# Rule-Based Systems and The Focus on Knowledge

## Gold Star Ideas

- ★ Where's the power? / Why does it work?
- ⋆ Simon's ant metaphor
- ★ Separate what to know from how to use it
- \* Knowledge engineering
  - Work from specific cases
  - Attend to unexplained variations
  - □ Failures are enormously informative
- ⋆ Knowledge engineering yourself

## Recap/Outline

- Models of problem solving
  - Generate and test
  - Problem reduction (integration)
  - Rule chaining: backward; Mycin
  - Rule chaining: forward
- Knowledge Engineering

## MYCIN: An Early Knowledge Based System

- The task
  - Medical diagnosis and therapy selection for bacterial infections of the blood
- Why this domain?
  - Overuse of antibiotics



Antibiotic resistance is: "one of the world's most pressing public health problems."

Centers for Disease Control and Prevention, July 2019

Wall Street Journal

11/30/01

# Why This Domain

- Overuse of antibiotics
- Irrational use of antibiotics
- Maldistribution of expertise
- Domain is "small" and "isolated"

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## Sample Interaction

-----PATIENT-248-----

- 1) Patient's name: (first-last)
- \*\* CR
- Sex:
- \*\* MALE
- 3) Age:
- \*\* 52
- 4) Have you been able to obtain positive microbiological information about a possible infection of C.R.?
- \*\* YES

-----INFECTION-----

- 5) What is the infection?
- \*\* ENDARTERITIS

## Sample Interaction (cont'd)

The first significant organism from this blood culture (CULTURE-1) will be referred to as:

-----ORGANISM-1-----

- 6) Enter the identity of ORGANISM-1
- \*\* UNKNOWN
- 7) Is ORGANISM-1 a rod or coccus (etc.):
- \*\* ROD
- 8) The gram stain of ORGANISM-1
- \*\* GRAMNEG
- 9) HAVE THERE BEEN positive cultures yielding organisms about which you will NOT be seeking advice?
- \*\* YES

## Sample Interaction: Diagnosis

#### INFECTION-1 is ENDARTERITIS with BACTEREMIA

- <lt><ltem 1> E. COLI
- <Item 2> SALMONELLA (species unknown)
- <Item 3> KLEBSIELLA-PNEUMONIAE
- <ltem 4> PSEUDOMONAS-AERUGINOSA
- <Item 5> ENTEROBACTER
- <ltem 6> PROTEUS-NON-MIRABILUS

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## Sample Interaction: Therapy

[REC 1] My preferred therapy recommendation is as follows:

In order to cover for Items <1 3 4 5 6 >:

Give: GENTAMICIN

Dose:128 mg (1.7. Mg/kg) q8h IV (or IM) for 10 days

Comments: Modify dose in renal failure

In order to cover for Item <2>:

Give: CHLORAMPHENICOL

Dose:563 mg (7.5 mg.kg) q6h for 14 days Comments: Monitor patient's white count

Do you wish to see the next choice therapy?

\*\* NO

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### How It Worked: Architecture

INFERENCE ENGINE

KNOWLEDGE BASE

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## Knowledge Base

#### Rule 27

#### If:

- 1) the gram stain of the organism is gram negative, and
- 2) the morphology of the organism is rod, and
- 3) the aerobicity of the organism is anaerobic,

#### Then:

There is evidence that the identity of the organism is Bacteriodes.

1.1

## Representation

#### Rule 27

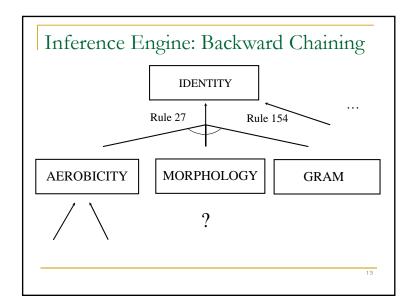
#### If:

- 1) the <u>gram stain</u> of the <u>organism</u> is <u>gram</u> negative, and
- 2) the morphology of the organism is rod, and
- 3) the <u>aerobicity</u> of the <u>organism</u> is anaerobic,

#### Then:

There is evidence that the  $\underline{identity}$  of the organism is Bacteriodes.

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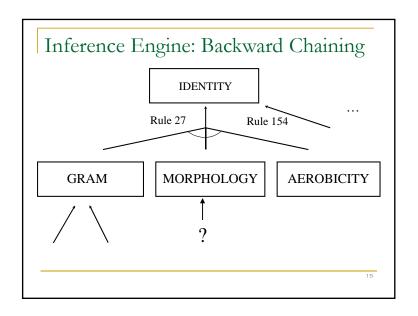


## Sample Interaction

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### Control Structure

- What kind of search?
  - Depth-first
  - □ Backward-chaining (chain from goals to facts)
  - Forward-chaining (chain from facts to goals)

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### Control Structure

- Dr. Backward Chaining
- Dr. Forward Chaining

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### Sample Interaction: Explanation

Is the patient's illness with ORGANISM-1 a hospital-acquired infection?

[i.e. WHY is it important to determine whether or not the infection with ORGANISM-1 was acquired while the patient was hospitalized]

[2.0] This will aid in determining the identity of ORGANISM-1.

It has already been established that

- [2.1] the morphology of ORGANISM-1 is rod
- [2.2] the gram stain of ORGANISM-1 is gramneg
- [2.3] the aerobicity of ORGANISM-1 is facul

#### Therefore, if

[2.4] the infection with ORGANISM-1 was acquired while the patient was hospitalized

then

there is evidence that the identity of ORGANISM-1 is pseudomonas [RULE050]

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## Explanation

\*\* HOW DID YOU DECIDE THAT ORGANISM-1 WAS AN E.COL!?

I used rule084 to conclude that the identity of ORGANISM-1 is e.coli. This gave a cumulative c.f. of (.51).

I used rule003 to conclude that the identity of ORGANISM-1 is e.coli. This gave a cumulative c.f. of (.43).

### Explanation

# \*\* WHY DIDN'T YOU THINK THAT ORGANISM-1 WAS NEISSERIA?

The following rules could have been used to determine that the identity of ORGANISM-1 is neisseria: 9.

However, none of these succeeded in the context of ORGANISM-1. If you would like an explanation for why any of these rules failed, please enter their numbers:

\*\* 9

Clause 2 of rule009 ["the morphology of the organism is coccus"] was already known to be false for ORGANISM-1, so the rule was never tried.

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### Successful?

- Appropriate task: Narrow domain, heuristic knowledge, articulate experts, etc.
- The match of knowledge and representation:
  - Knowledge about of how the body works, vs.
  - Knowledge about how to diagnose it
- Answer was a ranked list, not a single result
- Perhaps most important:
  Having the right abstractions, the right language

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### The Right Abstraction

If ...

the organism is gram-negative, and the <u>portal of entry</u> is skin-wound, Then the organism is likely to be ...

- It's an abstraction
- It's the right abstraction for this task
- Where did it come from?

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# Contributions

- Existence proof of adequacy of rule-based systems
- Knowledge can be captured as a set of mostly independent rules
- Experts can be debriefed
  - Specific cases
  - Subtle differences
  - Failures are wonderful, and revealing
  - You can usefully do this to yourself