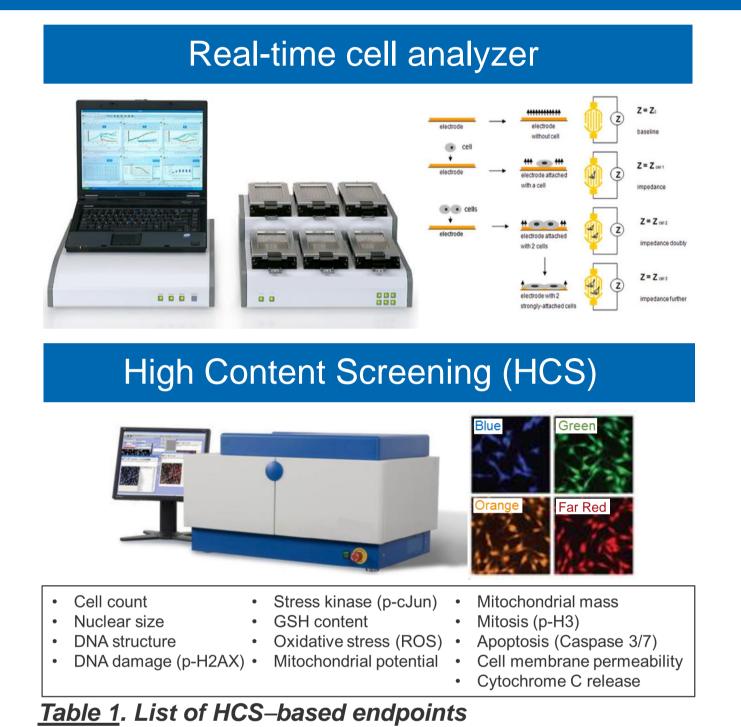
# High Content Screening analysis of the Biological Impact of Harmful / Potentially Harmful Constituents of **Tobacco Smoke**

### INTRODUCTION

Exposure to cigarette smoke (CS) causes lung toxicity and increases the risk of developing chronic obstructive pulmonary disease and cancer [1]. CS is a complex aerosol with over 6000 chemicals. Thus, it is difficult to determine individual contributions to overall toxicity, as well as the molecular mechanisms by which smoke constituents exert their effects. Previously [2], we performed a systems toxicology evaluation of a subset of 14 CS constituents categorized as harmful/ potentially harmful constituents (HPHCs) of tobacco smoke by the U.S. Food and Drug Administration [3]. Here, we investigated the biological impact of additional 32 HPHCs using normal human bronchial epithelial (NHBE) cells. Cytotoxicity was evaluated using an impedance-based, multi-electrode array system. Additionally, 13 multi-parametric indicators of cellular toxicity were measured via high content screening (HCS) assays over a wide range of concentrations and at different time points (4h and 24h). Based on the HCS results, 10 HPHCs were selected for microarray-based transcriptome analysis followed by a computational approach leveraging mechanistic network models to further identify and quantify perturbed molecular pathways.

## MATERIAL AND METHODS



#### Network Perturbation Amplitude (NPA)

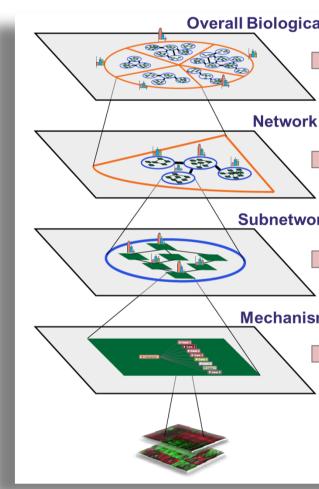


Figure 1. NPA scoring. By apply set of network models describing key biological processes (cellular stress, apoptosis, inflammation, DNA damage, senescence, etc.), NPA scoring enables the identification and the assessment of activated molecular mechanisms in response to HPHC exposure.

