# Fractional Factorial Designs With Admissible 

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An Experiment on How Time to Cycle up a Hill Is Affected by Seven Variables
(Box, Hunter, and Hunter, 1978)

| Variables <br> (Factors) | Variable Settings <br> (Levels) |
| :--- | :--- |
|  | - |
| $A:$ handlebars | up down |
| $B:$ generator | off on |
| $C:$ seat height | up down |
| $D:$ breakfast | yes no |
| $E:$ raincoat | on off |
| $F:$ gear | low medium |
| $G:$ tire pressure | high low |

Response variable: time (seconds) to complete a trial bicycle run up to a hill between fixed marks

# An Eight-Run Experimental Design With 

 Seven Factors: A $2^{7-4}$ Design|  |  | $A$ | $B$ | $C$ | $D$ | $E$ | $F$ | $G$ | time |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| run | $\mathbf{I}$ | 1 | 2 | 3 | 12 | 13 | 23 | 123 | $(\mathrm{sec})$ |
| 1 | + | - | - | - | + | + | + | - | 69 |
| 2 | + | - | - | + | + | - | - | + | 52 |
| 3 | + | - | + | - | - | + | - | + | 60 |
| 4 | + | - | + | + | - | - | + | - | 83 |
| 5 | + | + | - | - | - | - | + | + | 71 |
| 6 | + | + | - | + | - | + | - | - | 50 |
| 7 | + | + | + | - | + | - | - | - | 59 |
| 8 | + | + | + | + | + | + | + | + | 88 |

Four independent defining words:
$\mathbf{I}=A B D=A C E=B C F=A B C G$

## A $2^{m-p}$ Fractional Factorial Design

- $m$ two-level factors
$-2^{m-p}$ runs
- determined by its defining contrast subgroup, which consists of $2^{p}-1$ defining words generated by $p$ independent defining words

Example: For a $2^{8-3}$ design with

$$
\mathbf{I}=A B C F=A B D G=A C D E H,
$$

its defining contrast subgroup is

$$
\begin{aligned}
\mathbf{I} & =A B C F=A B D G=C D F G=A C D E H \\
& =B D E F H=B C E G H=A E F G H .
\end{aligned}
$$

The number of letters in a word is its length. Resolution: the length of the shortest word in the defining contrast subgroup (Box and Hunter, 1961)

## MaxC2 Designs

- Clear main effect: a main effect not aliased with any other main effect or any two-factor interaction (2fi)
- Clear 2 fi : a 2 fi not aliased with any main effect or any other 2 fi
- For economical reasons, resolution IV designs are often used for estimating main effects and some 2 fi 's.
- MaxC2 designs: resolution IV designs with the maximum number of clear 2fi's among all $2^{m-p}$ designs with maximum resolution IV
- Wu and Hamada (2000) recommend that MaxC2 designs be the best among designs with maximum resolution IV.


## Clear Compromise Plans

- Suppose that the $m$ factors are divided into two groups: $G_{1}$ of size $m_{1}$ and $G_{2}$ of size $m_{2}=m-m_{1}$.
- $G_{1} \times G_{1}$ : the set of 2 fi's among the factors in $G_{1}$ (similarly, $G_{2} \times G_{2}$ )
$G_{1} \times G_{2}$ : the set of 2 fi 's between the factors in $G_{1}$ and those in $G_{2}$
- Clear compromise plans (Ke, Tang, and Wu, 2005) are resolution IV designs with all the specified 2fi's (in one of the following sets) being clear:
(1) $G_{1} \times G_{1}$ (class I)
(2) $G_{1} \times G_{1}$ and $G_{2} \times G_{2}$ (class II)
(3) $G_{1} \times G_{1}$ and $G_{1} \times G_{2}$ (class III)
(4) $G_{1} \times G_{2}$ (class IV)


## Designs With Admissible Sets of Clear 2fi's

- For a $2^{m-p}$ resolution IV design $d$, its clear 2 fi 's can be represented by a linear graph $G(d)$ :
- Each vertex represents a factor.
- Each line connecting two vertices represents a clear 2 fi between the two vertices (factors).
- $G(d)$ is called admissible if it is not a real subgraph of $G\left(d^{\prime}\right)$ for any other $2^{m-p}$ resolution IV design $d^{\prime}$.
- If $G(d)$ is admissible, then $d$ is called admissible.


## Admissible Designs

- Admissible designs simplify the search for resolution IV designs that satisfy certain requirements for some 2 fi 's to be clear.
- The search for clear compromise plans can be carried out within the class of admissible designs. This greatly reduces the computational burden.
- The graphs representing the clear 2 fi 's of these admissible designs give the structures of the clear 2 fi 's. This is useful for practitioners to arrange for factors in an experiment.


## Notation and Basic Facts

- $k=m-p$
- $M(k)$ : the maximum value of $m$ for which there exists a $2^{m-p}$ design of resolution at least V
(e.g., $M(5)=6$ and $M(6)=8$, Draper and Lin, 1990)
- There exists a $2^{m-p}$ design of resolution IV with clear 2 fi 's if and only if $m \leq$ $2^{k-2}+1$ (Chen and Hedayat, 1998).
- It suffices to consider $k \geq 5$ and

