

# Supporting Guideline-Based Treatments for Polypathological Patients

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# Outline

- Context of the work
  - Single-disease guideline recommendations
  - Problems encountered for polypathological patient
  
- Technical approach
  - Rule base derivation
  - Inference engine
    - Pattern matching
    - Synthesis of recommendations
  
- Conclusion

## Medical context

- Clinical Practice Guidelines (CPGs)
  - General descriptions of “ideal” patients
  - Focusing on one disease only

- Problem:

How do we choose the most appropriate therapeutics for polypathological patients using CPGs?

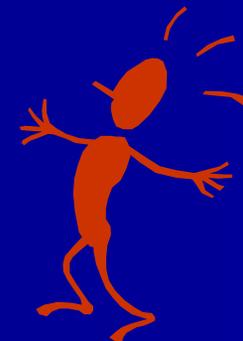
# Single-disease guidelines recommendations

## Ischemic heart disease

### Recommendations

1. For patients with stable angina and hypertension,  $\beta$ -adrenergic antagonists are preferred as initial therapy (grade D).
2. Alternative therapies would include long-acting calcium-channel blockers (grade B). Short-acting calcium-channel blockers should not be used (grade C).
3. Patients with hypertension and a recent myocardial infarction should be treated with either  $\beta$ -adrenergic antagonists, ACE inhibitors or both. Both classes of drug protect against reinfarction and death (grade A).
4. Alternative therapies would include verapamil (grade A) and diltiazem (grade C), but only in the setting of normal left ventricular function.

HT and stable angina



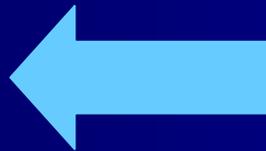
$R_{T1} = BB$

# Single-disease guidelines recommendations

HT and renal disease



$R_{T2}$  = ACE inhibitor



## Renal disease

### Recommendations

3. For patients with hypertension and renal disease, preferred initial therapy is with an ACE inhibitor (grade A).
4. Diuretics are recommended as additional antihypertensive therapy, since patients with renal insufficiency usually have difficulty with sodium balance (grade D).
5. Dihydropyridine calcium-channel blockers are recommended as alternative therapy for renoprotection in patients with nondiabetic renal disease (grade B).

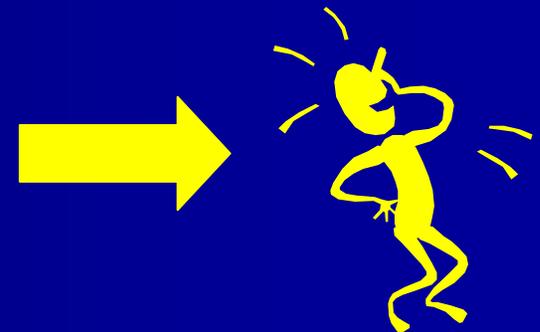
# Single-disease guidelines recommendations

