# Computational analysis of *in vitro* screening data highlights an atypical cytostatic mechanism of a cytosine derivative

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### Introduction

## 1-(p-toluenesulfonyl)cytosine (TsC) is characterized by:

antiproliferative activity on human tumor cell lines

regard to normal cells or CH3

induction of a general shutdown in the cellular DNA, RNA and protein biosynthesis [1].

### Results

The  $IC_{50}$  profile of TSC over 8 cell lines was compared to  $IC_{50}$  profiles in the NCI dataset.

### **Self-organizing Map**

A self-organizing map was trained using i2SOM software [4] to gain a rough estimate of TSC's mechanistic class, and find similar compounds by the IC<sub>50</sub> activity profile.

### **Random Forests**

RF classification was repeated with different samples of the compounds in "unknown" mechanistic class. Out-of-bag accuracy was 54.7% ± 1.0%.

| mechanistic class         | model<br>precision | TSC (probability of belonging to class) |
|---------------------------|--------------------|---|
| alkylating agent          | 81.6 %             | $0.6\% \pm 0.2\%$                       |
| antineoplastic antibiotic | 45.5 %             | $3.1\% \pm 0.7\%$                       |
| ion channel agent         | 35.8 %             | $17.4\% \pm 4.1\%$                      |
| DNA antimetabolite        | 63.4 %             | $3.3\% \pm 0.9\%$                       |
| intercalating agent       | 84.0 %             | $1.6\% \pm 0.3\%$                       |
| kinase inhibitor          | 53.2 %             | $3.3\% \pm 1.1\%$                       |
| membrane agent            | 68.6 %             | $3.6\% \pm 0.8\%$                       |
| mitotic agent             | 58.0 %             | $20.3\% \pm 3.4\%$                      |
| nucleobase analog         | 55.9 %             | $14.6\% \pm 2.5\%$                      |
| steroid                   | 46.6 %             | $1.0\% \pm 0.5\%$                       |
| topoisomerase I poison    | 54.1 %             | $0.2\% \pm 0.2\%$                       |
| topoisomerase II poison   | 49.9 %             | $1.1\% \pm 0.4\%$                       |
| unknown mechanism         | 76.4 %             | $29.9\% \pm 8.3\%$                      |

### Methods

- growth inhibition assay, after NCI's protocol [2] (10 tumor cell lines + 1 normal fibroblast line)
- computational methods applied to cytotoxicity profiles:
  - O self-organizing maps
  - permutation tests to assess significance of correlation
  - Random Forest (RF) classifier to determine mechanism-of-action class
- other wet-lab methods (cell cycle analysis, detection of apoptosis by Annexin-V assay)

# alkylating nucleobase mitotic antibiotics DNA antimetab. membrane intercalating steroids channel topo2 topo1 kinase NSC 27640 deoxyflourouridine (nucleoside analog) and similar compounds NSC 663790, 663791 NSC 14050, chloroquine diphosphate (ion channel agent) NSC 143647 alanosine (nucleobase analog)

### The NCI Dataset

Cytostatic activity, described by IC<sub>50</sub> concentration data for 9797 compounds was obtained from the National Cancer Institute's web site [3]. Mechanistic class assignments were kindly provided by dr. David Covell (537 compounds in 13 classes).

References: [1] Glavaš-Obrovac L et al. Anticancer Res 21:1979-1986, 2001 [2] Boyd MR, Kenneth DP. Drug Dev Res 34:91-109, 1995. [3] <a href="http://dtp.nci.nih.gov/docs/cancer/cancer\_data.html">http://dtp.nci.nih.gov/docs/cancer/cancer\_data.html</a> [4] Supek F: i2SOM (computer program); <a href="http://lis.irb.hr/~fran/i2SOM/">http://lis.irb.hr/~fran/i2SOM/</a> [5] Tusher VG, Tibshirani R, Chu G. Proc Natl Acad Sci USA 98:5116-5121, 2001.

### **Permutation test**

The Significance Analysis of Microarrays (SAM 2.33) software [5] was used to search for similar  $IC_{50}$  profiles among the NCI compounds.

| HO HO H                          | N S S CI                         | H.N.H                            |
|----------------------------------|----------------------------------|----------------------------------|
| rank: 1; NSC 676792; $r = 0.975$ | rank: 4; NSC 371189; $r = 0.856$ | rank: 5; NSC 671335; $r = 0.891$ |
| N N O O -H                       | CI S                             | S N H                            |
| rank: 2; NSC 697526; $r = 0.907$ | rank: 3; NSC 721655; $r = 0.941$ | rank: 6; NSC 674495; $r = 0.840$ |

This list is estimated (by SAM) to contain 2-3 false positives.

### Conclusion

Our results point to an unusual mechanism of cytostatic action, a combination of **nucleic acid antimetabolite activity** and a novel molecular mechanism, possibly similar to activity of **benzothiazoles**, previously described as involving the aryl hydrocarbon receptor, activation of CYP1A1 and CYP1B1 genes and a DNA damage response.