# Towards Realistic Optimization Benchmarks: A Questionnaire on the Properties of Real-World Problems

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Continuous

/discrete

Problem domain

Variable

types?

Both

Number of continuous

/discrete variables

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### Background

- Benchmarks are used for performance comparison
- Benchmark problems have unrealistic properties [1,2]
- Identify real-world problems
- Identify problem properties
- Integrate into improved benchmarks

### Fill Out the Questionnaire



https://sites.google.com/view/macoda-rwp/

## Read the paper 📾

https://arxiv.org/abs/2004.06395/

#### Variable cardinality Variable cardinality Combinatorial Q5-19 Number of combinatorial Number of combinatorial variables variables Number of constraints Constraints No Yes Constraint types Q20-28 Constraint evaluation times Objective types SO or MO Objective types SO MO Existing solutions Existing solutions Objective evaluation times Objective evaluation times Q29-69 Objective space topology Objective space topology Objective correlation and preference Pareto set/front properties Solvers used Q70-75

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### References

Contact information

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R. Tanabe and A. Oyama. 2017. A note on constrained multi-objective optimization benchmark problems. In 2017 IEEE Congress on Evolutionary Computation (CEC). IEEE, San Sebastian, Spain, 1127–1134. https://doi.org/10.1109/CEC. 2017.79694

## **Questionnaire Structure**

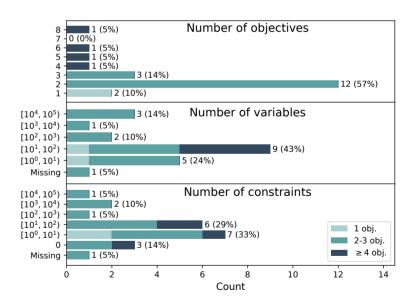
Number of continuous

/discrete variables

Q1-4

### **First Results**

- 21 problems
- Constrained and continuous problems are common
- Objective and constraint evaluations are costly: > 1 minute for 40+% of problems
- Objective space topology is often unknown: a challenge for future benchmark design



The number of objectives, variables, and constraints of the 21 optimization problems