|               |                              |                                 | activ          | valed molecula |
|---------------|------------------------------|---------------------------------|----------------|----------------|
|               |                              | Se                              | lection of HPI | HCs            |
|               |                              |                                 |                |                |
| Arsenic (III) | <ul> <li>p-Cresol</li> </ul> | <ul> <li>Arsenic (V)</li> </ul> | Acrilamide     | Benzene        |
| Selenium (IV) | <ul> <li>m-Cresol</li> </ul> | Nickel (II)                     | Phenol         | • MEK          |

| Arsenic (III)<br>Selenium (IV)<br>Lead (II) | • | p-Cresol<br>m-Cresol<br>o-Cresol | • | Arsenic (V)<br>Nickel (II)<br>1-Aminonaphthalene | • | Acrilamide<br>Phenol<br>2-nitropropane | • | Benzene<br>MEK<br>Nitrobenzene | • | Benz [a] anthracene<br>Benzo [a] pyrene<br>Benzo [b] fluoranthene | Dibenzo [a,l] pyrene<br>Indeno [1,2,3-cd] Pyren |
|---|---|----------------------------------|---|--|---|--|---|--------------------------------|---|---|---|
| Mercury (II)<br>5-Methylchrysene            |   | o-Anisidine<br>Naphthalene       | • | Crotonaldehyde<br>Chromium (VI)                  | • | Acetamide<br>Acetone                   | • | Quinoline<br>Toluene           | • | Benzo [k]fluoranthene<br>Dibenz [a,h] anthracene                  |   |

## CONCLUSIONS

This study provides a comprehensive overview of the toxicity mechanism of a wide selection of HPHCs. While some constituents showed no toxicity in NHBE cells, HCS analysis allowed us to gain insight into the molecular mechanisms of toxicity for 17 out of 32 tested HPHCs.

✤ In a subset of 10 HPHCs, transcriptomic analysis followed by a computational approach leveraging mechanistic network models offered deeper understanding of the biological pathways impacted upon exposure. Moreover, these results from the transcriptomics analysis were in fully agreement with those from HCS.

The combination of systems biology tools and high-throughput toxicity assays is a valuable approach to investigate the molecular mechanisms of toxicity. The results from this study will be used to support the approach to develop a systems biology-based risk assessment for Reduced Risk Products (RRPs).

#### REFERENCES

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2. Gonzalez Suarez et al. Systems biology approach for evaluating the biological impact of environmental toxicants in vitro. Chem Res Toxicol. 2014. 3. U.S. Department of Health and Human Services, Food and Drug Administration, Center for Tobacco Products. Rockville. Harmful and Potentially Harmful Constituents in Tobacco Products and Tobacco Smoke. 2012.

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| al Impact | <u>Overall Biological Impact</u><br><u>Factor (BIF)</u> is computed as a<br>linear combination of network<br>scores                              |
|-----------|--|
|           | <u>Network activity score</u> is<br>computed as a linear<br>combination of the scores of<br>subnetworks within the network                       |
| ork       | <u>Subnetwork activity score</u> is<br>computed as a linear<br>combination of the scores of<br>mechanisms within the<br>subnetwork               |
|           | <u>Mechanism activity score</u> is<br>computed as a linear<br>combination of the differential<br>expression of genes supporting<br>the mechanism |
|           |  |
|           | anscriptomics data to a<br>gical processes (cellula  |

