Mistakes Were Made What CYC has done wrong



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ONTOLOGY FOR THE INTELLIGENCE COMMUNITY

OIC 2009

Setting the Stage for High-level Knowledge Fusion

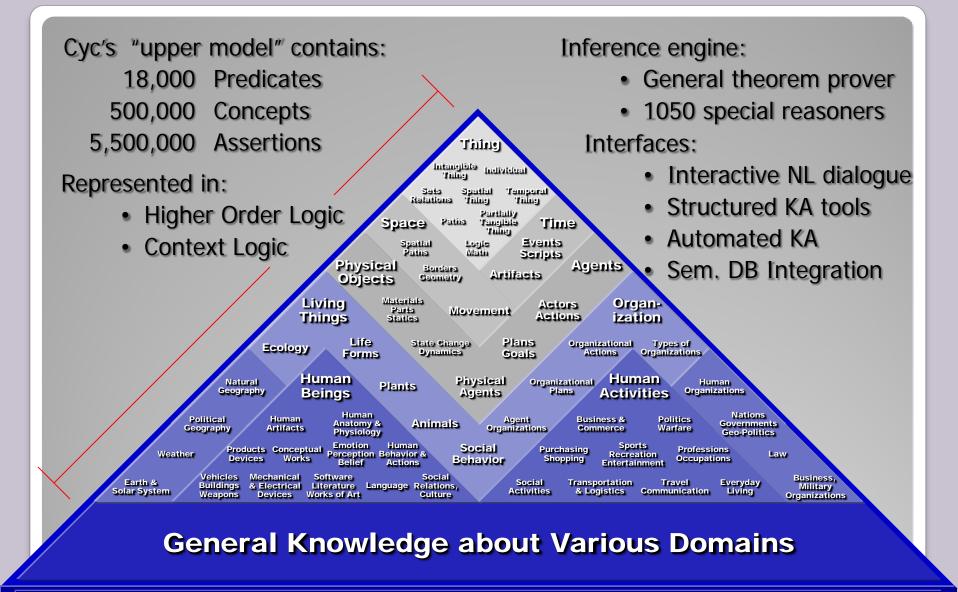


What AI did wrong before Cyc What CYC has done wrong What AI will do wrong next

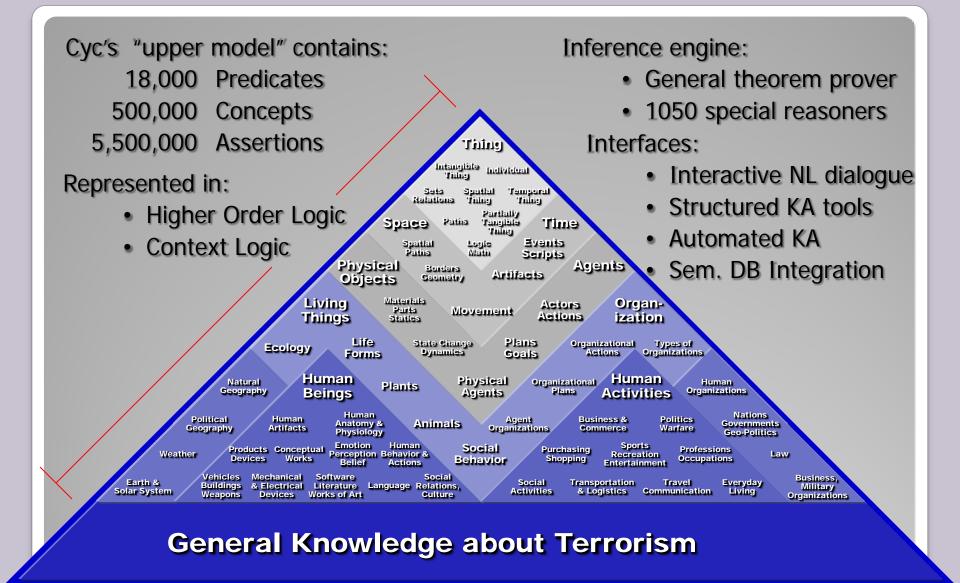
CYC introduced the process of large-scale ontological engineering in 1984. We learned a large number of useful lessons during those 25 years (1000 person-years = 2 million person-hours building the ontology) Errors in representation, in methodology, in inference, in scale. Traps we fell into, decisions we had to back out of, half-finished off-ramps to nowhere.

What CYC has done wrong

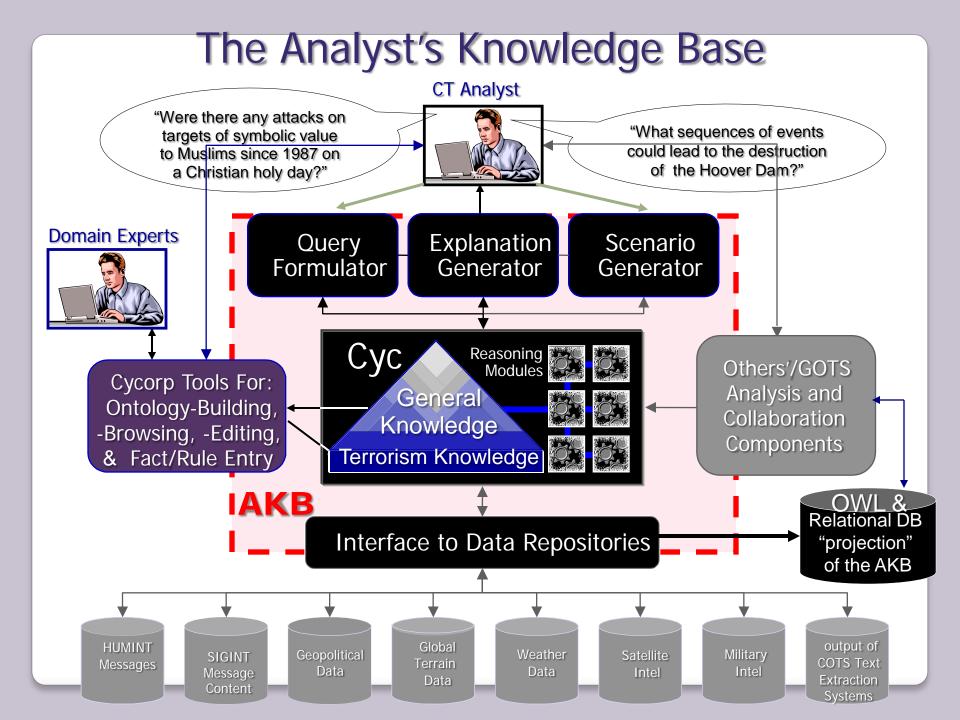
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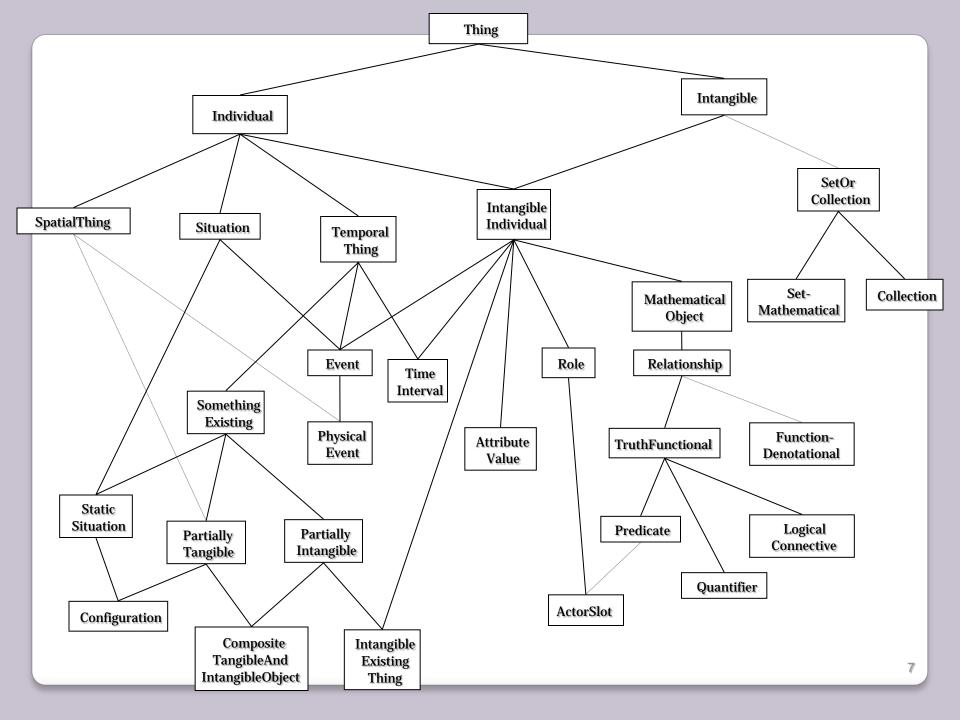


Specific data, facts, terms, and observations



Specific data, facts, terms, and observations about terrorist groups, individuals, and events





NO mostly just impacts <u>efficiency</u> Grue: something that's green during the day and blue at night

- Ex: big v. small trees
- Ex: GovernmentOfFranceIn2009
 - "Grass is grue by day and bleen at night"
- effic. of the axioms: fewer, terser, less ambiguous assertions
 - Ex: things grue by day are usually bleen at night
 - Ex: when smurfing a car, first smurf the key
 - Ex: **in**(*x*,*y*)

• Hence:

• Ex: (

Bleen: something that's blue

during the day and green at night

- effic. of the knowledge acquisition process
- effic. of the inference engine
- effic. of the cross-ontology mapping axioms

NO mostly just impacts <u>efficiency</u>

• effic. of the vocabulary (lower ontology): fewer/simpler terms

- Ex: big v. small trees
- Ex: GovernmentOfFranceIn2009
- Ex: grue and bleen
- effic. of the axioms: fewer, terser, less ambiguous assertions
 - Ex: things grue by day are usually bleen at night
 - Ex: when smurfing a car, first smurf the key
 - Ex: **in**(*x*,*y*)

• Hence:

- effic. of the knowledge acquisition process
- effic. of the inference engine
- effic. of the cross-ontology mapping axioms

Five friends get together to play 5 doubles matches, with a different group of 4 players each time. The sums of the ages of the players for the different matches are 124, 128, 130, 136 and 142 years. What is the age of the youngest player ?

- "The sun is yellow"
 - (isa TheSun YellowObject)
 - (hasAttribute TheSun Yellowness)
 - (colorOfObject TheSun YellowColor)
 - (yellowColored TheSun)
 - (frequencyOfRadiation TheSun (nanometer 570))
 - (wavelengthOfRadiation TheSun (hertz (exp 5.2 10 14)))
- "People are able to talk and are mammals"
 - (skillCapable TypicalPerson Speaking)
 - (genls **Person** Mammal)
 - (isa TypicalPerson TangibleObject)
 - (isa Person IntangibleObject)
 - (archetype Person TypicalPerson)
 - $(\forall x, y, z)$ (archetype x y) ^ (genls x z) \Rightarrow (isa y z)

Many ways to say the same thing

"The sun is yello 99% solution:

- (isa TheSun **) Just combine the two hierarchies**,
- (hasAttribute T
- (colorOfObject
- (yellowColored)

esp. if the same predicates don't apply (with different truth values)

- (frequencyOfRadi **COPPY**) (which only of the first of the
- "People are able to talk and are mammals"
 - (skillCapable Tyr Recoup the lost expressivity:
 - (genls Person (isa TypicalPer Introduce predicates to tease out
 - (isa Person In that aspect of the combined thing
 - (archetype Per in cases where you want to talk
 - (∀x,y,z) (archetyr about it and not the overall thing.

Large-scale forced duplication

- People are composite mental and physical (age (MindFn Frankenstein) (Years 10)) (age (BodyFn Frankenstein) (Years 34))
- Iran is similarly a composite entity: physical (territory, buildings, roads) and mental (social, economic, legal, military, diplomatic)

Recoup the lost expressivity: Introduce predicates to tease out that aspect of the combined thing in cases where you want to talk about it and not the overall thing.

Large-scale forced duplication

1984: We had to design and build *some* interface for ontologists building CYC

Helicoptering through node&link-space

PreSchool Teachers

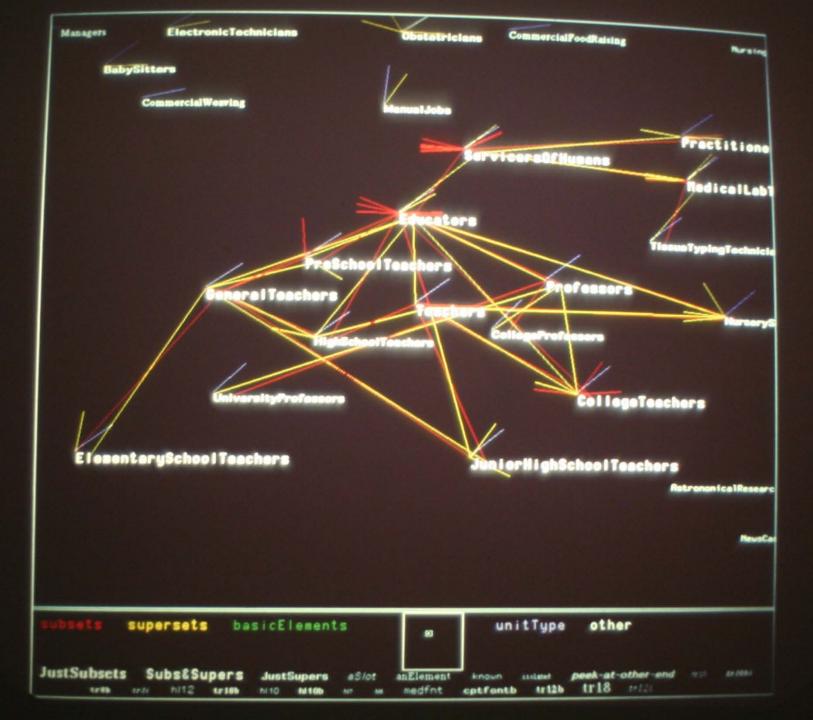
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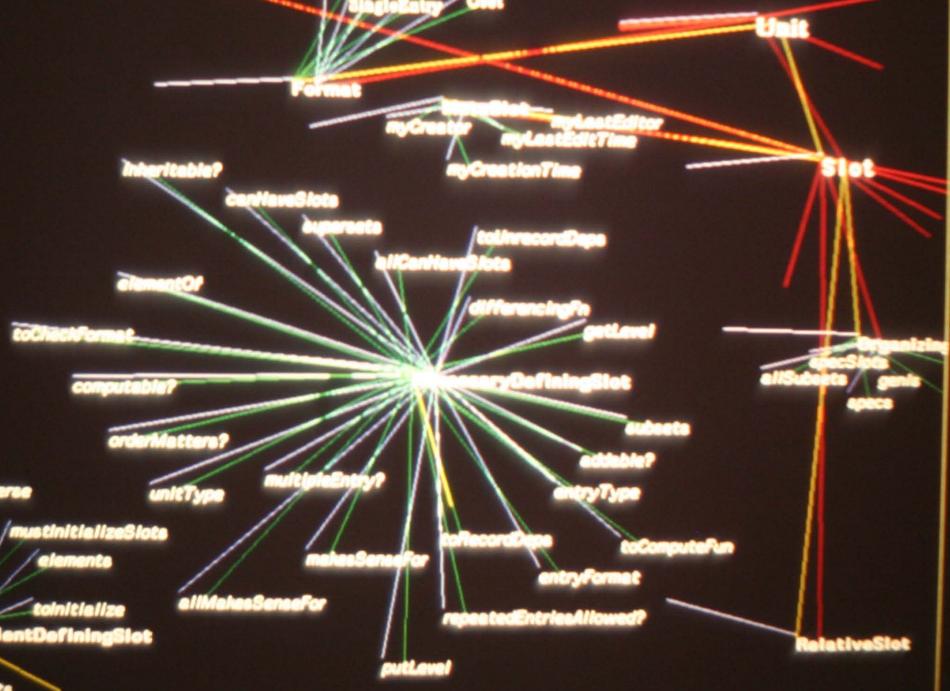
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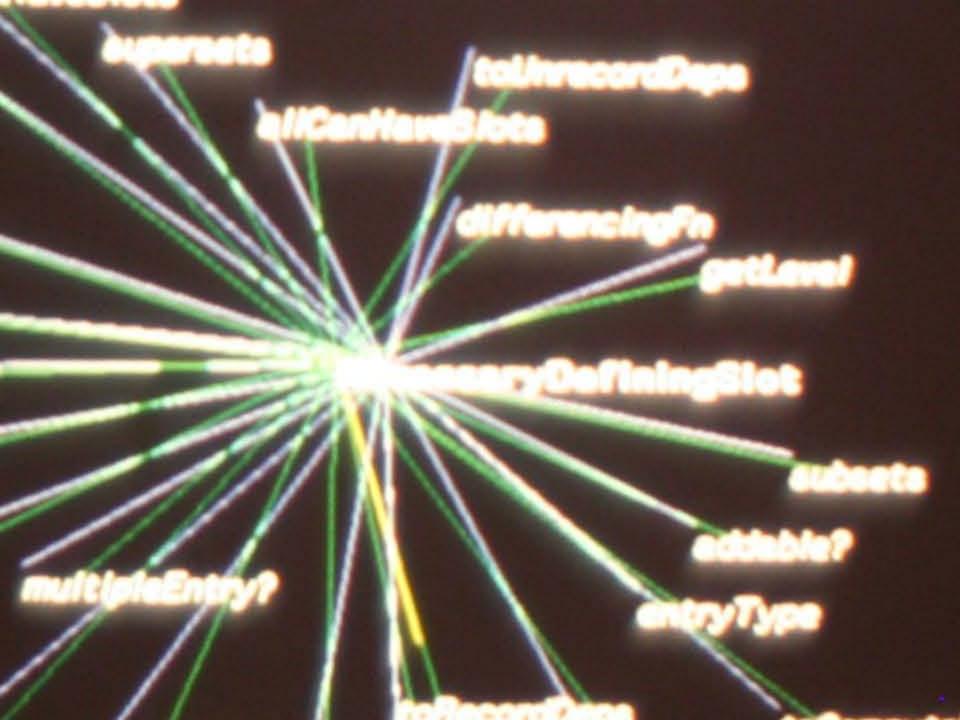
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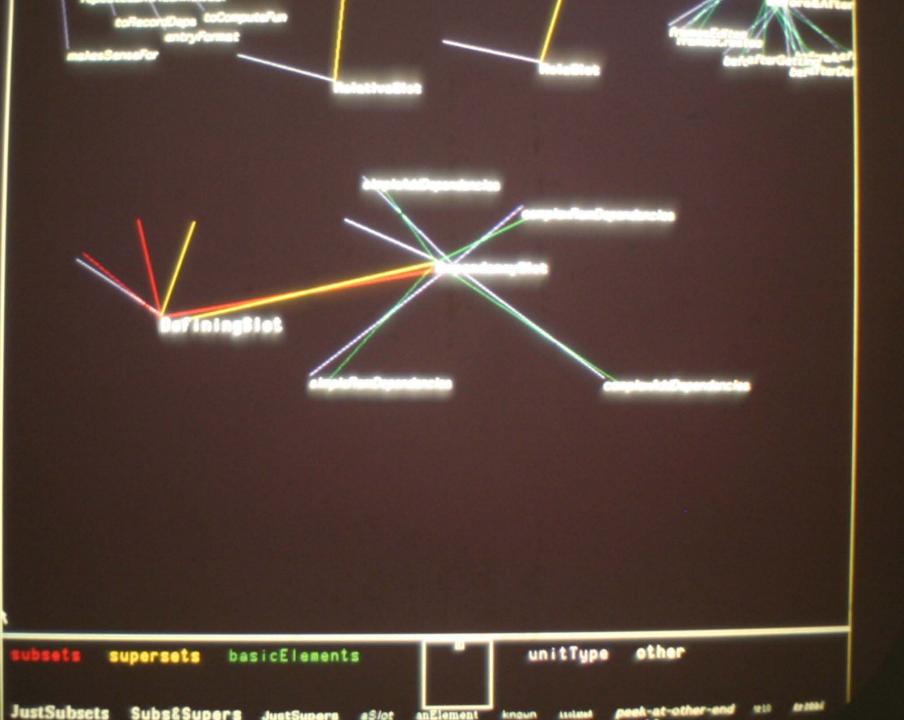
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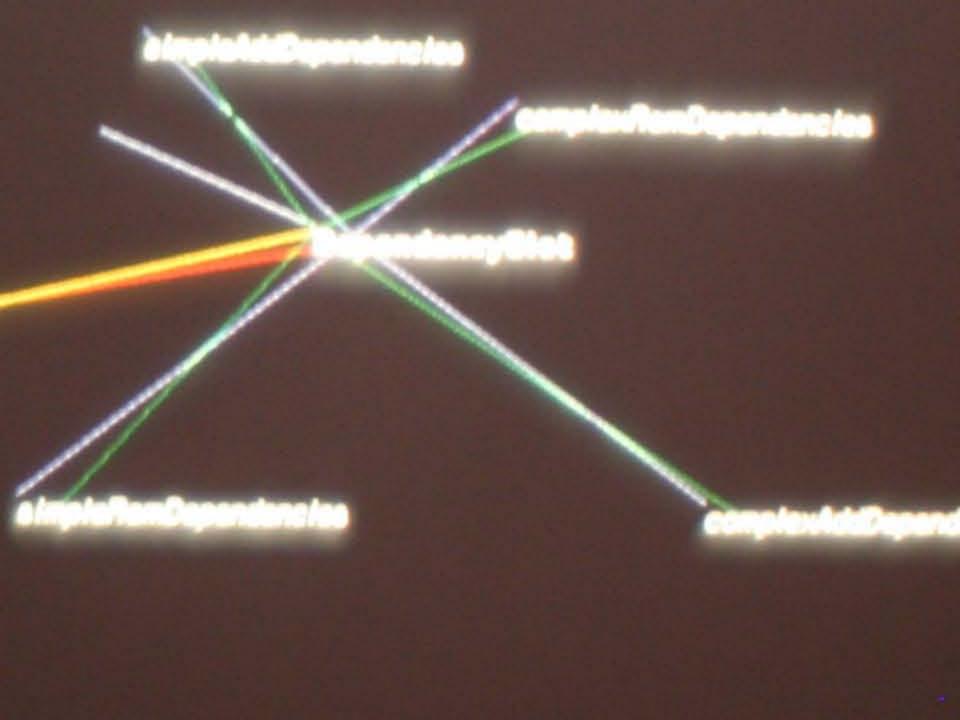
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1986: Experienced users want more text, less "blank space"

