

A Rigorous View of Mode Confusion

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Mode Confusion

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- in shared-control systems
- humans use a **mental model** of the technical system
 - can get **out of sync**

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- in shared-control systems
- humans use a **mental model** of the technical system
 - can get **out of sync**
- examples:
 - Airbus A320 in Mulhouse airshow, 1988
 - Airbus A320 near Strasbourg, 1992

movie

(small)

What Exactly is a Mode Confusion?

- literature??
- our work:
 1. a definition
 2. causes
 3. what to do

Basic Idea of a Definition

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reality: **implementation**
- formally: a refinement relationship
in an **abstracted** description

Autonomous Wheelchair “Rolland”

- joystick-to-motor line wiretapped
- ring of sonar sensors
- safety module
- driving assistant
 - turning on the spot skill
 - obstacle avoidance skill
 - . . .



Where are the Modes?

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- **black-box view!**
 - user can see wheelchair behaviour only
 - relevant events are environment events
 - ▷ “joystick pushed forward”
 - ▷ “motor starts to move”
- requirements level
 - formalism: CSP, . . .

Relating Mental Model and Reality

- user must perceive reality through his senses
 - environment events \neq mental events !
 - “wall gets close” \neq “see that wall gets close”
- formally: function over behaviours:
SENSE: environment events \rightarrow mental events

Relating Mental Model and Reality

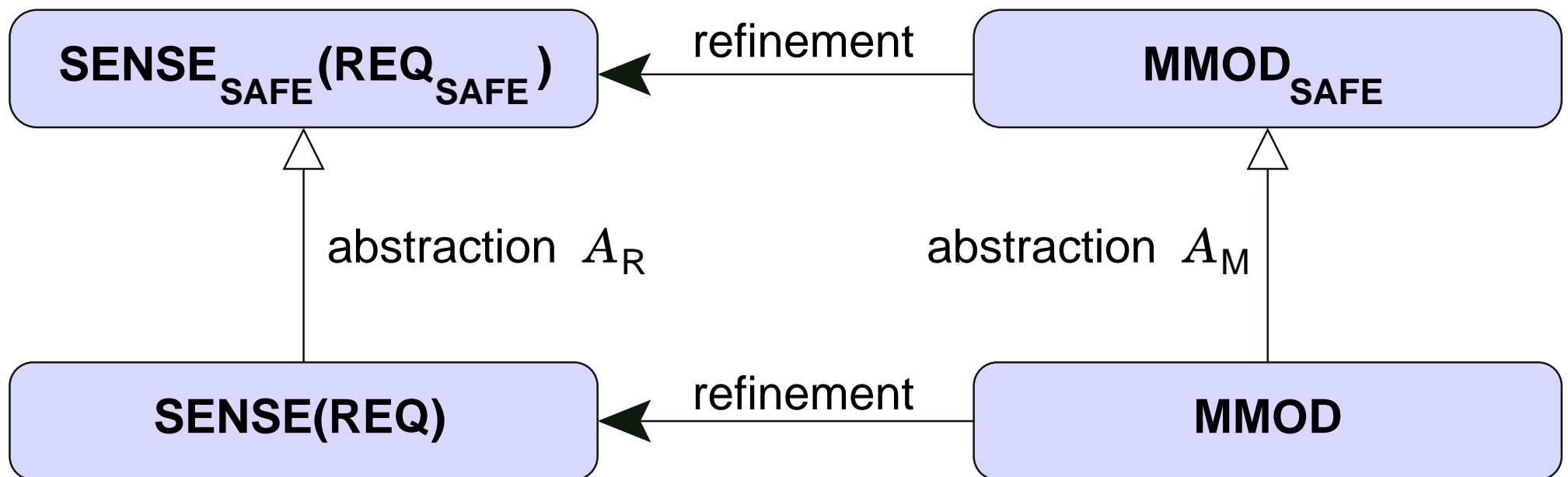
- user must perceive reality through his senses
 - environment events \neq mental events !
 - “wall gets close” \neq ”see that wall gets close”
- formally: function over behaviours:
SENSE: environment events \rightarrow mental events
- rigorous specification/implementation relation:

$$\text{MMOD} \sqsubseteq_F \text{SENSE}(\text{REQ})$$

- CSP, failure refinement. See paper.