## Systolic dysfunction

### Recommendations

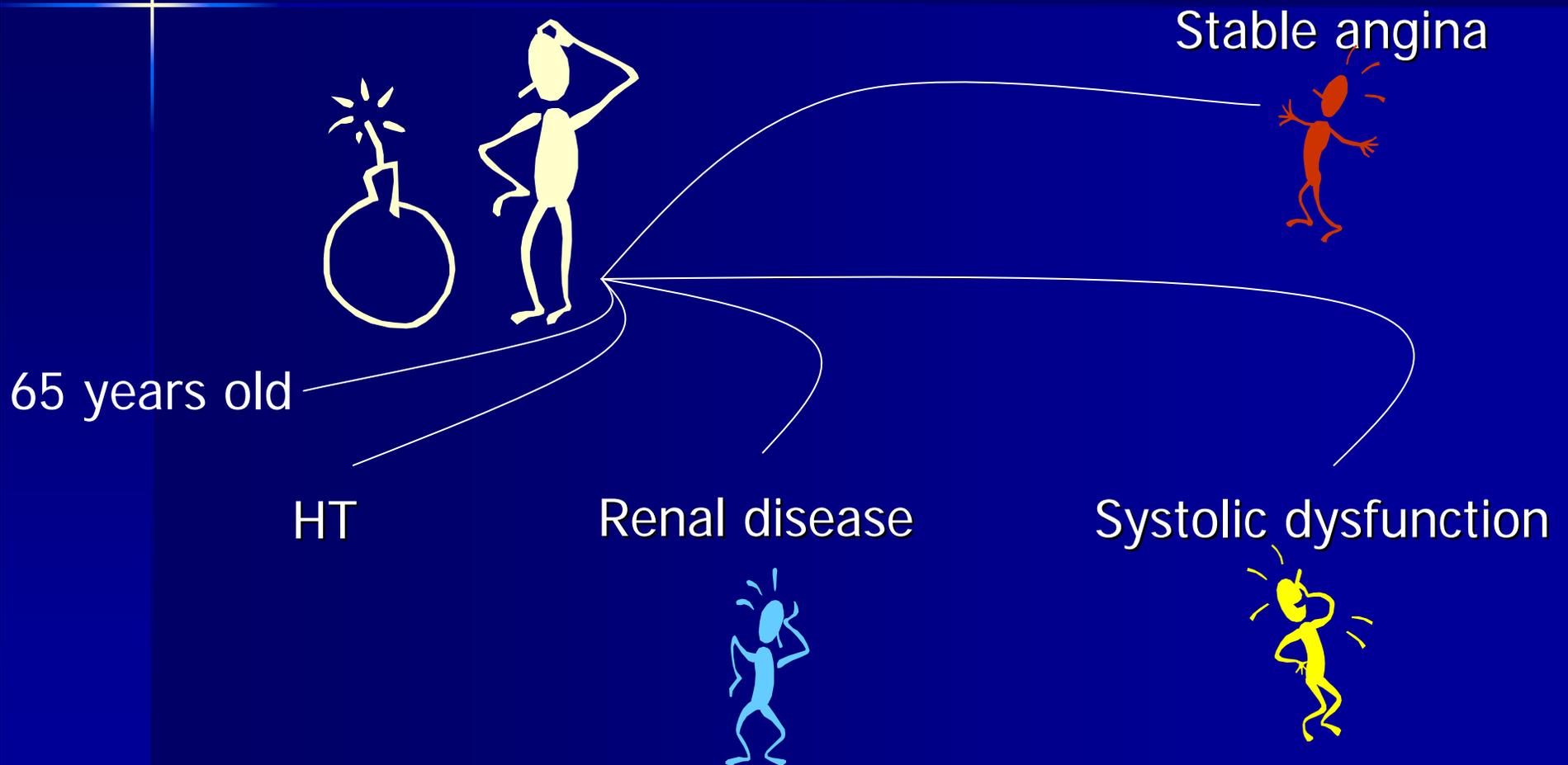
1. In patients with hypertension and systolic dysfunction, ACE inhibitors are recommended for initial therapy (grade A). Diuretics are recommended as additional therapy (grade A for thiazide diuretics, grade D for loop diuretics).
2. A combination of hydralazine and isosorbide dinitrate (grade A) or an angiotensin II receptor antagonist (grade A in patients older than 65 years of age) is recommended as an alternative therapy.
3. For patients with left ventricular systolic dysfunction who remain hypertensive despite optimal doses of ACE inhibitors or alternative first-line therapies, additional therapies would include  $\beta$ -adrenergic blockade with either carvedilol (grade A), or metoprolol (grade A) or the long-acting dihydropyridine calciumchannel blockers amlodipine (grade A) or felodipine (grade B).