UE: Frame editor MUE: Museum room editor

MCC Technical Report No. ACA/AI-357-87-Q Updated Version: Tutorial for the CYC Unit Editor

Mary Shepherd, R.V. Guha, Adolfo Guzman, H. J. Hewitt, John Huffman, Doug Lenat, Chris Maeda, Claudia Porter, David Wallace

November 1987

This document is a tutorial designed to prepare people to use CYC, by introducing them to two unit browsing and editing tools, UE and MUE. ACA/AI-357-87-Q is the current version of ACA/AI-333-87-Q.

ACA/AI LAB

284

probably easiest; type (in-package 'cyc).

ite-to-server interface function; it passes its input, an ation, and waits for an answer. If the it is waiting, it will signal an error. Any response from to the actual request generated (using D-SERVER signals an error. Otherwise, the [relevant]

ME)

his function creates a new unit -- on the CYC host --, and lets us call it NAME. The unit's the entry #%HypotheticalStatus. It is a means of d units can then, gradually, point to each other and to ations represesent a large larger concepts representing

Sinking007"). On the satellite, this is implemented as: stical-unit, PROTOTYPE-UNIT nil, NAME)))

specified SLOT in UNIT (replacing any other YC server. Example:

nk '(#\$USSNimitz))

s:

T (LIST ,@VALUE-LIST)))

285

On the satellite, this function is implemented as:

(nabu-send-server '(outv, UNIT, SLOT, VALUE))

NABU-INV (UNIT SLOT VALUE)

This function adds the VALUE to the list of those already in the sp invoking INV on the remote CYC server. Example:

(NABU-INV #\$Sinking007 #\$objectSunk #\$USSNimitz)

On the satellite, this function is implemented as:

(nabu-send-server '(inv ,UNIT ,SLOT ,VALUE))

NCP (&rest ARGS), Or NABU-COMP-PLAUS (&rest ARGS)

This is the heart of the whole enterprise! NABU-COMP-PLAUS as plausibility of a concept. (For more information about Compute Pla 24.0.) The argument structure is as defined by the CYC [server] fursimple example would be:

(NCP #\$Sinking #\$objectSunk :VALUE '(LIST #\$UnitedStates

This asks CYC to judge the plausibility of the unit #\$Sinking having with, among other possibilities, the value (#\$UnitedStatesOfAmeric

The value returned is a LIST of 5-tuples (each an interpretation): <unit slot va The 1st element, unit, MAY NOT BE IDENTICAL to the original input UNIT!

The 2nd element, slot, will presumably be the same as the input SLOT (but I haven't [yet] seen any exceptions)

The 3rd element, value, presumably MAY NOT BE IDENTICAL to the origina

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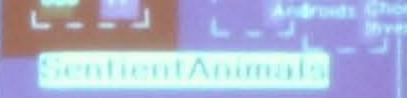
1986: Experienced users want more text, less "blank space"

- UE: Frame editor
- MUE: Museum room editor

Inspired by two Macintosh games: "The Manhole" and "Cosmic Osmo"

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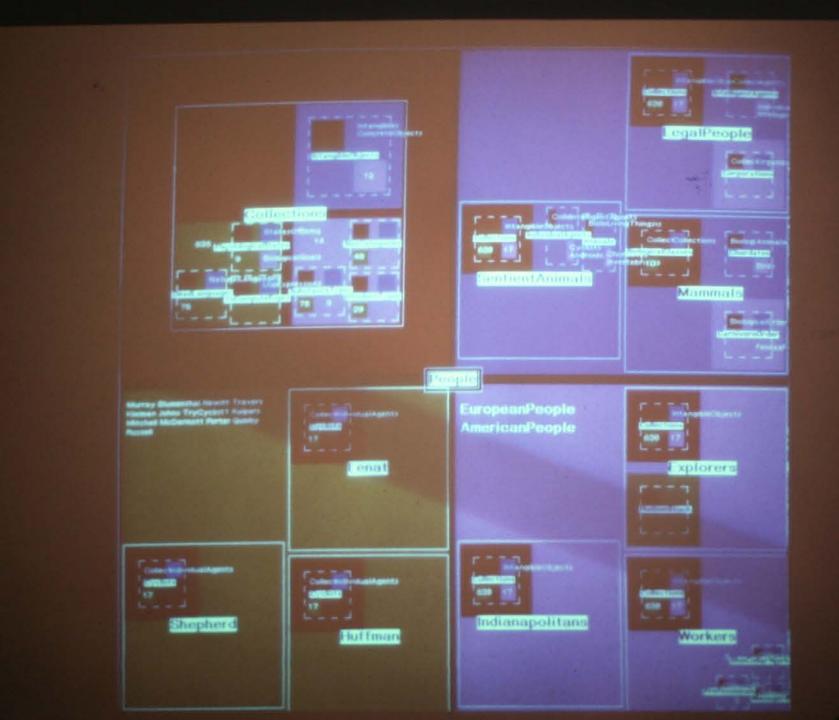


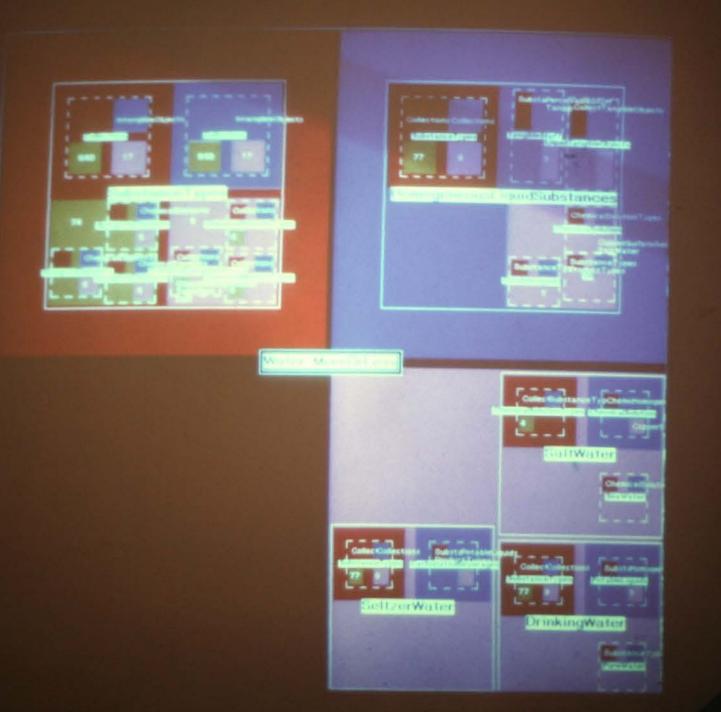
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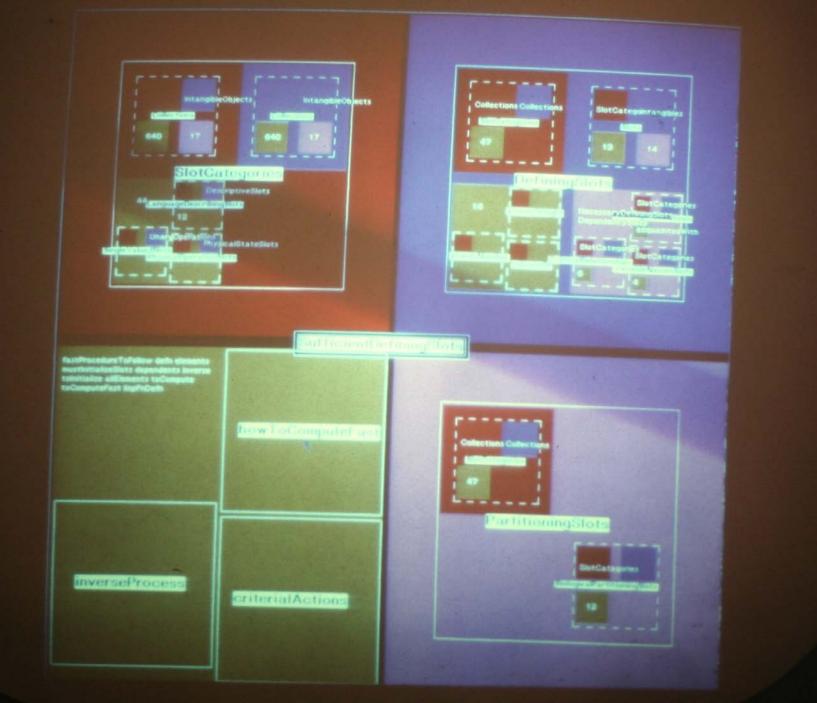
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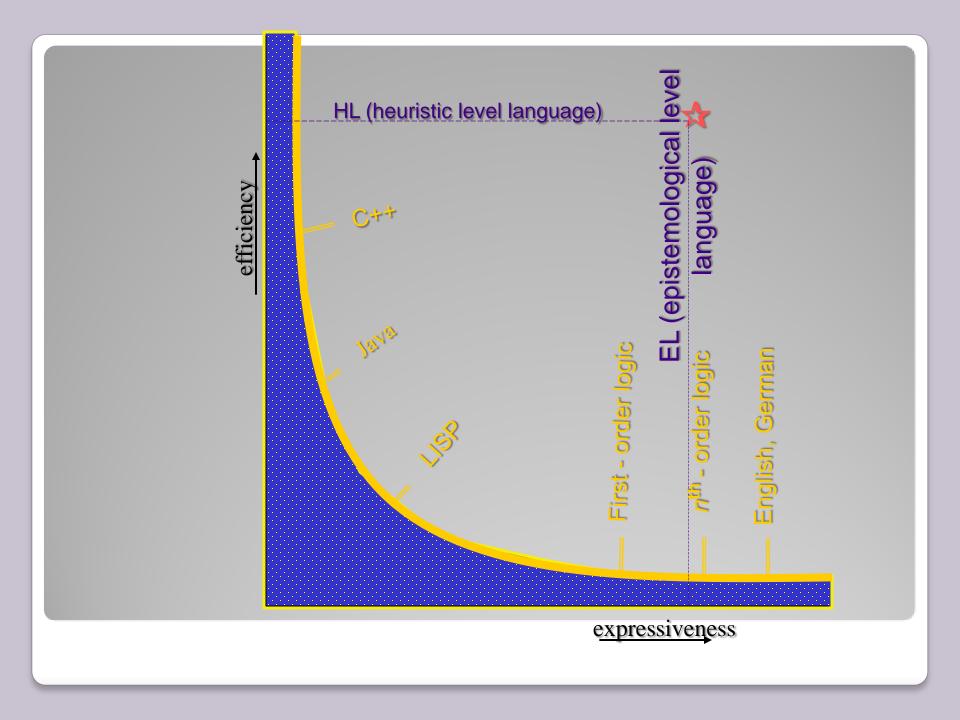




1988-89: Forced to more and more expressive representation languages: Frames → Description Logic → FOPC → HOL (CycL)

But with great power comes great **SLOWNESS** Solution: Separate the Epistemological Problem from the Heuristic Problem.

2 representation languages \rightarrow 2 editors



So: we had to learn the hard way to separate the EL from the HL

The next hard lesson: There is no one correct or best HL. Instead, there is a suite of HL modules – specialized reasoners, with (in some cases) special purpose data structures maintained so those methods can be (effic.) applied. By 1989: 20 HL modules. Today: 1k.

Always reason at the simplest language level you can, due to the tradeoff curve.

But, conversely, don't shirk from having a suitably expressive representation lang.

Representations of Knowledge

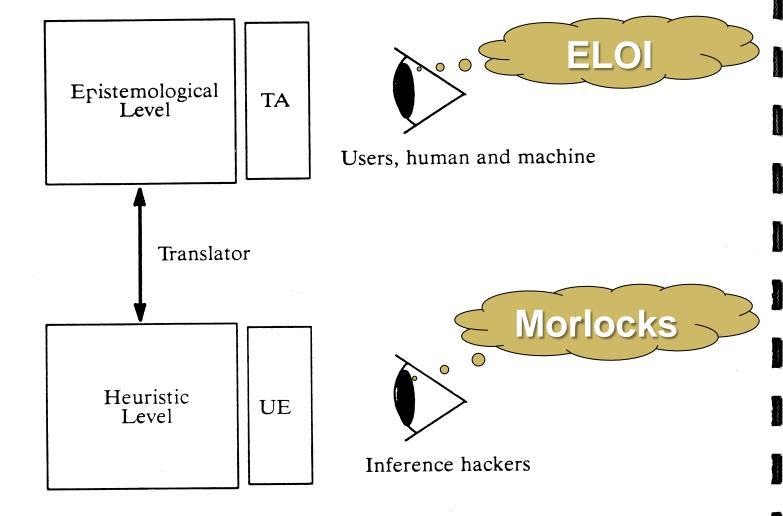
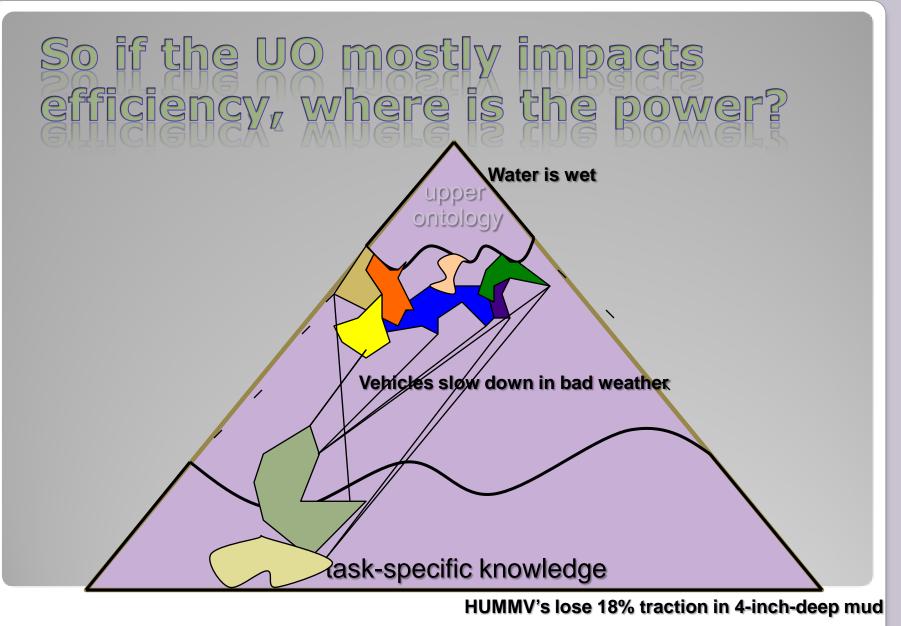


Figure 1: Schematic representation of the relationship between the Epistemological Level and the Heuristic Level. All run-time reasoning takes place at the HL, but the EH translator can make this transparent, enabling the user to interact with CYC at either level. Currently human users primarily enter knowledge with the Unit Editor (UE) at the Heuristic Level, because the organization of knowledge into frames makes browsing easier. For other programs, and for humans entering complex constraints, the Tell/Ask (TA) interface, at the Epistemological Level, is more appropriate.

1990-2009: The chasm persists

Eloi: NL dialogue-based interfaces: the WebGame, the CAE

Morlocks: Ever more baroque versions of the same UE machinery



So if the UO mostly impacts efficiency, where is the power?

- The Upper Level need only be adequate
- The Intermediate Level is locus of power
 - The Lower Levels supply the minutiae

So Upper + Intermed. is what we need to share with each other

Answering even an innocuous-sounding question: *"Can vehicle X get from Y to Z by time t ?"*

may require intermediate-level knowledge about localized spatial things, pathways, earth sciences, weather, topography, oceanography (depth, temperature, biota), terrain, transportation, industry, vehicles, geopolitics ("international waters"), communications, the driver, holidays, ...

So Upper + Intermed. is what we need to share with each other

What Needs to be Shared?

- bits/bytes/streams/network...
- alphabet, special characters,...
- words, morphological variants,...
- syntactic meta-level markups (HTML)
- semantic meta-level markups (XML, OWL)
- content (logical representation of doc/DB)
- context (models of the user's prior/tacit knowledge (incl. common sense, recent history), wants/needs, budget,...and *n* dimensions of metadata: time, space, level of granularity, the source's purpose/ideology...)

You

are

here

To do the logical/arithmetic combination across information sources, we need *tens of thousands* of relations, not *tens*

DAML+OIL, OWL add a few more distinctions:

inverses, unambiguous properties, unique properties, lists, restrictions, cardinalities, pairwise disjoint lists, datatypes, ... Indical representation of doc/DD) context (models of the user's prior/tacit) Tiny vocabulary (# distinctions) of standard relations: rdf:type, subclass, label, domain, range, comment,... Beyond which diversity is tolerated Which means divergence is inevitable "What do you mean we have no standard, we have *lots* of standards!"