Two Refinement Relations

- **abstraction** to safety-relevant part



Rigorous Definitions

Definition 1 (Potential future behaviour)

A potential future behaviour is a set of “failures”.

(failure = trace + set of refusals)

Definition 2 (mode)

A mode of the perceived reality $\text{SENSE}_{\text{SAFE}}(\text{REQ}_{\text{SAFE}})$ is a potential future behaviour.

A mode of the mental model $\text{MMOD}_{\text{SAFE}}$ is a potential future behaviour.

Rigorous Definitions [2]

Definition 3 (mode confusion)

A mode confusion between the perceived reality $\text{SENSE}_{\text{SAFE}}(\text{REQ}_{\text{SAFE}})$ and the mental model $\text{MMOD}_{\text{SAFE}}$ occurs if and only if the perceived reality is not a failure refinement of the mental model, i.e., iff

$$\text{MMOD}_{\text{SAFE}} \not\sqsubseteq_F \text{SENSE}_{\text{SAFE}}(\text{REQ}_{\text{SAFE}})$$

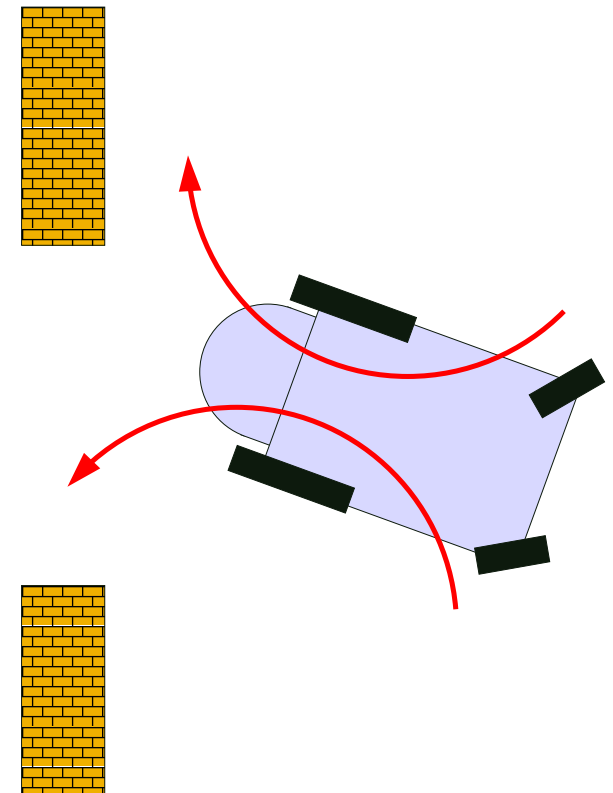
Application to Autonomous Wheelchair “Rolland”

- extracted mental model
by user interview
- got requirements
by reverse engineering C++ code
- both specifications written in CSP
 - 1200 lines of CSP
- model-checking refinement
 - commercial tool FDR