HT and systolic dysfunction

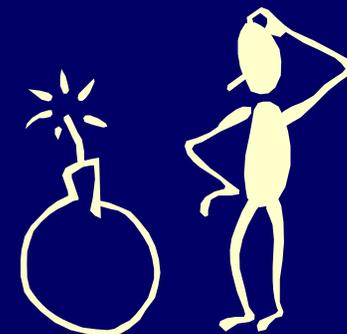


$R_{T3}$  = ACE inhibitors

# A polypathological patient



# What's the best treatment???



HT with stable  
angina



$R_{T1} = \text{BB}$

HT with renal  
disease



$R_{T2} = \text{ACE inhibitors}$

HT with systolic  
dysfunction



$R_{T3} = \text{ACE inhibitors}$

$R_{T1}?$     $R_{T2}?$     $R_{T3}?$

$R_{T1} \wedge R_{T2}?$

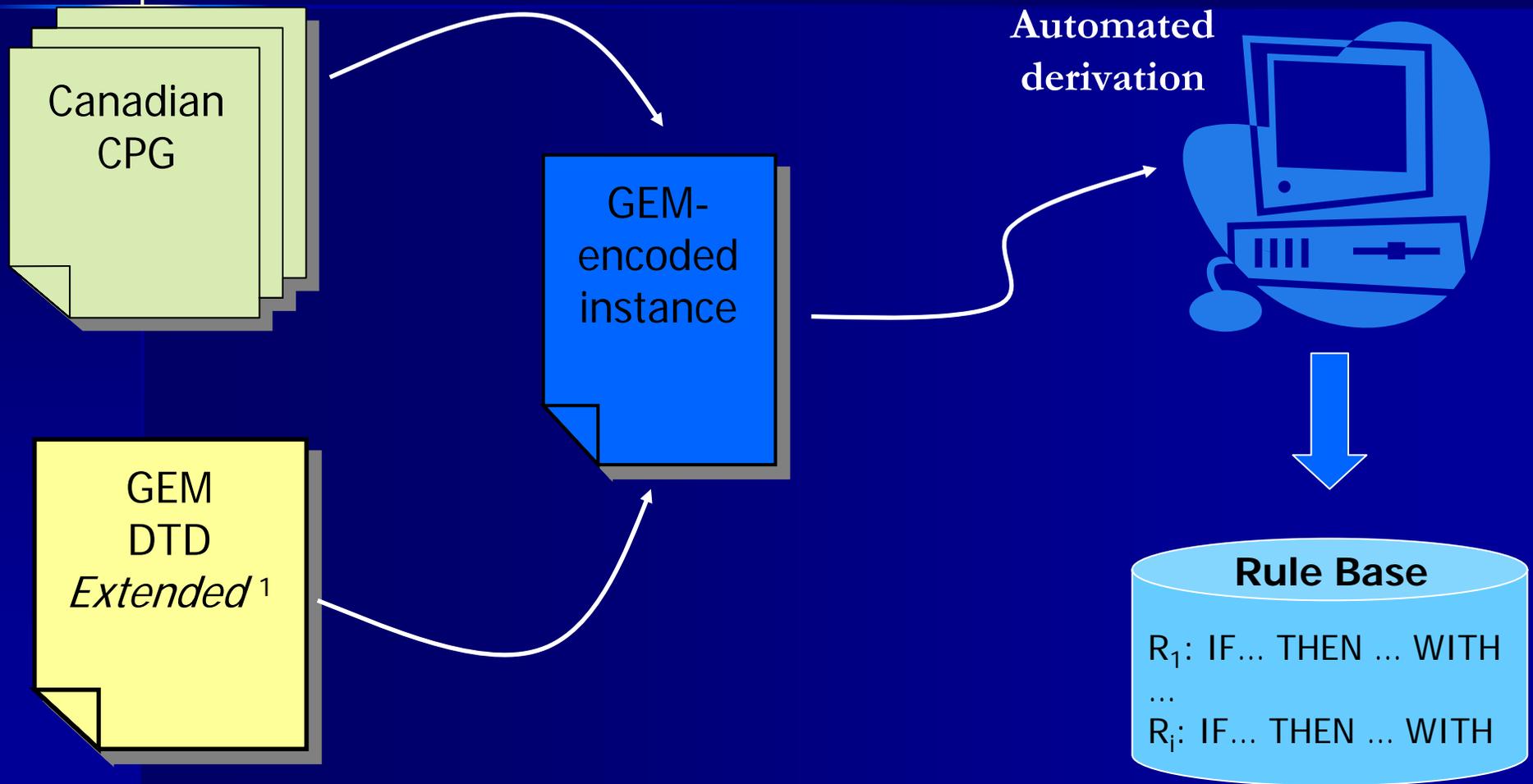
$R_{T1} \wedge R_{T3}?$

$R_{T1} \wedge R_{T2} \wedge R_{T3}?$

## Key ideas

- Automatic extraction (from textual CPG) of therapeutic rules addressing clinical situations (one disease, two associated diseases)
- Using the rule formalism to synthesize the contents of several sections and aggregate recommendations for multiple diseases (>2)

# Deriving a rule base from textual guidelines



<sup>1</sup> Georg G, et al. Extending the GEM model to support knowledge extraction from textual guidelines. International Journal of Medical Informatics, In Press.