To do the logical/arithmetic combination across information sources, we need tens of thousands of relations, not tens

- bits/bytes/streams
 alphabet, special
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 mantic meta-level markups ^twords in knowledge (incl. common sense, recent his wants/needs, budget,...and *n* dimensions of metadata: time, space, level of granularity, the source's purpose/ideology...)

There is no "correct" Ontology

- Are apes monkeys?
- Are poinsettias red flowers?
- Do we need to distinguish instance & subtype?
- Are these two terms the same thing:
 - Black US Presidents in the 20th Century
 - Female US Presidents in the 20th Century
- Davidsonian reification of events or not?

No need for separate ontologies

- Are apes monkeys?
- Are poinsettias red flowers?

(ist <context> <assertion>)

An assertion may be true in some contexts and false in others

• Explicitly *contextualize* each assertion

"If it's raining, carry an umbrella"

- the performer is a human being,
- the performer is sane,
- the performer can carry an umbrella; thus:
 - the performer is not a baby, not unconscious, not dead,
- the performer is going to go outdoors now/soon,
- their actions permit them a free hand (e.g., not wheelbarrowing)
- their actions wouldn't be unduly hampered by it (e.g., marathon-running)
- the wind outside is not too fierce (e.g., hurricane strength)
- It the time period of the action is after the invention of the umbrella
- It the culture is one that uses umbrellas for rain- (not just sun-) protection
- the performer has easy access to an umbrella; thus:
 - not too destitute, not someone who lives where it practically never rains, not at the office/theater/... caught without an umbrella
- the performer is going to be unsheltered for some period of time the more waterproof their clothing, the gentler the rain, and the warmer the air, the longer that time period
- the performer will not be wet anyway (e.g., swimming)
- the rain is annoying -- but merely annoying. Thus: not ammonia rain on Venus, radioactive post-apocalyptic rain, biblical (Noah's-ark-sized, or frogs/blood as rained on Pharaoh) the performer is not a hydrophobic person, gingerbread man, etc., and not a hydrophilic person, someone dying of thirst, etc.

No need for separate ontologies

- Are apes monkeys?
- Are poinsettias red flowers?

(ist <context> <assertion>)

- An assertion may be true in some contexts and false in others
- Contexts (microtheories) are themselves terms in the ontology. (genIMt HockeyMt SportsMt)
- > 12 facets or dimensions that (largely) characterize a Mt.
 - Explicitly contextualize each assertion

12 Dimensions of Ontol. Contexts

- Anthropacity / Let's
- Time
- GeoLocation
- TypeOfPlace
- TypeOfTime
- Culture
- Sophistication/Security
- Topic
- Granularity
- Modality/Disposition/Epistemology
- Argument-Preference
- Justification

How we evaluate proposed dimensions

Criteria:

- Do they separate out mutually-irrelevant (and esp. mutually-incompatible) portions of the KB?
- Is it easy for Cyc to mechanically compute the overlap or disjointness of regions of n-dim. context-space?
- Cognitive assonance: Do they (esp. their extrema) correspond to familiar real-world notions?
- Using them, is it empirically faster to enter assertions?
- Using them, is it empirically faster to do inference?

Mathematical Factoring of Contexts

UnitedStatesIn1985Context:

ere are at ... PennsylvaniaIn1985Contestine ference Dick Thornburgh is governot in side dependent 1985Contestine side dependent LehighCountyInFebruary1985Cont

Dick Thornburgh is governor and there

are at least 900,000 doctors.

"Calculi" for each dimension (and set)

Suppose we know that P holds in context C1 and P \Rightarrow Q holds in context C2 Then in what context C3 can we expect Q to hold?

Often this can be answered *dimension-by-dimension*

- E.g., if we know the time period and granularity of C1 and C2, we can infer (constrain) the time period and granularity of C3.
- E.g., if C1 is what men 18-40 think, and C2 is what Texans over 21 think, then C3 is what Texan males 21-40 think.
- E.g., if C1 or C2 makes a simplifying assumption such as ignoring air resistance, then that generally inherits to C3.

4 ways to cut ontological corners and end up with something that might demo well but not scale up

- Ignorance-based: Depend on the theory (#terms, #instances, #rules) being tiny
- Ignore elaboration tolerance (a static KB which is massively tuned, optimized, cached, etc. ahead of time, and whenever a new assertion gets added to it.)
- Restricted expressivity of the representation language (e.g., SAT constraints; propositional calculus; Horn; description logic; first order logic;...)
- One global context (no contradictions, limited domain, simplified world)

As with pharmaceuticals, what is toxic in one dosage is sometimes quite efficacious in a lesser dosage

- Ignorance-based: Depend on the theory (#terms, #instances, #rules) being tiny
- Ignore elaboration tolerance (a static KB which is massively tuned, optimized, cached, etc. ahead of time, and whenever a new assertion gets added to it.)
- Restricted expressivity of the representation language (e.g., SAT constraints; propositional calculus; Horn; description logic; first order logic;...)

One global context (no contradictions, limited domain, simplified world)
often a context *is* internally consistent (analog: the Earth is locally flat)

even a larger "problem solving context" that spans persistent contexts
often some (sub)problems *can* be represented and solved in a simpler repr.
effectively limit the size of the subtheory "explored" during inference

using relevance heuristics, spreading activation, contexts, etc.
this speeds up inference and also speeds up knowledge entry

Another Pitfall: Naming/commenting a term independently of the axioms

- Danger: bugs creep in: mismatches between what the English (name + comment) and the formal axioms say about the term.
- One solution have the system automatically generate the NL comment (and even the name) from the formal assertions
 - Additional pro's: Faster; catches missing axioms
 - Con's: stilted comment; neologism searches will "miss"
 - Mitigation: placeholder NL assertions (IOU's)

- 99.9...% of the meaning is in the assertions about the terms, not in the names E.g., Garbage-disposals and Microwave-ovens are known only to be Kitchen-Appliances
- So: one trap is to **take term names too seriously** (i.e., in situations where the associated set of assertions doesn't explicitly contain all that extra information)
- A related trap is to take NL names too seriously, and be led into ambiguity.
 - Sometimes they are related: Coral-Color Coral-Reef Coral-Polyp
 - Sometimes not: Horse as animal, apparatus, heroin,...
- The way out of this trap:
 - Constant term names should be unambiguous
 - Explicit lexicon(s) mapping constant terms to NL(s)

MicrowaveOven is a type of Kitchen-Appliance Dishwasher is a type of Kitchen-Appliance

The basic idea: Get the computer to **understand**, not just store, information. Then it can **reason** to answer your queries.

Rthagide-disjaks is a type of Kitchen-Appliance Gracinimumples is a type of Kitchen-Appliance

The basic idea: Get the computer to **understand**, not just store, information. Then it can **reason** to answer your queries.

You can't use X if it alorxes Y but lacks any Y **Rthagide-disjaks is a type of Kitchen-Appliance Gracinimumples is a type of Kitchen-Appliance Rthagide-disjaks alorxes Vorawnistz.** Gracinimumples alorxes Vorawnistz and Buzga. **Buzqa** is a Thwarn and supplied through Epluns. The basic idea: Get the computer to *understand*, not just store, information. Then it can *reason* to answer your queries.

etc. \leftarrow all the other stuff that everybody knows.

Eventually, after writing millions of these rules, the system knows as much about pipes, liquids, water, electricity, microwave ovens, dishwashers, cars, colors, movies, heights, etc. as you and I do.

Eventually, there is just one interpretation of that model, and it corresponds to the real world.

The basic idea:

Get the computer to **understand**, not just store, information. Then it can **reason** to answer your queries.

But long before that, the axioms model the world well enough that – as with human beings – it is cost-effective to act on conclusions derived from them.

Increased knowledge \rightarrow incr. understanding \rightarrow incr. confidence/trustworthiness.

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Lexical Entry Example: Coke

Constant : Coke-TheWord isa : EnglishWord

Mt : EnglishMt singular : "coke" massNumber : "coke"

pnSingular : "Coke" pnMassNumber : "Coke"

(denotation Coke-TheWord ProperCountNoun 0 (ServingFn CocaCola)) (denotation Coke-TheWord ProperMassNoun 0 CocaCola) (denotation Coke-TheWord MassNoun 0 Cocaine-Powder) (denotation Coke-TheWord MassNoun 2 ColaSoftDrink) (denotation Coke-TheWord SimpleNoun 0 (ServingFn ColaSoftDrink) *<various other denotations of the English word "coke">*

Lexical Entry Example: Eat

Constant: Eat-TheWord isa: EnglishWord Mt: EnglishMt infinitive: "eat" pastTense: "ate" perfect: "eaten" agentive-Sg: "eater"

(subcatFrame Eat-TheWord Verb 0 TransitiveNPCompFrame) (verbSemTrans Eat-TheWord 0 TransitiveNPCompFrame (and (isa :ACTION EatingEvent) (performedBy :ACTION :SUBJECT) (inputsDestroyed :ACTION :OBJECT)))

- 99.9...% of the meaning is in the assertions about the terms, not in the names E.g., if Garbage-disposals and Microwave-ovens are known only to be Kitchen-Appliances
- So: one trap is to take term names too seriously (i.e., in situations where the associated set of assertions doesn't explicitly contain all that extra information)
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Imbuing variable names with power

((ForAll ?mother) ((ForAll ?child) (older ?mother ?child)))

Imbuing variable names with power

Over-generalization

Is this a good default-true rule:

"Every organism has a head"

Replace it by a few rules for vertebrates, insects,...

Over-generalization

Over-specialization

- "Every person was born later than his mother" animal & ancestor; created thing & creator; cause/effect
- "Sailboat masts are (more or less) rigid"

(implies
 (and
 (isa ?MST Mast-Device)
 (physicalParts ?BOT ?MST)
 (isa ?BOT Sailboat))

(rigidity0f0bject ?MST Rigid))

(relationAllInstance rigidityOfObject Mast-Device Rigid)

Over-specialization

"Sailboats have masts and hulls."

"Sailboats have masts." "Sailboats have hulls."

(implies (isa ?BOT Sailboat) (implies (isa ?BOT Sailboat) (thereExists ?MST (thereExists ?MST (and (isa ?MST Mast-Device) (thereExists ?HUL (physicalParts ?BOT ?MST)))) (and (isa ?MST Mast-Device) (implies (isa ?BOT Sailboat) (isa ?HUL Hull-BoatPart) (thereExists ?H (physicalParts ?BOT ?MST) (physicalParts ?BOT ?HUL))))) (and (isa ?MST Hull-Boat) (physicalParts ?BOT ?H)))

Independent Assertions Glommed Together

"Sailboats have masts. (relationAllExists physicalParts Sailboat Mast-Device) allboats have hulls (relationAllExists Boat Hull-Boat) physicalParts (implies (isa ?BOT Sailboat) (thereExists ?MST Why separate them? (and (isa ?MST Mast-Device) 1. They generalize to diff. levels (physicalParts ?BOT ?MST)))) 2. Separated, they can then be (implies (isa ?BOT Sailboat) naturally expressed as efficient (terse, fast) GAF's (thereExists ?H (and (isa ?MST Hull-Boat) (physicalParts ?BOT ?H)))) Independent mistakes Glommed Together

TheGovernmentOfFrance, TheGovernmentOfFranceIn1997, TheGovernmentOfSpain, TheGovernmentOfSpainIn1997,... Nonatomic terms created by functions being applied to arguments: (GovernmentFn Iraq) (DuringMt 1997 (GovernmentFn Iraq)) Kilometer, Kilogram, Kilocalorie...

> (unitMultiplicationFactor (Kilo ?UNIT) ?UNIT 1000) (resultIsa (Kilo Meter) Distance) ((Kilo Meter) 8.3)

> > Pre- vs. Post-coordination

Faceting

Factoring

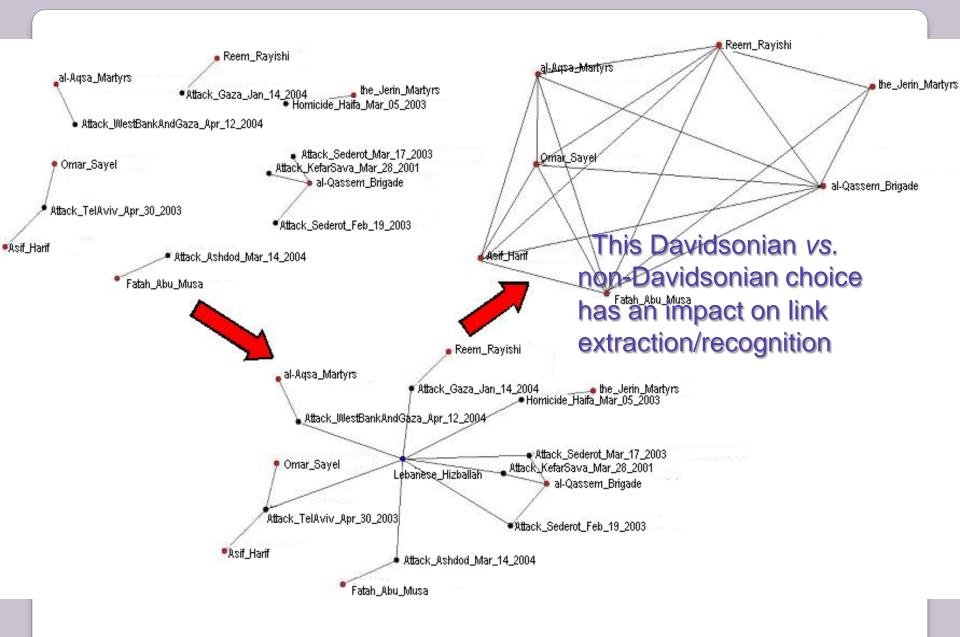
Over-reification

(marriedIn <groom> <bride> <wedding> <date>) Events are *rich* (*n*o limit to the number of args)

> (groom Wedding0947 JoeSmith) (bride Wedding0947 JaneDoe) (dateOfEvent Wedding0947 (DayFn 13 (MonthFn May (YearFn 1999))))

- Not all situations are *rich:* (successor 812 813)
- This Davidsonian vs. non-Davidsonian choice has an impact on link extraction/recognition

Pitfall: Choosing Predicates that lump independent properties together



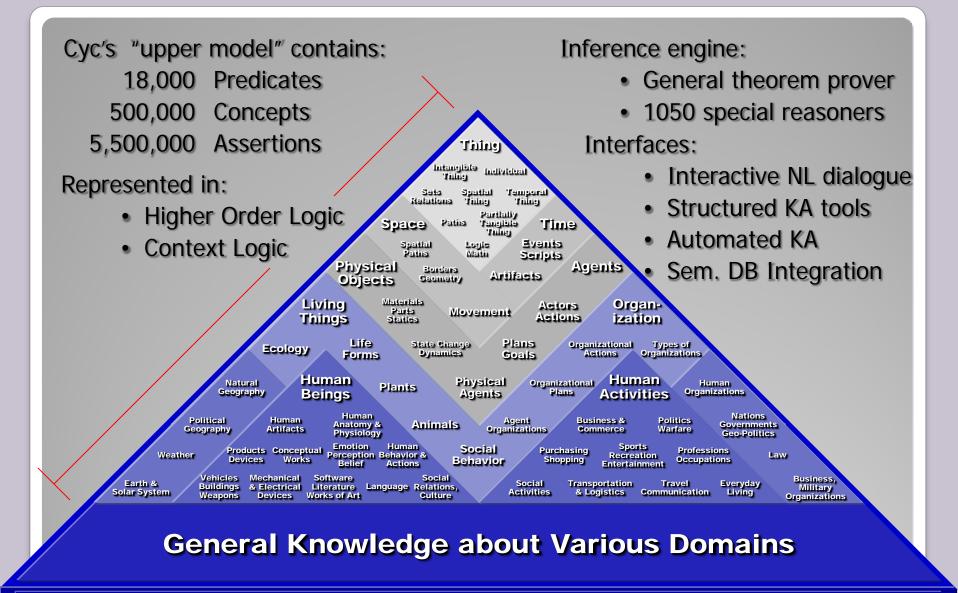
(teamLineup DallasCowboys-1998 TroyAikman EmmittSmith MichaelErvin . . .)

- 2 ways out of this trap:
- Make closure-like assertions about argument order
- Reify the separate assertions about each player's position (positionOPersonhOrganization TroyAikman DallasCowboys-199 Quarterback) (positionOPersonhOrganization EmmitSmith DallasCowboys-1990 Autorback)

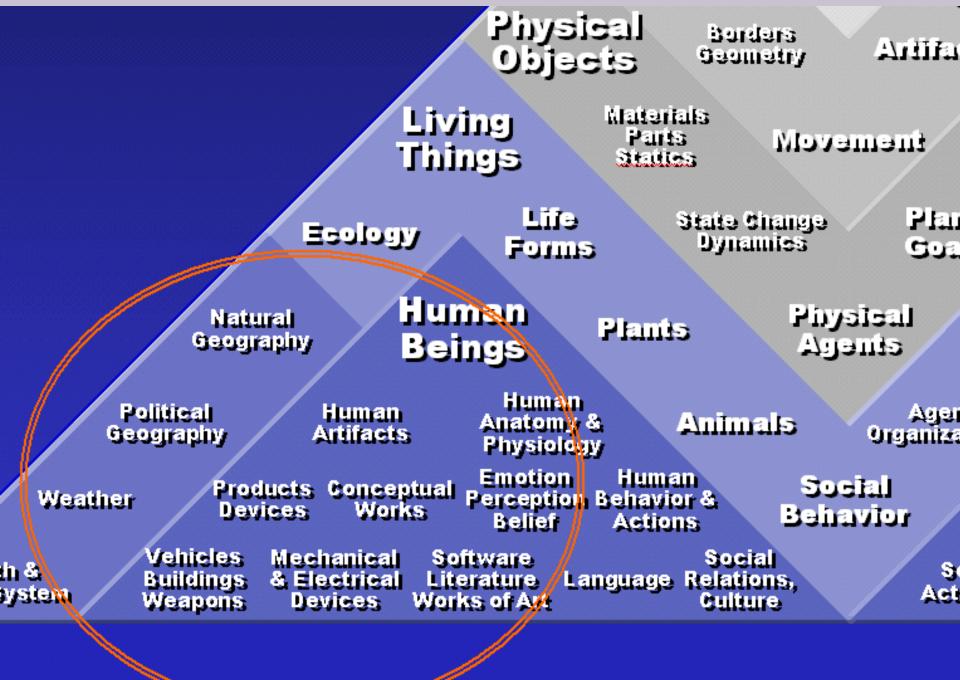
Every football team has at least one QB

- For any play, the offense has 1 QB on the field
- The QB's role in a play is ...

