
From cold to hot:

**Perception of the use and impact of QSP in immuno-oncology
– A survey of the community and stakeholders –**

Vincent Lemaire and Fei Hua

(on behalf of the ISoP QSP I-O Working Group)

Rosa webinar, Jan 18th, 2023

Clinical Pharmacology & Therapeutics

White Paper |  Open Access |   

From Cold to Hot: Changing Perceptions and Future Opportunities for Quantitative Systems Pharmacology Modeling in Cancer Immunotherapy

Vincent Lemaire, David Bassen, Mike Reed, Roy Song, Samira Khalili, Yi Ting (Kayla) Lien, Lu Huang, Aman P. Singh, Spyros Stamatelos, Dean Bottino , Fei Hua 

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The ISoP QSP I-O Special Interest Working Group

Members (at the time of the survey):

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- **Dean Bottino (Takeda) – past chair**
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- Vincent Lemaire (Genentech)
- David Bassen (Applied Biomath)
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- Andrzej Kiersek (Certara)
- Lei Sun (Alkermes)
- Paolo Vicini (Kymab)

Mission:

- Focus on maximizing impact of QSP in I-O Drug discovery, development, and use in patients.
- Exchange of ideas and pre-competitive knowledges among different companies, academia and clinicians to improve I-O QSP model development.
- Promote mechanistic modeling in I-O and dissemination of modeling in cross-disciplinary forums (in particular for non-modeling scientists and decision makers in immuno-oncology).
- Provide expert feedback and guidance for the modeling community in I-O.

Immune system and cancer

New York Times - July 29, 1908

ERYSIPELAS GERMS ASCURE FOR CANCER

Dr. Coley's Remedy of Mixed
Toxins Makes One Disease
Cast Out the Other.

MANY CASES CURED HERE

Physician Has Used the Cure for 15
Years and Treated 430 Cases—
Probably 150 Sure Cures.

Following news from St. Lou's that two men have been cured of cancer in the City Hospital there by the use of a fluid discovered by Dr. William B. Coley of New York, it came out yesterday that nearly 100 cases of that supposedly incurable disease have been cured in this city during the last few years, all through the use of the fluid discovered by Dr. Coley.

Image from following paper: Oiseth SJ, Aziz MS. Cancer immunotherapy: a brief review of the history, possibilities, and challenges ahead. *J Cancer Metastasis Treat* 2017;3:250-61. <http://dx.doi.org/10.20517/2394-4722.2017.41>

Hallmarks of Cancer: The Next Generation

Douglas Hanahan^{1,2,*} and Robert A. Weinberg^{3,*}

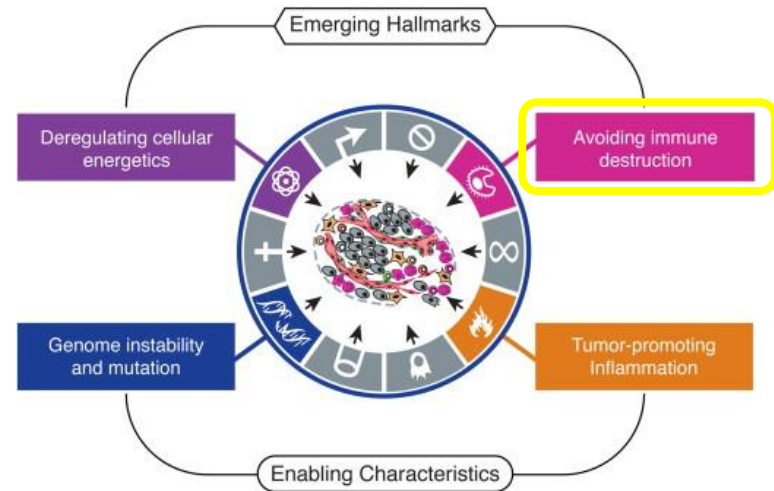
¹The Swiss Institute for Experimental Cancer Research (ISREC), School of Life Sciences, EPFL, Lausanne CH-1015, Switzerland

²The Department of Biochemistry & Biophysics, UCSF, San Francisco, CA 94158, USA

³Whitehead Institute for Biomedical Research, Ludwig/MIT Center for Molecular Oncology, and MIT Department of Biology, Cambridge, MA 02142, USA

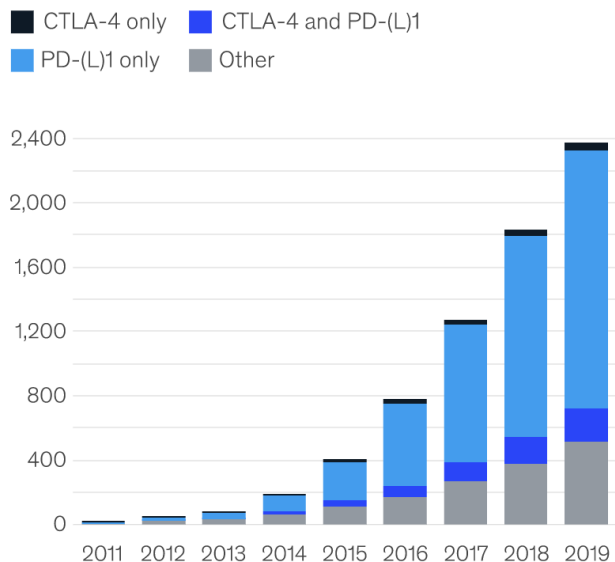
*Correspondence: dh@epfl.ch (D.H.), weinberg@wi.mit.edu (R.A.W.)

DOI 10.1016/j.cell.2011.02.013



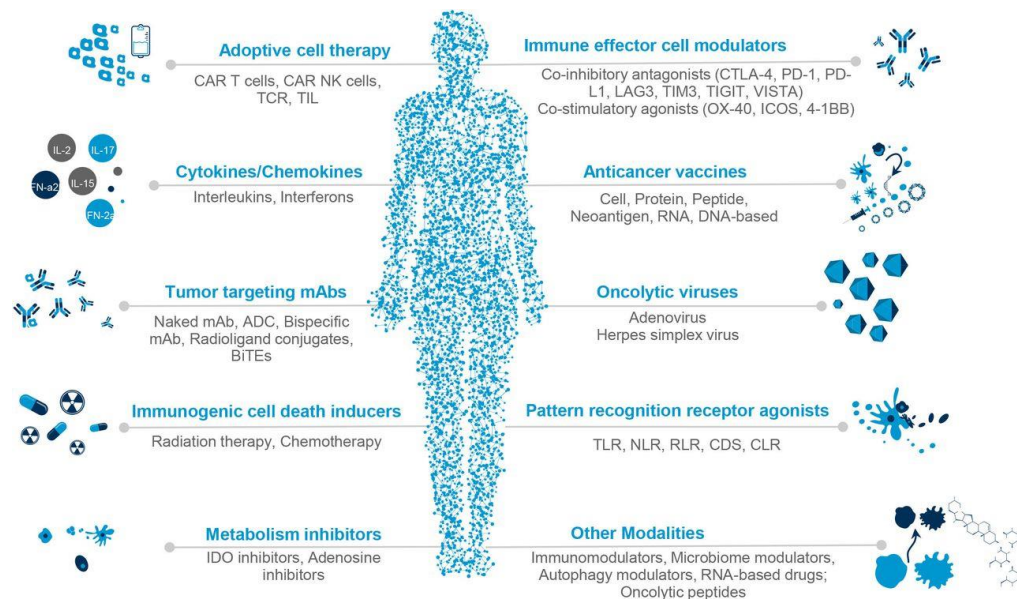
Immuno-oncology has experienced unprecedented diversity, scale, and complexity

PD-(L)1 and CTLA-4 clinical activity



<https://www.mckinsey.com/industries/life-sciences/our-insights/delivering-innovation-2020-oncology-market-outlook>

Classification of immuno-oncology agents



Franklin MR, Platero S, Saini KS, *et al* Immuno-oncology trends: preclinical models, biomarkers, and clinical development. *Journal for ImmunoTherapy of Cancer* 2022;10:e003231. doi: 10.1136/jitc-2021-003231

Range of ODE models in drug R & D

Empirical PK/PD

- Try to find a minimal model to describe the observed data

Mechanistic PK/PD

- Integrate the pharmacology of the drug, e.g. binding to targets

Quantitative Systems Pharmacology (QSP)