$$
M(k)+1 \leq m \leq 2^{k-2}+1 .
$$

Number of Admissible Designs and Graphs

| Design | $N$ | $N_{\text {des }}$ | $N_{\text {graph }}$ |
| ---: | ---: | ---: | ---: |
| $2^{7-2}$ | 3 | 1 | 1 |
| $2^{8-3}$ | 4 | 1 | 1 |
| $2^{9-4}$ | 5 | 1 | 1 |
|  |  |  |  |
| $2^{9-3}$ | 12 | 1 | 1 |
| $2^{10-4}$ | 24 | 4 | 3 |
| $2^{11-5}$ | 34 | 7 | 6 |
| $2^{12-6}$ | 43 | 12 | 9 |
| $2^{13-7}$ | 47 | 10 | 6 |
| $2^{14-8}$ | 49 | 9 | 5 |
| $2^{15-9}$ | 44 | 5 | 4 |
| $2^{16-10}$ | 48 | 1 | 1 |
| $2^{17-11}$ | 40 | 1 | 1 |
|  |  |  |  |
| $2^{12-5}$ | 249 | 3 | 1 |
| $2^{13-6}$ | 623 | 5 | 3 |
| $2^{14-7}$ | 1535 | 30 | 15 |
| $2^{15-8}$ | 3522 | 140 | 99 |
| $2^{16-9}$ | 7500 | 682 | 584 |

$N$ : \# of non-isomorphic resolution IV designs; $N_{\text {des }}$ : \# of admissible designs; $N_{\text {graph }}$ : \# of admissible graphs

## Complete Catalog of 32-Run Admissible Designs

|  | Additional |  | C |
| :--- | :--- | :--- | :--- |
| Design | Columns | C 2 | $*(8,16,27)$ |
| $7 \_2.1$ | 727 |  | 15 |
| $8 \_3.1$ | 71129 | $*(16,29)$ | 13 |
| $9 \_4.1$ | 7111330 | $*(16,30)$ | 15 |

- Columns: in the sense of Chen, Sun, and Wu (1993)
- C2: clear 2fi's
- C: the number of clear 2fi's
- *(8, 16, 27): the set of 2 fi 's involving at least one of the factors (columns) 8, 16 , or 27


## All $2^{9-3}$ and $2^{10-4}$ Admissible Designs

- 9_3.1: Additional columns $(\mathrm{AC})=\{7,27,45\}$; $\mathrm{C}=30$; C 2 : ${ }^{*}(8,16,32,27,45)$
- 10_4.1: $\mathrm{AC}=\{7,27,43,53\} ; \mathrm{C}=33$; C2: $*(8,53),(1,2,4,7) \times(16,32,27$, 43)
- 10_4.2: $\mathrm{AC}=\{7,11,29,51\} ; \mathrm{C}=30$; C2: *(16, 32, 29, 51)
- 10_4.3: $\mathrm{AC}=\{7,11,29,46\} ; \mathrm{C}=30$; C2: * $16,32,29,46$ )
- 10_4.4: $\mathrm{AC}=\{7,25,42,53\} ; \mathrm{C}=27$; C2: *53; @((4, 7), $(16,25),(32,42))$; $8 \times(4,7) ; 2 \times(16,25) ; 1 \times(32,42)$

Note: $@\left(G_{1}, G_{2}, G_{3}\right) \equiv\left(G_{1} \times G_{2}\right) \cup\left(G_{2} \times\right.$ G3) $\cup\left(G_{3} \times G_{1}\right)$

## All $2^{13-6}$ Admissible Designs

- 13_6.1: $\mathrm{AC}=\{7,27,43,85,102,120\} ; \mathrm{C}=66$; C2: *(8, 64, 85, 102, 120);
$(1,2,4,7) \times(16,32,27,43)$
- 13_6.2: $\mathrm{AC}=\{7,27,43,53,78,120\} ; \mathrm{C}=66$; C2: * $(8,64,53,78,120)$; $(1,2,4,7) \times(16,32,27,43)$
- 13_6.3: $\mathrm{AC}=\{7,27,45,78,121,122\} ; \mathrm{C}=63$; C2: *(8, 16, 32, 64, 27, 45, 78)
- 13_6.4: $\mathrm{AC}=\{7,25,42,77,118,120\} ; \mathrm{C}=60$; C2: *(64, 77, 118, 120); @((4, 7), $(16,25),(32,42))$; $8 \times(4,7) ; 2 \times(16,25) ; 1 \times(32,42)$
- 13_6.5: $\mathrm{AC}=\{7,25,42,53,78,120\} ; \mathrm{C}=60$; C2: * $64,53,78,120$ ); © $((4,7),(16,25),(32,42))$; $8 \times(4,7) ; 2 \times(16,25) ; 1 \times(32,42)$


## Some Observations

- MaxC2 designs are always admissible.
- In general, minimum aberration designs (Fries and Hunter, 1980) are inadmissible unless they are MaxC2 designs.
- For $2^{7-2}, 2^{8-3}, 2^{9-4}, 2^{9-3}, 2^{16-10}$, $2^{17-11}, 2^{32-25}$, and $2^{33-26}$ designs, MaxC2 designs are unique and are the only admissible designs.
- All three admissible $2^{12-5}$ designs are MaxC2 designs and have the same linear graph of clear 2 fi 's.
- It is easy to identify from the catalogs of admissible designs those that have the same linear graph.


## Applications

- Use a 64-run design to study 10 factors $A$ to $J$.

To estimate all the main effects and 2fi's among factors $A, B, C$, and $D$ :

- Select the design 10_4.2 and assign factors $A, B, C$, and $D$ to the columns 16, 32, 29, and 51.
- Use a 128-run design to study 13 factors $A$ to $M$.

To estimate all the main effects, any 2 fi 's that contain at least one of the factors from $\{A, B, C, D, E\}$, and any 2 fi 's in $\{F, G, H, I\} \times\{J, K, L, M\}$ :

- Select the design 13_6.1 and assign factors $A$ to $M$ to the columns 8, 64, 85, 102, 120, 1, 2, 4, 7, 16, 32, 27 , and 43, respectively.