Predicates that hide concepts (and assertions) in *argument order*



Specific data, facts, terms, and observations



(isa ?ARG1 WeaponType)

1071 answers for ?ARG1 :

105MIMRifledBoreCannon 125MIMSmoothBoreCannon 2s12-Mortar 76MMRifledBoreCannon 85MMSmoothBoreCannon A-5C-Fighter AGS-17 AH-1J-Helicopter AIM-7M-AirToAirMissile icedTemplateTyp AIM-9J-AirToAirMissile AIM-9M-AirToAirMissile AIM-9P4-AirToAirMissile ANFOBomb ASWMortarLauncher AT-5 ATGMLauncher-9P111 ATGMLauncher-9P135M2 ATGMLauncher-AT13 ATGMLauncher-AT7 ATGMLauncher-D10T2S ATGMLauncher-Eryx ATGMLauncher-Milan AcousticWeapon AdvancedAmphibiousAssaultVehicle AdvancedArmoredPersonnelCarrier AerialBomb AerialBomb-MK53 AerialBomb-MK82 AerialBomb-MK83 AerialBomb-MK84 AgentOrange AirDefenseGun AirDefenseSystem AirDefenseWeapon AirToAirMissile AirToSurfaceMissile AirToSurfaceMissile-AGM-114 AmphibiousAssaultShip AnthraxSporeBasedWeapon AnthraxSprayer-PortableWeapon AntiAircraftArtillery AntiAircraftArtilleryGun AntiAircraftGun AntiAircraftGun-SelfPropelled AntiAircraftGunSP-Leopard2 AntiAircraftGunSP-Urutu AntiAircraftGunSP-ZSU23-4 AntiAircraftWeapon AntiArmorHandGrenade AntiArmorMine AntiArmorWeapon AntiPersonnelMine AntiPersonnelWeapon AntiRadarMissile AntiShipCruiseMissile AntiShipMissile AntiSubmarineRocket AntiTankGuidedWeapon AntiTankGuidedWeapon-AT3Sagger AntiTankHandGrenade AntiTankWeapon AntiTankWeapon-M47Dragon AntiTankWeapon-Rocket ArleighBurkeClassDestroyer ArmorPiercingDiscardingSabot ArmorPiercingDiscardingSabot-FinStabilized ArmoredFightingVehicle ArmoredInfantryFightingVehicle ArmoredMortarVehicle ArmoredTOWVehicle Arrow Artillery-SelfPropelled Artillery-Towed ArtilleryShell ArtilleryShellRemoteDetonatedBomb AssaultRifle AssaultRifle-AK47 AssaultRifle-G36 AssaultRifle-G36C AssaultRifle-G36K AssaultRifle-M14 AssaultRifle-M16A1 AssaultRifleAgran AtomicBomb AttackAircraftCarrier AttackHelicopter AttackSubmarine AutomaticFirearm AutomaticFirearm-BeltFed AutomaticFirearm-BlowbackOperated AutomaticFirearm-ClipFed AutomaticFirearm-GasOperated AutomaticFirearm-HopperFed AutomaticFirearm-RecoilOperated AutomaticFirearm-StripFed

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Knowledge (117) Info (2) tions (115) a (5) 🚛 <u>Ferm</u> (9) 🚜 <u>⁄lt</u> zAssertion_ sAmmunition_ String ing (3) 🚛 <u>ystem</u> (5) 🚜 iousExternalConcept_ ndedBehaviorCapable_ apableFn behaviorCapable)__ ithWeaponType (4) em<u>bersOneOf</u> (2) [sa1-2 [<u>sa2-3</u>___ jectType 📶Instance (8) 🛻 rmamentOfUnit

pping

(genls AssaultRifle-AK47 ?ARG2)

97 answers for ?ARG2 :

Agent-Underspecified Artifact Artifact-Generic Artifact-HumanCreated Artifact-NonAgentive AssaultRifle AssaultRifle-AK47 AutomaticFirearm AutomaticFirearm-GasOperated BilateralObject Boundary-Underspecified BusinessRelatedThing Collectible Container-Underspecified ContainerIndependentShapedThing ConventionalWeapon CulturalThing DangerousTangibleThing DangerousThing Device-SingleUser DirectFireWeapon DurableGood EnduringThing-Localized FiniteSpatialThing FrontAndBackSidedObject Gun Gun-BreechLoading Gun-Portable HexalateralObject HumanScaleObject InanimateObject InanimateObject-NonNatural Individual Landmark-Underspecified LeftAndRightSidedObject Location-Underspecified ManMadeThing ManufacturedGoods MechanicalDevice MilitaryEquipment MilitaryHardware MilitaryThing-SpatiallyLocalized MilitaryWeapon NonFluidlikeTangibleThing NonNaturalThing NotVeryRoundObject ObjectWithUse PartiallyTangible PartiallyTangibleProduct PhysicalDevice PolyDimensionalThing PortableObject PositiveDimensionalThing PoweredDevice Product ProjectileLauncher ProjectileLauncher-Direct ProjectileWeaponOrLauncher Region-Underspecified Rifle RigidPortableObject SelectiveFireFirearm ShapedObject SmallArm-Weapon SolidTangibleArtifact SolidTangibleThing SomethingExisting SpatialThing SpatialThing-Localized SpatialThing-NonSituational SpatiallyContinuousThing SurfaceRegion-Underspecified Technology-Artifact TemporalThing TemporallyExistingThing Thing ThreeDimensionalThing TopAndBottomSidedObject Trajector-Underspecified TriggerableDevice UserTriggeredWeapon Weapon (CollectionDifferenceFn SomethingExisting Organization) (CollectionDifferenceFn SpatialThing Situation) (CollectionDifferenceFn TemporalThing BiologicalLivingObject) (CollectionUnionFn (TheSet Action Artifact-Generic PropositionalConceptualWork)) (CollectionUnionFn (TheSet AxisymmetricObject BilateralObject)) (CollectionUnionFn (TheSet DurableGood ServiceEvent Product)) (CollectionUnionFn (TheSet Event Artifact)) (CollectionUnionFn (TheSet Gun-Portable Bomb)) (CollectionUnionFn (TheSet MilitaryEquipment (GroupFn CommunicationDevice))) (CollectionUnionFn (TheSet SolidTangibleThing LiquidTangibleThing)) (CollectionUnionFn (TheSet SpatialThing VectorInterval)) (CollectionUnionFn (TheSet TemporalThing Collection)) (CollectionUnionFn (TheSet WeaponSystem MilitaryWeapon)) (MeaningInSystemFn SENSUS-Information1997 "DECOMPOSABLE-OBJECT") (MeaningInSystemFn SENSUS-Information1997 "SEPARABLE-ENTITY")

37 Relations Between Temporal Things

- temporalBoundsIntersect
 - temporallyIntersects
 - startsAfterStartingOf
 - endsAfterEndingOf
 - startingDate
 - temporallyContains
- temporallyCooriginating

temporalBoundsContain
 temporalBoundsIdentical

 startsDuring
 overlapsStart
 startingPoint
 simultaneousWith
 after



Temporal Granularity: one of many types of metadata

"Ariel Sharon was in Jerusalem throughout 2005 (except for isolated trips each < 1 week long)"

"Condoleezza Rice made a ten-day trip to Jerusalem in February of 2005"







Information-Bearing Things

Books, web-page copies, radio broadcasts, utterances, intell cables, TV series,...

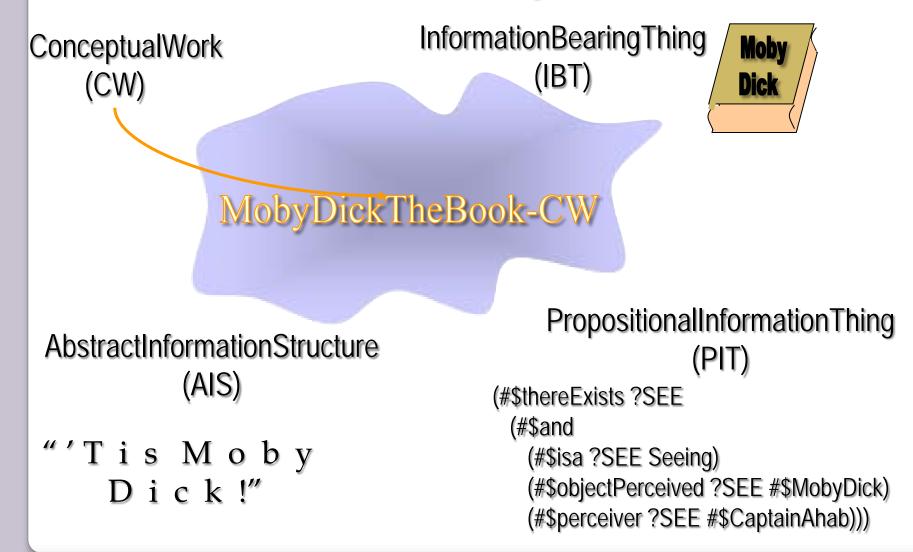
What is "Moby Dick" ? InformationBearingThing (IBT) Moby Dick Problem: People refer to all of these as "Moby Dick"

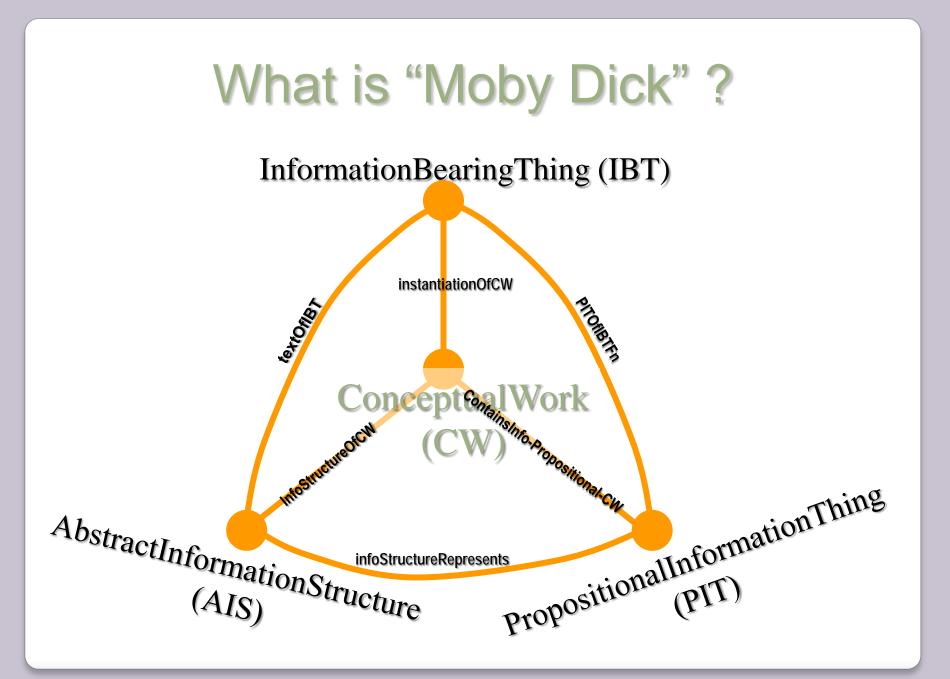
AbstractInformationStructure (AIS)

PropositionalInformationThing (PIT)

(#\$thereExists ?SEE
 (#\$and
 (#\$isa ?SEE Seeing)
 (#\$objectPerceived ?SEE #\$MobyDick)
 (#\$perceiver ?SEE #\$CaptainAhab)))

What is "Moby Dick" ?





Relations Between an Event and its Participants

performedBy
causes-EventEvent
objectPlaced
objectOfStateChange
outputsCreated
inputsDestroyed
assistingAgent
beneficiary

- fromLocation
 - toLocation
- o deviceUsed
- driverActor
 - o damages
 - vehicle
- providerOfMotiveForce
 transportees

Over 400 more.

- We started in 1984 with just one binary predicate, "in".
- in(X,Y) means the inner object X is spatially located in the region defined by the outer object Y.
- If I just tell you in(X,Y), and you aren't told what X and Y are, then you (and Cyc) can't answer questions like these:
 From the outside of Y, can I see any part of X?
 - If I turn Y over and shake it, will X fall out?
 - Is there room to put more things in Y?
 - Is X actually a part of Y?
- Such failures led to our introducing new, more precise, more specialized versions of "in". By now there are over 75 such predicates, organized in a graphical taxonomy.

- Is the inner thing part of the outer object?
 - Yes → Then use physicalDecompositions
 - Not at all → Then use objectFoundInLocation
- Can a cutting plane cut the inner object and not the non-cospatial outer object?
 - No → Then use spatiallyContains
 - Yes → Then use sticksInto
 - Can the inner object be seen sticking out on both sides of the outer object?
 - Yes → Then use surroundsRinglike

- Can the inner object leave by passing by (passing through gaps among) members of the outer group?
 - o Yes → Then use in-Among
 - Is the inner object also one of those outer group members?
 - Yes → Then use groupMemberOf
- Is the inner object a building built on the outer object, which is a plot of land?
- Yes → Then use groundsOfBuilding

- If the outer object moves, does the inner object move along with it ?
 - Yes → Then use physicallyContains
 - Is the inner object a hole or cavity in the outer object?
 - Yes → Then use containsCavity
 - Is some part of the inner object in every part of the outer object?
 - Yes → Then use constituents
 - Was it used in constructing the outer object?
 - Yes → Then use builtUsingParts (if it still has essentially the same shape and properties) or ingredients (if it doesn't)

- Can the physically-contained "inner" object be removed if sufficient force is supplied in some direction, without damaging either object?
 - Yes → Then use nailedOrPinnedIn if the direction required is outward; use screwedIn if the required direction to apply the force is rotational

Various specialized forms of in-Container

- wearsClothing
- protectiveContains -- by purpose
- coversBaglike
- occupantsAre

- -- by object type
- -- by object feature
- -- by object type

- Various specialized forms of physicallyContains
 - anatomicalParts, electricalParts, hasDevices, hasFloors, hasRooms, hasMarkings, mainProduct, movingParts, mealComponent, outfitParts, portalHasCovering, packaging, celestialSubRegion, geographicSubRegion...
- These semantic disentanglings lead to the question: Is Virgina an intelligent agent or just a region?
 - In one context (Geography), it is just a region.
 - In others (GeopoliticalDualistTheoryOfTheWorld), both

Propositional Attitudes Relations Between Agents and Propositions

- goals
- intends
- desires
- hopes
- expects
- believes

- opinesThat
- knowsThat
- remembersThat
- perceivesThat
- seesThat
- fearsThat

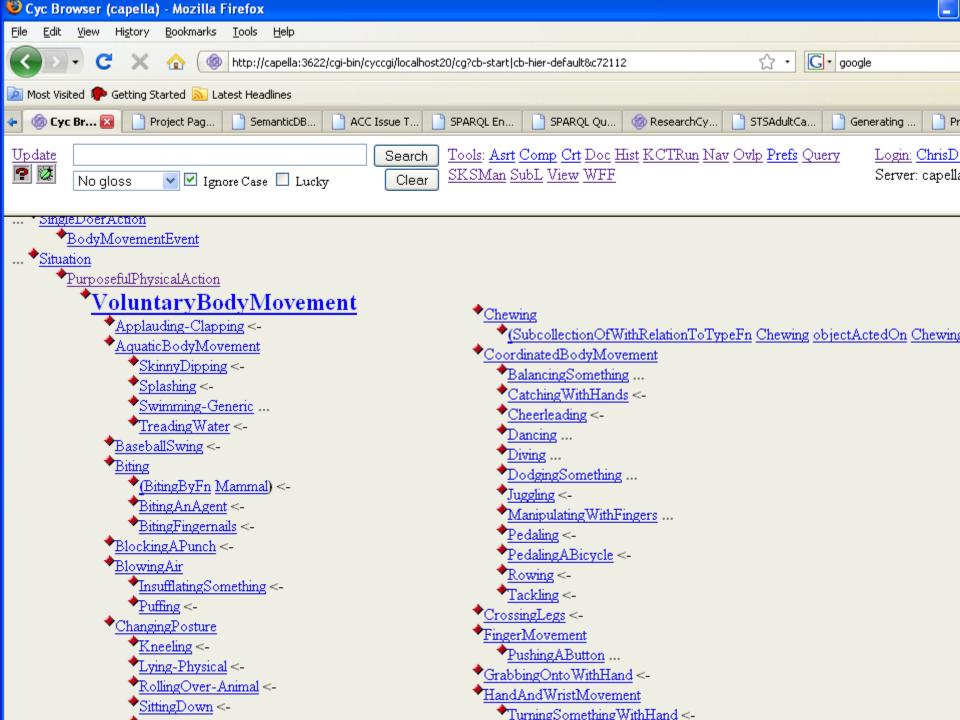
These are *modal*;* assertions using them go beyond 1st-order logic.

* I.e., modus ponens, substitution of equals for equals, etc. often doesn't hold.

deliberateActors

assistingAgent controllingLaunchAuthority-USAF <-dutyOfficerOfTask <-launchAerospaceControlOfficer <launchMissionDirector <-launchOpe<u>rationsDirector</u> <-launchRangeControlOfficer <launchRangeOperationsCommander <-launch AFLD-AFSD <-missionFlightControlOfficer ... computerInteractionUser mySentientSessionUser <-crewMember driverActor ... deliberateSocialParticipants (PresentTenseVersionFn deliberateSocialParticipants) adversaryInConflict ... agreementSponsors <arbitrageur authorizingAgents <buyingPerformer

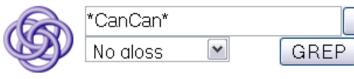
communicationParticipants ... competingAgents ... contractee <contractor <cooperatingParticipants ... cultureCoreParticipants <-guestAtSocialGathering <guestInHosting host ... hostOfEvent <initiator ... interviewee interviewer <-keyParticipants ... mediators meetingParticipants ... negotiators <-noVoter <-officiator pickupCourier <-presenter <-projectLeader <-projectParticipants ... providerOfService ... sellingPerformer ...



ResearchCyc Browser (ariadne)

G (Untitled)

Se



🖻 HL Support Detail 👘 [Refrest

Mt : <u>CurrentWorldDataCollectorMt-NonHomocentric</u>

[Refresh] [Q

(typeBehaviorIncapable Can Cancan-StyleOfDance performedBy)

Strength : Default Module : TVA

Confusing the user by:

talking in logic vs. NL

- talking in too-precise NL
- including prior/tacit knowl.



Can a can can-can?

Justification :

HL Formula :

(typeBehaviorIncapable InanimateObject AtLeastPartiallyMentalEvent doneBy) in AnimalActivitiesMt
 (transitiveViaArgInverse typeBehaviorIncapable genlPreds 3) in UniversalVocabularyMt
 :GENLPREDS (genlPreds performedBy doneBy) in CurrentWorldDataCollectorMt-NonHomocentric

(transitiveViaArgInverse typeBehaviorIncapable genls 1) in UniversalVocabularyMt
:GENLS (genls Can InanimateObject) in CurrentWorldDataCollectorMt-NonHomocentric

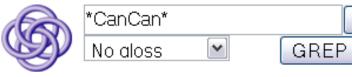
(transitiveViaArgInverse typeBehaviorIncapable genls 2) in UniversalVocabularyMt
:GENLS (genls Cancan-StyleOfDance AtLeastPartiallyMentalEvent) in CurrentWorldDataCollectorMt-NonHe

<u>Update</u> <u>Comm</u>: Storing Only <u>Agenda</u>: Idle KB: 7113 <u>System</u>: 1.10183

ResearchCyc Browser (ariadne)

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🖻 HL Support Detail

Strength : Default Module : TVA

Confusing the user by: ✓ talking in logic vs. NL

[Refresh] [• talking in too-precise NL

including prior/tacit knowl.



Mt : CurrentWorldDataCollectorMt-NonHomocentric HL Formula : Can a can can-can?

(typeBehaviorIncapable Can Cancan-StyleOfDance performedBy)

Justification :

Inanimate objects cannot play the role of doer in partially mental event.

Argument 3 of <u>#\$typeBehaviorIncapable</u> is transitive with respect to the inverse of <u>#\$genIPreds</u>.

If some agent deliberately performed some action, then it did that action. (claimed by GENLPREDS module)

Argument 1 of #\$typeBehaviorIncapable is transitive with respect to the inverse of #\$genls.

A <u>can</u> is a type of <u>inanimate object</u>. (claimed by **GENLS** module) 🔆

Argument 2 of #\$typeBehaviorIncapable is transitive with respect to the inverse of #\$genls.

Cancan dancing is a type of partially mental event. (claimed by GENLS module) 🔆

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? Update Comm: Storing Only Agenda: Idle KB: 7113 System: 1.10183 ResearchCyc Browser (ariadne)

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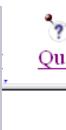
🖻 HL Support Detail

Strength : Default Module : TVA

Confusing the user by: ✓ talking in logic vs. NL

[Refresh] [• talking in too-precise NL ✓ including prior/tacit knowl.

