# SDV INPROVER SYSTEMS BIOLOGY VERIFICATION

www.sbvimprover.com



The systems biology verification endeavor – harness the power of the crowd to address computational and biological challenges

Stéphanie Boué, PhD Manager Scientific Transparency and Verification Philip Morris International R&D

12th Career Fair in Horizons in Molecular Biology - September 2018

Crowdsourcing





## Crowdsourcing in biomedical research

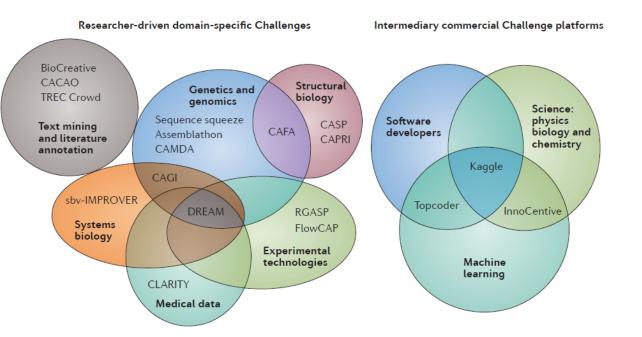


Figure 1 | **Challenge platforms and organizations.** The most popular researcher-driven Challenge initiatives in the life sciences (left) and the most popular commercial Challenge platforms (right) are shown. Initiatives, such as DREAM (Dialogue for Reverse Engineering Assessment and Methods), FlowCAP (Flow Cytometry Critical Assessment of Population Identification Methods), CAGI (Critical Assessment of Genome Interpretation) and sbv-IMPROVER (Systems Biology Verification combined with Industrial Methodology for Process Verification in Research), organize several Challenges per year; only the generic project and not the specific Challenges are shown. Among the most popular and successful commercial Challenge platforms are: InnoCentive, which crowdsources Challenges in science and technology (social sciences, physics, biology and chemistry); Topcoder, which serves the software developer community; and Kaggle, which administers Challenges to machine-learning and computer experts, addressing predictive analytics problems in a wide range of disciplines. The figure is not comprehensive, but highlights the most consistent and well-established Challenge initiatives. CAFA, Critical Assessment of Functional Annotation; CACAO, Cross-language Access to Catalogues And On-line libraries; CAMDA, Critical Assessment of Massive Data Analysis; CAPRI, Critical Assessment of Prediction of Interaction; CASP, Critical Assessment of protein Structure Prediction; CLARITY, Children's Leadership Award for the Reliable Interpretation and appropriate Transmission of Your genomic information; RGASP, RNA-seq Genome Annotation Assessment Project; TREC Crowd, Text REtrieval Conference Crowdsourcing Track.

J. Saez-Rodriguez, J. C. Costello, S. H. Friend, M. R. Kellen, L. Mangravite, P. Meyer, T. Norman, G. Stolovitzky, Crowdsourcing biomedical research: leveraging communities as innovation engines. *Nature reviews*. *Genetics* **17**, **470-486 (2016)** 

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SYSTEMS BIOLOGY VERIFICATION

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# Benefits of crowdsourcing in science – for the organizers and participants



Be part of a pioneering community, working together to improve how scientific research is verified

### Complement peer review

Drive innovation in science with crowdsourced solutions

Monetary incentives

Peer recognition and self-esteem

Access network of experts

Co-author publications

Contribute and work toward consensus in the scientific community

## SDV IMPROVER SYSTEMS BIOLOGY VERIFICATION

## PMI R&D

Smoking is one of the causes of serious diseases, such as cardiovascular diseases, lung cancer, and chronic obstructive pulmonary disease.

Philip Morris International (PMI) is therefore developing novel products that may have the potential to reduce smoking-related disease risk compared with smoking cigarettes.

Scientific determination of the reduced risk potential of these products includes comparison of their biological impact with that of a 3R4F reference cigarette on a mechanism-by-mechanism basis.



