

Enumeration of large four-and-two-level designs

Introduction

Four-level factors are useful:

- ▶ to study multi-level categorical factors
- ▶ to study non-linear effects of numerical factors

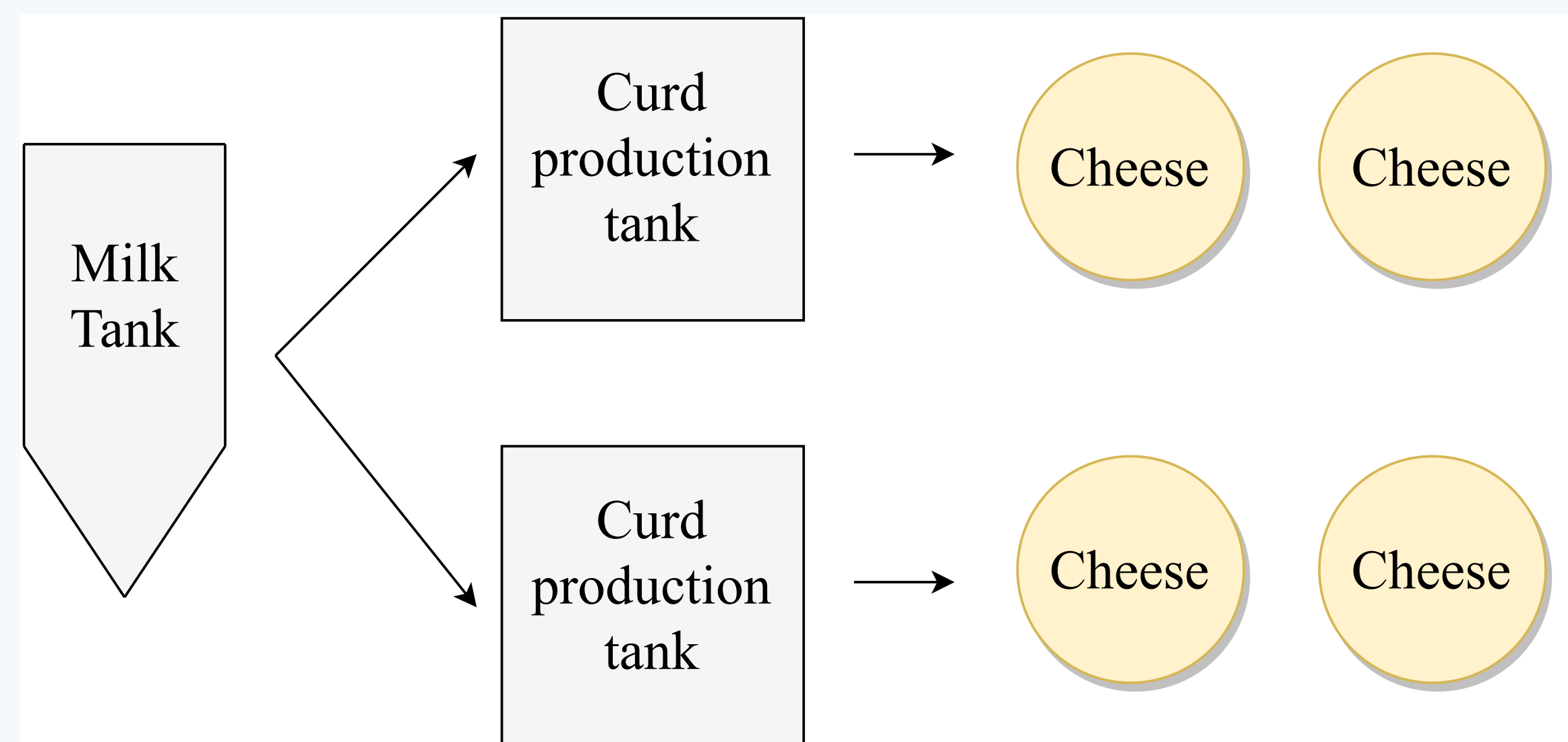
Current catalogs of four-and-two-level designs:

- ▶ **Wu & Zhang (1993; [1]):** 16 and 32-run designs, 1 or 2 four-level factors, up to 11 two-level factors
- ▶ **Ankenman (1999; [2]):** 16 and 32-run designs, 1, 2 or 3 four-level factors, up to 14 two-level factors

Cheese-making experiment

Screening experiment in 128 runs. There are 10 potentially influential factors :

- ▶ 9 two-level factors $\rightarrow 2^9$
- ▶ 1 four-level factor $\rightarrow 4^1$