*



Mt : CurrentWorldDataCollectorMt-NonHomocentric HL Formula : (typeBehaviorIncapable Can Cancan-StyleOfDance performedBy)

Can a can can-can?

Justification :

Inanimate objects cannot play the role of doer in partially mental event.

A can is a type of inanimate object. (claimed by GENLS module) 🔆

Cancan dancing is a type of partially mental event. (claimed by GENLS module) 🗮

What AI did wrong before Cyc

Al Magazine Volume 29 Number 2 (2008) (© AAAI)

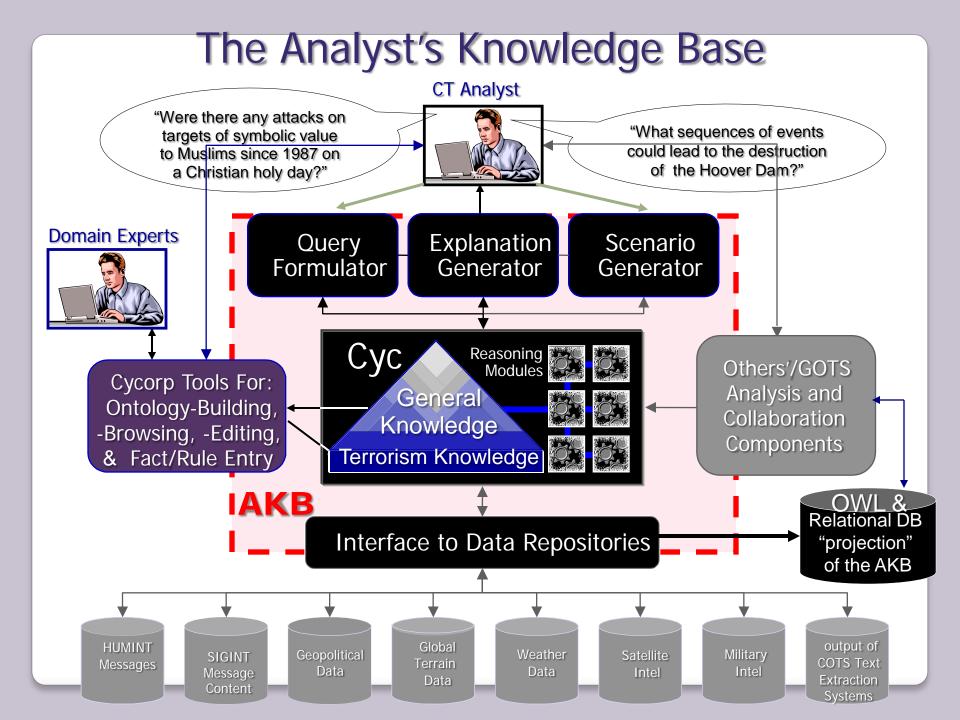
Articles

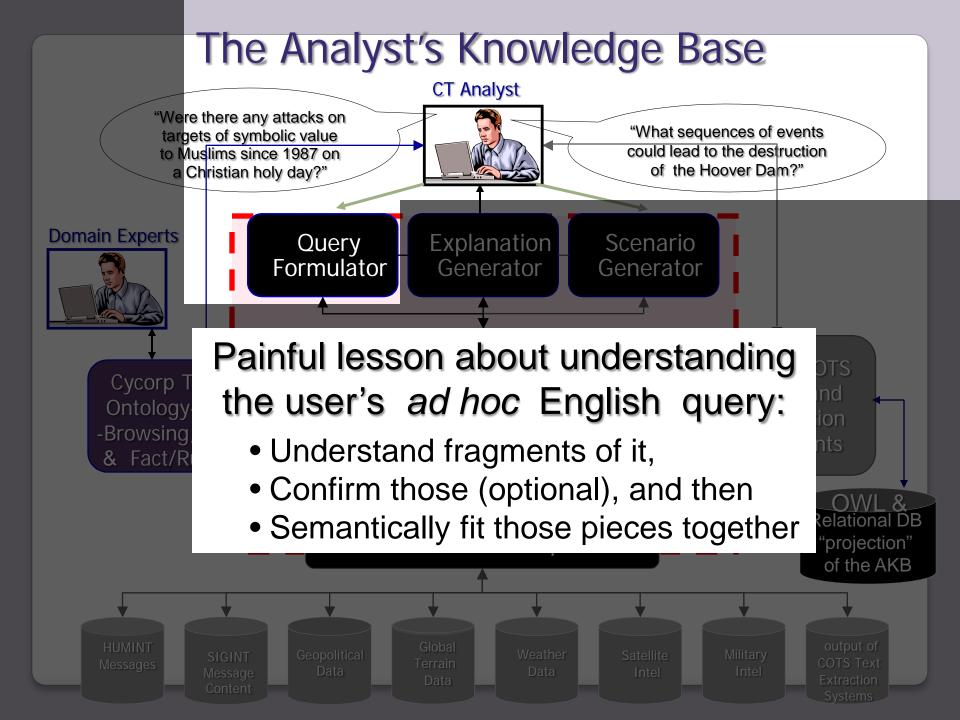
The Voice of the Turtle: Whatever Happened to AI?

Doug Lenat

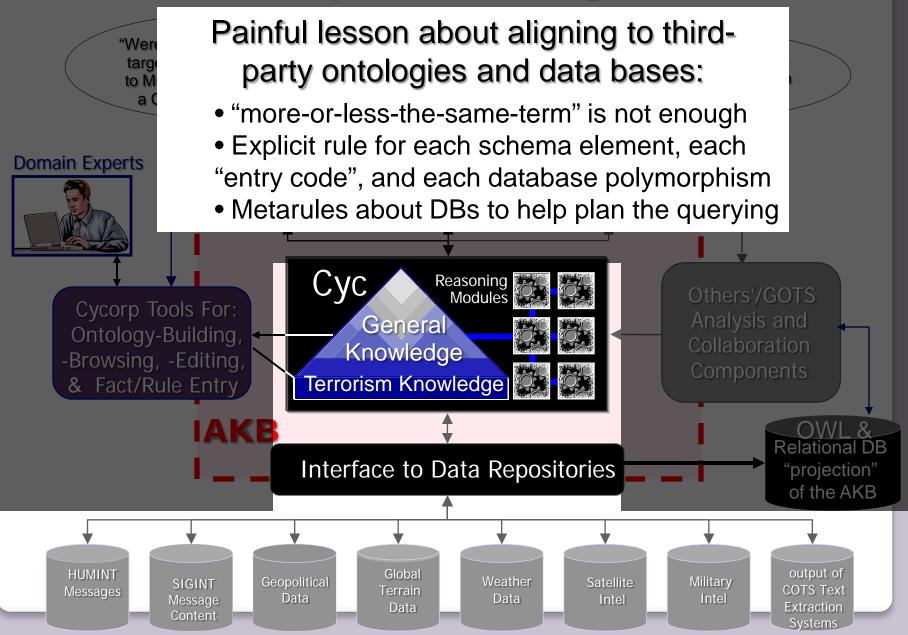
Errors in representation, in methodology, in inference, in scale. Traps we fell into, decisions we had to back out of, half-finished off-ramps to nowhere.

■ On March 27, 2006, I gave a lighthearted and occasionally bittersweet presentation on "Whatever Happened to AI?" at the Stanford Spring Symposium presentation—to a lively audience of active AI researchers and formerly active ones (whose current inaction could be variously ascribed to their having aged, reformed, given up, redefined the problem, and so e're now well past 2001; where is HAL? When Marvin Minsky advised Arthur C. Clarke and Stanley Kubrick, 40 years ago, it seemed that achieving a full HAL-like AI by 2001 was every bit as likely as, well, commercial Pan Am flights to the moon by 2001.¹ As Bill Rawley said, the future is just not what back-and-forth clarification dialogues with us, their human users. But for that to be anywhere near as efficient as conversing with another human being—for the computer to not come off like an idiot savant or idiot—requires its knowing a vast panoply of facts (hot coffee is hot; jet planes fly hundreds of miles per hour),





The Analyst's Knowledge Base



• the **population** field of the GNIS table contains the number of inhabitants of the city that that row is "about"

(fieldDecoding (LogicalSchemaFn Usgs-Gnis) ?x
 (TheFieldCalled "population")
 (numberOfInhabitants
 (TheReferentOfTheRow Usgs-Gnis) ?x))



The Geographic Names Information System (GNIS) DB maintained by the *US Geological Survey* (USGS).



• metalevel statistics on that DB to help plan queries

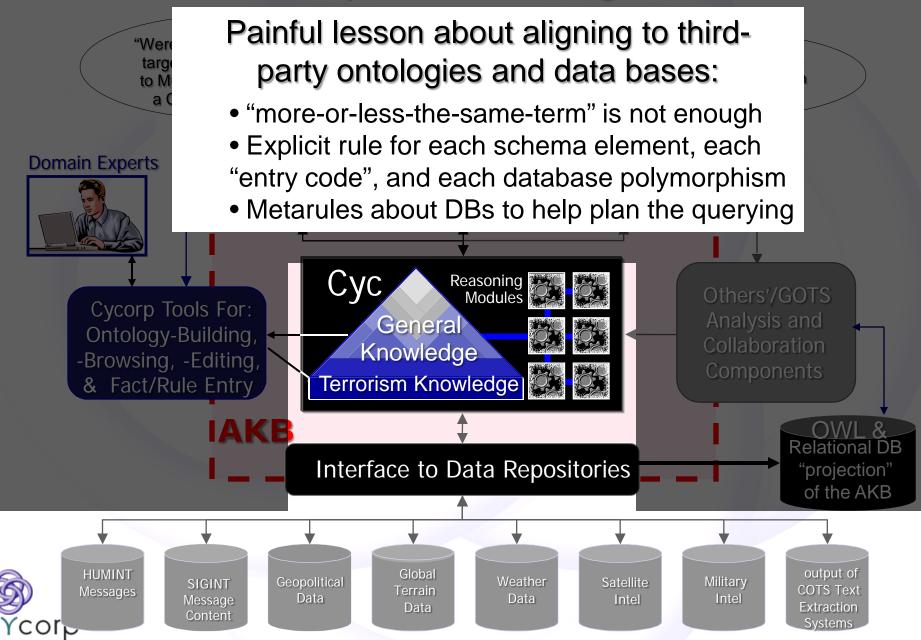
E.g., these were asserted into the (MappingMtFn Usgs-KS) context:

(resultSetCardinality Usgs-Gnis-PS (TheSet (PhysicalFieldFn Usgs-Gnis-PS "state")) TheEmptySet 60.0)

```
(resultSetCardinality Usgs-Gnis-PS
(TheSet
(PhysicalFieldFn Usgs-Gnis-PS "primary_long")
(PhysicalFieldFn Usgs-Gnis-PS "primary_lat")
(PhysicalFieldFn Usgs-Gnis-PS "name"))
(TheSet
(PhysicalFieldFn Usgs-Gnis-PS "county")
(PhysicalFieldFn Usgs-Gnis-PS "state"))
530.36)
```



The Analyst's Knowledge Base



"What major US cities are particularly vulnerable to an anthrax attack now?"

"major US city" ⇔ U.S. City with >1M population

- the current ambient temperature at ?C is above freezing, and
- ?C has more than 100 people for each hospital bed, and

• the number of anthrax host animals near ?C > 100k

Cyc knows that pullets are chickens, so don't add those two numbers together!

Cyc AKB: Design

Basic design: An extension of Cyc's ontology, KB, and HL reasoners

Held 3 workshops to elicit terrorism experts' consensus on:

- * Questions (templates and fragments) that often come up
- * What an ideal relational DB schema would be (for indivs, groups, events)

➤Use a logic of contexts (Cyc Microtheories) to distinguish and correctly combine information from multiple sources (written at different times, levels of granularity, cultural ideology...)

- * E.g., the user might want the AKB to answer a query...
 - ...using only US-intell-vetted data repositories available in Aug. 2001
 - ...including all wire service sources except radical Arab news sources
 - ...using only sources which the CIA believes that HAMAS trusts

Cyc AKB: Construction

Construct Analysts' Knowledge Base (AKB) by extending Cyc

Extend the ontology (based on the experts' "dream DB schema") [note that this and the other steps go on in parallel]

Manually "prime the pump": add specific assertions in CycL

- Develop a structured interface for non-Cyclists to use, and have them (e.g., poli sci students) manually enter much more
- Find ways to (semi-)automatically slurp mass quantites more
 - by "fishing" unstructured text sources
 - by SKSI (semantic knowl. source integration) maps to DBs
- Develop a structured interface for end users



General Knowledge about Terrorism:

Terrorist groups are capable of directing assassinations:

(implies

(isa ?GROUP TerroristGroup)

(behaviorCapable ?GROUP AssassinatingSomeone directingAgent))

• • •

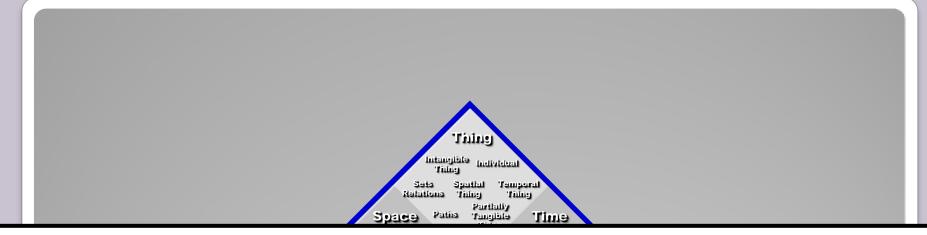
If a terrorist group considers an agent an enemy, that agent is vulnerable to an attack by that group: (implies

(and

(isa ?GROUP TerroristGroup) (considersAsEnemy ?GROUP ?TARGET)) (vulnerableTo ?GROUP ?TARGET TerroristAttack))



Specific data, facts, and observations about terrorist groups and activities



Specific Facts about Al Qaida:

(basedInRegion AlQaida Afghanistan) Al-Qaida is based in Afghanistan.

(hasBeliefSystems AlQaida IslamicFundamentalistBeliefs) Al-Qaida has Islamic fundamentalist beliefs. (hasLeaders AlQaida OsamaBinLaden) Al-Qaida is led by Osama bin Laden.

(affiliatedWith AlQaida AlQudsMosqueOrganization) Al-Qaida is affiliated with the Al Quds Mosque. (affiliatedWith AlQaida SudaneseIntelligenceService) Al-Qaida is affiliated with the Sudanese Intell Service

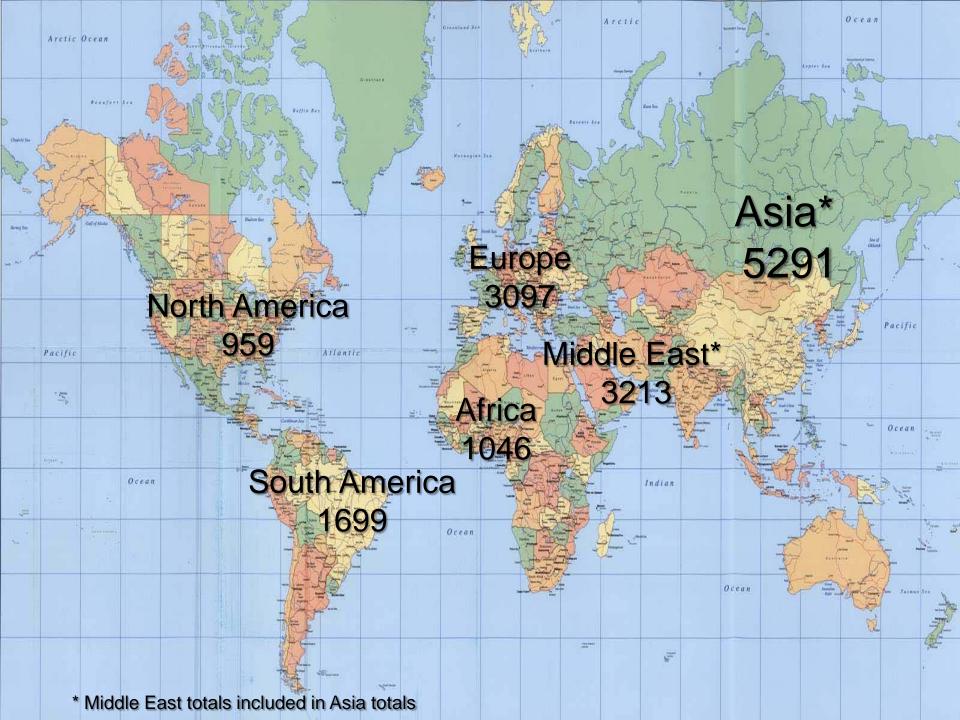
(sponsors AlQaida HarakatUlAnsar) Al-Qaida sponsors Harakat ul-Ansar. (sponsors AlQaida LaskarJihad) Al-Qaida sponsors Laskar Jihad.

(performedBy EmbassyBombingInNairobi AlQaida) Al-Qaida bombed the Embassy in Nairobi.

