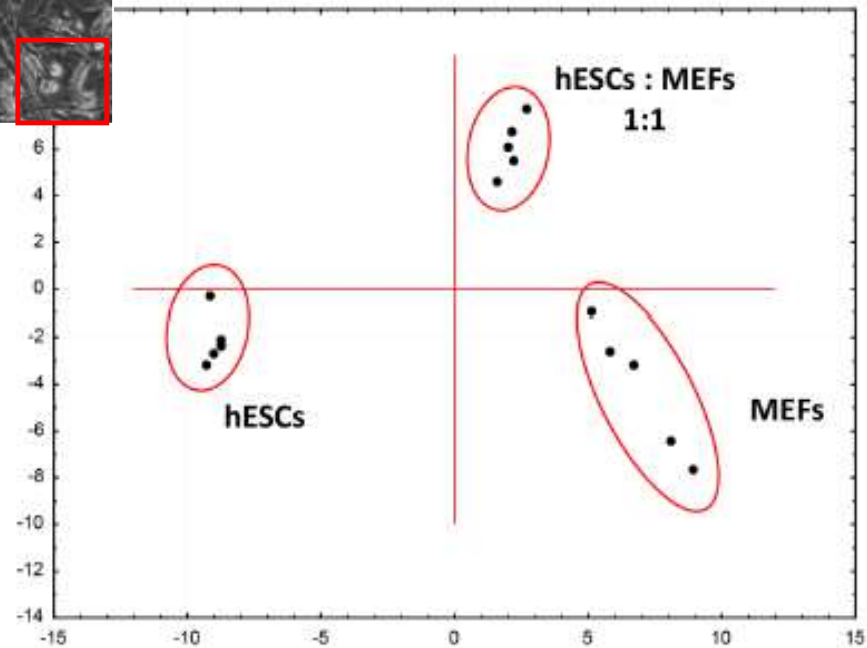
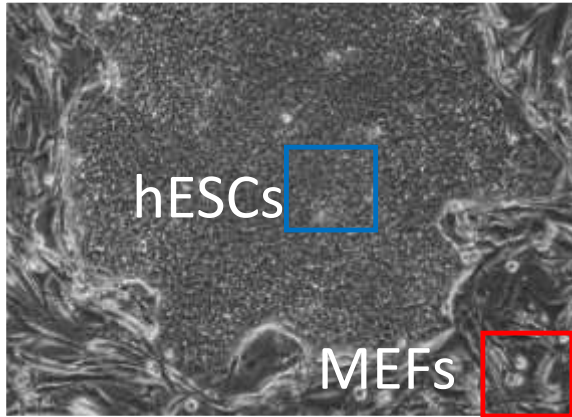
Cases

# Determination of cell types

# Identification of cell type by MS – proof of principle

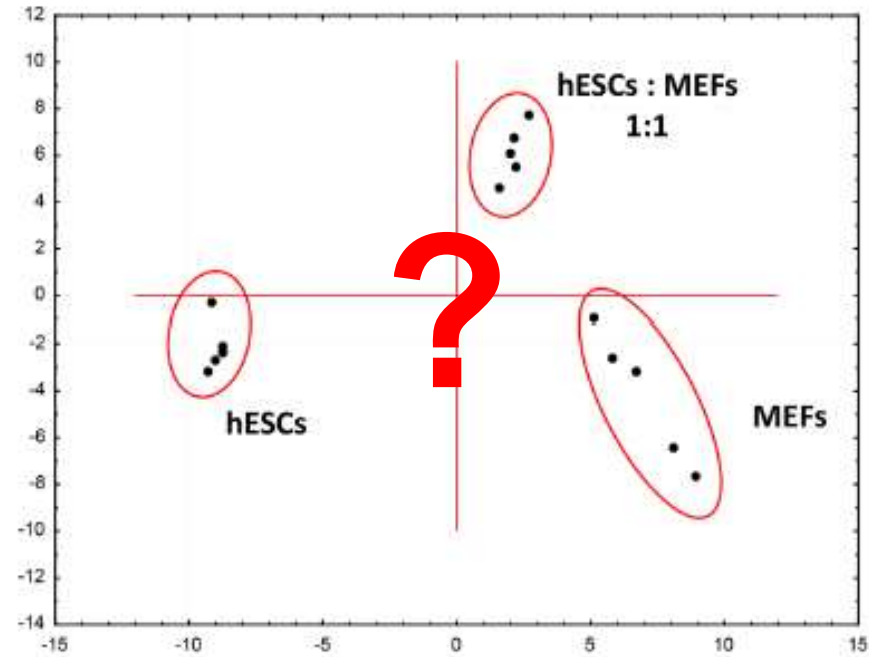
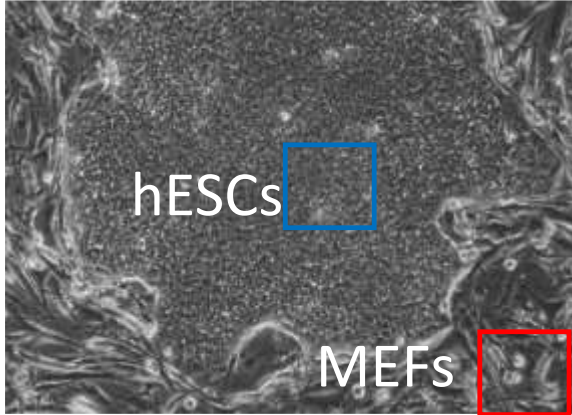