- Describe disease biology
- Describe downstream effects after drug engagement

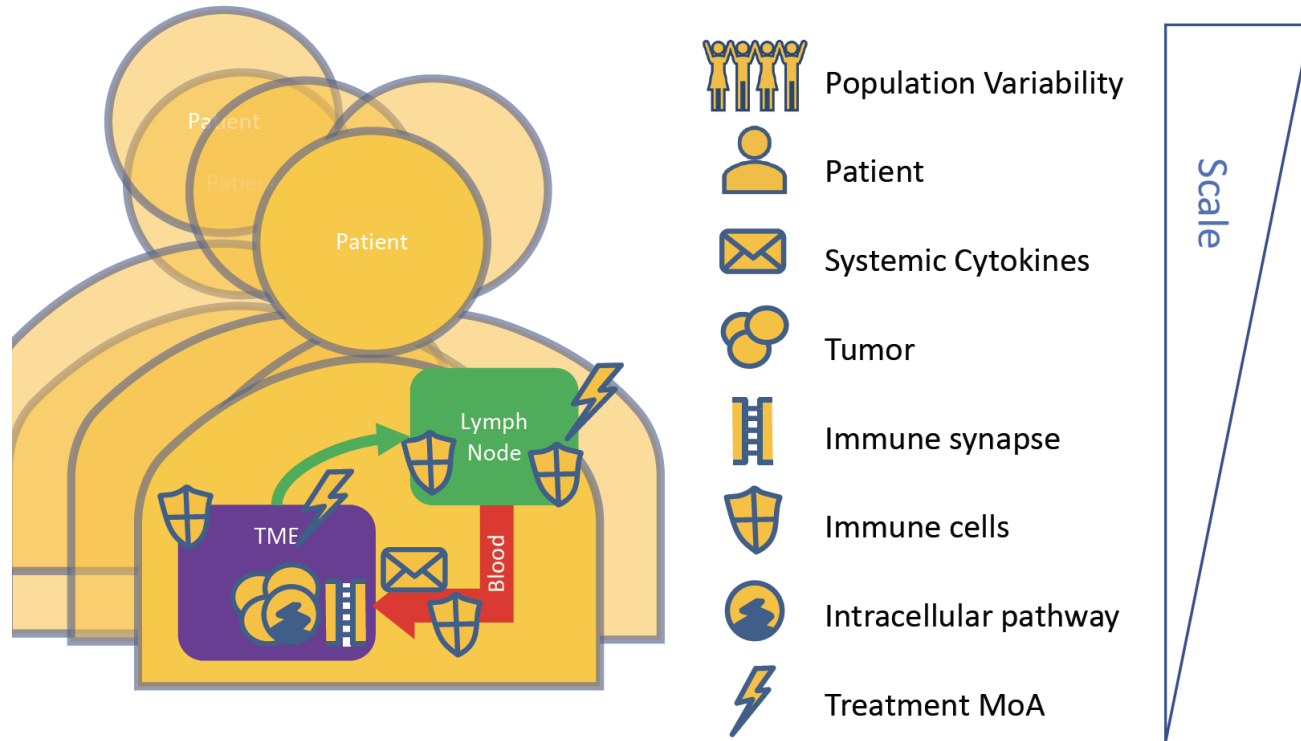
Interpolation

Extrapolation

Knowledge captured ↑ Model complexity ↑ Model identifiability ↓



Anatomy of IO QSP Model



The survey

The survey form was live for 4 months in Feb-June 2021

**Use and impact of immuno-oncology
QSP modeling in the pharma/biotech
industry**

Quantitative systems pharmacology (QSP) models describe complex biology and mode of action of drugs by integrating a variety of data including in vitro, in vivo data, and data from different compounds. QSP models in immuno-oncology (I-O) have been used to support target evaluation, drug property optimization, efficacious dose predictions, dose and schedule optimization, biomarker identification, patient population selection and combination strategy.

In this survey, we want to identify what areas QSP modeling has influenced your I-O programs and potential improvement/development you want to see in QSP modeling so that it can further help your programs.

We are seeking feedback from all R&D functions with experience in I-O programs.

Thank you very much for filling out this survey.

lemairv1@gene.com (not shared) [Switch account](#)

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Google Forms

The goal of the survey was to

- Evaluate the current impact of QSP in immuno-oncology
- Identify areas of strength and areas that would need improvement
- Get a sense for where the field may be going in the future.

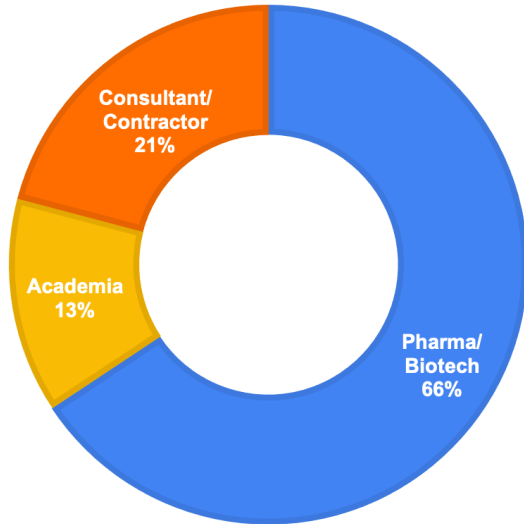
16 questions in 5 categories:

1. Background
2. Current use and impact of QSP in I-O
3. Current challenges of QSP in I-O
4. Future directions of QSP in I-O
5. Additional thoughts

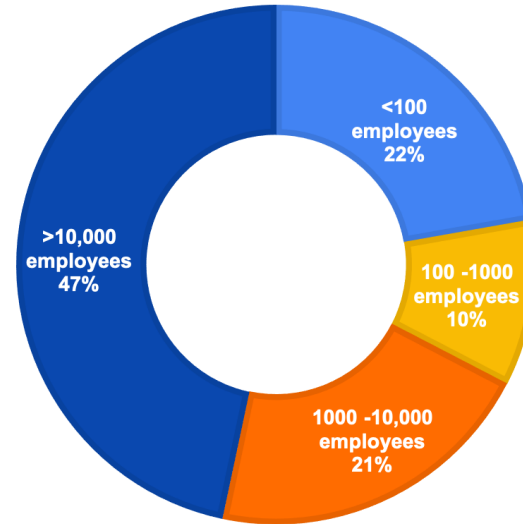
Survey respondents demographics

134 respondents from industry and academia

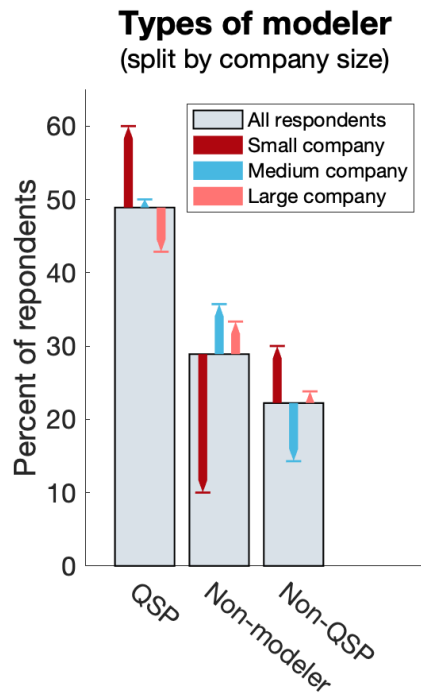
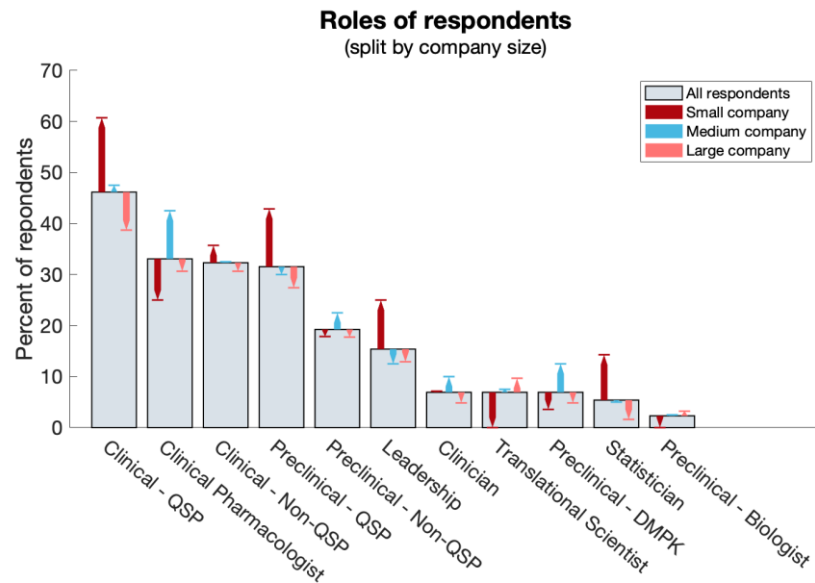
ORIGIN OF SURVEY RESPONDENTS