General Knowledge about Terrorism



Specific data, facts, and observations about terrorist groups and activities



Armed attack 22% Attack type percent by Levant Country Bombing (non-suicide): 15% Kidnapping: 12 % Assassination/Murder: 6.5% Suicide bombing: 3% Grenade attack: 2.1% srae Armed attack: 38% Suicide bombing: 15% Bombing (non-suicide): 13% Missile attack: 6% Assassination/murder: 6% Mortar attack: 1.8% Kidnapping: 1.7%

West Bank

Gaza Ship

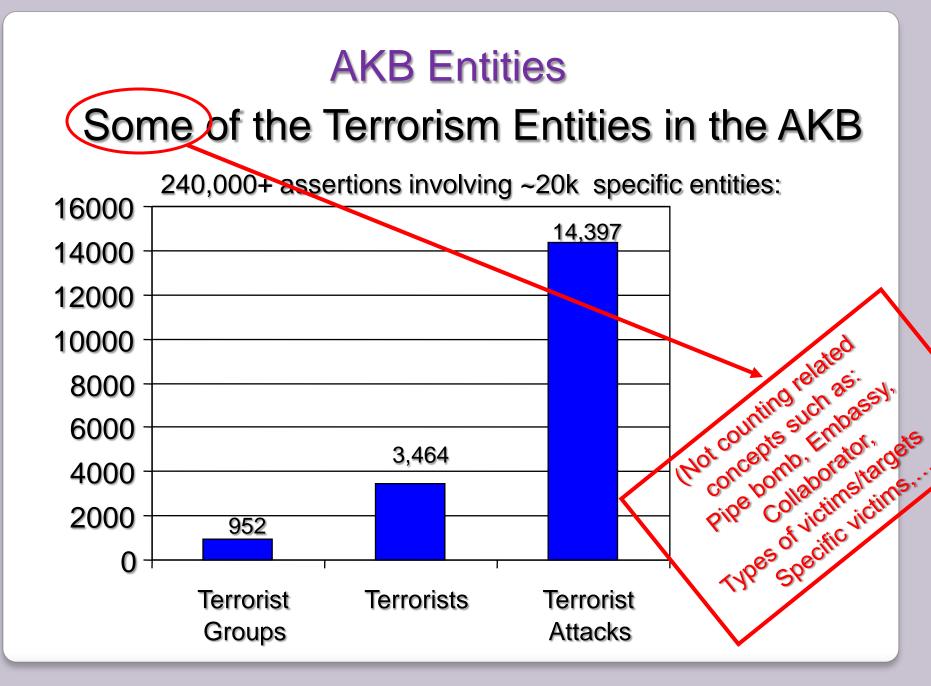
744

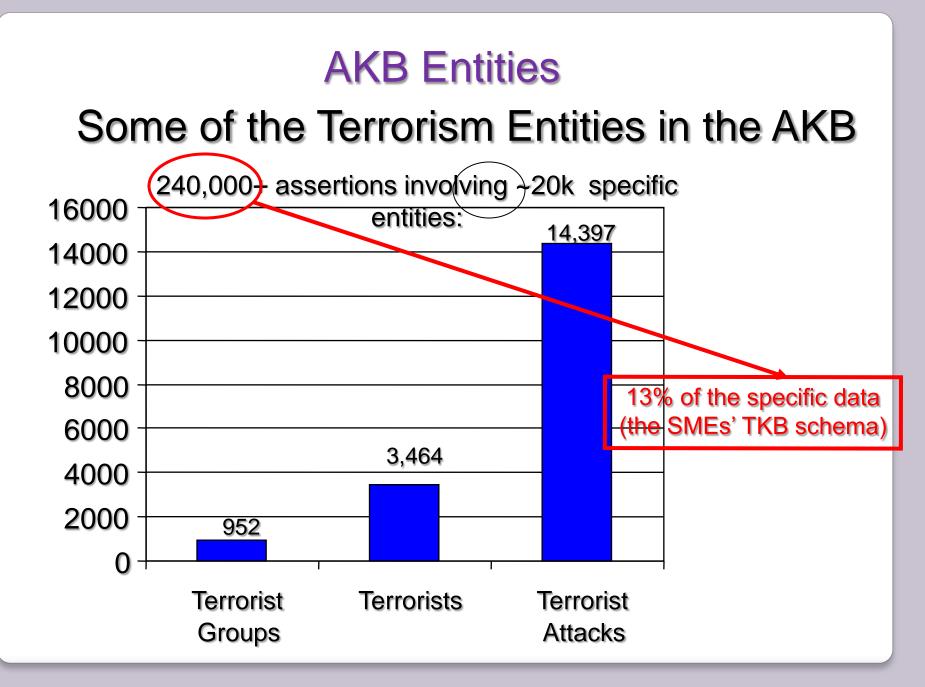
V

Israel

Syria Armed attack: 50% Mortar attack: 30% Missile attack: 30% Ambushes: 17% Bombing (all): 18% Assassination/murder:6%

Jordan Armed attack: 36% Bombing (all): 13% Assassination/murder: 10% Ambushes: 4% West Bank and Gaza Arson: 4% Armed attack: 81% Bombing (non-suicide): 45% Kidnapping: 3% Suicide bombing: 15% Murder/Assassination: 7.5% Ambushes: 4.4% Mortar attack: 3.5% Missile attack: 3.0%





The FET (Fact Entry Tool) Enables SMEs to Represent CT Knowledge and Terrorism Facts

"According to the website 'Inside Terrorism', the ANVC's headquarters has been in Garo Hills, India, since sometime in December, 1995."

(thereExists ?TIME

(and

(temporallySubsumes (DateFn 12/1995) ?TIME) (ist

(MtSpace

(ContextOfPCWFn WebSite-Inside-Terrorism)

(MtTimeWithGranularityDimFn

(TimeIntervalInclusiveFn ?TIME Today-Indexical TimePoint))) (residenceOfOrganization ANVC GaroHillsIndia))))

File

<



Help "According to the website 'Inside Terrorism', the Edit View Go FactEntry Window \otimes ANVC's headquarters has been in Garo Hills,

India. since sometime in December, 1995."

'ind '	Terror Organization Achik Nation	nalVo	lunteer Council
	Description		Fact
-	Organization's headquarters:	0	Garo Hills, India
-	When:	0	from sometime in December, 1995 to today
2	Performs this kind of attack:	0	kidnapping
2	Against this kind of target:	0	
2	In this location:	0	
-	When:	0	
	Others assisting a setticity	0	

2	Against this kind of target:	0		l
2	In this location:	0		l
D	When:	0		
₽.	Other criminal activity:	0		
-	In location:	0		l
>	When:	0		l
Name	Type Members Locations	Histor	y Assets Support Attacks	1

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Name

Type

Members

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Assets



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Fi	Find Terror Organization					Achik National Volunteer C			
			Des	scriptio	n				
-	. 11 .						111 B 110		

According to the website 'Inside Terrorism', the ANVC's headquarters has been in Garo Hills, India. since sometime in December. 1995. "

	Description		Fact
▶	Organization's headquarters:	0	Garo Hills, India
₽.	When:	0	from sometime in December, 1995 to today
2	Performs this kind of attack:	0	kidnapping
•	Against this kind of target:	0	public official
₽.	In this location:	0	India
2	When:	0	from sometime in the late part of 1995 to today
₽.	Other criminal activity:	0	money laundering
A	In location:	0	India
₽.	When:	0	late 1995 to early 2003
			•

Support

Attacks



Edit View Go FactEntry Window File Help "According to the website 'Inside Terrorism', the \otimes ANVC's headquarters has been in Garo Hills, India, since sometime in December, 1995." Find Terror Organization Achik National Volunteer Council Description Fact P 0 Organization's headquarters: Garo Hills, India A 0 from sometime in December, 1995 to today When: 2 0 Performs this kind of attack: kidnapping 14,600 other 2 0 public official Against this kind of target: target types 2 0 India In this location: 2 When: 0 from sometime in the late part of 1995 to today P 0 Other criminal activity: money laundering A 0 India In location: A When: late 1995 to early 2003 \bigcirc Type Members Locations History Assets Support Attacks Name

FI 88888888

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е Сус	Terrorism Knowledge Base			العالعا				
3	dit <u>V</u> iew <u>G</u> o Fact E <u>n</u> try <u>W</u> indo (a) (b) (b) (c) (c) Terror Organization Achik Nation		ANVC's headquarter	osite 'Inside Terrorism', the rs has been in Garo Hills, ne in December, 1995. "				
	Description			Fact				
₽.	Organization's headquarters:	0	Garo Hills, India					
₽.	When:	0	from sometime in December, 1995 to today					
2	Performs this kind of attack:	0	kidnapping					
D	Against this kind of target:	0	public official					
2	In this location:	0	India					
b	When:	0	from sometime in the late part of 1	7762 other				
₽.	Other criminal activity:	0	money laundering	7,763 other				
A	In location:	0	India	action types				

7,763 other action types In location: India late 1995 to early 2003 When: 0

Name Type	Members	Locations	History	Assets	Support	Attacks
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Type

Name

Members

Locations

History

Assets

Support

Attacks



	-		ANVC's headquarters has been in Garo Hills, <u>India, si</u> nce sometime in December, 1995. "
Find	Terror Organization Achik Nation Description	nal vo	Fact
▶	Organization's headquarters:	0	Garo Hills, India
₽	When:	0	from sometime in December, 1995 to today
2	Performs this kind of attack:	0	kidnapping
D	Against this kind of target:		public official
2	In this location:		India time Cise tely m
2	When:	0	from sometime in the late part of 1995 . Cr Vac any
₽.	Other criminal activity:	0	money laundering
▶	In location:	0	kidnapping Indefinitely public official Drecipinitely India time or vany from sometime in the late part of 1995 Oressions money laundering India
▶	When:	0	late 1995 to early 2003

"In what countries bordering Pakistan are there members of the ANVC?"

Cyc Analytic Environment: The Lebanese Hezt	bollah Task	_ = ×
<u>File Edit Tools Window H</u> elp		
S (S) (∅)		
Task Info 🗷 Concepts 🗷 Queries 🗷	What values of <i>COUNTRY</i> are there such that	
Results	* COUNTRY is a country, * and some other agent MEMBER is a member of Achik National Volunteer Council.	
3 Queries Jilarity Queries	* and MEMBER is located in COUNTRY,	
tording to the MIPT 1998-2002 data, In v attacks did ETA issue warnings?	* and Pakistan borders on COUNTRY?	
ording to the MIPT 1998-2002 data, In v		
attacks on commercial targets did ETA iss vhat percentage of its attacks on governm		
98 and 2002 did ETA issue warnings? the suicide bombings that occurred in cit	Ask Save Stop Allow Speculation?	(3)
each major attack type, what is the ratio t are of that type?		
anything linked to Mustafa Kamel via the acherOf" "relatives" "actors" and "affected	Answers Monitoring	
all attacks in which it is known that some		
ery Builder Folders Complex Relations		
Terrorist Attacks Organizations		
▶ Name ▶ Type		
Members PERSON was a member of ORGAN		
 PERSON was a member of ORGAN PERSON was a spokesperson for (
PERSON was a spokesperson for (
PERSON was a leader of ORGANIZ		
AGENT-1 was affiliated with AGEN		
AGENT-1 was affiliated with AGEN ORGANIZATION has NUMBER mem		
► Locations ► History		
Assets	Justify Answer Visualize Visualize All <u>R</u> emember Email Results	
Status: Idle Message:	1	

"In what countries bordering Pakistan are there members of the ANVC?"

Cyc Ar	alytic Environment: The Lebanese Hezbollah Task	
<u>File</u> Edit	Tools Window Help	
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Each answer that CAE finds for this generally involves a 1-4-step (not 0-step) argument (reasoning chain):

E.g., for the answer "India", the justification is:

• According to the web site 'Inside Terrorism', the ANVC's headquarters has been in Garo Hills, India from the beginning of January, 1996 through today.

• If an organization's HQ is in place x, then there are members of that organization in place x.

- If someone is in place x, they are in every super-region of x.
- India borders Pakistan

Locations History		
Assets	Iustify Answer Visualize Visualize All Remember Email Results	
Status: Idle Message:		

"In what countries bordering Pakistan are there members of the ANVC?"

Сус	Analy	tic Environm	nent: The Lebanese Hezbollah Task	- 🗆 X
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•	India	hore	0.10	Pa		an	
		bore		Ia	NO	a	łн.,

Locations History		
Assets	Justify Answer Visualize Visualize All Remember Email Results	
Status: Idle Message:		

"Terrorist events with no civilian casualties?"

"Terrorist events with only American casualties?"

Source 1: Khobar Towers bombing had a total of 17 casualties. Source 2: 17 U.S. soldiers killed in Khobar Towers bombing. Even though they are expressed in formal logic, most axioms state *usuals*, not absolute truths.

Nonmonotonic (later information can show that something you earlier believed is false after all).

So the reasoning is default.

Argumentation: Gather up all the pro- and conarguments, and compare them. Check: for each *con* argument, is there a *pro* argument which is preferred?

To conclude **preferred**(A1,A2): Prefer short arguments to long ones; recent ones to stale ones; expert ones to novice ones; constructive ones to nonconstructive ones; formal ones to informal ones; etc.

What factors argue <for/against> the conclusion that <ETA> <performed> <the March 2004 Madrid attacks>?

For:

- ETA often executes attacks near national election
- ETA has performed multi-target coordinated attacks
- Over the past 30 years, ETA performed 75% of all terrorist attacks in Spain
- Over the past 30 years, 98% of all terrorist attacks in Spain were performed by Spain-based groups, and ETA is a Spain-based group.

Against:

-ETA warns (a few minutes ahead of time) of attacks that would result in a high number civilian casualties, to prevent them. There was no such warning prior to this attack. -ETA generally takes responsibility for its attacks, and it did not do so this time. -ETA has never been known to falsely deny responsibility for an attack, and it did deny responsibility for this attack.

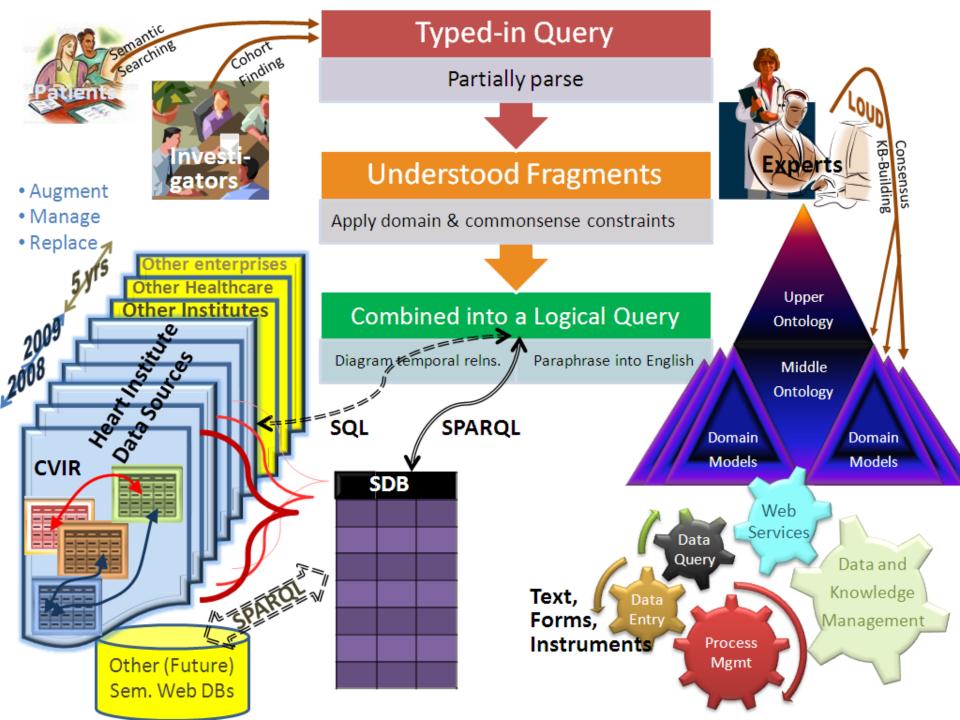
- Collaboration with the Cleveland Clinic; initial domains are cardiothoracic surgery, echocardio, cath, infec. disease,...
- Task: Originally: identify potential trial participants for cohort studies by querying patient info. Once it worked: Generate external outcomes reports; interlingua enabling less repetitive interdepartmental patient data entry system
- Main motivation: Query formation/asking cycle is 1 month
- Challenges:
 - Data from disparate sources must be combined
 - Doctors unfamiliar with underlying data schemata and with forming logic-based queries
 - Their typical query is 50-250 words long

CAE ABB: Medical Cohort Planning

Identify a patient population (a cohort) for a clinical trial

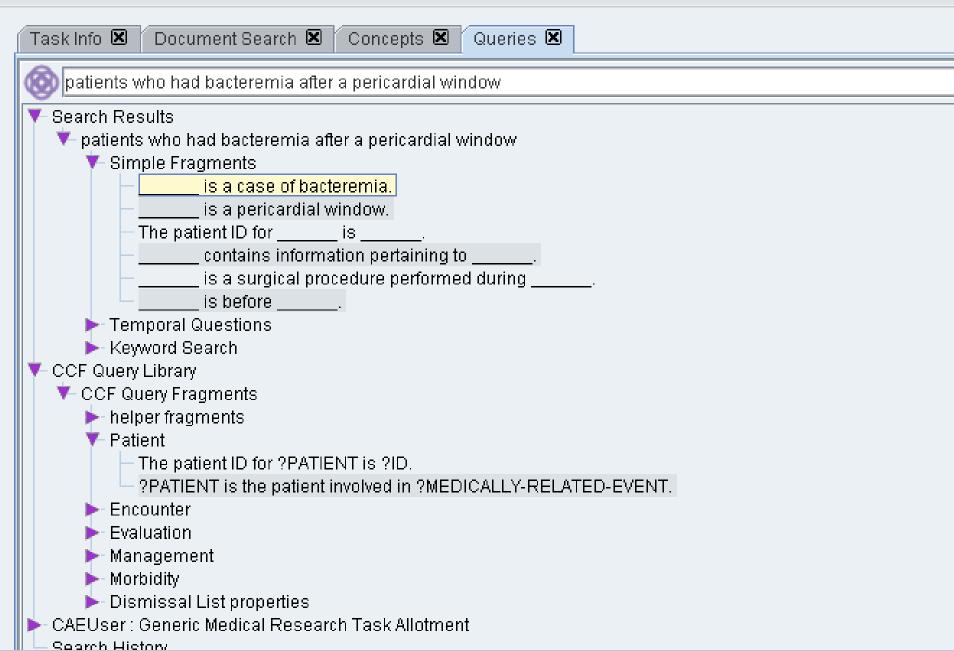
- <u>FIND</u> all native aortic valve replacements performed at CCF between January 1, 2000 and December 31, 2004 with a pre-operative diagnosis, as determined by echocardiogram, of moderately severe or severe aortic stenosis and moderate to severe left ventricular impairment.
- <u>INCLUDE</u> operations in which concomitant primary CABG or concomitant mitral or tricuspid valve repair was performed.
- <u>EXCLUDE</u> all patients with any prior valve repair or replacement; or with concomitant pulmonary valve repair; or with concomitant mitral, tricuspid, or pulmonary valve replacement; or with aortic regurgitation greater than moderate degree.

Typical Query for outcomes study 56,000 more examples: www.clinicaltrials.gov



🕌 Cyc Analytical Environment: Generic Medical Research Task Allotment

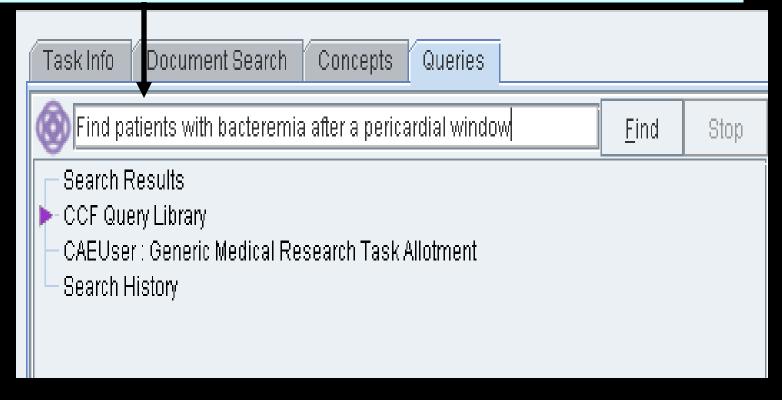
<u>File Edit Tools Window Help</u>



- Users will want to type unrestricted English queries.
 - Let them, but then partially parse the queries into fragments
 - The users say yes/no for the fragments (lesson: minimize the number of fragments presented, BUT it's worth guessing at "combines")
 - Use domain knowledge, general common sense knowledge, and models of the user and the user's context (and discourse pragmatics) to semantically combine those fragments into a meaningful utterance
- Users often err when writing spatiotemporal constraints
 - Palette of objects/events they can drag around and graphically arrange into a configuration; i.e., 2D space (vs. 1D text) repr. 3D space + time

Lessons from that application

Simple English sentences are typed into the query search box



Simple English sentences are typed into the query search box

Task Info	Document Search Concepts Queries			
🛞 Find pa	tients with bacteremia after a pericardial window	<u>F</u> ind	Stop	
🔻 Search F	Results			
🔰 🔻 Find	patients with bacteremia after a pericardial window			
📔 🔻 🗡 S	imple Questions			
	 The patient ID for PATIENT is 			
	PATIENT is the patient involved in and PATIENT is involved in	the patien	t	
	PATIENT is the patient involved in and is a	nericardia	1	
	window.			
	 is a case of bacteremia. 			
	involves the infection : bacteremia.			
	inafter			
	PATIENT s the patient involved in and is a	a surgical		
	procedure performed during	-		
contains information pertaining to				
Keyword Search				
CCF Query Library				
— CAEUser : Generic Nedical Research Task Allotment				
🛛 🖵 Search F	listory			

The system extracts entities, concepts, and relations from the text and instantiates them according to rules and constraints (argument types, disjointness, containment, inter-arg constraints, etc.) placed on the concepts and relations

Examples of Cyc knowledge used

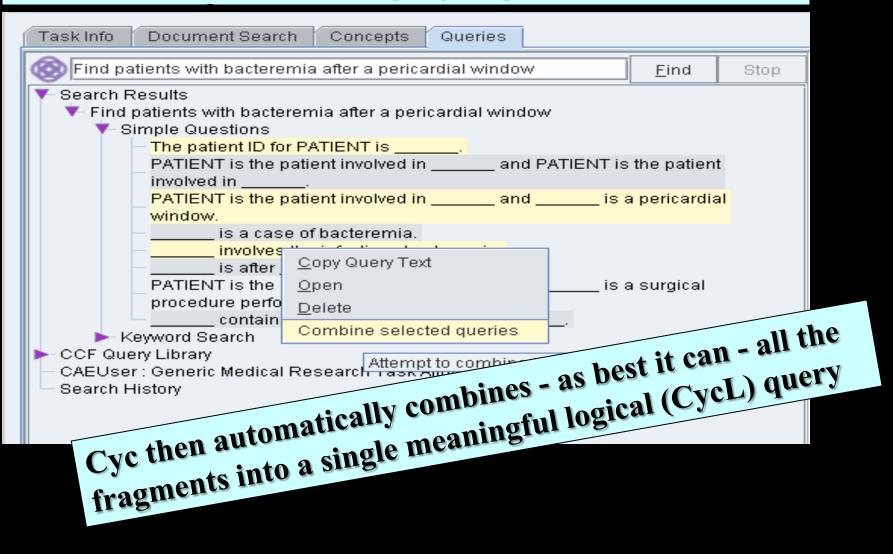
Ex. 1.: Whenever the doctor mentions a surgical procedure, suggest that they may want a fragment about the patient and the patient's ID (this is often a "column" in the final table of answers they are seeking.)