# Identification of cell type by MS – proof of principle



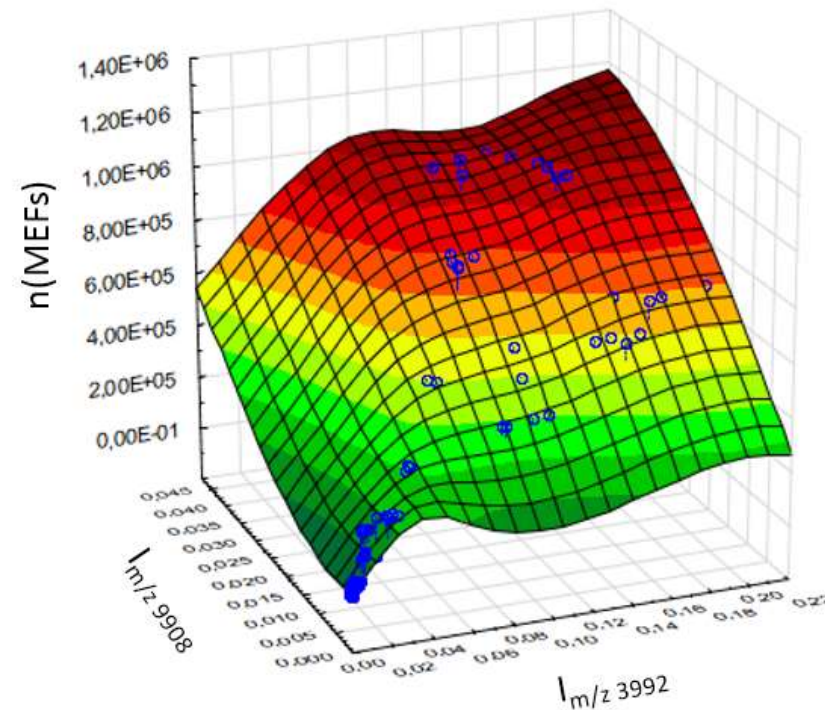
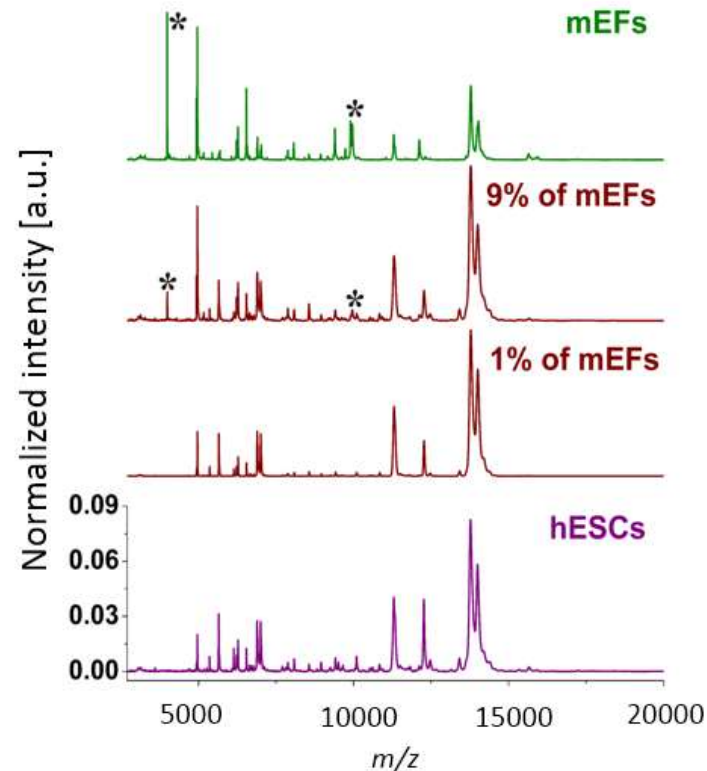
# Prediction of quantification of cell types in mixture

# Quantification of cell types in mixture



# Quantification of cell types in mixture

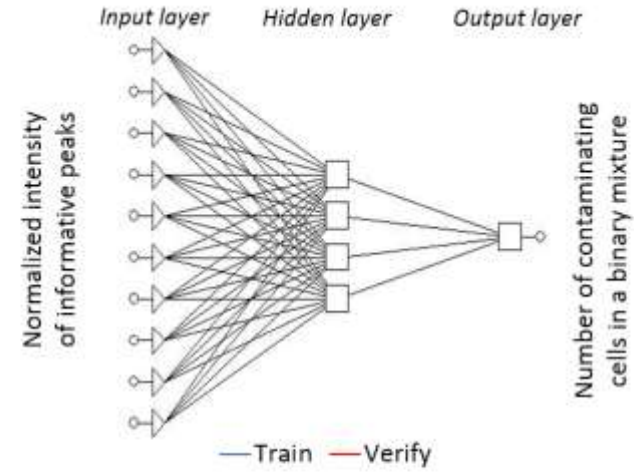
- “marker peak” approach **fails**
- problem of **non-linear** relations



# Quantification of cell types

- “Artificial intelligence” approach

Multilayer perceptron trained on a database of intensities of selected peaks ( $m/z$ ) annotated to a particular phenotype



ID	INPUT	OUTPUT
1	Intensities of $n$ peaks ( $n=20-100$ ) of defined $m/z$ (2-20 kDa)	Prediction of classification
2		
...		
ID <sub><math>n</math></sub>		