# Creation of a GEM-encoded instance

- XML marking-up of CPG documents
- GEM<sup>1</sup>
  - Guideline document model of CPGs
  - Defines a structure for basic units of information
  - Multi-level hierarchy of more than 100 elements
- Extension of GEM
  - Add additional level of structuring supporting rule generation

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<sup>1</sup>Shiffman RN, et al. GEM: a proposal for a more comprehensive guideline document model using XML. *J Am Med Inform Assoc* 2000;7(5):488-498.

# The GEM-encoded instance

For patients with hypertension and renal disease, preferred initial therapy is with an ACE inhibitor (grade A).



```
<decision.variable source="explicit"
decision.variable.id="state_patient.pathology">HT
  <value source="implicit" id="HT"/> </decision.variable>

<decision.variable source="explicit"
decision.variable.id="state_patient.pathology">renal disease
  <value source="implicit"
id="REN_DIS"/></decision.variable>

<action source="explicit" id="treatment.line">first line treatment
  <value source="implicit" id="L1"/> </action>

<action source="explicit" id="treatment.intention">first
intention
  <value source="implicit" id="INT1"/> </action>

<action source="explicit" id="treatment.type">monotherapy
  <value source="implicit" id="MONO"/> </action>

<action source="explicit" id="treatment.nature">ACE inhibitor
  <value source="implicit" id="ACE_in"/> </action>

<recommendation.strength source="explicit" id="A">grade A
< recommendation.strength>
```

# The Rule formalism

IF  $[C \wedge T]$  THEN  $R_T$  WITH Context

$[C \wedge T]$ :

- Set of clinical criteria  $C = \{C_i\}$
- Set of therapeutic criteria  $T = \{T_j\}$

→ Value of *decision.variable* elements

$R_T$

- Therapeutic recommendation

→ Value of *action* elements

Context:

strength  $\wedge$  *character*  $\wedge$  *sign*

Strength: A, B, C, D

*Character*: D\_Reco

(grade=A);(Dominant=true),

N\_Reco, R\_Reco

*Sign*: +/-

# Automatic derivation of rules

```
<decision.variable source="explicit"
decision.variable.id="state_patient.pathology"> HT
  <value source="implicit" id="HT"/>
</decision.variable>

<decision.variable source="explicit"
decision.variable.id="state_patient.pathology"> renal
disease
  <value source="implicit" id="REN_DIS"/>
</decision.variable>

<action source="explicit" id="treatment.line">first line
treatment
  <value source="implicit" id="L1"/> </action>

<action source="explicit" id="treatment.intention">first
intention
  <value source="implicit" id="INT1"/> </action>

<action source="explicit"
id="treatment.type">monotherapy
  <value source="implicit" id="MONO"/> </action>

<action source="explicit" id="treatment.nature"> ACE
inhibitor
  <value source="implicit" id="ACE_in"/> </action>

<recommendation.strength source="explicit"
id="A">grade A </recommendation.strength>
```