Ex. 2.: Whenever the doctor mentions an infectious organism, suggest that they may want a fragment about cases where patients have contracted that type of infection.

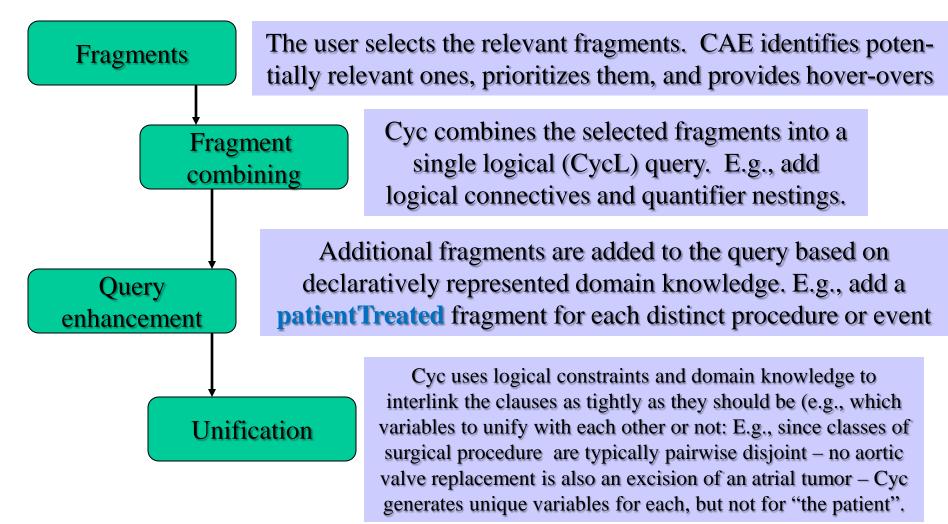
In CCFOntologyMt: (generateFormulasForElements-TermIsa CCFInfectionPathogenType (TheSet infectionCausedByOrganismType))

Cyc believes it to be appropriate to generate a formula for infectionCausedByOrganismType whenever an instance of CCFInfectionPathogenType is a member of the valid term set.

The user selects the relevant query fragments



Combining the selected fragments into a full query (in HOL – namely, CycL)



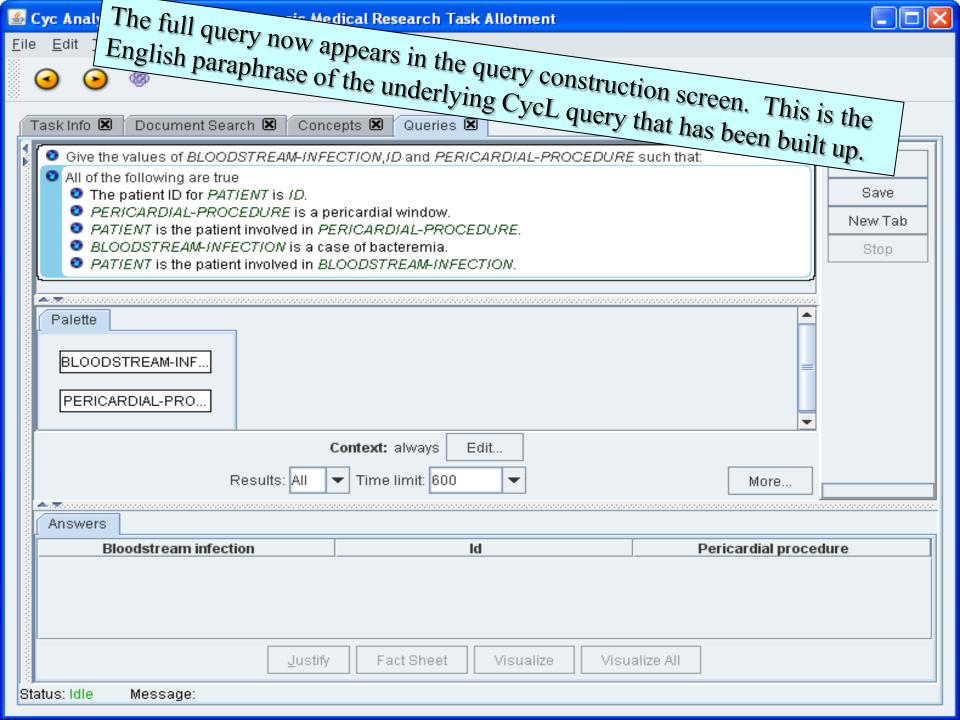
Examples of Cyc knowledge used

1784 pieces of pre-existing (prior to this project) Cyc KB knowledge used while handling a typical query. E.g.: Inferred Disjointness constraints:

(disjointWith PericardialWindow-SurgicalProcedure MedicalPatient)

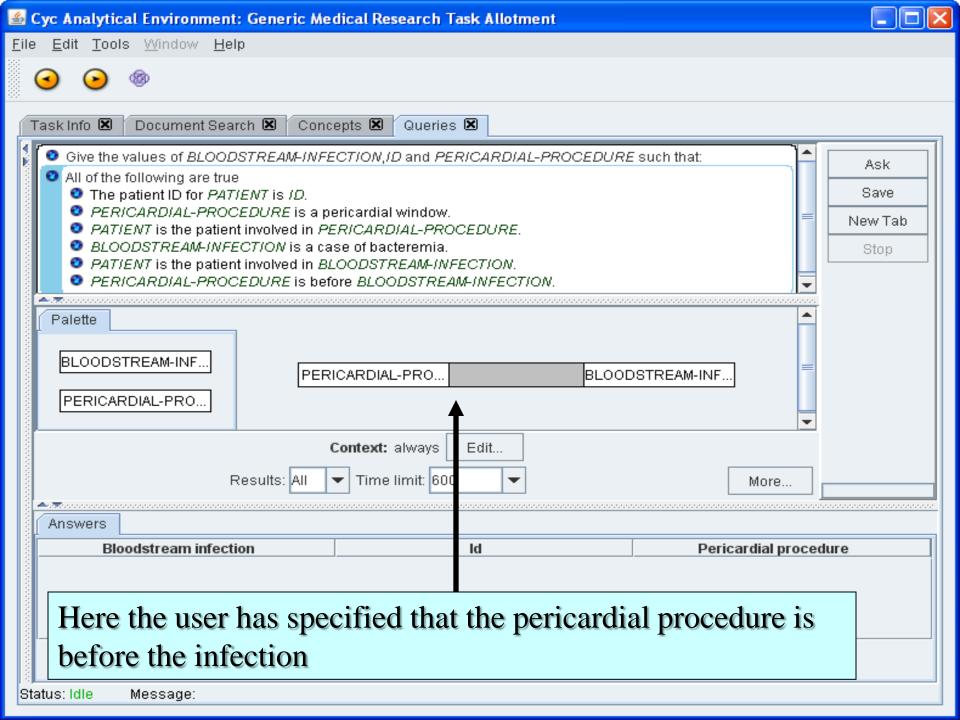
Justification: [we are "counting" each of these assertions, in the total:]

(genls PericardialWindow-SurgicalProcedure PericardialProcedure-Surgical) in UniversalVocabularyMt (genls PericardialProcedure-Surgical CardiacProcedure-Surgical) in UniversalVocabularyMt (genls CardiacProcedure-Surgical SurgicalProcedure) in UniversalVocabularyMt (genls SurgicalProcedure MedicalCareEvent) in BaseKB (genls MedicalCareEvent PhysicalSituation) in BaseKB (genls PhysicalSituation Situation-Localized) in UniversalVocabularyMt (genls Situation-Localized Situation) in UniversalVocabularyMt (disjointWith SpatialThing-NonSituational Situation) in BaseKB (genls EnduringThing-Localized SpatialThing-NonSituational) in UniversalVocabularyMt (genls Agent-NonGeographical EnduringThing-Localized) in UniversalVocabularyMt (genls PerceptualAgent Agent-NonGeographical) in UniversalVocabularyMt (genls PerceptualAgent-Embodied EmbodiedAgent) in UniversalVocabularyMt (genls Animal PerceptualAgent-Embodied) in UniversalVocabularyMt (genls MedicalPatient Animal) in UniversalVocabularyMt



🚳 Cyc Analytical Environment: Generic Medical Research Task Allotment			
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 Solution 			
Task Info 🗷 Document Search 🗷 Concepts 🗷 Queries 🗷			
Give the values of BLOODSTREAM-INFECTION, ID and PERICARDIAL-PROCEDURE such that:	Ask		
 All of the following are true The patient ID for PATIENT is ID. 	Save		
PERICARDIAL-PROCEDURE is a pericardial window. ADJ 10 AD	New Tab		
 PATIENT is the patient involved in PERICARDIAL-PROCEDURE. BLOODSTREAM-INFECTION is a case of bacteremia. 	Stop		
PATIENT is the patient involved in BLOODSTREAM-INFECTION.			
Palette			
BLOODSTREAM-INF			
PERICARDIAL-PRO			
Context: always Edit			
Results: All 👻 Time limit: 600 💌 More			
Answers			
Bloodstream infection Id Pericardial proce	dure		
Towns, that can be town availy availified and referenced have			
Terms that can be temporally qualified are referenced here.			
Justify Fact Sheet Visualize Visualize All			
Status: Idle Message:			

🕌 Cyc Analytical Environmer	nt: Generic Medical Research Task Allotment			
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	DSTREAM-INFECTION,ID and PERICARDIAL-PROCEDURE such that:	Ask		
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 PERICARDIAL-PROCEDURE is a pericardial window. PATIENT is the patient involved in PERICARDIAL-PROCEDURE. 				
BLOODSTREAM-INF	FECTION is a case of bacteremia.	Stop		
PATIENT is the patie	ent involved in BLOODSTREAM-INFECTION.			
Palette				
BLOODSTREAM-INF		=		
PERICARDIAL-PRO	BLOODSTREAM-INF			
		-		
	Context: always Edit			
	Results: All 🔻 Time limit: 600 🔽 More]		
Answers				
Bloodstream infec	ction Id Pericardial proc	cedure		
The user can drag and drop these to form sequences				
	Justify Fact Sheet Visualize Visualize All			
Status: Idle Message:				



🕌 Cyc Analytical Environment: Generic Medical Research Task Allotment			
<u>F</u> ile <u>E</u> dit <u>T</u> ools <u>W</u> indow <u>H</u> elp			
Task Info 🗷 Document Search 🗷 Concepts 🗷 Queries 🗷			
Give the values of BLOODSTREAM-INFECTION, ID and PERICARDIAL-PROCEDURE such that:	Ask		
 All of the following are true The patient ID for PATIENT is ID. 	Save		
 PERICARDIAL-PROCEDURE is a pericardial window. PATIENT is the patient involved in PERICARDIAL-PROCEDURE. 	New Tab		
 BLOODSTREAM-INFECTION is a case of bacteremia. PATIENT is the patient involved in BLOODSTREAM-INFECTION. 	Stop		
PATIENT Is the patient involved in BLOODST REAM-INFECTION. PERICARDIAL-PROCEDURE is before BLOODSTREAM-INFECTION.			
Palette			
BLOODSTREAM-INF PERICARDIAL-PRO BLOODSTREAM-INF			
PERICARDIAL-PRO			
Context: always Edit			
Results: All Time limit: 600 More			
Answers			
Bloodstream infection Id Pericardial proced	lure		
At that point, the constraint is automatically added to the query			
Justify Fact Sheet Visualize Visualize All			
Status: Idle Message:			

🕌 Cyc Analytical Environment: Generic Medical Research Task Allotment			
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Task Info 🗷 Document Search 🗷 Concepts 🗷 Queries 🗷			
Give the values of BLOODSTREAM-INFECTION, ID and PERICARDIAL-PROCEDURE such that:	Ask		
 All of the following are true The patient ID for PATIENT is ID. 	Save		
PERICARDIAL-PROCEDURE is a pericardial window.			
 PATIENT is the patient involved in PERICARDIAL-PROCEDURE. BLOODSTREAM-INFECTION is a case of bacteremia. 	Stop		
 PATIENT is the patient involved in BLOODSTREAM-INFECTION. PERICARDIAL-PROCEDURE is before BLOODSTREAM-INFECTION. 			
BLOODSTREAM-INFECTION happened between 1999 and 2006.]		
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Context: always Edit			
Results: All 💌 Time limit: 600 💌 More			
Answers			
The user can also specify a range of times that the condition			
or procedure must occur within.			
Status: Idle Message:			

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Give the values of BLOODSTREAM-INFECTION, ID and PERICARDIAL-PROCEDURE such that:	Ask		
 All of the following are true The patient ID for PATIENT is ID. 	Save		
PERICARDIAL-PROCEDURE is a pericardial window. ATTENT is the patient involved in DERICARDIAL DEPENDENCE.	New Tab		
 PATIENT is the patient involved in PERICARDIAL-PROCEDURE. BLOODSTREAM-INFECTION is a case of bacteremia. 	Stop		
 PATIENT is the patient involved in BLOODSTREAM-INFECTION. PERICARDIAL-PROCEDURE is before BLOODSTREAM-INFECTION. 			
 BLOODSTREAM-INFECTION happened between 1999 and 2006. 			
Palette			
BLOODSTREAM-INF			
PERICARDIAL-PRO BLOODSTREAM-INF			
PERICARDIAL-PRO			
Context: always Edit			
Results: All Time limit: 600 More			
Answers			
Bloodstream infection Id Pericardial proce	dure		
Here the user has stated that the infection must have			
Occurred between 1999 and 2006.			

Answers (4)			
Id		Infection	Pericardial Procedure
PATIENT DATA REDACTED		the case of bacteremia of the patient with ID 31077290 on April 24, 2001	the pericardial window of the patient with ID 31077290 starting at 14:38:00, April 17, 2001
		the case of bacteremia of the patient with ID 62034912 on December 10, 2004	the pericardial window of the patient with ID 62034912 starting at 13:40:00, November 9, 2004
		the case of bacteremia of the patient with ID 24472418 on June 23, 1999	the pericardial window of the patient with ID 24472418 starting at 16:05:00, December 30, 1998
		the case of bacteremia of the patient with ID 27843204 on March 23, 1999	the pericardial window of the patient with ID 27843204 starting at 15:28:00, March 23, 1999
Justify Fact Sheet Visualize Visualize All			

The answers in each column (except for the already-verystraightforward Patient ID number column) are paraphrased at ~0 cost using information contained in the justification for the query

CycL \rightarrow SPARQL/SQL

 The user has produced a coherent query, paraphrased to them in English but underlying that is a full formal logic (CycL) query

 It often leads to dozens or hundreds of SPARQL and/or SQL queries (e.g., a single logical term might be indicated in multiple ways in multiple information sources)

 Logical properties of the vocabulary enable various simplifications of the query; i.e., sometimes Cyc can prove that some branches of the query will be unproductive

• The query is ordered according to cardinality and connectedness properties; i.e., Cyc applies metarules to optimize the query (or set of queries), esp. SPARQL ones

• SKSI (Semantic Knowledge Source Integration) modules translate the CycL into strings, URIs, and RDF patterns appropriate for delivery to the SPARQL/SQL service

CycL → SPARQL transformation

Example Query

What patients had a CCF tumor excision during the years 1998 through 2005?

(and

(temporallyBetween-Inclusive ?PRO (YearFn 1998) (YearFn 2005)))
(isa ?PRO TumorExcision)
(cCFCCFID ?PAT ?ID)
(patientTreated ?PRO ?PAT)
(cCFEventOccursAt ?PRO ClevelandClinicMainCampus))))))

CycL → SPARQL transformation

In transforming the query the system appeals to contextdependent transformation rules, such as these:

(implies

(and (rdf-type ?PATIENT MedicalPatient) (rdf-type ?PRO ?TYPE) (genls ?TYPE CCFThingWithIndirectTemporalData) (cCF-contains ?PTREC ?PATIENT) (cCF-contains ?PTREC ?EVT) (cCF-contains ?EVT ?PRO)) (patientTreated ?PRO ?PATIENT))

(implies

(and

(genls ?TYPE CCFThingWithIndirectTemporalData) (rdf-type ?PRO ?TYPE) (cCFEventPlace ?EVT ?LOC) (cCF-contains ?EVT ?PRO)) (cCFEventOccursAt ?PRO ?LOC))

(implies (and (rdf-type ?TEMP-DATA CCFEventDate) (cCFDateTimeMax ?TEMP-DATA ?MAX) (startsAfterStartingOf ?MAX ?EARLY) (cCF-contains ?EVT ?TEMP-DATA) (cCF-contains ?EVT ?SUB-EVT) (rdf-type ?SUB-EVT ?TYPE) (genls ?TYPE CCFThingWithIndirectTemporalData) (endsAfterEndingOf ?LATE ?MAX)) (temporallyBetween-Inclusive ?SUB-EVT ?EARLY ?LATE))

Even a tiny CCF query requires *thousands* of inferences involving extant (pre-project-start) Cyc assertions

"What patients had bacteremia after a pericardial window?"

Fragments get chosen; most of them have blanks to fill in. Each blank is converted to a logical *variable*. Which blanks might/must/mustn't be unified (same variable)?

- s is a CCF patient
- t had an infection u .
- *v* was a bacteremia infection
- w had a procedure x.
- y was a pericardial window

Prior to the CCF project, Cyc's KB had184 specializations of MedicalCareEvent:

MedicalCareEvent Ablation Ligation **CoronaryArteryBypassGraft Biopsy-SurgicalProcedure** TrephiningSomeone Prostatectomy RoboticSurgery **OutpatientSurgery** InpatientSurgery LiposuctionSurgery **RemovalOfUniqueBodyPart** Appendectomy

...

Tonsillectomy GumSurgery SurgicalTreatment TransplantSurgery HeartTransplantSurgery GeneralSurgery MajorSurgery **OpenHeartSurgery** RootCanalSurgery VaccinationEvent **BoosterVaccinationEvent** Anthrax Military Vaccination Sc ript MedicalTesting

....

Prior to the CCF project, Cyc's KB had 350+ specializations of AilmentCondition:

....