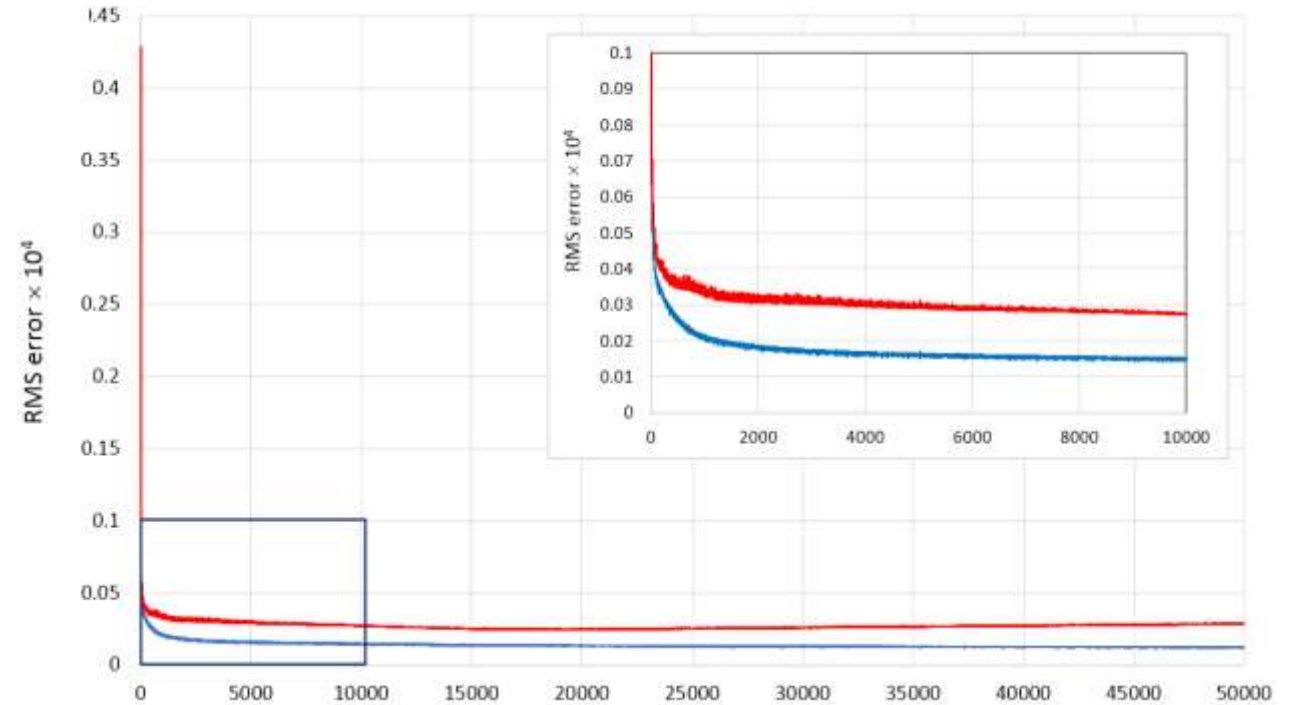


Known input

Unknown input

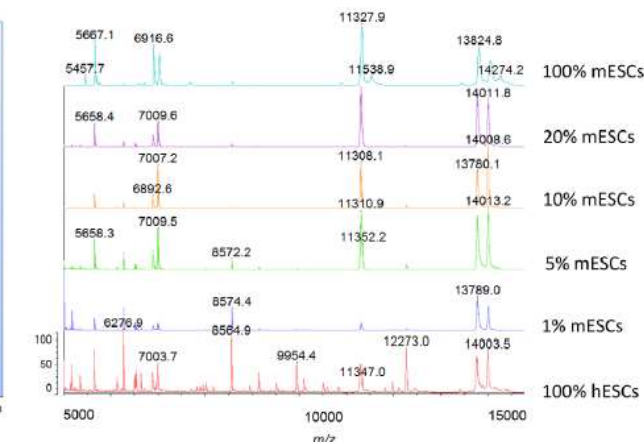
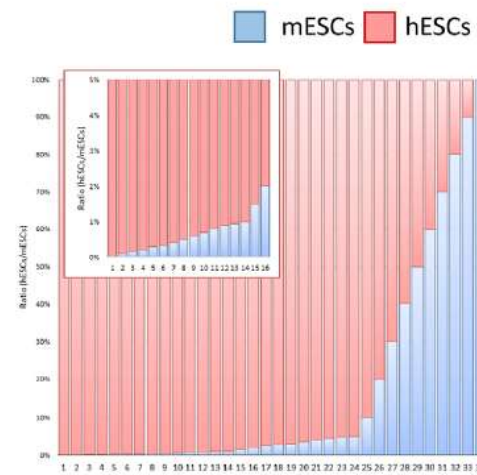
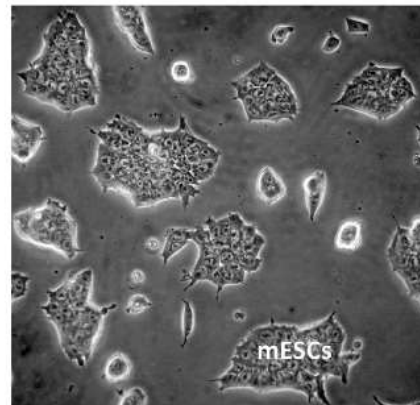
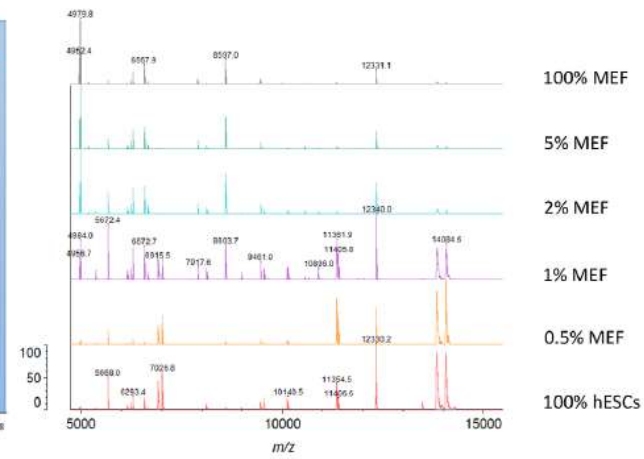
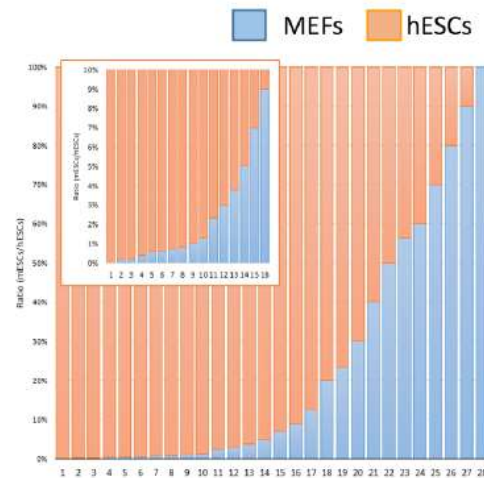
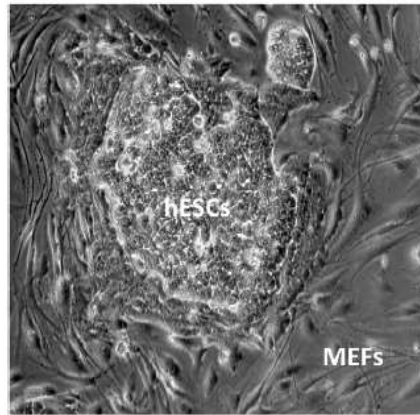
Assigned to known outputs