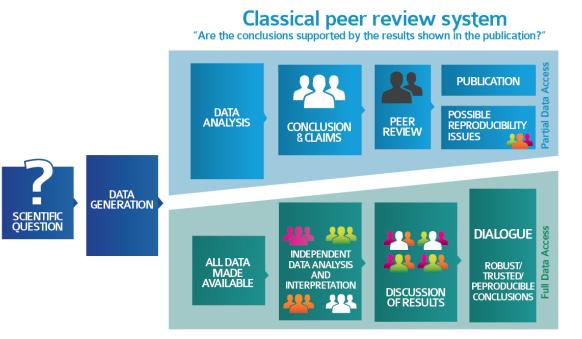
# sbv IMPROVER



sbv IMPROVER stands for <u>Systems</u> <u>B</u>iology <u>V</u>erification combined with <u>I</u>ndustrial <u>M</u>ethodology for <u>Pro</u>cess <u>Ve</u>rification in <u>R</u>esearch.

This approach aims to provide a measure of quality control for industrial research and development by verifying the methods used.

The sbv IMPROVER project is a collaborative effort led and funded by PMI Research and Development.



**sbv IMPROVER** "Are the conclusions supported by the data?"

BIOINFORMATICS

REVIEW Vol. 28 no. 9 2012, pages 1193–1201 doi:10.1093/bioinformatics/bts116

Advance Access publication March 14, 2012

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#### Systems biology

## Industrial methodology for process verification in research (IMPROVER): toward systems biology verification

Pablo Meyer<sup>1,†</sup>, Julia Hoeng<sup>2,†</sup>, J. Jeremy Rice<sup>1,†</sup> Raquel Norel<sup>1</sup>, Jörg Sprengel<sup>3</sup>, Katrin Stolle<sup>2</sup>, Thomas Bonk<sup>2</sup>, Stephanie Corthesy<sup>3</sup>, Ajay Royyuru<sup>1,\*</sup>, Manuel C. Peitsch<sup>2,\*</sup> and Gustavo Stolovitzky<sup>1,\*</sup>

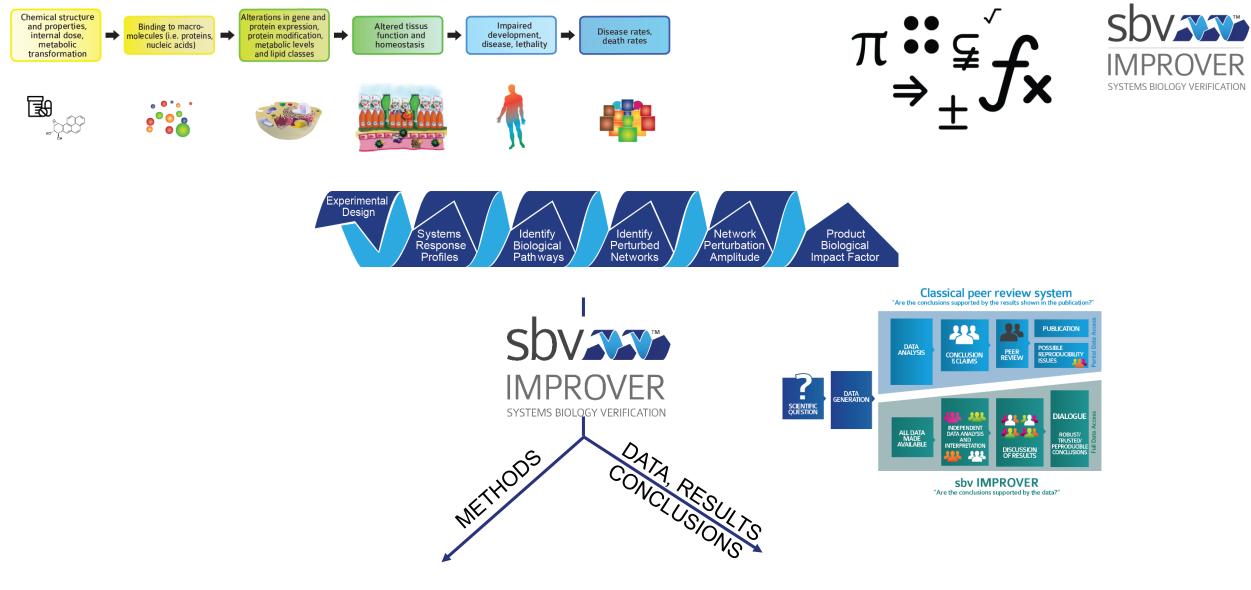
<sup>1</sup>IBM Computational Biology Center, Yorktown Heights, 10598 NY, USA, <sup>2</sup>Phillip Morris Products SA, Research and Development, 2000, Neuchâtel, Switzerland and <sup>3</sup>IBM Life Sciences Division,8802, Zurich, Switzerland COMMENTARY