COMPANY SIZE OF RESPONDENTS



Survey respondents roles

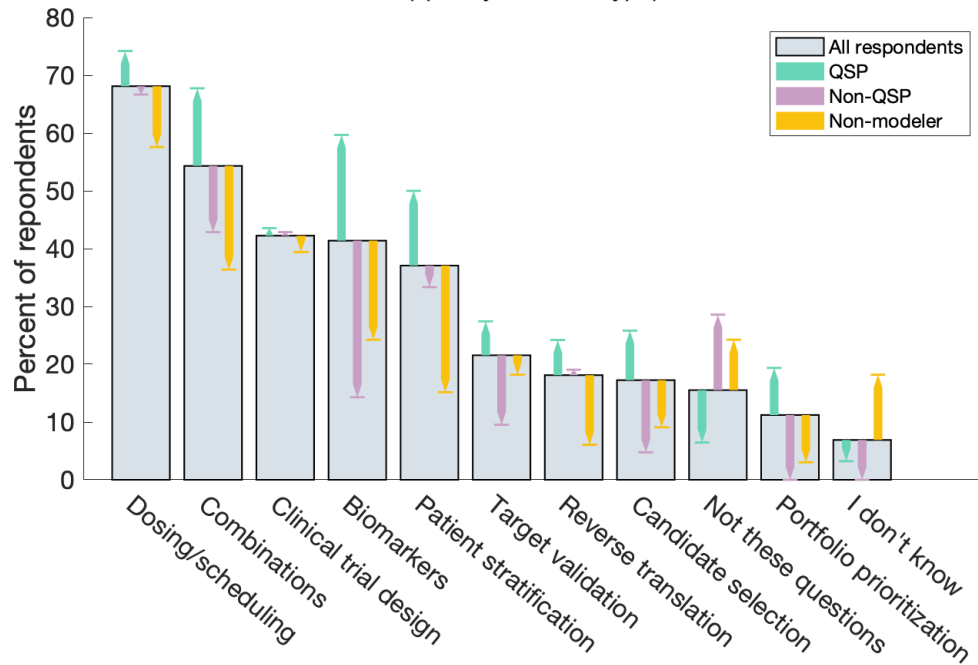




Applications of QSP in I-O

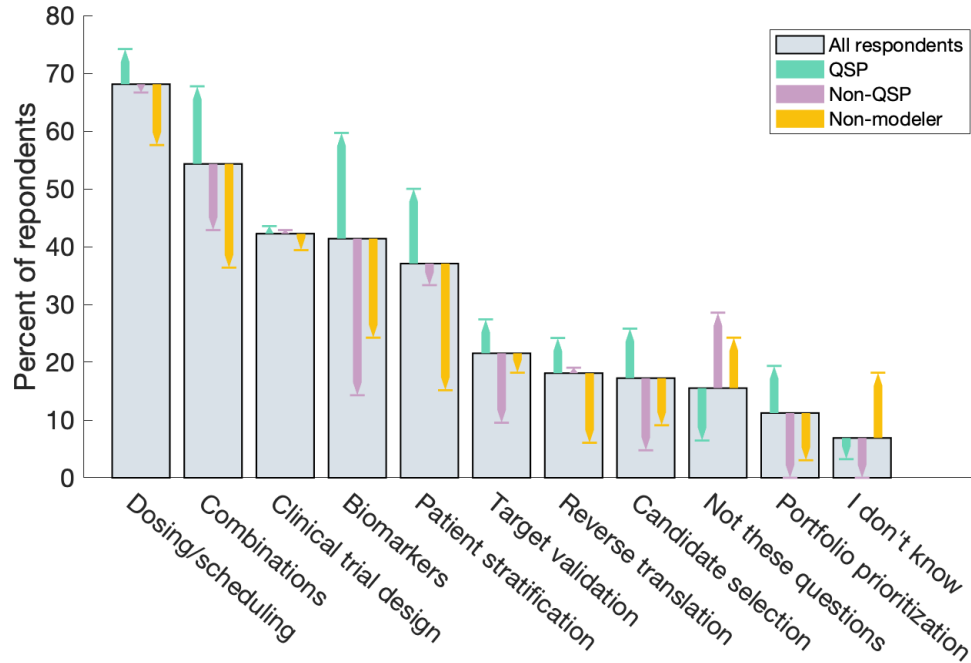
What are the key I-O questions that QSP has already facilitated in your programs?

Questions that QSP has addressed
(split by modeler type)



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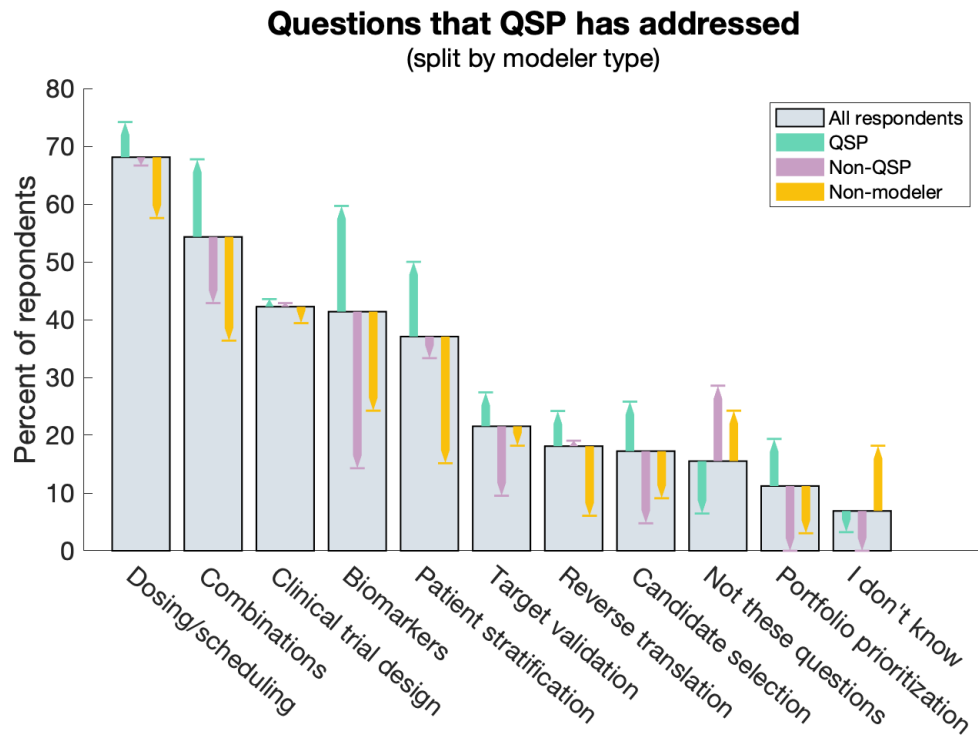
Questions that QSP has addressed
(split by modeler type)



Top areas:

1. Dosing/scheduling
2. Combinations

What are the key I-O questions that QSP has already facilitated in your programs?