Output prediction



# Quantification of cell types

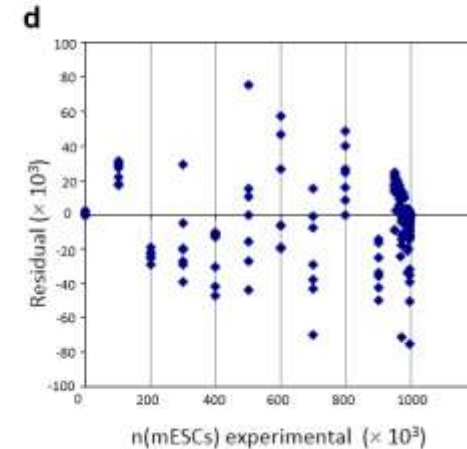
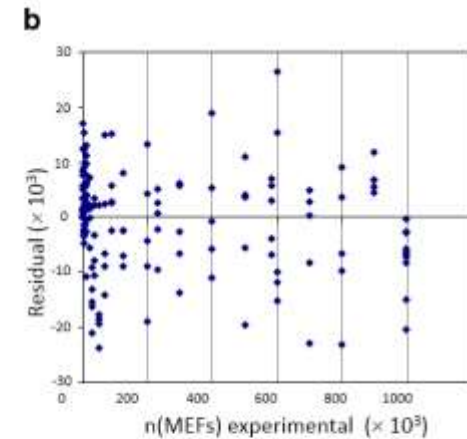
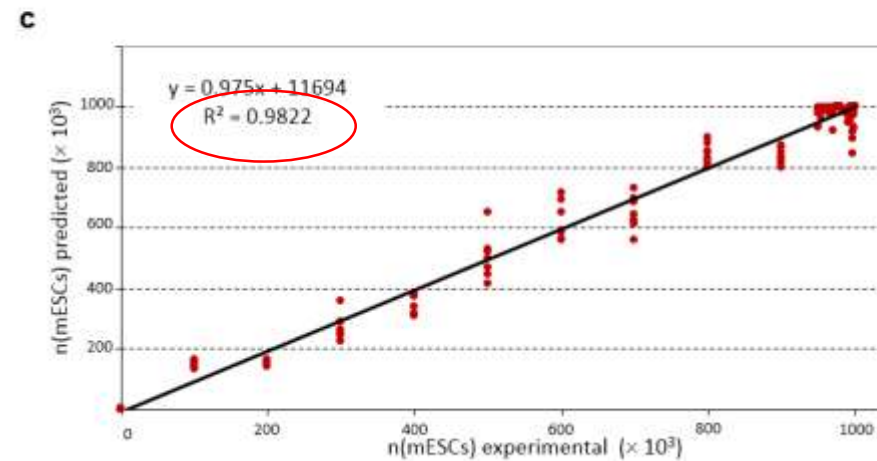
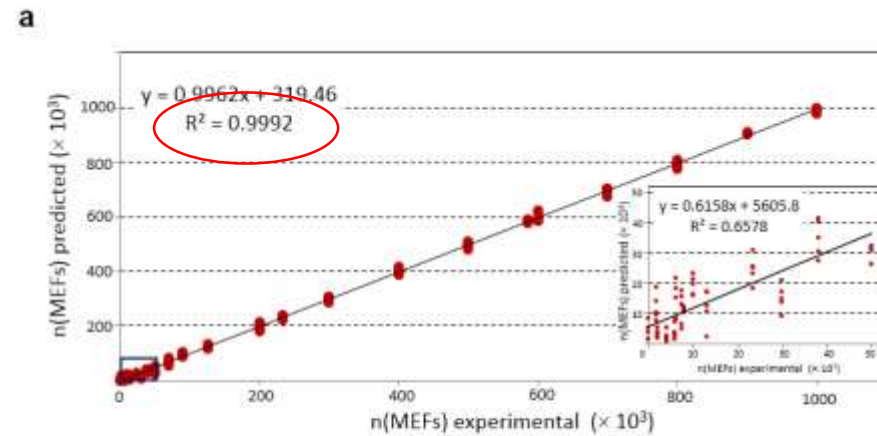
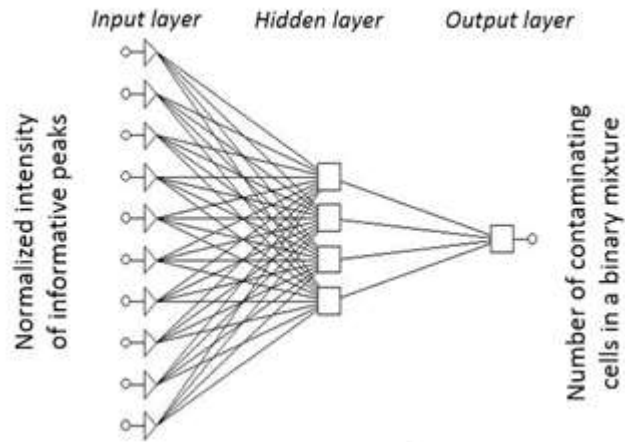
- Multivariate dataset based on binary mixtures of **hESCs : MEFs** or **hESCs: mESCs**