## Verification of systems biology research in the age of collaborative competition

Pablo Meyer<sup>1</sup>, Leonidas G Alexopoulos<sup>2</sup>, Thomas Bonk<sup>3</sup>, Andrea Califano<sup>4</sup>, Carolyn R Cho<sup>5</sup>, Alberto de la Fuente<sup>6</sup>, David de Graaf<sup>7</sup>, Alexander J Hartemink<sup>8</sup>, Julia Hoeng<sup>3</sup>, Nikolai V Ivanov<sup>3</sup>, Heinz Koeppl<sup>9</sup>, Rune Linding<sup>10</sup>, Daniel Marbach<sup>11</sup>, Raquel Norel<sup>1</sup>, Manuel C Peitsch<sup>3</sup>, J Jeremy Rice<sup>1</sup>, Ajay Royyuru<sup>1</sup>, Frank Schacherer<sup>12</sup>, Joerg Sprengel<sup>13</sup>, Katrin Stolle<sup>3</sup>, Dennis Vitkup<sup>4</sup> & Gustavo Stolovitzky<sup>1</sup>

#### Nature Biotechnology 2011 Sep 8;29(9):811-5

Bioinformatics 2012 28(9):1193-1201

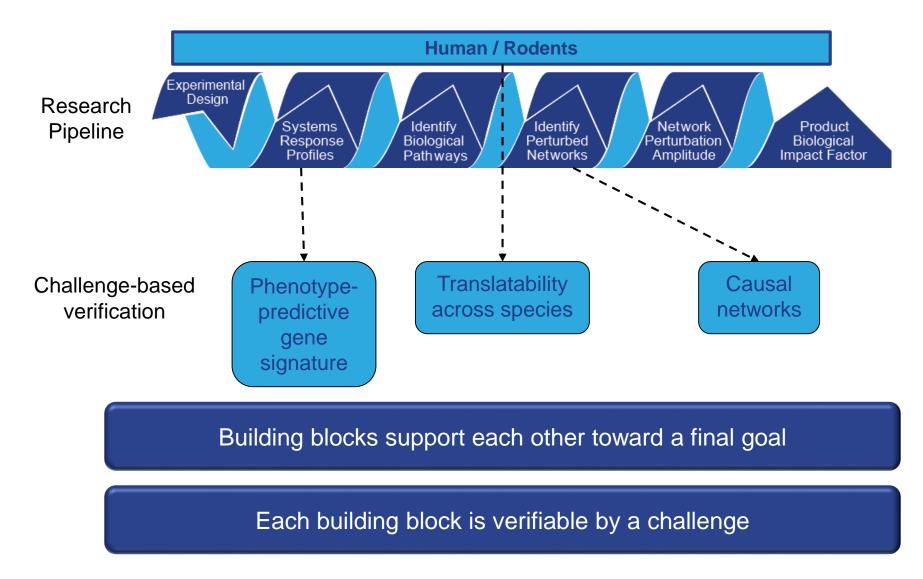


# **COMPUTATIONAL CHALLENGE**

VERIFICATION

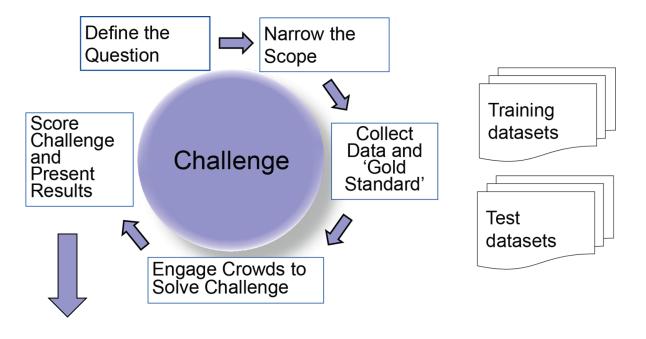
# Complex industrial research pipeline/workflow divided into verifiable building blocks