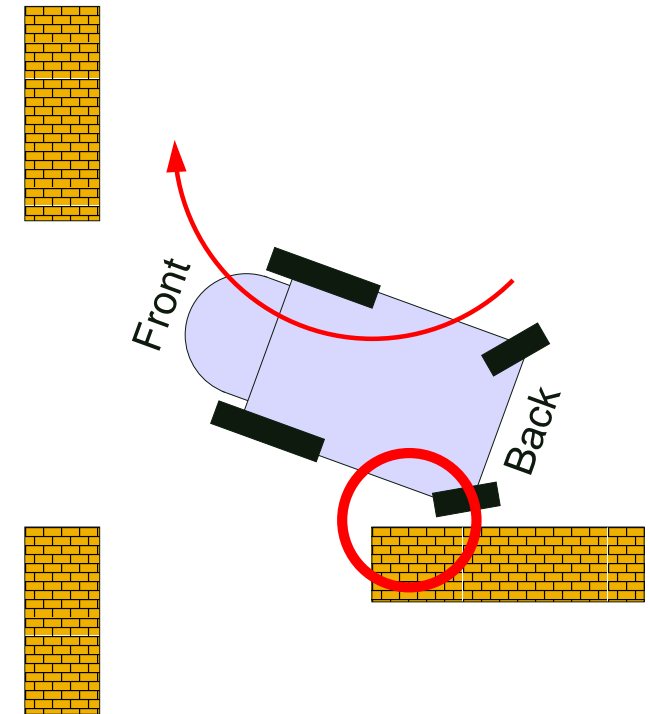
Wheelchair: Obstacle Avoidance Skill

- re-inforces user command to either
 - pass left (through doorway)
 - pass right (turn away from door)
- steers back after avoidance complete
- implicit mode transitions



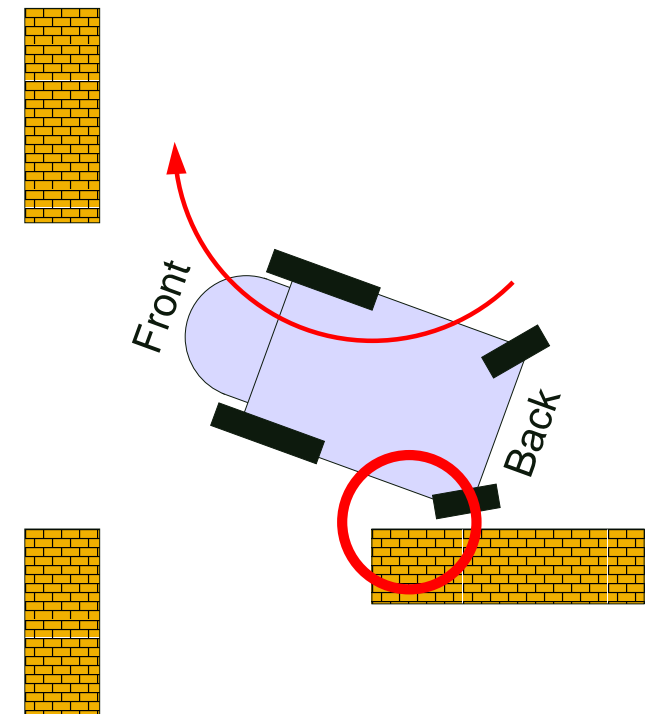
Mode Confusion Found while Modelling Wheelchair

- unexpectedly hidden obstacle
 - danger in **forward** curve:
 - ▷ back of wheelchair swerves out
 - ▷ may **hit obstacle behind** user's head



Mode Confusion Found while Modelling Wheelchair

- unexpectedly hidden obstacle
 - danger in **forward** curve:
 - ▷ back of wheelchair swerves out
 - ▷ may **hit obstacle behind** user's head
 - automation prevents accident
 - ▷ changes direction/speed
 - user doesn't notice event
 - wheelchair and mental model behave differently



Mode Confusions Found by Model-Checking Wheelchair

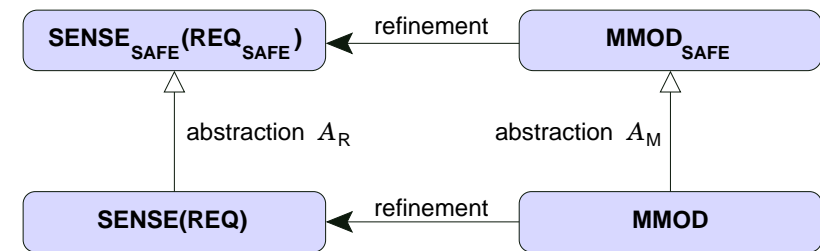
- user's senses work at different speeds
 - vision, tactile, motion-detection
 - perceive reaction before cause
 - is general problem
- wrong mental model of "halt" routine
 - speed command = 0 cm/s → steering angle = "straight"
 - is relevant: "can you do this narrow curve?"