# Quantification of cell types

- Prediction by artificial neural network

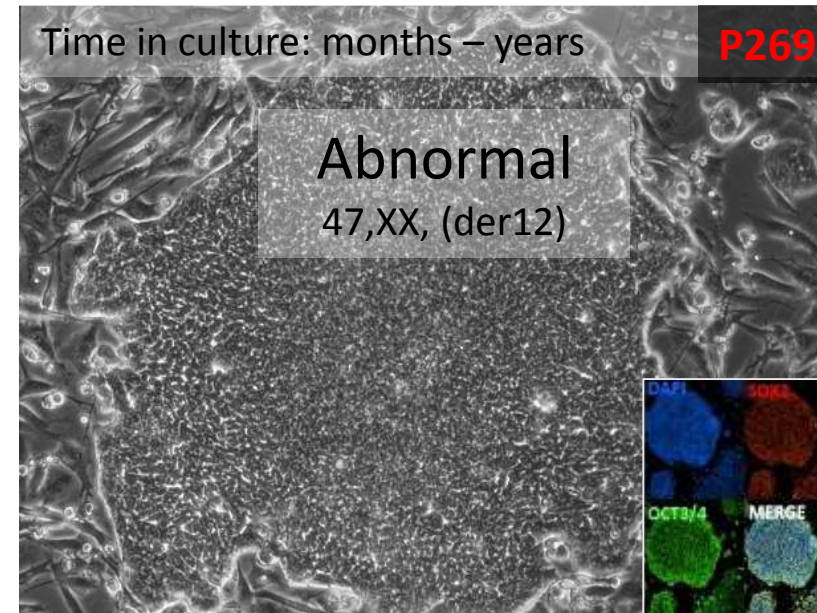
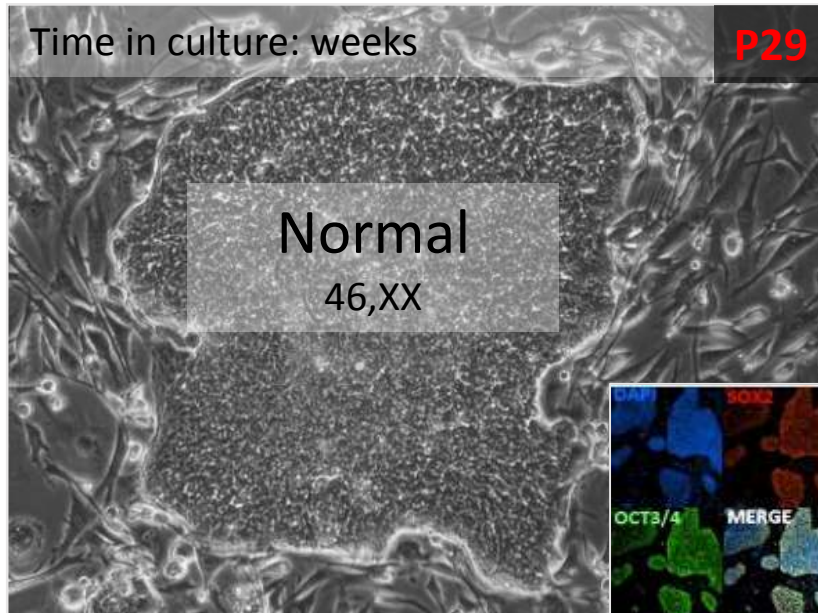
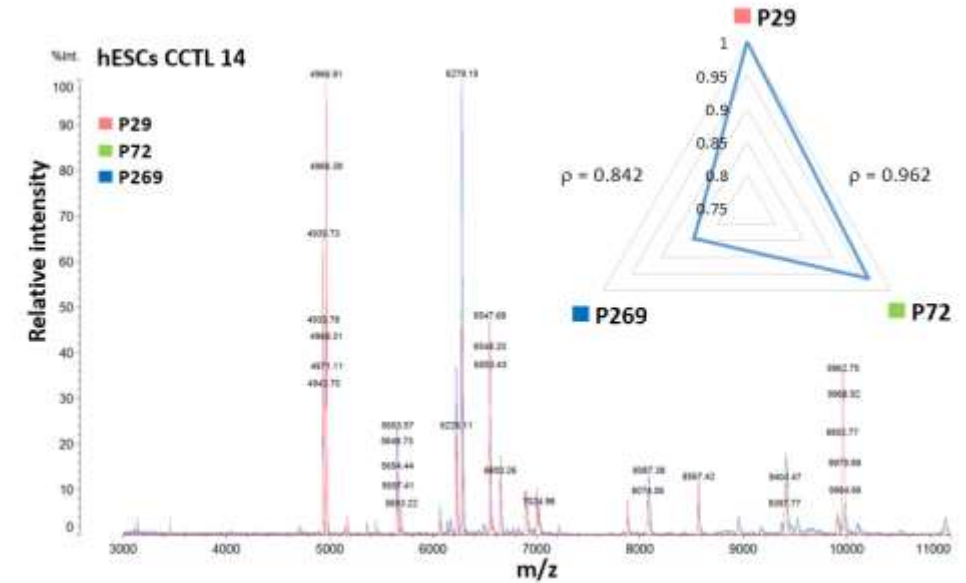
## Correlation of experimental and predicted values



# Real lab-life applications

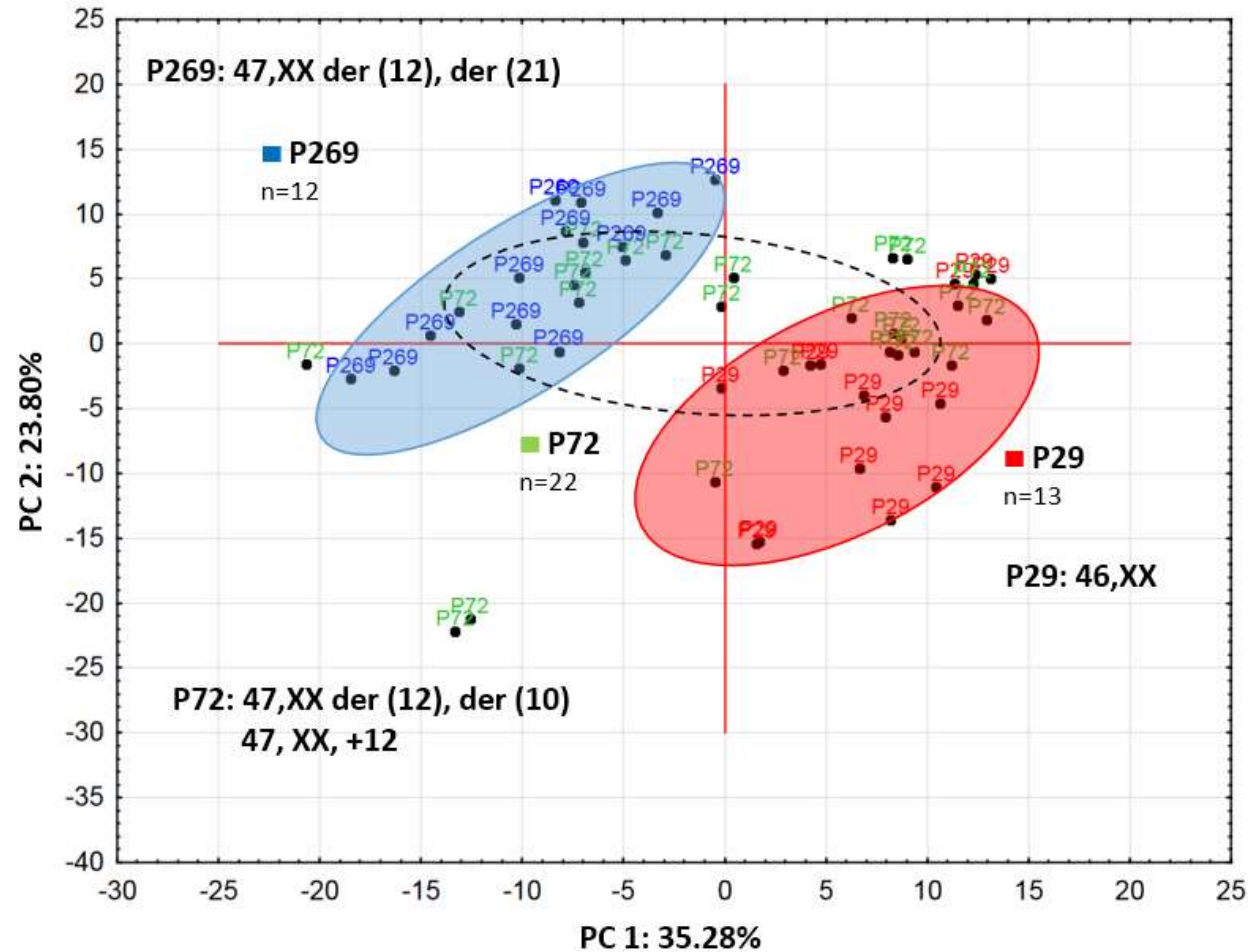
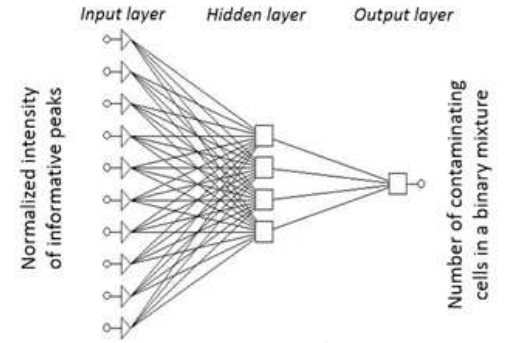
# Identification of aberrant hESCs