# sbv IMPROVER Challenges: build, run, score, analyze, and publish





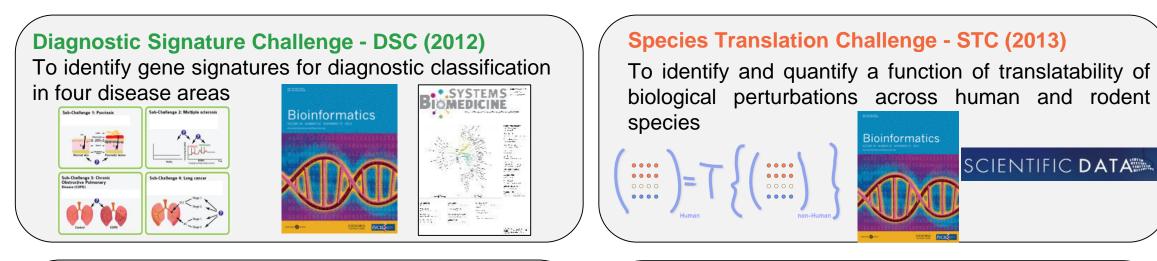
## **Double-blind performance assessment**

- Predefined scoring strategy approved by a Scoring Review Panel (SRP) of external experts
- Scoring metrics released after challenge closure
- Scoring of anonymized participants' submissions
- Final team ranking reviewed and approved by the SRP

Publish

# Past sbv IMPROVER Computational Challenges





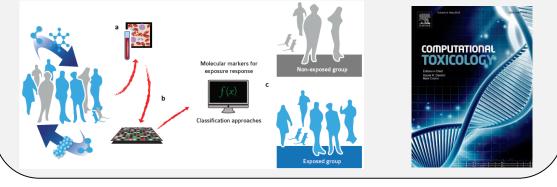
#### **Network Verification Challenge – NVC (2014-2015)**

To review biological network models that are suitable for drug discovery and toxicological and mechanistic research in respiratory and cardiovascular diseases



### Systems Toxicology Challenge (2015-2016)

To identify robust blood-based gene signatures as predictors for smoking and cessation status

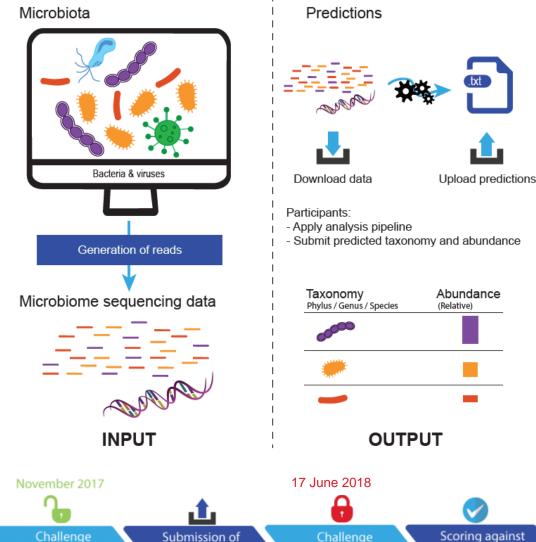


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# Microbiomics Computational Challenge (2017-2018)



#### https://www.sbvimprover.com/challenge-5



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#### Scientific questions

- Which pipelines best recover bacterial community composition and relative sequence read abundance at phylum, genus, and species taxa rank?
- Do technical biases and specific microbial composition affect the performance?