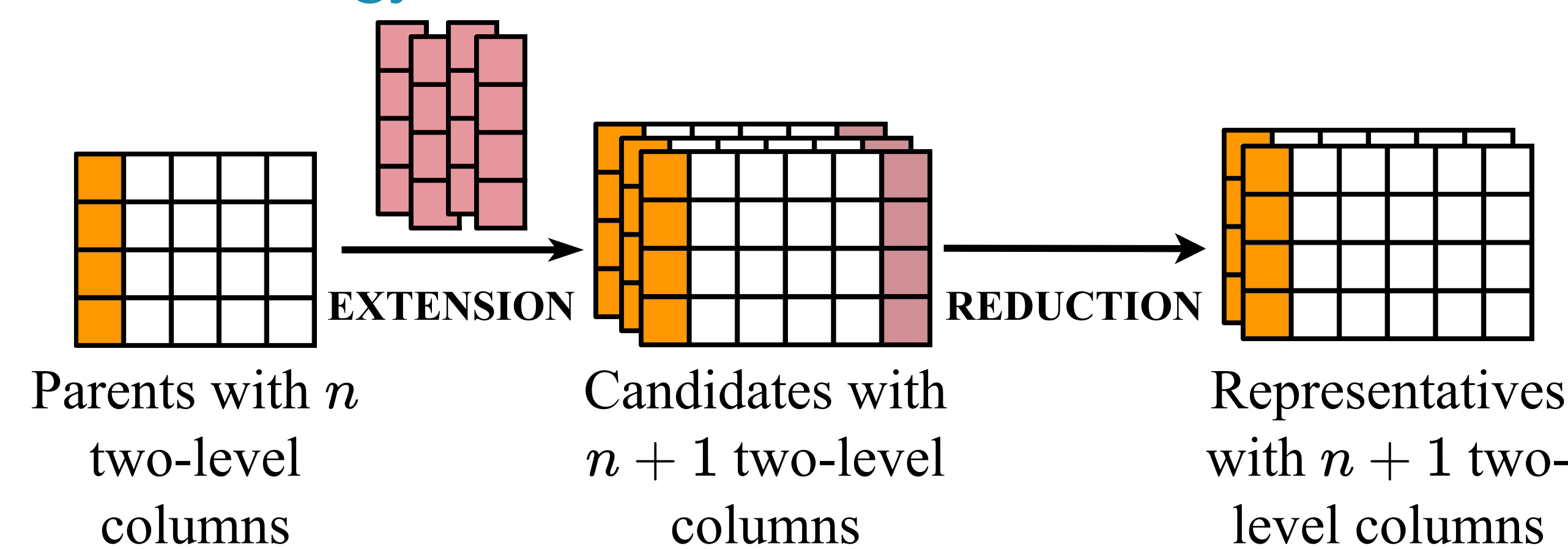
No available catalog !

Goal

Create a complete catalog of regular four-and-two-level designs with large run sizes

- ▶ **Complete:** all non-equivalent designs
- ▶ **Large run sizes:** for up to 256 runs