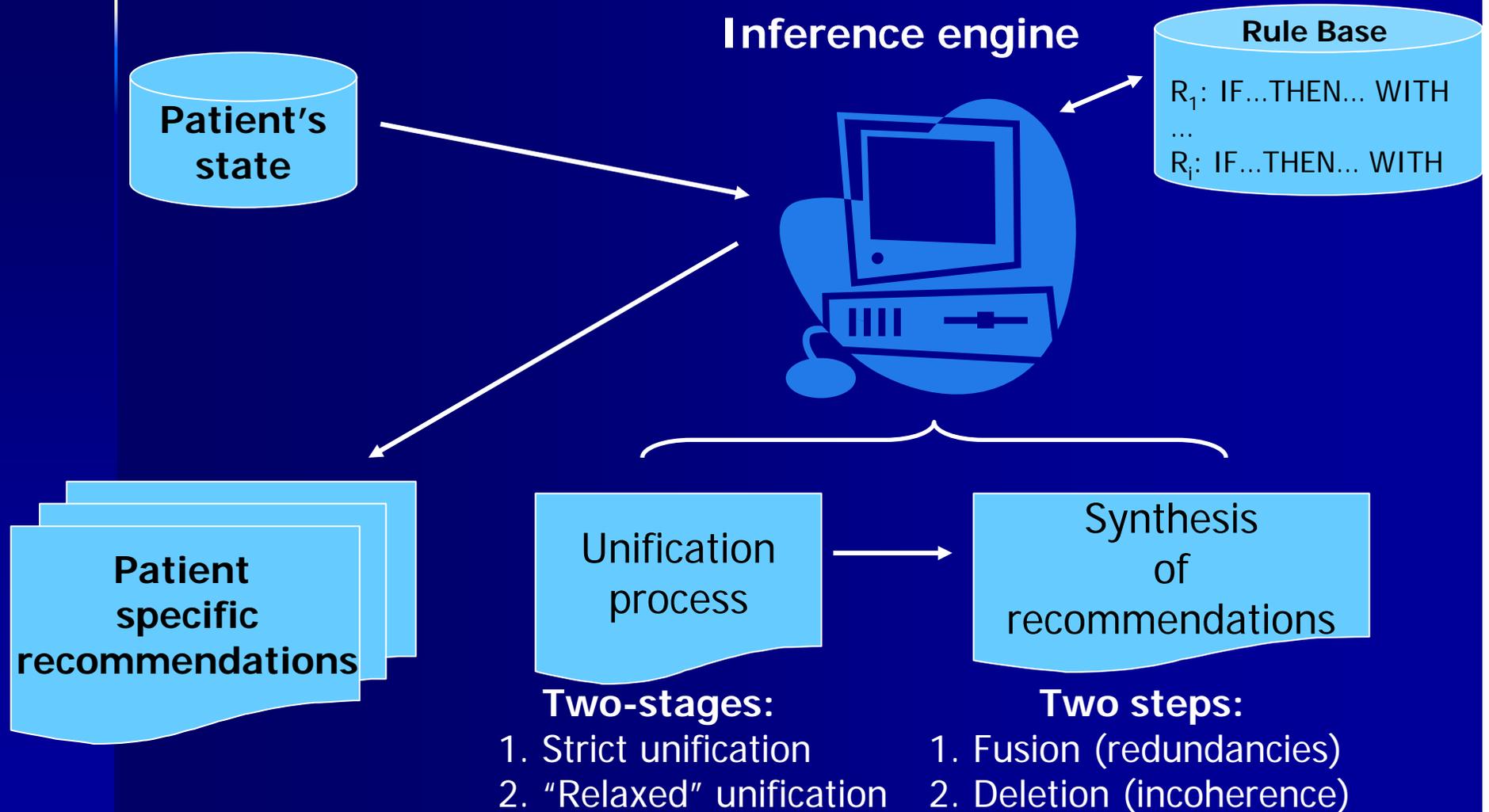


```
IF
  patient_state.pathology = HT
  and patient_state.pathology = REN_DIS

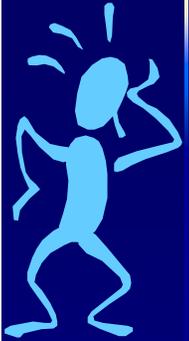
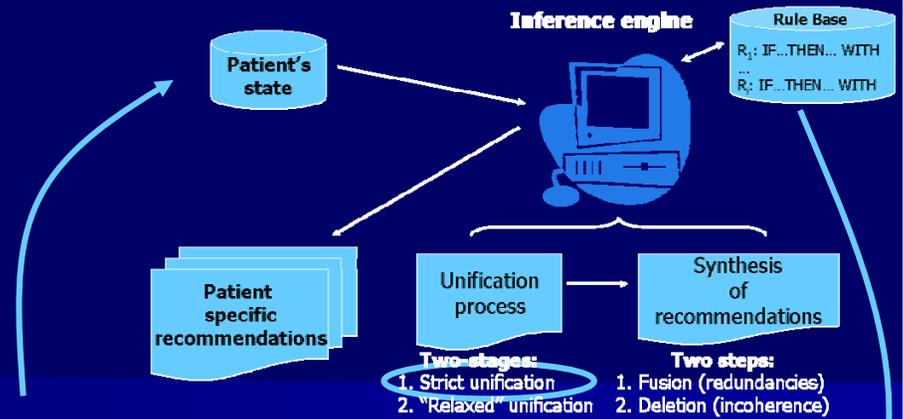
THEN
  treatment.line = L1
  and treatment.intention = INT1
  and treatment.type = MONO
  and treatment.nature = ACE_in

WITH
  recommendation.strength = A
  and character = D_Reco
  and sign = +
```