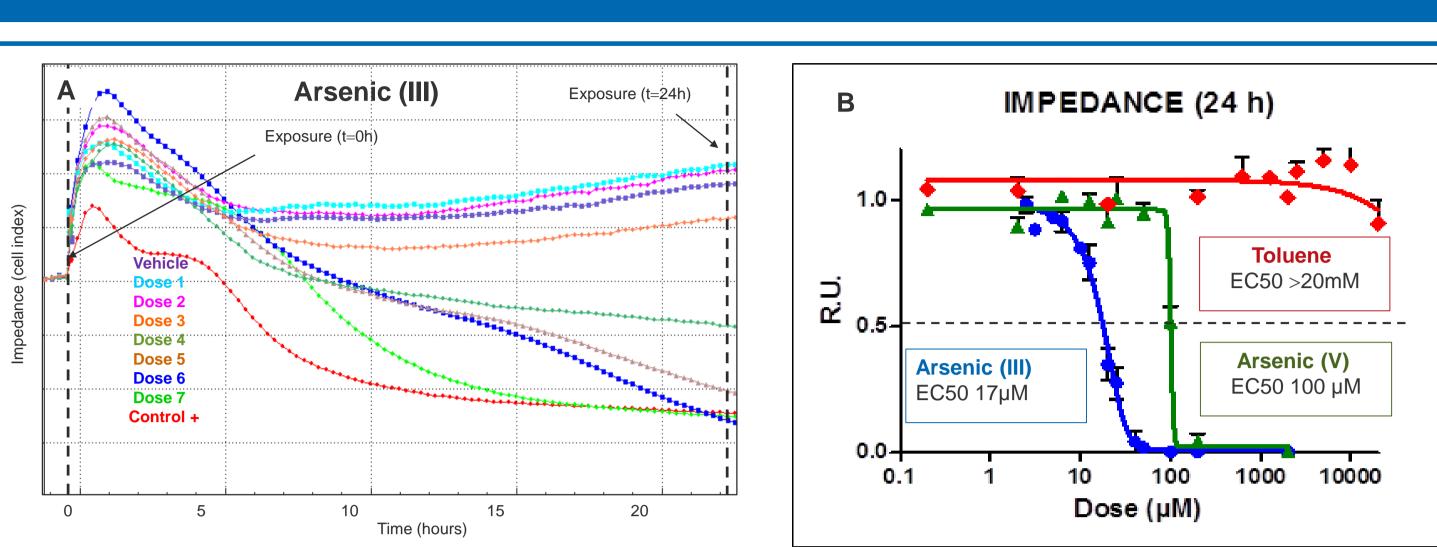


Figure 2. Effect of HPHCs on cell viability. A) Representative real-time cellular analysis experiment showing the response of NHBE cells to arsenic (III) (impedance is used as a readout of cell viability). Data was acquired every 15 minutes and represents the average of three replicate wells. Vertical dotted lines delimitate the exposure period (0-24h). Carbonyl cyanide m-chlorophenyl hydrazone (CCCP) was used as positive control. B) Impedance values at 24h post-exposure were normalized to vehicle control and fitted using GraphPad Prism® 5.0 [4] in order to calculate EC50 values. As (III), As (V) and Toluene are shown as an example. Data represents average ± SEM of at least 3 independent experiments. For all remaining HPHCs, EC50 values are shown in Table 3.