Top areas:

1. Dosing/scheduling¹
2. Combinations²

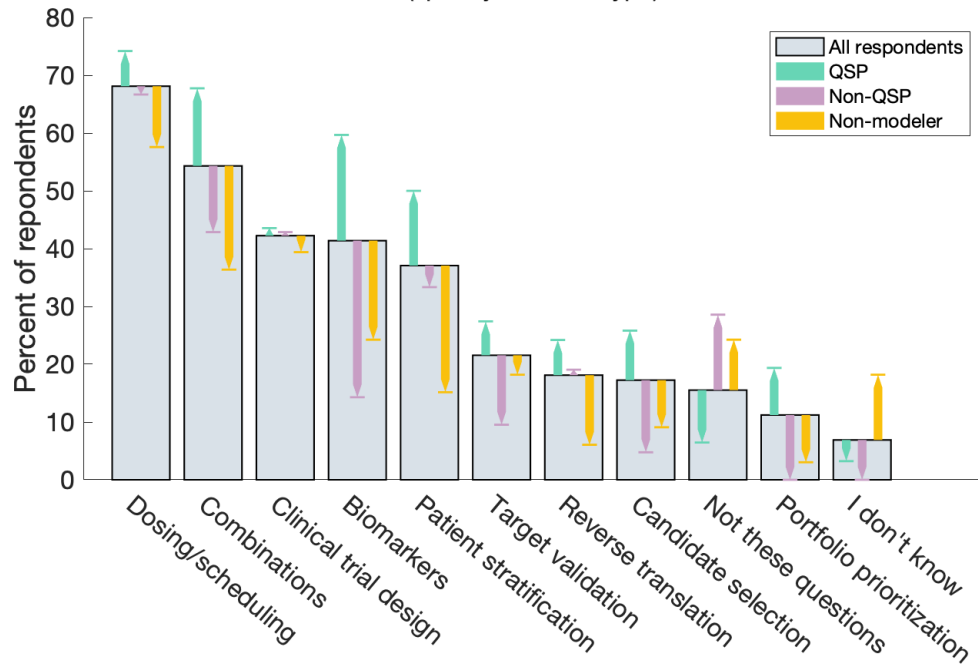
Top perceived applications correlate well with the frequency of publications in these domains

¹ Hosseini I., et al., 2020., NPJ Syst Biol Appl 6, 28.

² Kosinsky Y., et al., 2018. J Immunother Cancer 6, 17

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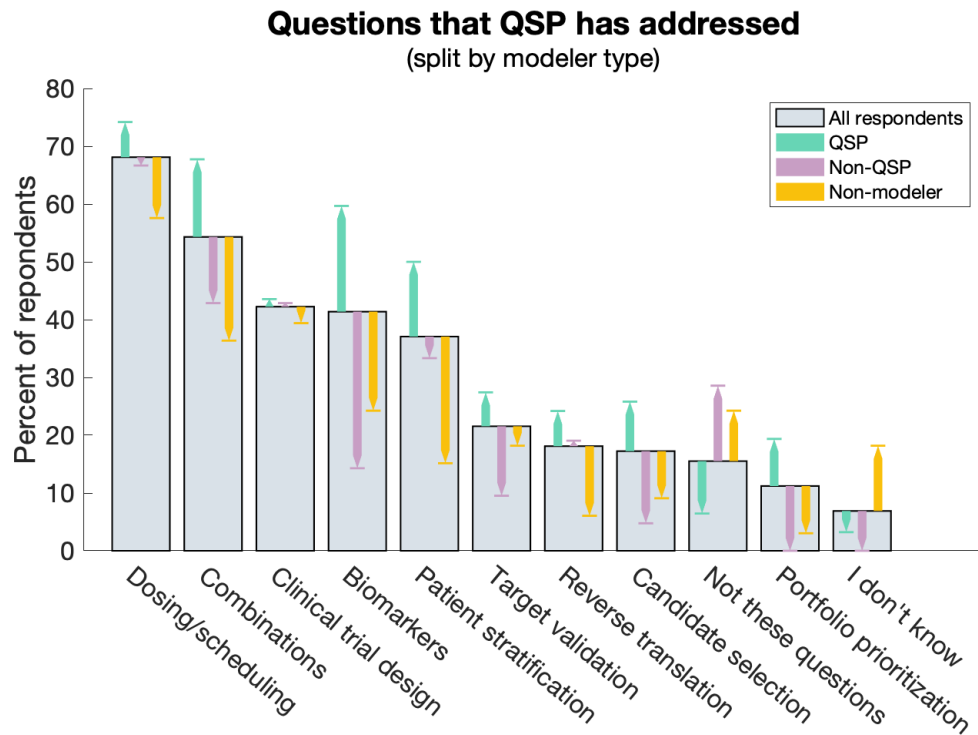
Questions that QSP has addressed
(split by modeler type)



bottom areas:

1. Portfolio prioritization
2. Not these questions
3. Candidate selection
4. Reverse translation
5. Target validation

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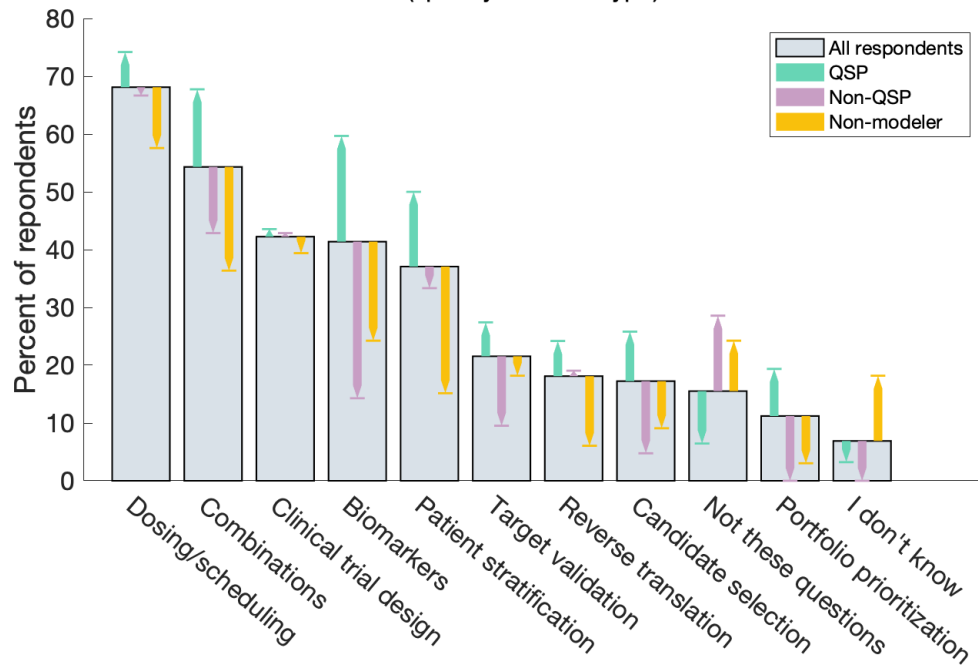
Candidate selection & Target validation: Early development

Reverse translation: New area

Portfolio prioritization: Strategic decision based on multiple inputs

What are the key I-O questions that QSP has already facilitated in your programs?

Questions that QSP has addressed
(split by modeler type)

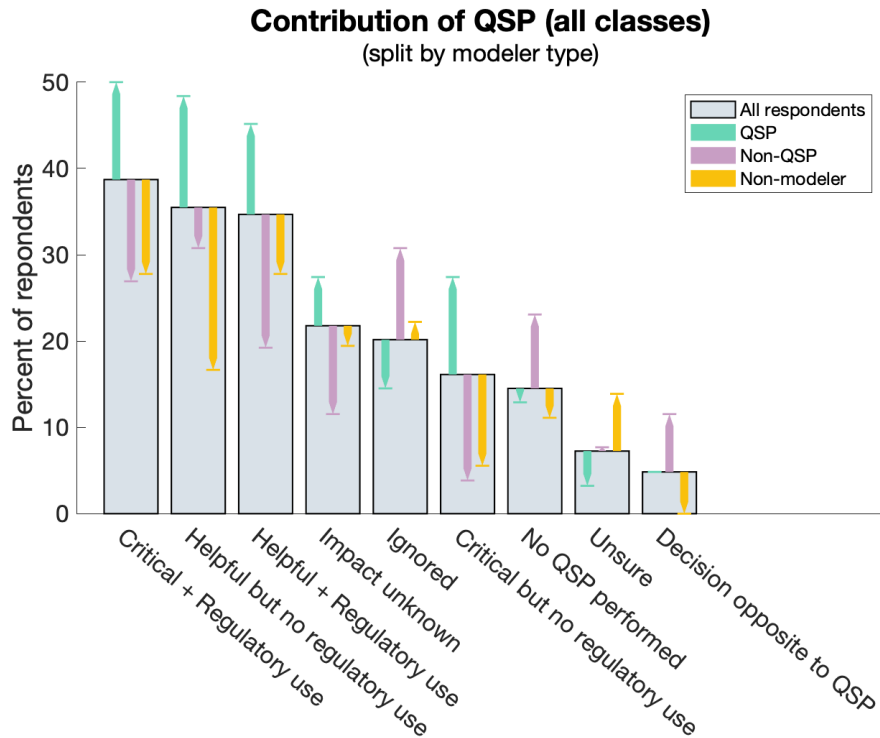


Most conflicting areas:

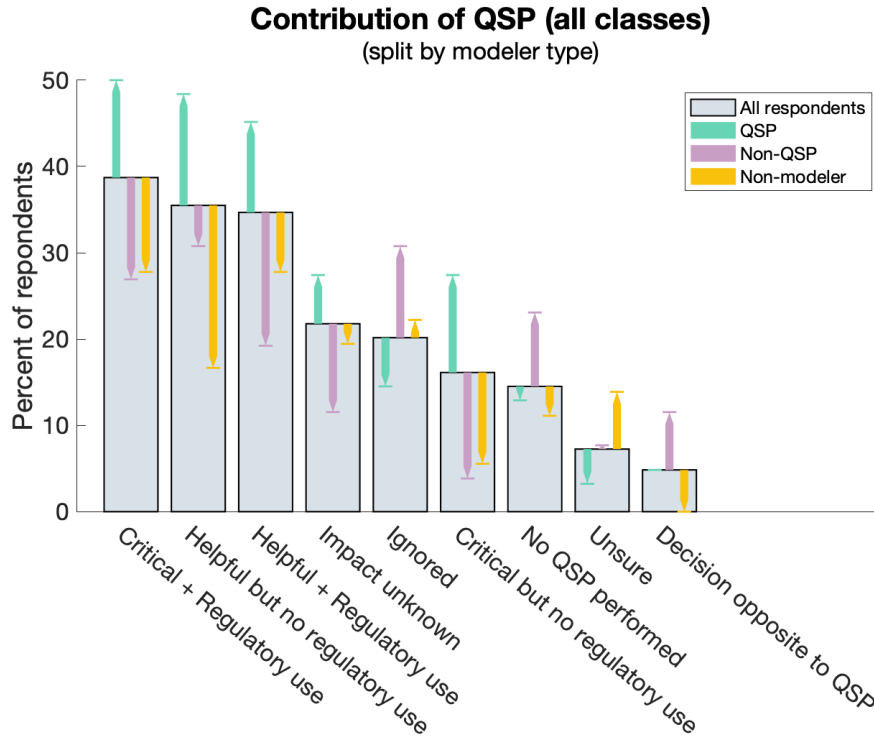
1. Biomarkers

Perceived impacts of QSP in I-O

What have been the contributions of QSP in your I-O projects?



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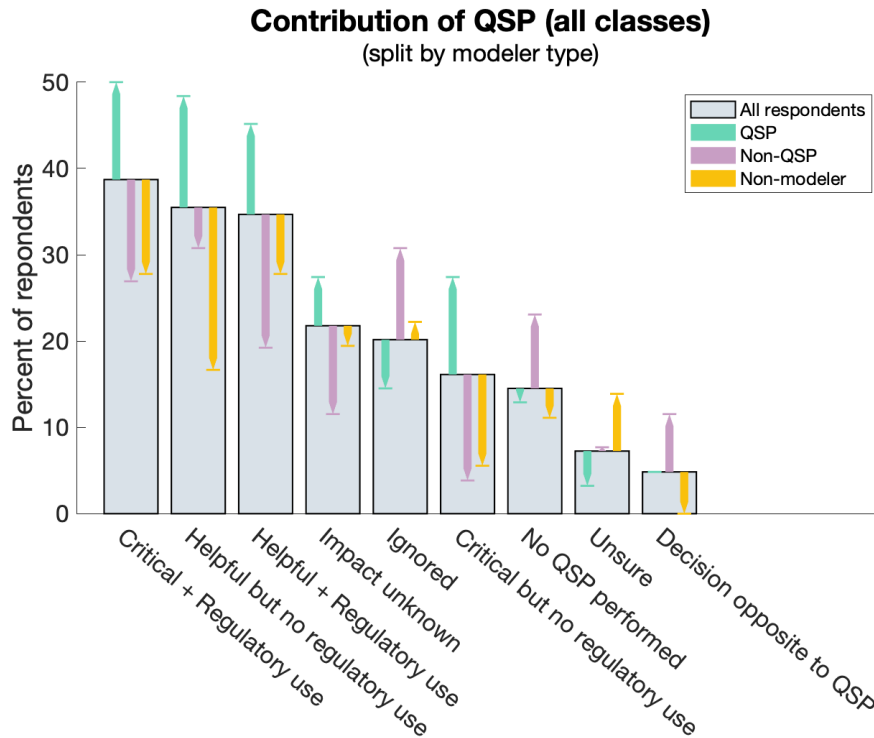


Top impacts:

1. Critical + Regulatory use
2. Helpful but no regulatory use
3. Helpful + regulatory use

The survey respondents perceive the contribution of QSP positively, with most of the responses ranging from QSP leading to critical impact on projects to being useful to projects

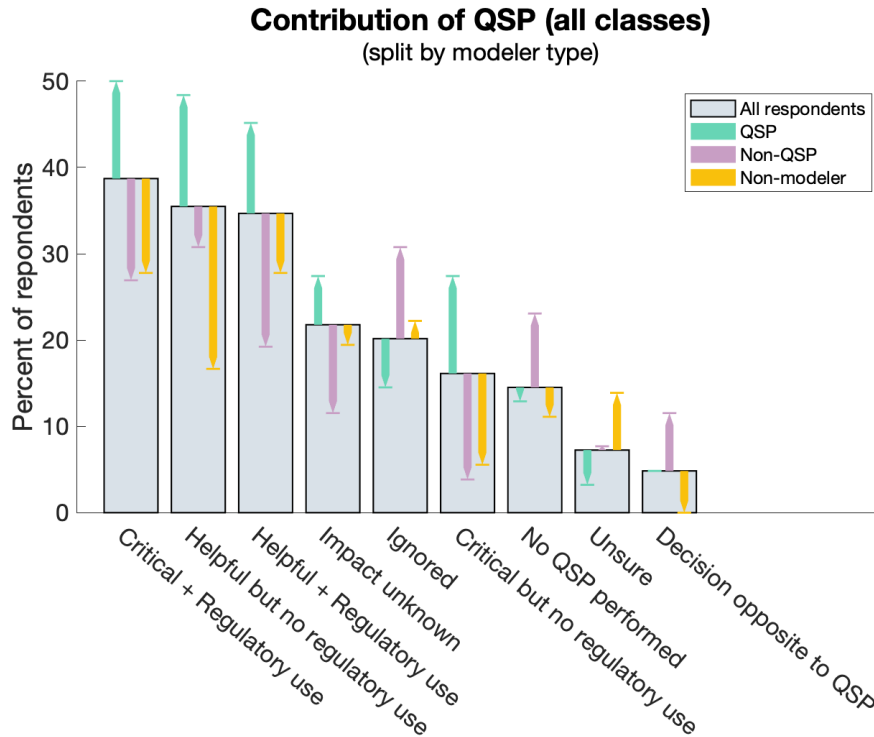
What have been the contributions of QSP in your I-O projects?



Bottom impacts:

1. Decision opposite to QSP
2. Unsure
3. No QSP performed

What have been the contributions of QSP in your I-O projects?