# Extraction of applicable relevant rules



# Strict unification



state\_patient.pathology = HT  
 ^ state\_patient.pathology = REN\_DIS

R<sub>145</sub>: ...  
 THEN

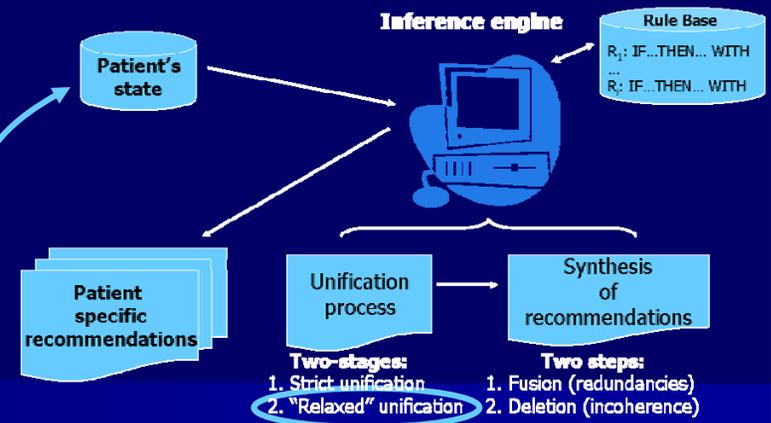
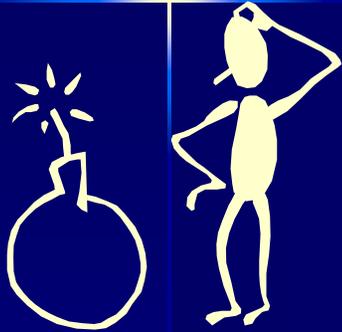
treatment.line=L1  
 ^ treatment.intention=INT1  
 ^ treatment.type=MONO  
 ^ treatment.nature=ACE\_in  
 A ^ D\_Reco ^ +

ACE inhibitor  
 with grade A



WITH

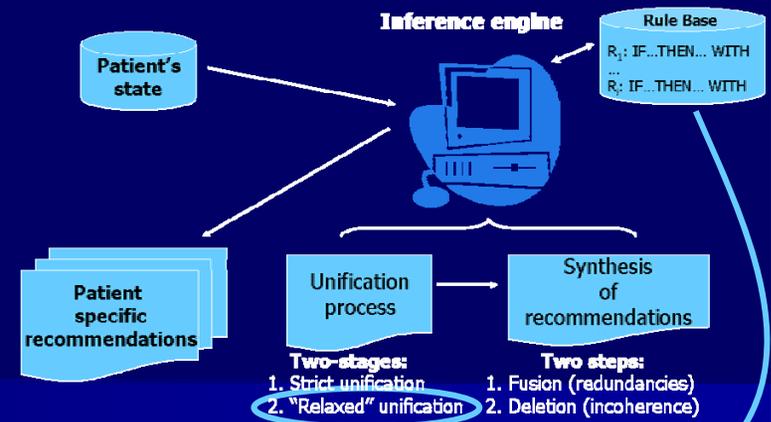
# "Relaxed" unification



state\_patient.age = 65

- ^ state\_patient.pathology = HT
- ^ state\_patient.pathology = REN\_DIS
- ^ state\_patient.pathology = ISC\_HEA\_DIS
- ^ state\_patient.pathology = STA\_ANG
- ^ state\_patient\_pathology = SYS\_DYS