- identical morphology
- major molecular drivers with negligible fluctuation
- hazardous (cancer prone) phenotype



# Identification of aberrant hESCs

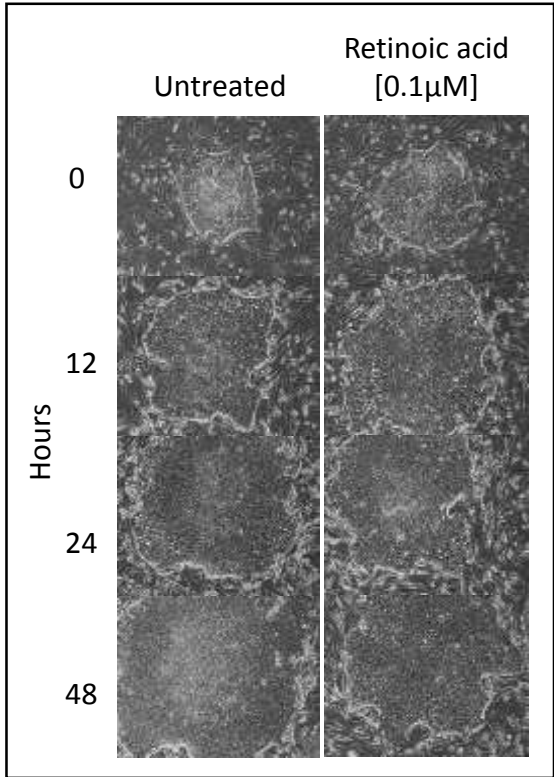
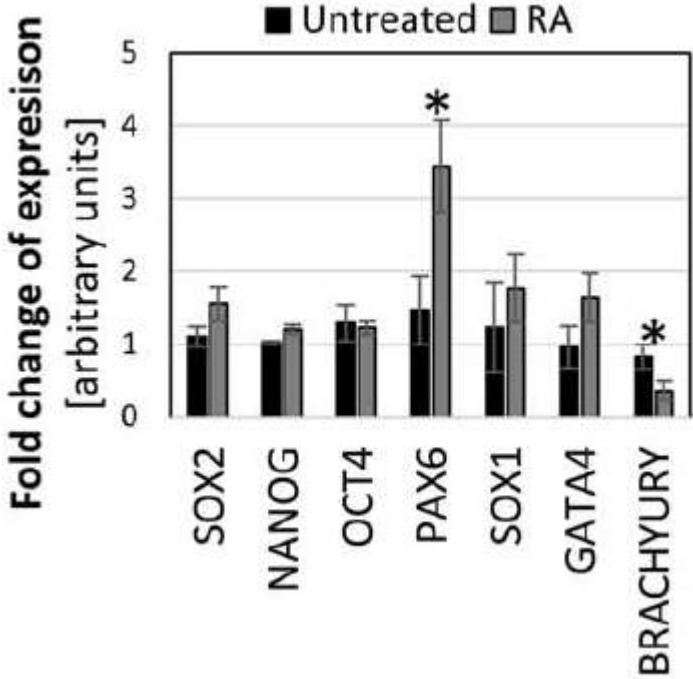
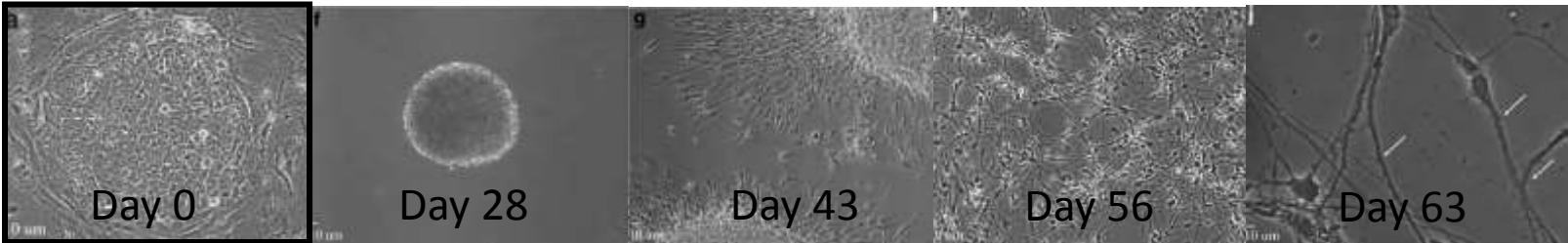
- based on mass spectrum fingerprints
- correct clustering by PCA