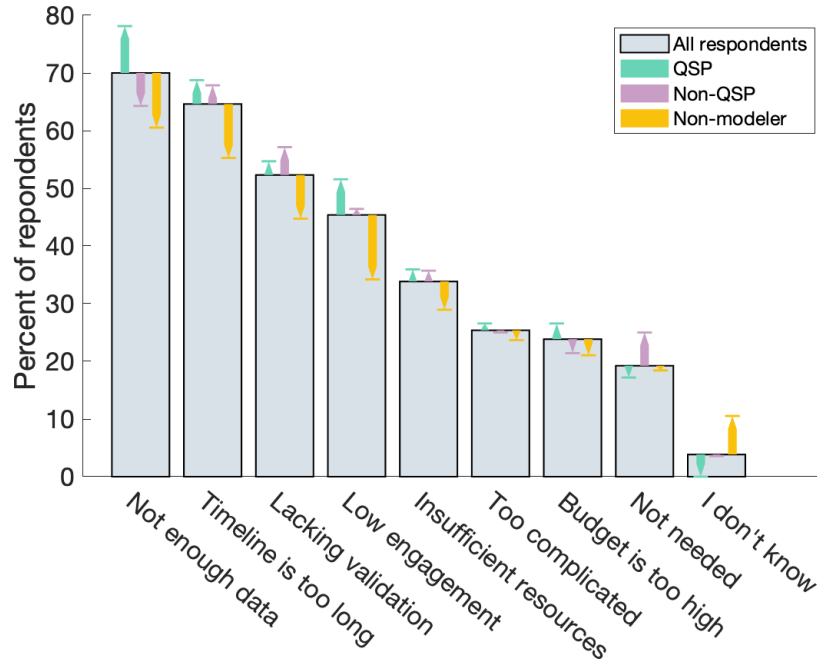
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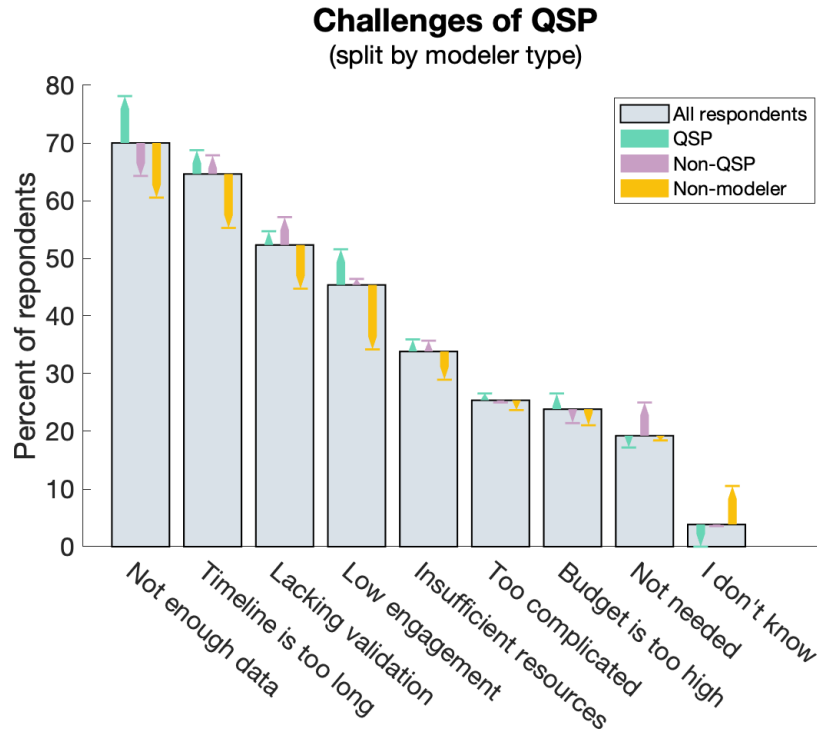
Challenges of applying QSP in I-O

What are the challenges in applying QSP modeling to support I-O projects?

Challenges of QSP
(split by modeler type)



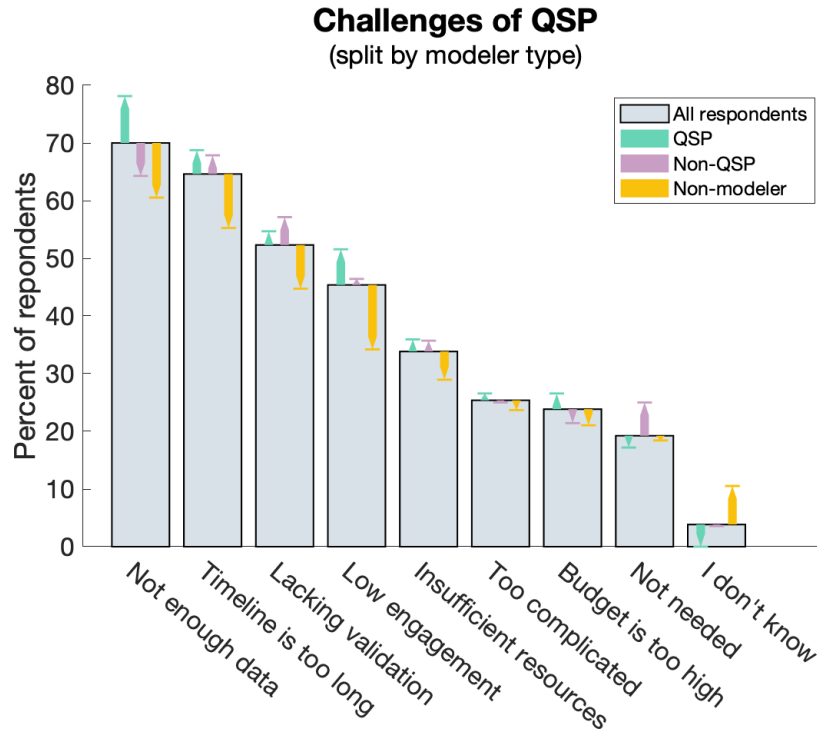
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Top Challenges:

1. Not enough data
2. Timeline is too long
3. Lacking validation

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Top Challenges:

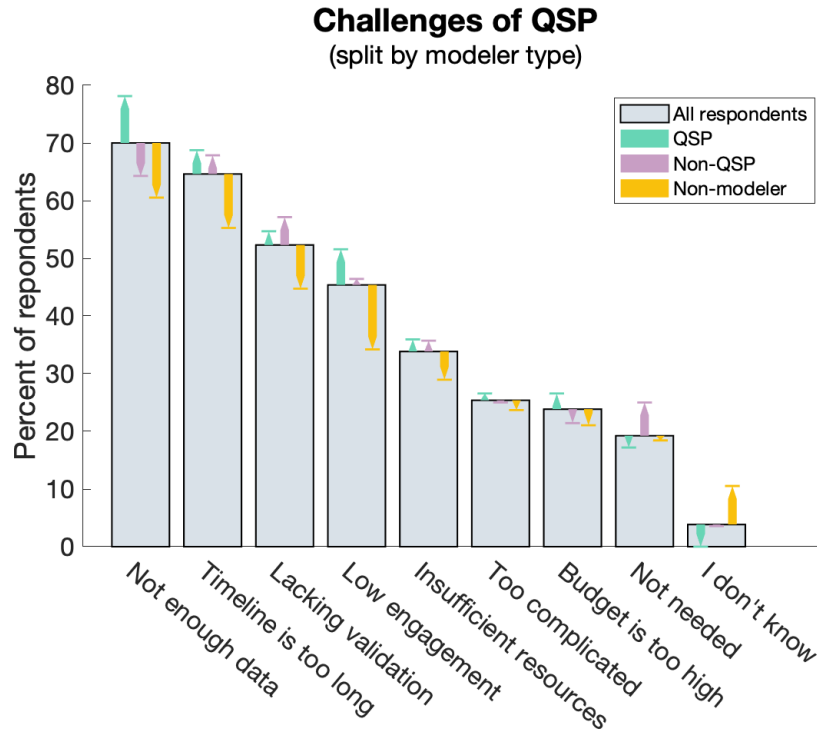
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2. Timeline is too long
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Not enough data: Widespread difficulty for all modeling approaches