#### Datasets

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Simulated and real shotgun sequencing metagenomics data

#### Scoring

- Scoring of anonymized teams' predictions against the gold standard
  - = known relative abundances of bacteria
- Binary classification and abundance metrics computed using the OPAL software (https://github.com/CAMI-challenge/OPAL)
- Score aggregation: weighted sum of ranks
- Final team ranking approved by an external SRP



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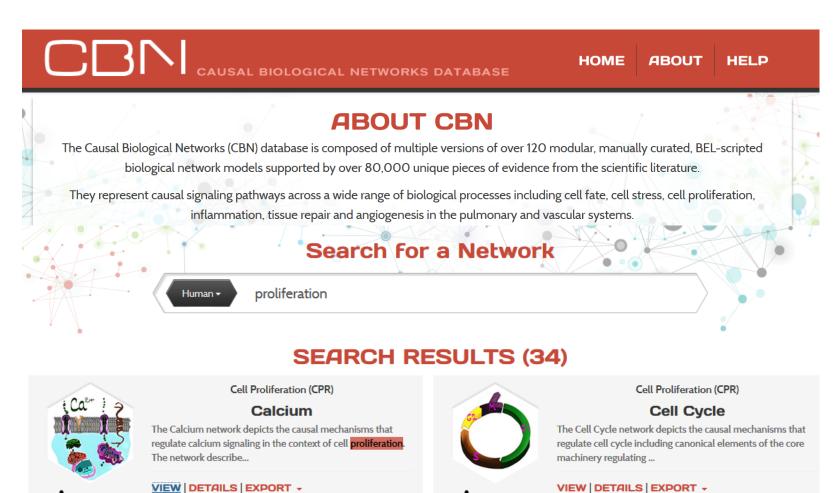
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# Causal Biological Networks (CBN) database

2.0 (Other versions: Hs\_1.1, Hs\_1.0)

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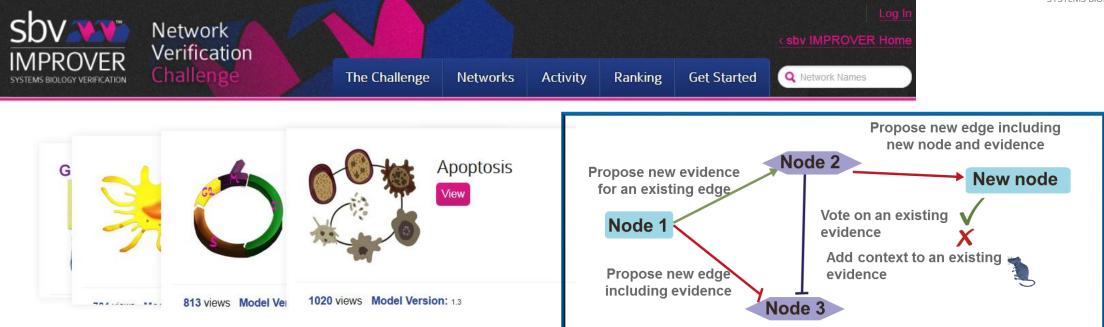
VIEW | DETAILS | EXPORT -1.2 (Other versions: Hs\_1.0 , Hs\_1.1 )

Boué, S., et al. (2015). "Causal biological network database: a comprehensive platform of causal biological network models focused on the pulmonary and vascular systems." *Database* **2015: bav030**.

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# **Network Verification Challenges**





	NVC1	NVC2	NVC3
Number of networks	40 (lung biology)	8 (lung biology)	3 (liver xenobiotic metabolism)
Open phase	10/2013-02/2014	04/2014-05/2015	07/2017-06/2018
Number of participants / countries	150 / 18	173 / 26	39 / 6
Number of votes	2,456	9,286	2,599
New pieces of evidence	885	2,225	423
Number of new edges	451	1,289	250

## Testimonials from participants on NVC3



As a recent biology graduate, an interesting topic caught my attention. During my work I was exploring many research papers and the platform itself. I enriched my knowledge in field of Xenobiotic metabolism in the liver, but most importantly I learned the basics of BEL. In the future, I will definitely use network models in my scientific activity, learn more and contribute in collaborative projects. I would recommend participation to young scientists because beside rewards, I gained great knowledge and new acquaintances.