| НРНС                 |     | Cell<br>Loss | DNA<br>Damage          | Stress<br>Kinase       | GSH<br>Content         | Oxidative<br>Stress    | Caspase<br>3/7         | Cytochrome<br>C Release | Cell<br>Membrane<br>Permeability | Membrane               | Mitochondrial<br>Mass  |
|----------------------|-----|--------------|------------------------|------------------------|------------------------|------------------------|------------------------|-------------------------|----------------------------------|------------------------|------------------------|
| 5-Methylchrysene     | 4h  | -            | -                      | $\checkmark$           | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |
| 5 We dry terry serie | 24h | $\checkmark$ | $\checkmark$           | $\checkmark$           | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |
| Arsenic (III)        | 4h  | -            | -                      | $\checkmark\checkmark$ | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |
| Alsellie (III)       | 24h | $\checkmark$ | $\checkmark$           | $\checkmark\checkmark$ | $\checkmark\checkmark$ | -                      | $\checkmark$           | $\checkmark\checkmark$  | $\checkmark$                     | $\checkmark$           | -                      |
| Lead (II)            | 4h  | -            | -                      | -                      | $\checkmark$           | -                      | -                      | -                       | -                                | ✓                      | $\checkmark\checkmark$ |
|                      | 24h | $\checkmark$ | -                      | -                      | $\checkmark$           | -                      | -                      | $\checkmark$            | -                                | $\checkmark$           | $\checkmark\checkmark$ |
| m-Cresol             | 4h  | -            | $\checkmark\checkmark$ | ✓                      | $\checkmark$           | ✓                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                       | $\checkmark$                     | $\checkmark$           | -                      |
| Mercury (II)         | 4h  | -            | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | ✓                      | $\checkmark$           | $\checkmark\checkmark$  | $\checkmark\checkmark$           | $\checkmark\checkmark$ | <i>√ √</i>             |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark\checkmark$ | $\checkmark\checkmark$  | $\checkmark\checkmark$           | $\checkmark\checkmark$ | $\checkmark\checkmark$ |
| Naphthalene          | 4h  | -            | -                      | -                      | $\checkmark\checkmark$ | ✓                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark$           | -                      | $\checkmark\checkmark$ | -                      | -                      | -                       | -                                | -                      | -                      |
| o-Anisidine          | 4h  | -            | $\checkmark$           | -                      | $\checkmark\checkmark$ | -                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | -                       | $\checkmark\checkmark$           | -                      | $\checkmark$           |
| o-Cresol             | 4h  | -            | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | ✓                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark$           | -                      | $\checkmark\checkmark$ | -                      | $\checkmark\checkmark$ | $\checkmark$            | $\checkmark\checkmark$           | -                      | -                      |
| p-Cresol             | 4h  | -            | $\checkmark\checkmark$ | <i>✓</i>               | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | ✓                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                       | -                                | -                      | ✓                      |
| Selenium (IV)        | 4h  | -            | $\checkmark\checkmark$ | -                      | $\checkmark$           | ✓                      | -                      | $\checkmark\checkmark$  | -                                | -                      | $\checkmark\checkmark$ |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark\checkmark$ | -                      | $\checkmark$           | $\checkmark\checkmark$  | $\checkmark\checkmark$           | -                      | -                      |
| 1-aminonaphthalene   | 4h  | -            | $\checkmark\checkmark$ | -                      | $\checkmark$           | $\checkmark\checkmark$ | -                      | -                       | $\checkmark\checkmark$           | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark$           | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark$            | $\checkmark\checkmark$           | -                      | -                      |
| Chromium (VI)        | 4h  | -            | $\checkmark$           | -                      | ✓                      | -                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | -            | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                      | $\checkmark\checkmark$ | -                       | $\checkmark\checkmark$           | -                      | -                      |
| Crotonaldehyde       | 4h  | -            | $\checkmark\checkmark$ | -                      | -                      | $\checkmark\checkmark$ | ✓                      | -                       | $\checkmark\checkmark$           | -                      | -                      |
| erotonalaenyae       | 24h | $\checkmark$ | $\checkmark\checkmark$ | $\checkmark$           | -                      | $\checkmark$           | $\checkmark$           | $\checkmark\checkmark$  | $\checkmark$                     | ✓                      | -                      |
| Acrylamide           | 4h  | -            | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | $\checkmark$           | $\checkmark$           | -                      | -                      | -                       | $\checkmark$                     | -                      | -                      |
| Phenol               | 4h  | -            | $\checkmark$           | -                      | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                      | $\checkmark$           | -                       | $\checkmark$                     | -                      | $\checkmark$           |
| Nickel (II)          | 4h  | -            | -                      | -                      | $\checkmark\checkmark$ | -                      | -                      | -                       | -                                | -                      | -                      |
|                      | 24h | $\checkmark$ | -                      | -                      | $\checkmark\checkmark$ | -                      | $\checkmark$           | -                       | -                                | -                      | -                      |
| Arsenic (V)          | 4h  | -            | -                      | -                      | $\checkmark$           | -                      | -                      | -                       | -                                |                        |                        |
|                      | 24h | $\checkmark$ | -                      | -                      | $\checkmark$           | -                      | -                      | -                       | -                                | -                      | -                      |

Table 4. Summary of HCS results. The table summarizes the HCS results only for the 17 HPHCs with a calculated EC50 value (Table 3). A result was considered as positive ( $\checkmark$ ) if a dose-dependent response was observed with at least 2-fold increase in signal over vehicle control (or a 50% decrease in signal in the case of GSH content). A signal increase between 1.5 and 2-fold (or a decrease between 30% and 50% in the case of GSH content) was considered as weakly positive ( $\checkmark$ ). Data represent results from at least 3 independent experiments. Based on the HCS results, a subset of 10 HPHCs (highlighted in blue in the table) were selected for further analysis via transcriptomics.



