Chemometric investigations of the multidrug resistance in strains of the phytopathogenic fungus Penicillium digitatum Márcia Miguel Castro Ferreira and Rudolf Kirali, marcia@igm.unicamp.br. rudolf@igm.unicamp.br. http://lgta.igm.unicamp.br Laboratório de Quimiometria Teórica e Aplicada (LQTA), Instituto de Química, Universidade Estadual de Campinas. Campinas SP. 13084-971. Brazil

## THE OBJECTIVES OF THIS WORK

- 1) P. digitatum (green mold). like other Penicillium species, contaminates fruits, nuts, vegetables, and even cereals causing serious losses in agriculture worldwide, and various respiratory problems, allergic diseases and other non-inflammatory symptoms that may be extremely dangerous to immunocompromised persons. To get more insight into the multidrug resistance (MDR) mechanisms of this microbe particularly CYP51- (cytochrome 51 - eroosterol biosynthesis) and efflux pump PMR1-mediated resistance to demethylation inhibitors (DMIs), is one of the objectives:
- 2) To present novel ASR (Activity-Structure Relationship) & chemometric study of MDR activities of diverse P. diaitatum strains with respect to DMIs:
- 3) To present novel QGAR (Quantitative Genome-Activity Relationship) and regression modeling of these MDR activities, taking into account the genome structure of the strains.







b)

Dataset B obtained by extension of the B1 with 8 analogue descriptors for fungal cultures in presence of triflumizole. This gave matrix 39x16. The PCA scores plots: a) strains discriminated according to their baseline DMI resistance character; b) strains distributed according to their geographic origin; c) strains differentiated by their target types (fruits). This discrimination is rather satisfactory. New methods would be desirable that only bioassays without toxicants would be sufficient to identify the strains and their MDR character and other characteristics.



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## ACTIVITY-STRUCTURE RELATIONSHIPS (ASR) I

D PD5 DF1

 LU2
PD5-21
PD5-7
PD5-15 Toxicant

depetions

antibiotic

5

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Exploratory analysis (PCA – Principal Component Analysis and HCA – Hierarchical Cluster Analysis) of the data set At Exploratory analysis (PCA – Principal Component Analysis and HCA – Hiracrichical Cluster Analysis) of the data set AI (7x7 matrix of pMICs: 7 toxicants and 7 strains). a) PCA loadings plot shows the clustering of the *P*, digitatum strains, b) PCA scores plot shows the clustering of the toxicants with the number of hydrogen bonds and charge-charge interactions in brackets. c) Other PCA loadings plot shows the distribution of the *P*, digitatum strains with respect to the profile types from the previous Figure. d) PCA scores plot shows the clustering of the toxicants with the number of *w* systems in brackets. c) Other PCA loadings plot shows the distribution of the Schmidt Cluster with the number of *w* systems in brackets. d) HCA dendegram for variable: (pMCs) dendogram for the samples (oxicants) and their clustering. The samples are classified as condensed ring systems (GR: Mut toxicants V and WI), how-ring linear systems (GR: II, III, and IV with bent topology that mimics a three-ring structure). PCT makes some distinction between DMIs and non-DMIs. The increase in PC1 is related to higher molecular fackbillity and lower compactness. The increase in PC2 is related to the elevated number of hydrogen bonds and polar character. These observations may be useful in discovering new antifungals.

## QUANTITATIVE GENOME-ACTIVITY RELATIONSHIPS (QGAR)

## nome descriptors

PMR1-g - presence or absence of the native functional (non-disrupted) PMR1 gene, or the presence of a *PMR1* gene from another plasmid; PMR1-e – constitutive *PMR1* gene expression level (quantity of total RNA) in the absence of a

PMR-t – PMR1 expression level (quantity of total RNA) induced by a toxicant, triflum

PCR - the size of the promoter fragment in the PdCYP51 gene, corresponding to one or more copies of the CYP51 transcriptional enhancer;

CYP51-e - constitutive CYP51 gene expression level (quantity of total RNA) in the absence of a toxicant relative to DMI-S strains

CYP51-g – the number of the transcriptional enhancer copies in the CYP51 gene.

The dataset C1 (matrix 92x6 with 6 descriptors and vector 92x1 for pEC<sub>ss</sub>) was formed from these descriptors and corresponding MDR activities obtained from 92 experiments with 24 diverse strains and DMI toxicants I-V. The dataset C2 (matrix 23x6 with the descriptors and vector 73x1 for pEC<sub>ss</sub>) was formed in the same way for non-DMI toxicants I-V. The complete data set C (matrix 13x6 with descriptors and vector 13x1 for pEC<sub>ss</sub>) was and of C1 and C2.



Exploratory analysis of the six genome variables (the data set C1): a) PCA scores plot shows the clustering of the *P. digitatum* strains. b) PCA loadings plot shows the clustering of the genome variables. c) HCA dendogram for variables. A new classification soft class trains introduces some differences with respect the the previous classification. S1 class contains the most DMI-susceptible strains with no functional *PMR1* gene and only one copy of the CVPS1 gene enhancer. The most DMI-resistance character, although and S copies of the CVPS1 enhancer. Moderately resistant classes (MDR1, MDR2) lie between S- and R-classes. The present analysis shows that the DMI-resistance character, although mainly being determined by the CYPS1 resistance mechanism, is also alfected by the PMR1 resistance mechanism.

QGAR using PLS (Partial Least Squares) regression for the C1 data set showed to have satisfactory statistics, and therefore, can be used in further predictions of traint/notican behavior: 99.45% in 3 PCs, R = 0.989, d. = 0.888, SEV = 0.333, SEV = 0.333, for utiliers removed.