Methodology

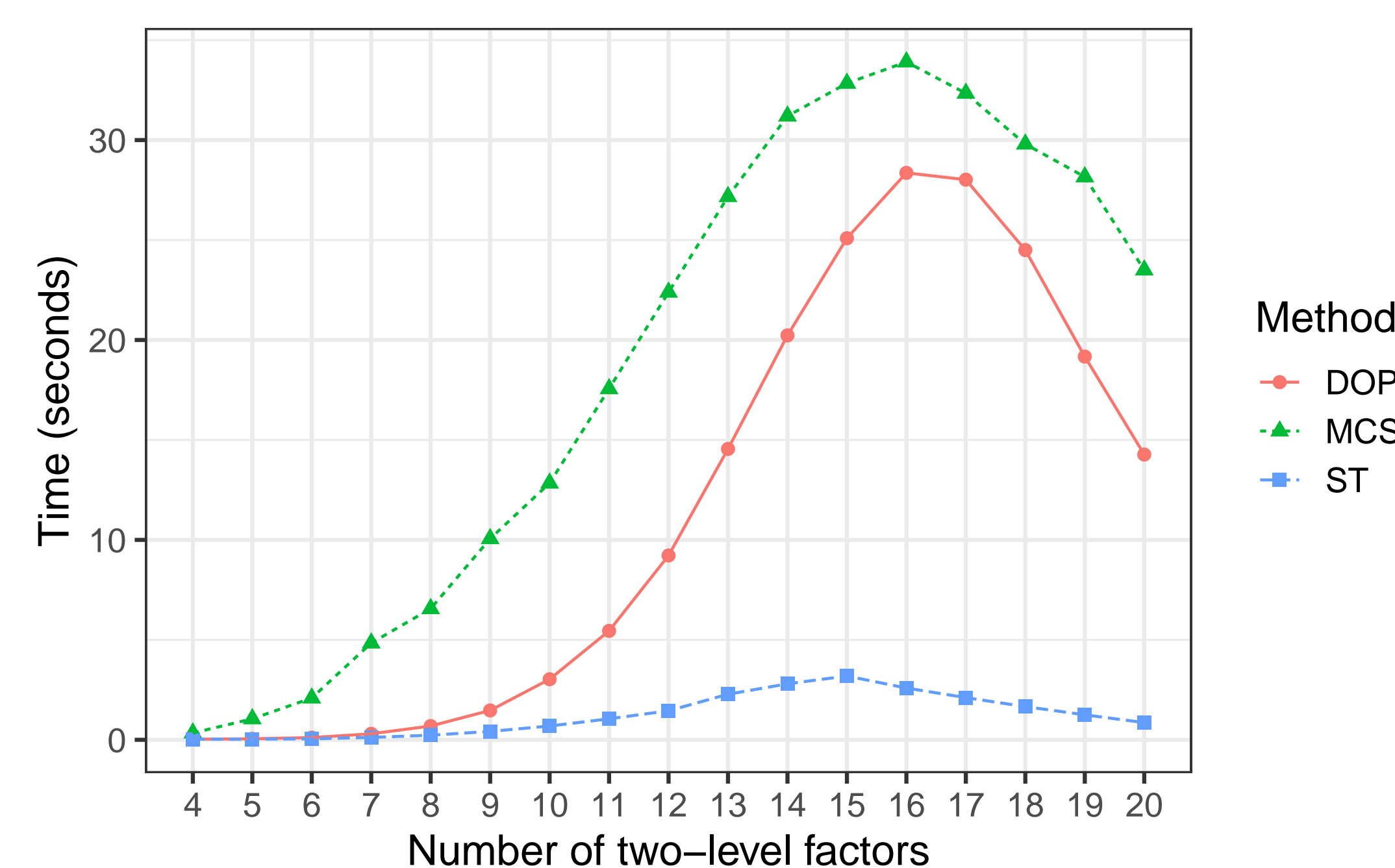


Selected algorithms

- ▶ Extension procedures: Search Table (ST; [3]), Delete-One-Factor Projection (DOP; [4]), Minimum Complete Set (MCS; [5])
- ▶ Reduction procedures: NAUTY graph isomorphism [6, 7], LMC canonical form testing [5]

	ST	DOP	MCS
NAUTY	ST-NAUTY	DOP-NAUTY	Not optimal
LMC test	Not optimal	Incompatible	MCS - LMC

Computing times for 32-run designs with 1 four-level factor



- ▶ ST-NAUTY was the most efficient of the 3 enumeration methods. Similar results for other test cases.

Results

Number of non-equivalent $4^m 2^n$ designs for $n \leq 20$:

m	N			
	32	64	128	256
1	8,279	254	1,442,301	> 86,528
2	36,692	137	2,837,275	> 40,848
3	-	28	2,141,911	> 78,386

Cheese-making experiment revisited

There are 264 $4^1 2^9$ designs involving 128 runs

ID	Added columns	WLP (A_4, A_5, A_6)
	1	60, 77, 86, 103
2	29, 46, 90, 101	(0, 9, 3)
3	13, 58, 91, 116	(1, 6, 6)

- ▶ Designs 1 and 2 were not compatible with required restrictions on the randomization.
- ▶ Design 3 is the best design that is compatible with these restrictions.
- ▶ Remaining designs have inferior WLP.

References

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- [2] Bruce E. Ankenman. Design of Experiments with Two- and Four-Level Factors. *Journal of Quality Technology*, 31(4):363-375, October 1999.
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- [4] Hongquan Xu. Algorithmic Construction of Efficient Fractional Factorial Designs With Large Run Sizes. *Technometrics*, 51(3):262-277, August 2009.
- [5] Eric D. Schoen, Pieter T. Eendebak, and Man V. M. Nguyen. Complete enumeration of pure-level and mixed-level orthogonal arrays. *Journal of Combinatorial Designs*, 18(2):123-140, 2010.
- [6] Kenneth J. Ryan and Dursun A. Bulutoglu. Minimum Aberration Fractional Factorial Designs With Large N. *Technometrics*, 52(2):250-255, May 2010.
- [7] Brendan D. McKay and Adolfo Piperno. Practical graph isomorphism, II. *Journal of Symbolic Computation*, 60:94-112, January 2014.

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