# Which are applicable recommendations?



R<sub>145</sub>: ...  
 THEN treatment.line=L1  
 ^ treatment.intention=INT1  
 ^ treatment.type=MONO  
 ^ treatment.nature=ACE\_in  
 WITH A ^ D\_Reco ^ +

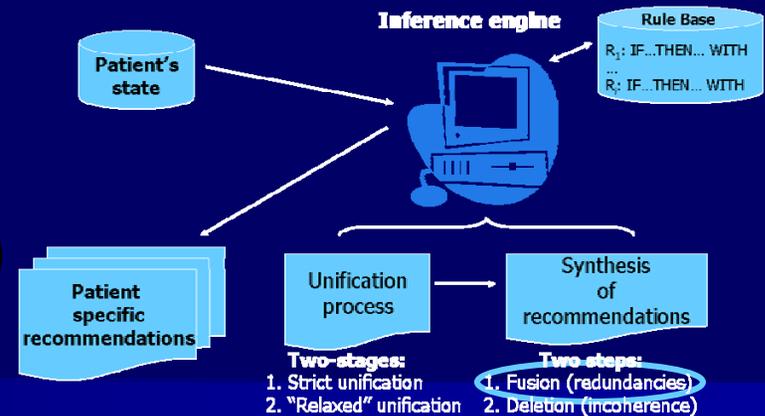


R<sub>47</sub>: ...  
 THEN treatment.line=L1  
 ^ treatment.intention=INT1  
 ^ treatment.type=MONO  
 ^ treatment.nature=ACE\_in  
 WITH A ^ D\_Reco ^ +



R<sub>70</sub>: ...  
 THEN treatment.line=L1  
 ^ treatment.intention=INT1  
 ^ treatment.type=MONO  
 ^ treatment.nature=BB  
 WITH D ^ D\_Reco ^ +

# Elimination of redundancies (Fusion)



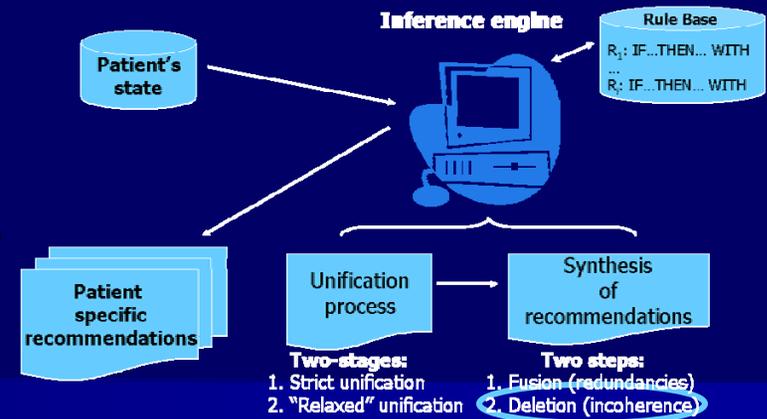
$R_{145}$ :  
 THEN ...  
 treatment.line = L1  
 $\wedge$  treatment.intention = INT1  
 $\wedge$  treatment.type = MONO  
 $\wedge$  treatment.nature = ACE\_in  
 WITH  $A \wedge D\_Reco \wedge +$



$R_{47}$ :  
 THEN ...  
 treatment.line = L1  
 $\wedge$  treatment.intention = INT1  
 $\wedge$  treatment.type = MONO  
 $\wedge$  treatment.nature = ACE\_in  
 WITH  $A \wedge D\_Reco \wedge +$

**Recommendations are merged into a unique recommendation of ACE inhibitors, with grade = *A* and character = *D\_Reco* and sign = *+***

# Elimination of inconsistencies (Deletion)



**IF**  
 patient\_state.pathology = HT  
 $\wedge$  patient\_state.pathology = ISC\_HEA\_DIS  
 $\wedge$  patient\_state.pathology = STA\_ANG