# Determination of hESC differentiation

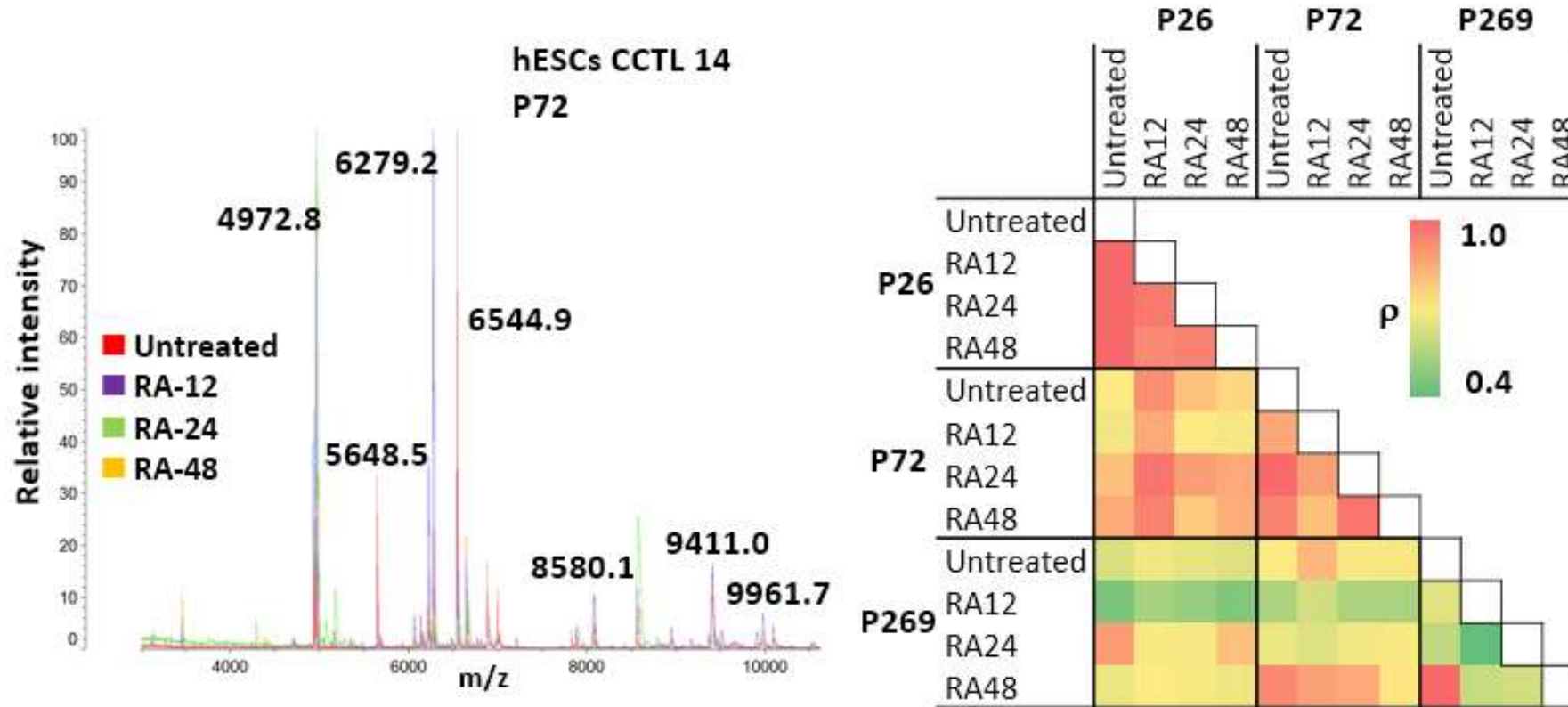
- Modelling retinoic acid-induced neuronal differentiation

Francis and Wei, Cell Death and Disease (2010)



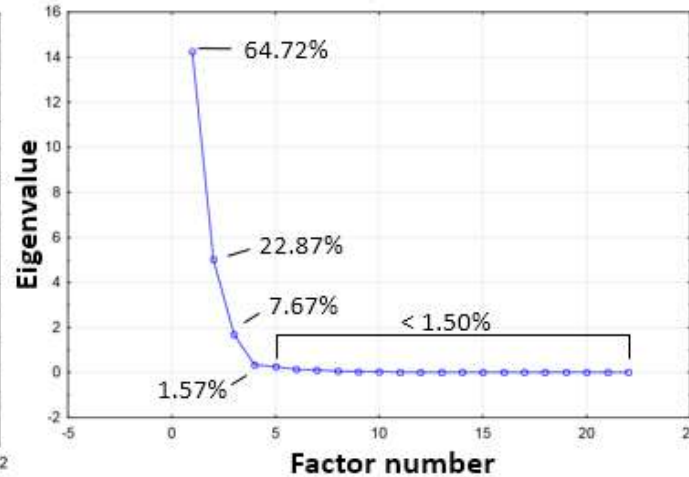
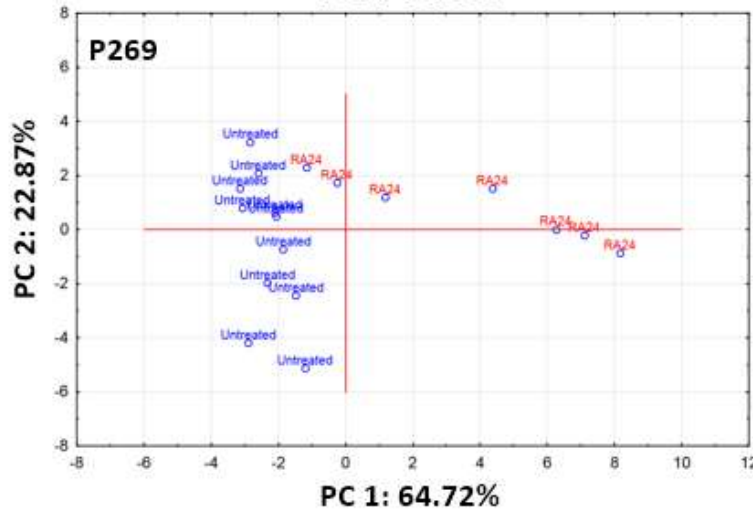
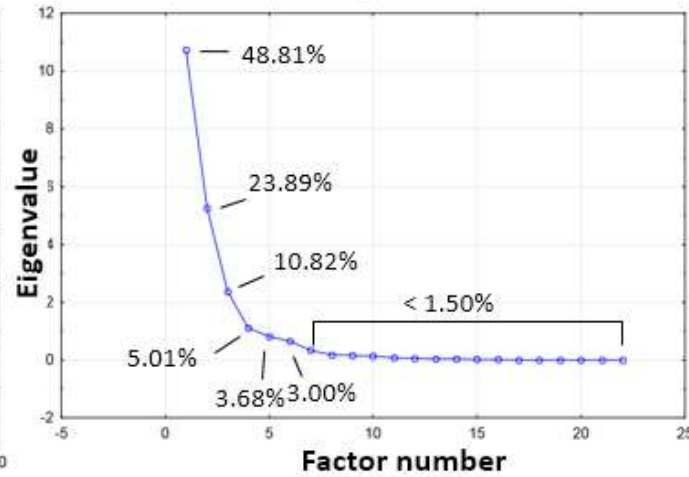
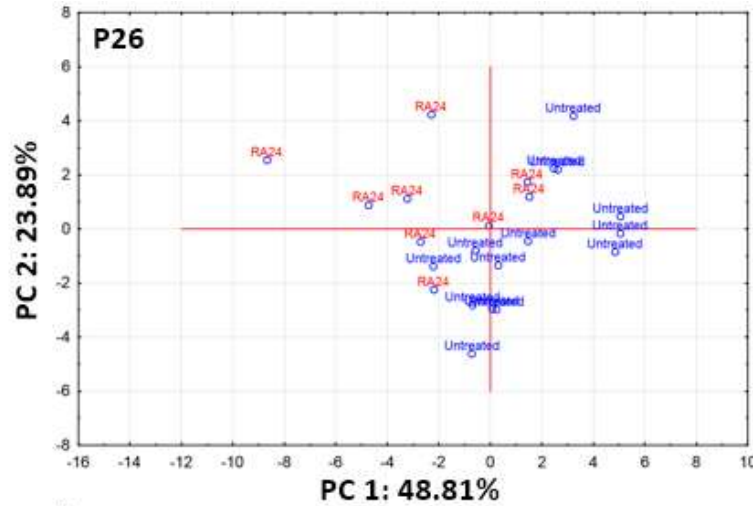
# Determination of hESC differentiation