#### RESULTS

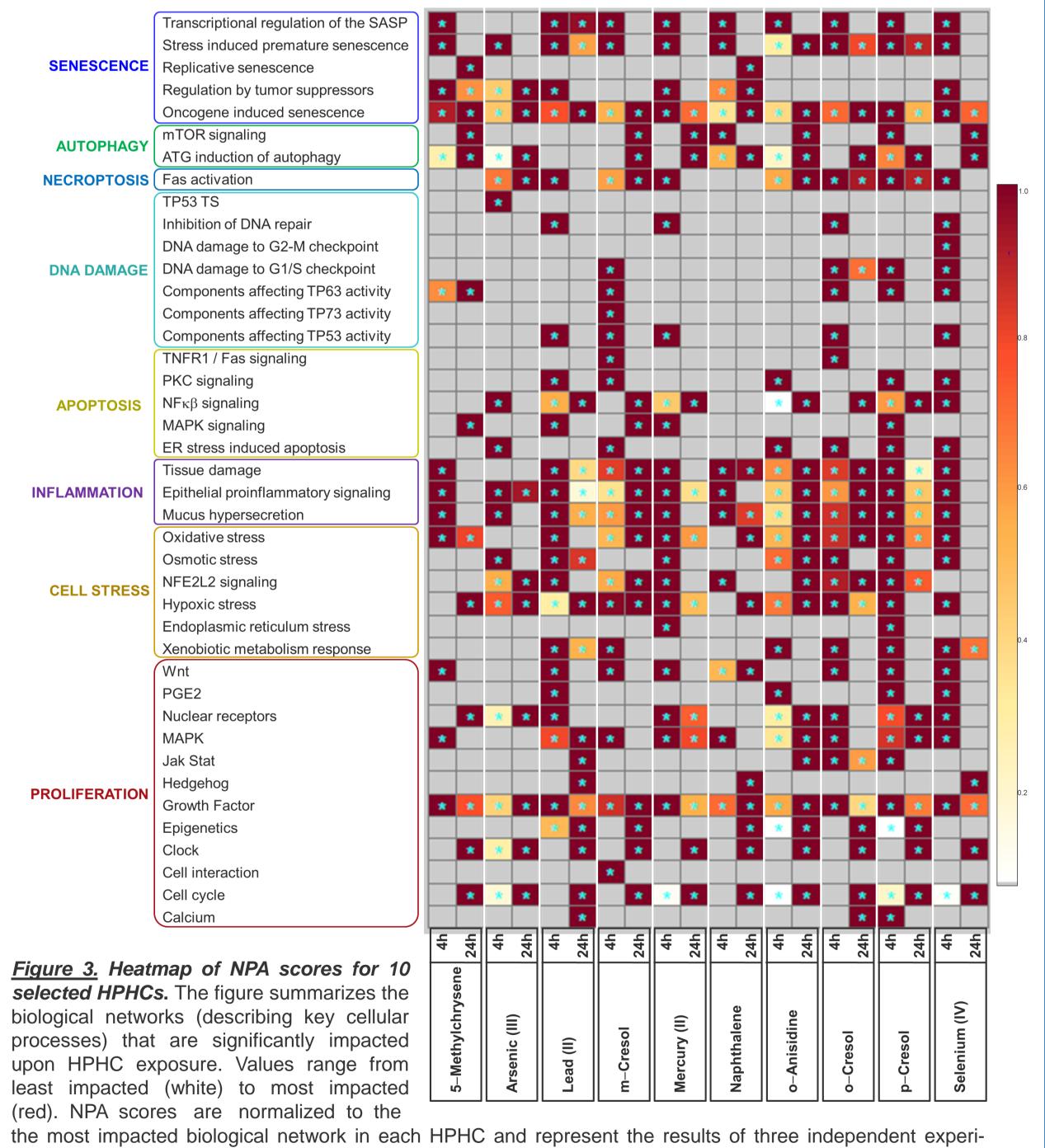
|    | НРНС               | EC50 Value | $R^2$ |    | НРНС                     | EC50 Value | R <sup>2</sup> |
|----|--------------------|------------|-------|----|--------------------------|------------|----------------|
| 1  | Chromium (VI)      | 4 μM       | 0.995 | 17 | o-Anisidine              | 11970 μM   | 0.968          |
| 2  | Arsenic (III)      | 17 μM      | 0.968 | 18 | 2-nitropropane           | > 20 mM    | -              |
| 3  | 5-Methylchrysene   | 28 µM      | 0.961 | 19 | Acetamide                | > 20 mM    | -              |
| 4  | Arsenic (V)        | 100 µM     | 0.990 | 20 | Acetone                  | > 20 mM    | -              |
| 5  | Mercury (II)       | 110 μM     | 0.999 | 21 | Benzene                  | > 20 mM    | -              |
| 6  | Selenium (IV)      | 338 µM     | 0.982 | 22 | MEK                      | > 20 mM    | -              |
| 7  | Crotonaldehyde     | 501 µM     | 0.994 | 23 | Nitrobenzene             | > 20 mM    | -              |
| 8  | Nickel (II)        | 520 μM     | 0.999 | 24 | Quinoline                | > 20 mM    | -              |
| 9  | Lead (II)          | 528 µM     | 0.918 | 25 | Toluene                  | > 20 mM    | -              |
| 10 | 1-Aminonaphthalene | 1000 µM    | 0.964 | 26 | Benz [a] anthracene      | > 100 μM   | -              |
| 11 | Naphthalene        | 1176 μM    | 0.902 | 27 | Benzo [a] pyrene         | > 100 µM   | -              |
| 12 | m-Cresol           | 2028 μM    | 0.936 | 28 | Benzo [b] fluoranthene   | > 100 µM   | -              |
| 13 | o-Cresol           | 2170 µM    | 0.912 | 29 | Benzo [k]fluoranthene    | > 100 μM   | -              |
| 14 | p-Cresol           | 5060 µM    | 0.900 | 30 | Dibenz [a,h] anthracene  | > 100 μM   | -              |
| 15 | Acrilamide         | 5880 µM    | 0.981 | 31 | Dibenzo [a,l] pyrene     | > 100 μM   | -              |
| 16 | Phenol             | 6680 µM    | 0.982 | 32 | Indeno [1,2,3-cd] Pyrene | > 100 µM   |                |