Timeline is too long: Complexity

Lacking validation: No generally accepted validation process

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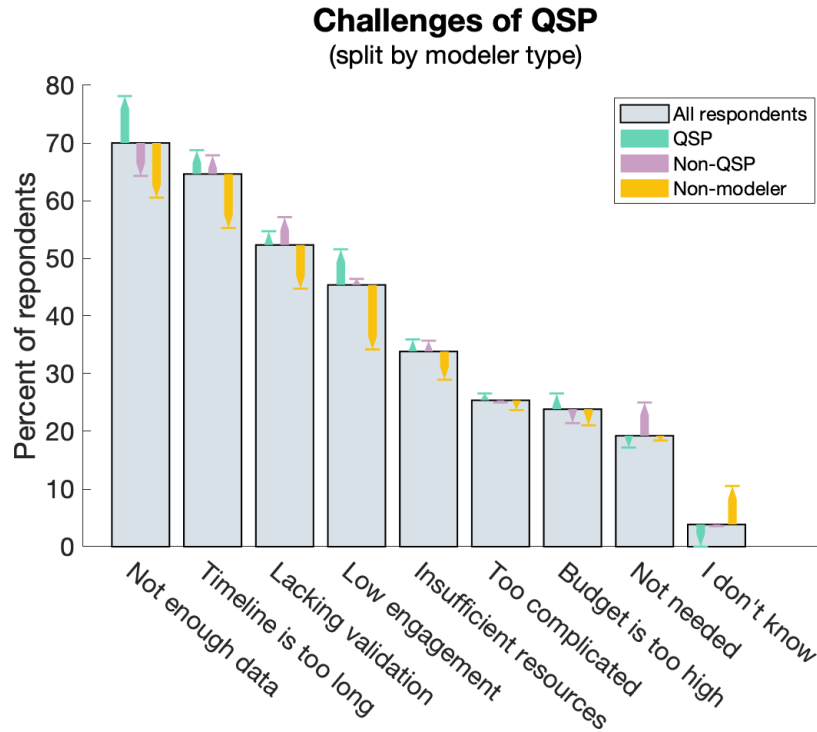
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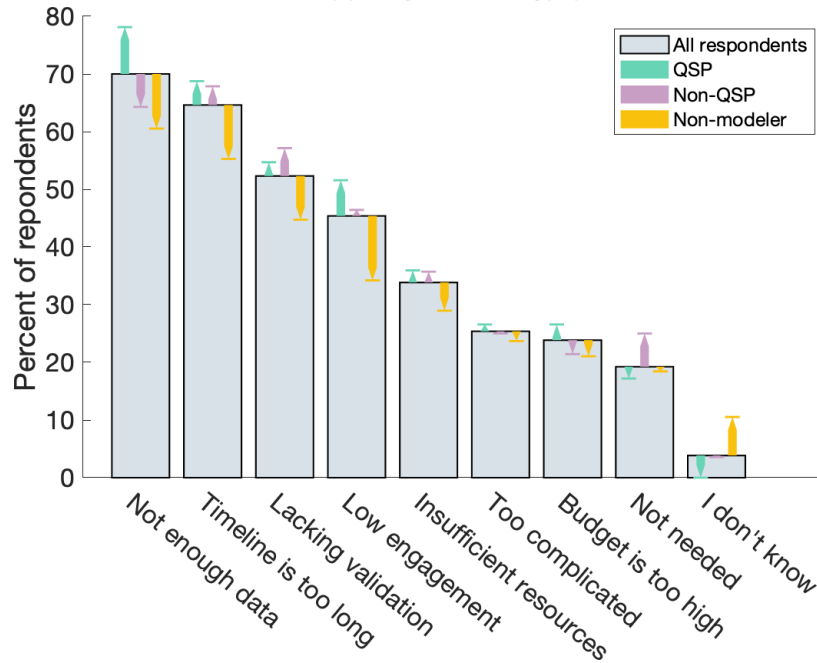
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What are the challenges in applying QSP modeling to support I-O projects?

Challenges of QSP
(split by modeler type)

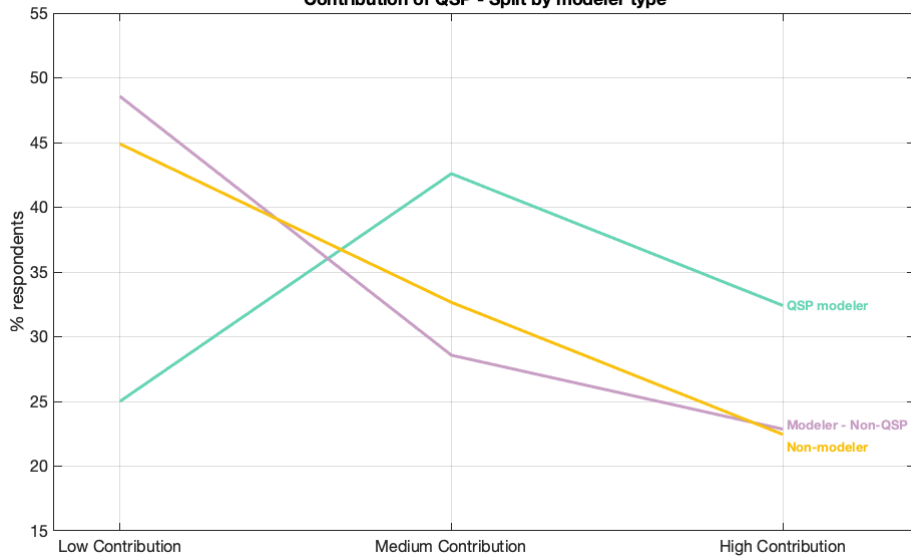


Bottom Challenges:

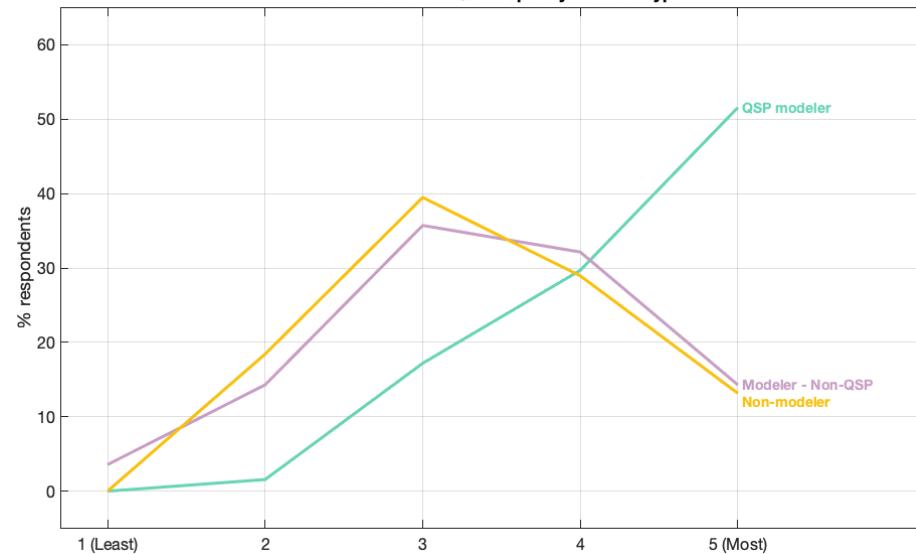
1. Not needed
2. Budget is too high
3. Too complicated

Difference in perception between QSP modelers and non-QSP people

Contribution of QSP - Split by modeler type



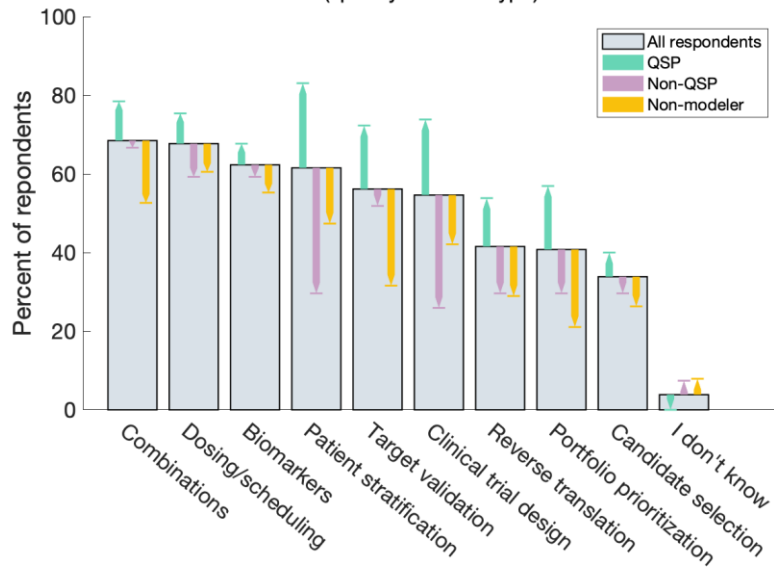
Reliance level on QSP - Split by modeler type



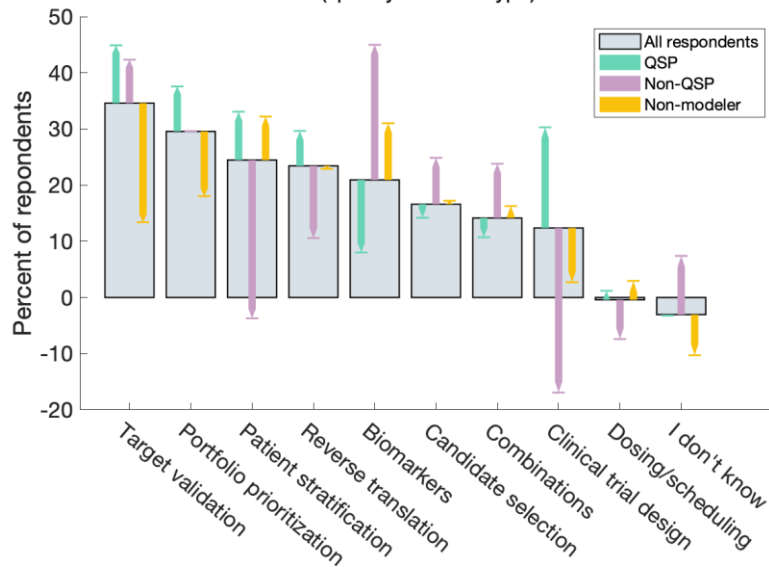
Future directions of QSP in I-O

What are the key I-O questions that QSP could address in your programs in the future?