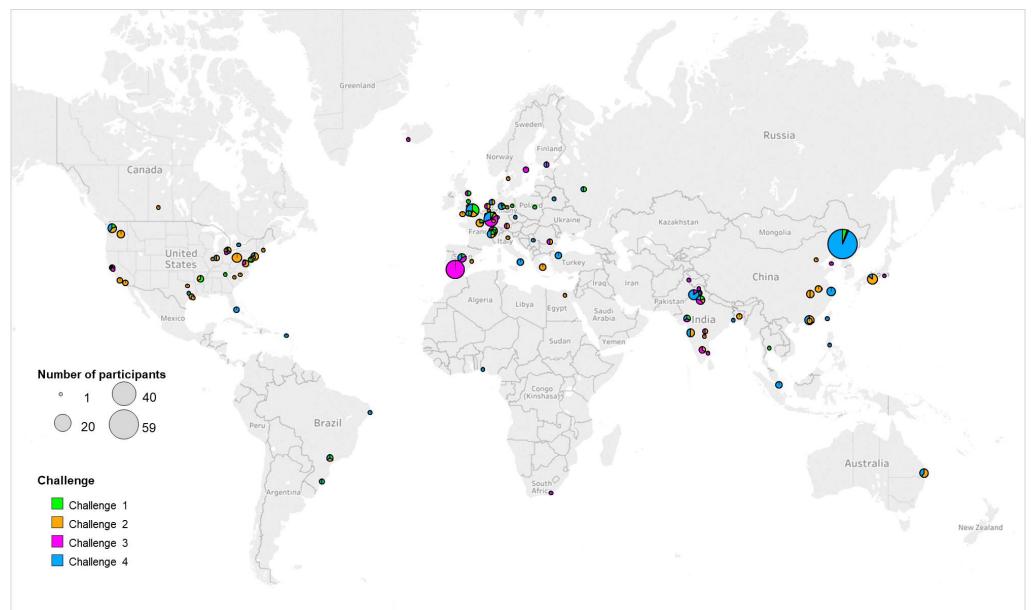
Tijana Samardzic from the Faculty of Sciences, University of Novi Sad, Serbia

One of the great things about this challenge is that we learned a lot during it. The BEL syntax for example, which enables the easiest way of representing scientific findings in life sciences, lot of us was not familiar with it before. I met a lot of incredible people during the challenge, and after the challenge on NVC3 workshop as well, and I'm so glad that I have been a part of project like this. I would recommend my colleagues to participate in future challenges, and would also like to participate again.

Ana Predojevic from the Faculty of Sciences, University of Novi Sad, Serbia

# Participation map (Challenges 1-4)





# sbv IMPROVER Symposia



















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# Publications resulting from the sbv IMPROVER project