**Table 3. EC50 values for all HPHCs.** Values were calculated at 24h of exposure using GraphPad Prism® 5.0 [4]. Only those HPHCs where an EC50 value could be calculated were further analyzed via HCS.

|                       | Transcriptional regulation of the SA |
|-----------------------|--------------------------------------|
|                       | Stress induced premature senesce     |
| SENESCENCE            | Replicative senescence               |
|                       | Regulation by tumor suppressors      |
|                       | Oncogene induced senescence          |
| AUTOPHAGY             | mTOR signaling                       |
| AUTOPHAGT             | ATG induction of autophagy           |
| NECROPTOSIS           | Fas activation                       |
|                       | TP53 TS                              |
|                       | Inhibition of DNA repair             |
|                       | DNA damage to G2-M checkpoint        |
| DNA DAMAGE            | DNA damage to G1/S checkpoint        |
|                       | Components affecting TP63 activity   |
|                       | Components affecting TP73 activity   |
|                       | Components affecting TP53 activity   |
|                       | TNFR1 / Fas signaling                |
|                       | PKC signaling                        |
| APOPTOSIS             | NFκβ signaling                       |
|                       | MAPK signaling                       |
|                       | ER stress induced apoptosis          |
|                       | Tissue damage                        |
| INFLAMMATION          | Epithelial proinflammatory signaling |
|                       | Mucus hypersecretion                 |
|                       | Oxidative stress                     |
|                       | Osmotic stress                       |
| CELL STRESS           | NFE2L2 signaling                     |
| CELL STRESS           | Hypoxic stress                       |
|                       | Endoplasmic reticulum stress         |
|                       | Xenobiotic metabolism response       |
|                       | Wnt                                  |
|                       | PGE2                                 |
|                       | Nuclear receptors                    |
|                       | МАРК                                 |
|                       | Jak Stat                             |
|                       | Hedgehog                             |
| PROLIFERATION         | Growth Factor                        |
|                       | Epigenetics                          |
|                       | Clock                                |
|                       | Cell interaction                     |
|                       | Cell cycle                           |
|                       | Calcium                              |
|                       |                                      |
| Eigura 2 Usat         | man of NDA approa for                |
| <u>rigure 3.</u> Heat | map of NPA scores for                |

selected HPHCs. The figure summarizes the biological networks (describing key cellular processes) that are significantly impacted upon HPHC exposure. Values range from least impacted (white) to most impacted (red). NPA scores are normalized to the

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ments. The figure shows the results for only one dose (highest dose resulting in at least 70% cell viability at 24h) and two exposure time points (4h and 24h). \* indicates that NPA score is significant (p<0.05) not only with respect to the experimental variation, but also considering the biology described in the network [5]



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