**THEN**  
 treatment.line = L1  
 $\wedge$  treatment.intention = INT1  
 $\wedge$  treatment.type = MONO  
 $\wedge$  treatment.nature = BB

**WITH**  
 D  $\wedge$  D\_Reco  $\wedge$  +

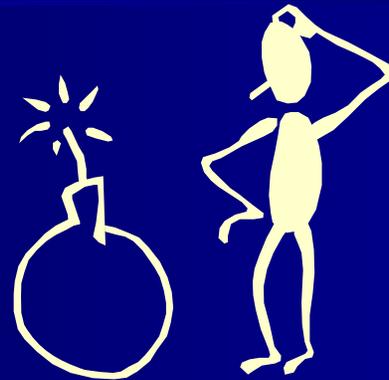
**IF**  
 patient\_state.pathology = HT  
 $\wedge$  patient\_state.pathology = REV\_AIRWAY\_DIS

**THEN**  
 treatment.line = L1  
 $\wedge$  treatment.intention = INT1  
 $\wedge$  treatment.type = MONO  
 $\wedge$  treatment.nature = BB

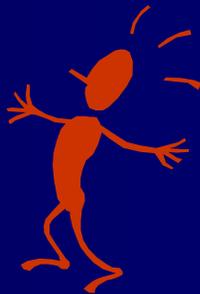
**WITH**  
 D  $\wedge$  D\_Reco  $\wedge$  -

**Recommendations are cancelled and BB are eliminated for final recommendations**

# Decomposing the patient into "virtual" individual patients



HT & stable  
angina



$R_{T1} = \text{BB}$

HT & renal  
disease



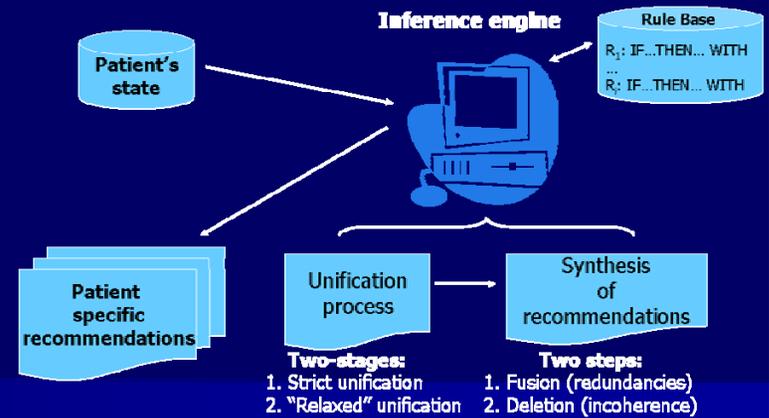
$R_{T2} = \text{ACE inhibitors}$

HT & systolic  
dysfunction



$R_{T3} = \text{ACE inhibitors}$

# Patient specific recommendations



ACE inhibitors  
(grade A)

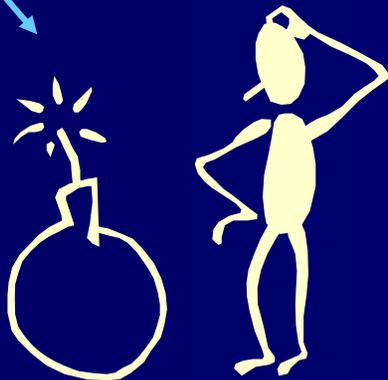
source

HT & renal disease  
& systolic dysfunction

BB (grade D)

source

HT & ischemic heart  
disease & stable angina



Physician's choice



ACE inhibitors (grade A)

# Conclusions

- From guidelines: “Ideal case” or “textbook patient”
  - Guidelines describe an “ideal” patient suffering from only one associated disease in addition to the guideline’s main disease (here hypertension)
- How do we manage “real”-world patients?
  - Decompose patient description into “virtual” individual patients affected by a single disease
  - Trigger rules containing at least one disease
  - Synthesize rules
- Proposing of a set of applicable recommendations in context enables to physician the select of the best one