- model of retinoic acid-induced neuronal differentiation



# Determination of hESC differentiation

- model of retinoic acid-induced neuronal differentiation



# Determination of hESC differentiation

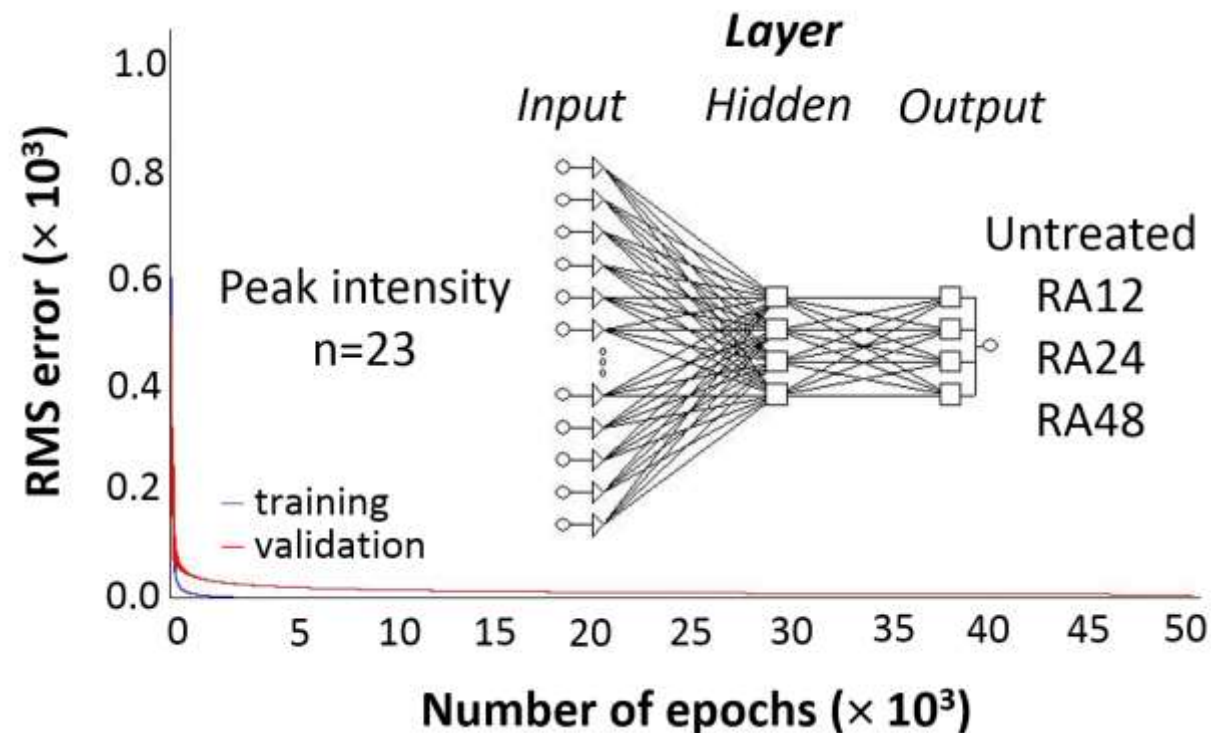
- ANN-based approach
- training using 23 peaks
- successful determination of “unknown” spectral fingerprint

Intact Cell Mass Spectrometry as a Quality Control Tool for Revealing Minute Phenotypic Changes of Cultured Human Embryonic Stem Cells

PETR VAVRANA<sup>1,2,3</sup>, LUKAS KUCERA<sup>1,2</sup>, LUBOMIR PROKES<sup>1</sup>, LUCIE JUREKOVÁ<sup>1</sup>, ELADIA MARIA PERA-MENDOZA<sup>2</sup>, JOSEF HAVEL<sup>1</sup>, ALES HAMEL<sup>1,2</sup>

Key Words: Embryonic stem cells • Cell culture • Differentiation • Technology • Tissue engineering

recognized by stem cells biology community as a promising approach (Stem Cells Portal 2018)



# Intact cell MS for cell biotyping

## Strengths

- simple, robust, affordable
- biomarker-free
- intuitive, straight-forward
- high reproducibility within datasets
- discrimination of unapparent but critical alterations in stem/ progenitor cells that are not detected by other techniques
- clinical applications (diagnostics, quality control, clinical grade cell technology)

## Weak points

- inter-instrumental variability
- high number of low intensity peaks
- calibration sensitivity
- data processing
- ANN overtraining
- careful translation to routine application or commercialization

**Thank you for  
attention**