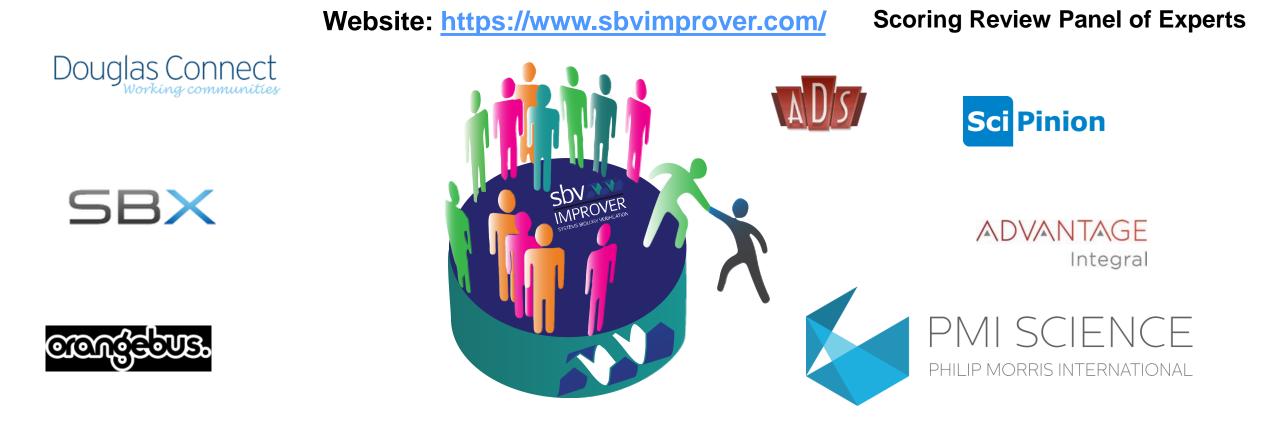


- Ansari, S. et al. On crowd-verification of biological networks. Bioinformatics and biology insights 7 (2013).
- Belcastro, V. et al. The sbv IMPROVER Systems Toxicology computational challenge: Identification of human and species-independent blood response markers as predictors of smoking exposure and cessation status. Computational Toxicology, doi:https://doi.org/10.1016/j.comtox.2017.07.004 (**2017**).
- Bilal, E. et al. A crowd-sourcing approach for the construction of species-specific cell signaling networks. Bioinformatics 31, 484-491, doi:10.1093/bioinformatics/btu659 (2015).
- Binder, J. et al. in Pacific Symposium on Biocomputing. Pacific Symposium on Biocomputing. 270-281.
- Boue, S. et al. Enhancement of COPD biological networks using a web-based collaboration interface. F1000Research 4 (2015).
- Hoeng, J., Peitsch, M. C., Meyer, P. & Jurisica, I. Where are we at regarding species translation? A review of the sbv IMPROVER challenge. *Bioinformatics* **31**, **451-452**, **doi:10.1093/bioinformatics/btv065 (2015).**
- Meyer, P. et al. Verification of systems biology research in the age of collaborative competition. Nature biotechnology 29, 811-815, doi:10.1038/nbt.1968 (2011).
- Meyer, P. et al. Industrial methodology for process verification in research (IMPROVER): toward systems biology verification. Bioinformatics 28, 1193-1201, doi:10.1093/bioinformatics/bts116 (2012).
- Poussin, C. et al. Crowd-Sourced Verification of Computational Methods and Data in Systems Toxicology: A Case Study with a Heat-Not-Burn Candidate Modified Risk Tobacco Product. Chemical research in toxicology **30**, **934-945**, **doi:10.1021/acs.chemrestox.6b00345 (2017)**.
- Poussin, C. et al. The species translation challenge-a systems biology perspective on human and rat bronchial epithelial cells. Scientific data 1, 140009, doi:10.1038/sdata.2014.9 (2014).
- Rhrissorrakrai, K. et al. Understanding the limits of animal models as predictors of human biology: lessons learned from the sbv IMPROVER Species Translation Challenge. Bioinformatics 31, 471-483, doi:10.1093/bioinformatics/btu611 (2015).
- sbv IMPROVER project team et al. On Crowd-verification of Biological Networks. Bioinformatics and biology insights 7, 307-325, doi:10.4137/BBI.S12932 (2013).
- sbv IMPROVER project team et al. Reputation-based collaborative network biology. Pacific Symposium on Biocomputing. Pacific Symposium on Biocomputing, 270-281 (2015).
- sbv IMPROVER project team et al. Enhancement of COPD biological networks using a web-based collaboration interface. F1000Research 4, 32, doi:10.12688/f1000research.5984.2 (2015).
- sbv IMPROVER project team et al. Community-Reviewed Biological Network Models for Toxicology and Drug Discovery Applications. Gene regulation and systems biology 10, 51-66, doi:10.4137/GRSB.S39076 (2016).
- Tarca, A. L. et al. Strengths and limitations of microarray-based phenotype prediction: lessons learned from the IMPROVER Diagnostic Signature Challenge. Bioinformatics 29, 2892-2899, doi:10.1093/bioinformatics/btt492 (2013).

# Thank you!

Questions? Contact us sbvimprover.RD@pmi.com





The sbv IMPROVER project, the websites, and the Symposia are part of a collaborative project designed to enable scientists to learn about and contribute to the development of a new crowdsourcing method for verification of scientific data and results. The project is led and funded by Philip Morris International.

For more information on the focus of Philip Morris International's research, please visit <u>www.pmiscience.com</u>.