Mode Confusions Found by Model-Checking Wheelchair [2]

- wrong abstraction in user's mental model of old joystick position
 - wheelchair steers back when obstacle passed
 - except if joystick moved
 - did not work in abstracted mental model
- (found above known problem, too)
- (proved that no further mode confusion exists)

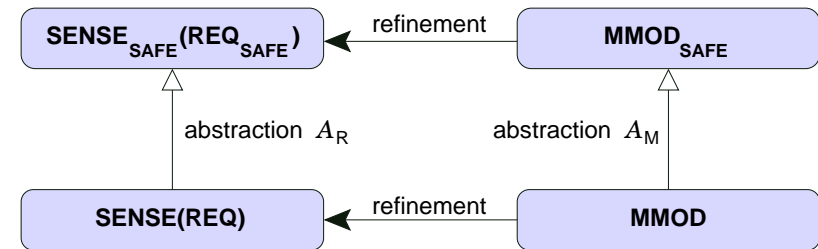
Classification of Mode Confusion Problems

- derived from rigorous definitions:



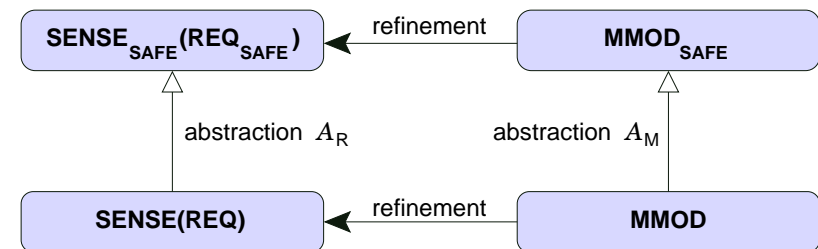
Classification of Mode Confusion Problems

- derived from rigorous definitions:
- classification:
 - 1. incorrect observation by the user
 - 2. incorrect knowledge of the user
 - 3. incorrect abstraction by the user



Classification of Mode Confusion Problems

- derived from rigorous definitions:
- classification:
 - 1. incorrect observation by the user
 - 2. incorrect knowledge of the user
 - 3. incorrect abstraction by the user
- classification is by cause
- leads to recommendations for avoiding mode confusions
 - → details in paper



Summary

- **rigorous definitions of “mode” and “mode confusion”**
 - mental model/reality like specification/implementation
 - rigorous modelling approach
 - ▷ black-box view
 - ▷ precise interfaces
- new classification by **cause**
- solutions:
 - **recommendations** for design
 - foundation for **detection** by **model checking**
 - ▷ successful practical application

Thank you.

Recommendations for Avoiding Mode Confusions [1]

- correct observation by the user:
 - check: can user physically observe all relevant events?
 - check: are user's senses sufficiently precise?
 - solution: add feedback event
 - check: do all relevant events become conscious?
 - ▷ psychology!

Recommendations for Avoiding Mode Confusions [2]

- correct knowledge of the user:
 - document requirements rigorously
 - ▷ training material complete
 - ▷ also learnable
 - avoid non-determinism in requirements (complexity!)
 - check: do imprecise sensors introduce non-determinism?
 - solution for non-determinism: add feedback event

Recommendations for Avoiding Mode Confusions [3]

- correct abstraction by the user:
 - psychology!
 - document explicitly what is safety-relevant

Future Work

- try out recommendations
 - → psychology experts for non-technical ones
- more application domains beyond aviation and robotics

Failure

Definition 4 (Failure of a process P)

is a pair (s, X) of a trace s ($s \in \text{traces}(P)$) and a “refusal” set X of events.

The events in X may be blocked by P after the execution of s .

Failure Refinement

Definition 5 (Failure Refinement)

Process P refines process S in the failures model, written $S \sqsubseteq_F P$, iff
 $traces(P) \subseteq traces(S)$ and also
 $failures(P) \subseteq failures(S)$.

Description Without Internal State

- refer to history of events only
- example:
 - wheelchair has approached a wall
 - wheelchair has not moved back yet
 - → wheelchair must not move forward
- formalism: CSP, ...

Getting an Explicit Mental Model

according to Rushby [1]:

- from training material
- from user interviews
- by user observation