Questions that QSP could address in the future
(split by modeler type)



Trend in what questions QSP could address
(split by modeler type)



Unique aspects of applying QSP in I-O vs. other disease areas

What are the unique aspects of applying QSP in I-O vs. other disease areas?



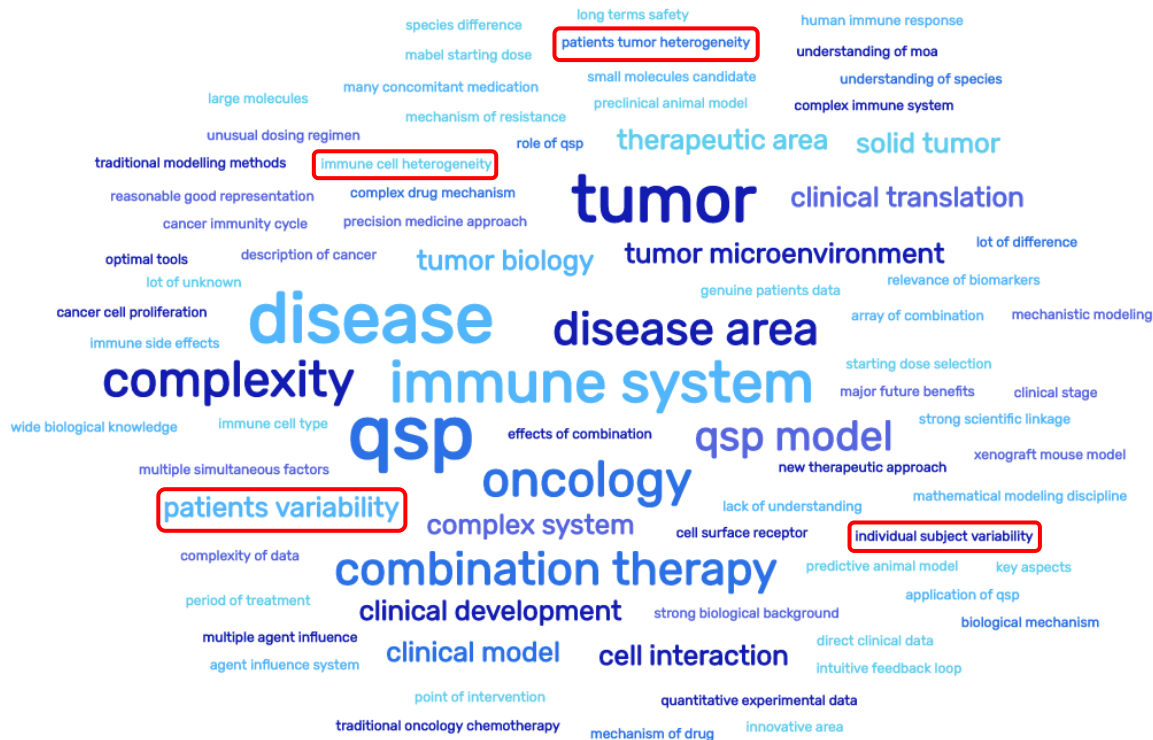
What are the unique aspects of applying QSP in I-O vs. other disease areas?

Complexity



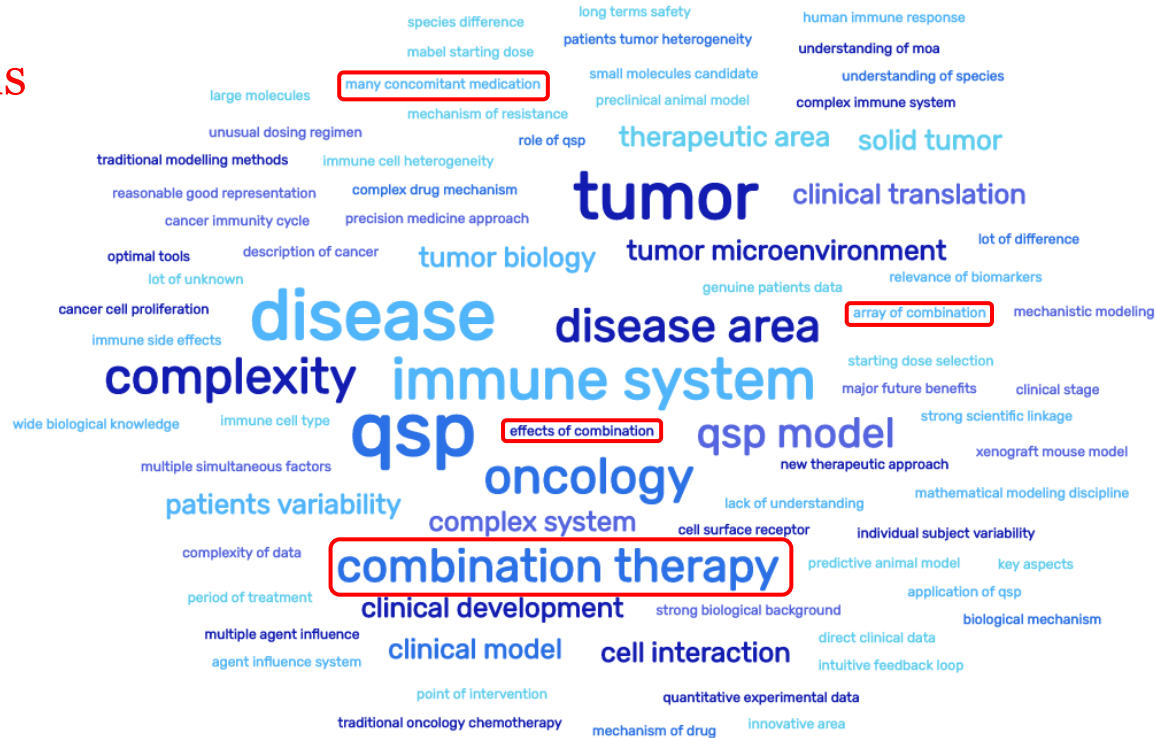
What are the unique aspects of applying QSP in I-O vs. other disease areas?

Variability



What are the unique aspects of applying QSP in I-O vs. other disease areas?

Combinations



What are the unique aspects of applying QSP in I-O vs. other disease areas?

Other aspects



Key takeaway from the survey results

- Overall, the survey respondents perceive the contribution of QSP positively, with most of the responses ranging from QSP leading to critical impact on projects to being useful to projects.
- QSP models seem to be currently most often used to help with dosing/scheduling of clinical studies; while use in early drug discovery such as target validation and candidate selection is lower at the moment but is expected to grow in the future.
- The top 3 challenges for IO QSP model development identified in the survey are limited data, long timeline and insufficient validation of the models.
- The survey revealed differences in perception on the impact of QSP in I-O between QSP modelers and others suggesting QSP modelers need to improve education and communication to their stakeholders.
- For the future, people in general consider that QSP models can further increase their contribution to IO programs in all areas; while helping with combination therapy is being selected by the highest number of respondents.
- A lot of room to grow, either in terms of communication, applying QSP more widely, more transparent validation criteria.



THANK YOU!