AttentionDeficitDisorder **Glaucoma SpinalStenosis SleepDeprivation Ache-**AilmentCondition Migraine Hemorrhaging-TheCondition Jaundice ParasiticAilment **BacillaryAngiomatosis Cryptosporidiosis Rickettsiosis** EpidemicTyphus-NAmerica ArthropodInfestation ExternalArthropodInfestation InternalArthropodInfestation **Trichinosis Schistosomiasis** Ascariasis BladderFlukeInfestation

Atherosclerosis MultiplePersonalityDisorder Adenomyosis Scabies AmyotrophicLateralSclerosis Scoliosis Hypoglycemia TemproMandibularJointSyndr ome AcetylcholinePoisoning CadmiumPoisoning CarbonMonoxidePoisoning FoodborneBotulism InhalationalBotulism WoundBotulism InfantBotulism Endometriosis Neuralgia Sciatica **Diverticulitis Gout** MacularDegeneration

 $\mathbf{x}_{i} \in \mathbf{x}_{i}$

Prior to the CCF project, Cyc's KB had 200+ specializations of Bacterium:

....

StreptococcusPneumoniae StreptococcusPyogenes **Bacillaceae-Family Bacillus-Genus BacillusCereus-Species** Monotrichous **Bacterium-Monotrichous** Peritrichous **Bacterium-Peritrichous** Amphitrichous **Bacterium-Amphitrichous Tenericutes-Division** Mollicutes-Class Anaeroplasmataceae-Family Asteroplasma-Genus Acholeplasmatales-Order Acholeplasmataceae-Family Acholeplasma-Genus Phytoplasma-Genus Eperythrozoon-Genus Mycoplasmatales-Order Mycoplasmataceae-Family Mycoplasma-Genus MycoplasmaPneumoniae-Species Spirillales-Order Vibrionaceae-Family Vibrio-Genus VibrioCholerae-Species

. . .

Prior to the CCF project, Cyc's KB had hundreds of of pre-existing relevant relationships

General Role Predicates:

objectActedOn eventOccursAt dateOfEvent objectPlaced objectRemoved deviceUsed

....

Medical domain specific relations:

infectionCausedByOrganism infectingPathogen patientTreated deviceTypeTreatsConditionType causeOfDeathTypeOfType formOfDisease ailmentTypeAffects ailmentEpidemicType ailmentAcquiredBy ailmentTypicallyAcquiredBy indicatedDrug mortalityRiskForCondition survivalRate riskOfInfectionFromTypeToType

"Slurp" the CCF ontology into Cyc

- Start with (pre-)existing Cyc medical ontology
- Import CCF specific medical domain ontology
 - OWL files generate new collections and predicates
 - Controlled vocabulary lists generate new (mostly) collections
 - 90% of the import was automated; now over 95%
- Merge the newly created terms onto existing terms when possible
 and assert mappings (ptrec:Patient maps to pre-existing MedicalPatient)
- Add required genls, isa, and other basic assertions to integrate the inported ontology into the Cyc ontology

"Slurp" the CCF ontology into Cyc

Establish bridging (translation) rules

 Define rules that allow users to associate patients, dates, locations, etc. with the various events – e.g. define patientTreated as a relationship between a medical event and a patient.

 Define rules that allow users to easily express complicated logical conditions – e.g. the defining rules for PrimarySurgery, isolatedProcedureOfType, concomitantProcedures, etc.

 Define concise vocabulary for constructions that are complicated or difficult to express – e.g. "aortic valve replacement' is represented as a single non-atomic term. This allows the user to specify this very common procedure with a single fragment instead of three distinct fragments in the CCF ontology (which in turn came about due to there not being an explicit functional term composition construct in the CCF representation). Use of Cyc Knowledge In answering *ad hoc medical* queries by clinical researchers at CCF

- Converting the NL query → Understood "fragments"
- Combining the selected fragments into a full query
- Converting the query from HOL form (CycL) into one or more SPARQL and/or SQL queries and sending them to the service
 -- for efficiency of running the SPARQL/SQL queries, making judicious choices of, e.g., clause ordering
- Parse more complex fragments (esp. temporal ones)
- Persistent queries (triggers/schedules and actions)
- Ontologize new domains and align to new data sources
- Extend downward (patient data entry)
- Extend outward (generate internal and 3rd party external reports)

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	30 days after a history and physical with a diagnosis of valve endocarditis		
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	Supplemental Fragments	#\$Animal, is an instance of #\$	\$Mec	dicalPatient during TREATMENT (an instance of
	CCF Query Library	#\$MedicalTreatmentEvent) an	id is	treated by that TREATMENT.
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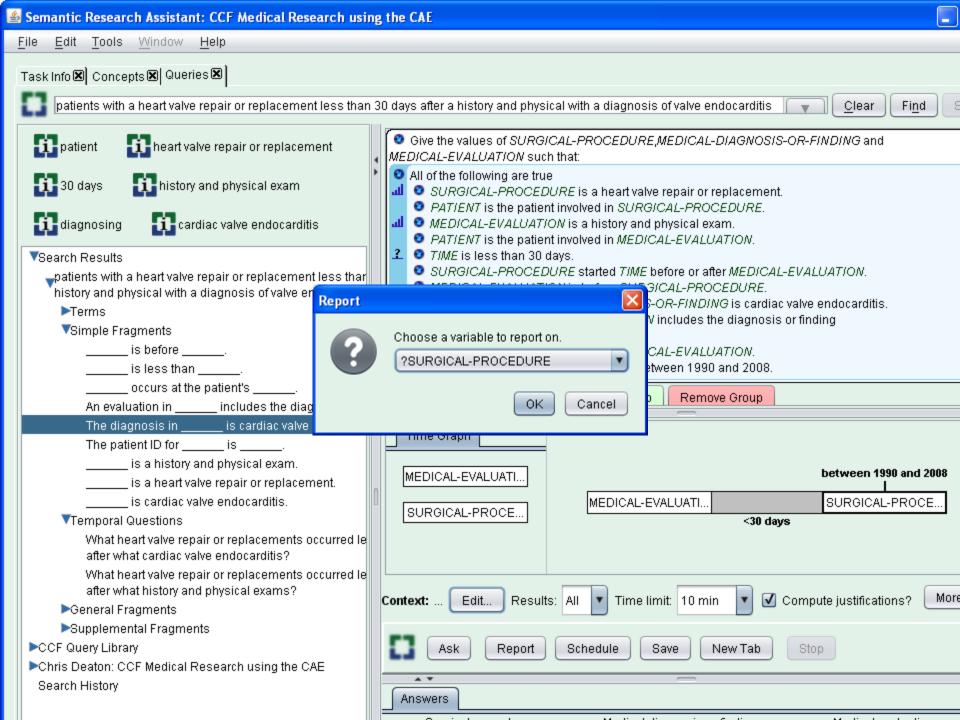
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	MEDICAL-EVALUATION is a history and physical exam.
1	PATIENT is the patient involved in MEDICAL-EVALUATION.
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Use of Cyc Knowledge In answering *ad hoc medical* queries by clinical researchers at CCF

- Converting the NL query → Understood "fragments"
- Combining the selected fragments into a full query
- Converting the query from HOL form (CycL) into one or more SPARQL queries and sending them to the service
 - -- for efficiency of running the SPARQL queries, making judicious choices of, e.g., clause ordering
- Parse more complex fragments (esp. temporal ones)
- Persistent queries (triggers/schedules and actions)
- Ontologize new domains and align to new data sources
- Extend downward (patient data entry)
- Extend outward (generate internal and 3rd party external reports)

Lessons from that application

- Users will want to type unrestricted English queries.
 - Let them, but then partially parse the queries into fragments
 - The users say yes/no for the fragments (lesson: minimize the number of fragments presented, BUT it's worth guessing at "combines")
 - Use domain knowledge, general common sense knowledge, and models of the user and the user's context (and discourse pragmatics) to semantically combine those fragments into a meaningful utterance
- Users often err when writing spatiotemporal constraints
 - Palette of objects/events they can drag around and graphically arrange into a configuration; i.e., 2D space (vs. 1D text) repr. 3D space + time

- Application provider (hospital) cares a lot about validation
 - Verifying that the results the Cyc-based CAE system obtained matched precisely the ones returned by their previous system, which involved multiple people (user + intermediary + DBA) and multiple emails.
 - The good news: high level of conformance (98%)
 - The interesting news: each discrepancy was interesting, no-fault, generally revealing some hitherto unsuspected ambiguity in terms
 - E.g., an "isolated" procedure; "insertion of an artificial mitral valve"; ...
- Why it may be useful to stream answers rather than waiting until the query runs to completion:
 - Even if the overall time to run a query to completion is increased 25%
 - First few answers reveal that the user mis-stated/forgot something

Lessons from that application

diabetes, body mass index of 39.5, NYHA function class III, mitral valve regurgitation grade (MVRG) of 2+, and no aortic valve regurgitation (AVR is assigned to CABG surgery. RF+Cyc is consulted and the RF (randon forest statistical reasoning) component, having been trained on a large database identifies CARC along as the most likely treatment option, citin

understand and know enough to calculate an answer

or else, if that fails,

partial understanding/knowledge → semantic search or else, if that fails,

the final fallback: syntactic search (e.g., Google)

surgery.

In this setting, RF+Cyc, if consulted, could have alerted the heart team to additional data that might have swayed their decision, thus potentially saving a life. RF+Cyc would have noted that while an MVRG of 3+ is consistent with CABG+MVA, the odds favoring CABG only marginally decrease from 2.6:1 to 1.7:1 when MVRG is upstaged for this patient from 2+ to 3+, and that surgery under CABG alone offers a 20% increase is median survival compared to CABG+MVA. RF+Cyc could further argue that intraoperative MVRG can falsely appear to be upstaged due to altered hemodynamics in anesthetized patients. A Cyc-assisted semantic search of the recent literature reveals that transesophageal transthoracic echocardiograms (TTE) more reliably reflect the degree of mitra requiration than TEE. That (+co-morbidities) argues for just CABG.

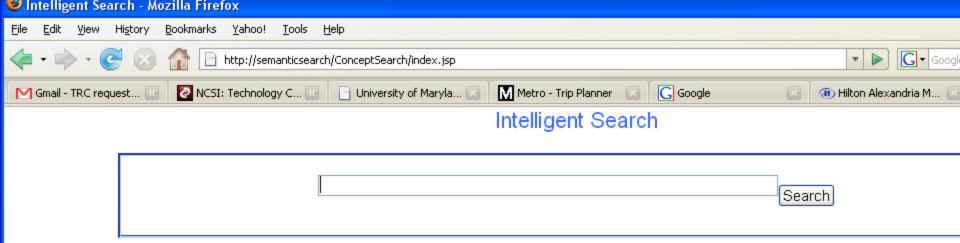
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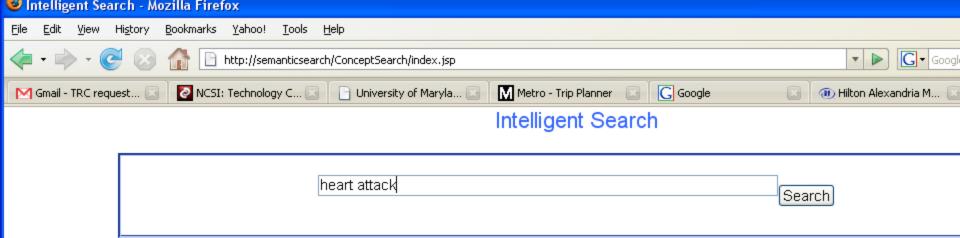
understand and know enough to calculate an answer or else, if that fails,

partial understanding/knowledge → semantic search > fewer false positives (flesh eating bacteria attack heart) > fewer false negatives (Myocardial Infarctions, CABGs,...) > a little extra info to include (Gillinov graphs) or exclude or else, if that fails,

the final fallback: syntactic search (e.g., Google)

consistent with CABG+MVA, the odds favoring CABG only marginally decrease from 2.6:1 to 1.7:1 when MVRG is upstaged for this patient from 2+ to 3+, and that surgery under CABG alone offers a 20% increase in median survival compared to CABG+MVA. RF+Cyc could further argue that intraoperative MVRG can falsely appear to be upstaged due to altered hemodynamics in anesthetized patients. A Cyc-assisted semantic search of the recent literature reveals that transesophageal transthoracic echocardiograms (TTE) more reliably reflect the degree of mitra requiring than TEE. That (+co-morbidities) argues for just CABG.





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Semantic Search Results

Joseph F. Sabik III, M.D.

Joseph F. Sabik III, M.D. Specialties: Adult cardiac surgery, valvular heart disease, coronary artery disease, thoracic aortic surgery, minimally invasiv off-pump coronary artery bypass surgery, mitral and aortic valve repair and http://tomcat/html-content/sabik ..html (cached)

Jose L. Navia

Jose L. Navia Specialties: Adult acquired heart disease, minimally invasive robotic and video-assisted cardiac surgery, off-pump coronary artery byp invasive mitral and aortic valve surgery, heart transplantation,

http://tomcat/html-content/navia ..html (cached)

Gonzalo Gonzalez-Stawinski, M.D.

Gonzalo Gonzalez-Stawinski, M.D. Specialties: Adult cardiac surgery, heart and lung transplantation, reoperations, coronary artery bypass graft surgery embolectomies, and valve surgery. Medical Degree:

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A. Marc Gillinov, M.D.

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Coronary Disease

0% Mortality for reoperative CABG in 2006. PRIMARY ISOLATED CABG Primary isolated CABG refers to a patient's first coronary artery bypass sur without any other procedure. In 2006, Cleveland Clinic surgeons performed 538 primary isolated CABG http://tomcat/html-content/Coronary_Disease_.html (cached)

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coronary artery bypass graft standard treatment for heart attacks

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Minimally Invasive

Isolated valve procedure CABG + valve procedure valve procedure + other cardiac procedure other cardiac procedure CABG + other http://tomcat/html-content/Minimally_Invasive_.html (cached)

Cardiomyopathy

Septal Myectomy + CABG Septal Myectomy + Other Septal Myectomy http://tomcat/html-content/Cardiomyopathy_.html (cached)

Valve Disease

Isolated MV MV Repair or Replace + CABG MV Repair or Replace + Other AV Repair or Replace + Other AV Repair or Replace + CABG Isolated...v repair/replacement with CABG, valve repair/replacement with aorta surgery, and valve repair/replacement http://tomcat/html-content/Valve_Disease_.html (cached)

Text Search Results

Lung Transplant

. DISTRIBUTION OF LUNG TRANSPLANT PROCEDURES Heart - Lung Transplant... 2006 Distribution by State, heart transplants and lung transplar http://tomcat/html-content/Lung_Transplant_.html (cached)

Tomislav Mihaljevic, M.D.

: Minimally invasive cardiac surgery, robotic cardiac surgery, image-guided cardiac surgery, heart failure, mitral and aortic valve repair and replacent disease, beating heart revascularization, Maze procedure, heart and lung transplantation, ventricular assist devices, and adult congenital http://tomcat/html-content/mihaljevic .html (cached)

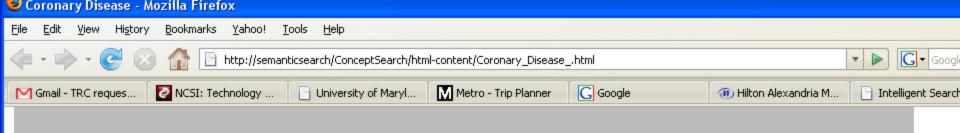
Heart Transplant

1,285 Heart transplants performed at Cleveland Clinic since inceptation of the Cardiac Transplant Program HEART TRANSPLANT VOLUME Clevela 2006, 76 heart transplants were performed (including two heart-lung and one heart-liver http://tomcat/html-content/Heart_Transplant_.html (ached)

Nicholas G. Smedira, M.D.

Nicholas G. Smedira, M.D. Specialties: Heart and heart-lung transplantation, ventricular assist devices, ECMO, heart failure surgery, aortic and mitra replacement, off-pump coronary artery bypass grafting, myectomy, reoperations http://tomcat/html-content/smedira_.html (cached)

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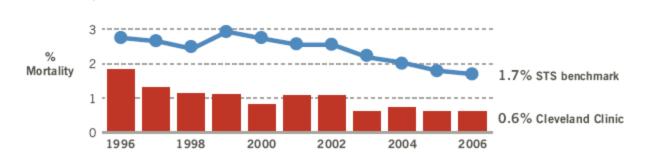
Coronary Disease

PRIMARY ISOLATED CABG

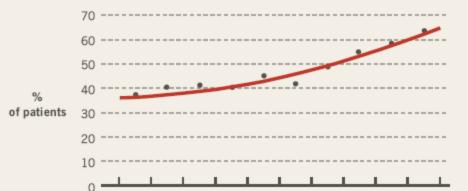
Mortality for reoperative CABG in 2006.

0%

Primary isolated CABG refers to a patient's first coronary artery bypass surgery when performed without any other procedure. In 2006, Cleveland Clinic surgeons performed 538 primary isolated CABG procedures. Mortality was 0.6%, well below the national benchmark established by The Society of Thoracic Surgeonsof Thoracic Surgeonsof (STS) national database.



Left Main Trunk Stenosis



Rising occurrence of left main trunk stenosis demonstrates increasing acuity of patients treated for coronary disease.



A. Marc Gillinov, M.D.

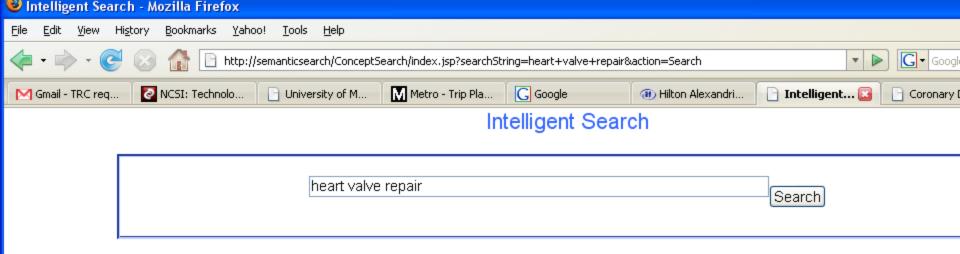
Specialties: Minimally invasive mitral valve, aortic valve, and tricuspid valve surgery; mitral valve repair, surgical treatment and minimally invasive surgery for atrial fibrillation; off-pump coronary artery bypass surgery; and high-risk mitral valve surgery.

Medical Degree: Johns Hopkins University School of Medicine, Baltimore, Maryland

Special Training: Johns Hopkins University School of Medicine, Baltimore, Maryland

A native Clevelander, Dr. Gillinov spent the summers of 1978 to 1980 dividing his time between working at Cleveland Clinic and playing tennis. He still enjoys both activities.





Semantic Search Results

A. Marc Gillinov, M.D.

A. Marc Gillinov, M.D. Specialties: Minimally invasive mitral valve, aortic valve, and tricuspid valve surgery; mitral valve repair, surgical... Gillinov, M.E heart-valve repair operations at

http://tomcat/html-content/gillinov_GillinovHeartValveRepair.html (cached)

Valve Disease

AV Repair or Replace + Other AV Repair or Replace + CABG Isolated AV Repair or Replace Aortic Valve Procedures In 2006, 89% of our... AV Spair Replacements AV = Aortic http://tomcat/html-content/Valve Disease .html (cached)

Nicholas G. Smedira, M.D.

Nicholas G. Smedira, M.D. Specialties: Heart and heart-lung transplantation, ventricular assist devices, ECMO, heart failure surgery, aortic and mitra replacement, off-pump coronary artery bypass grafting, myectomy, reoperations, <u>http://tomcat/html-content/smedira_.html (cached)</u>

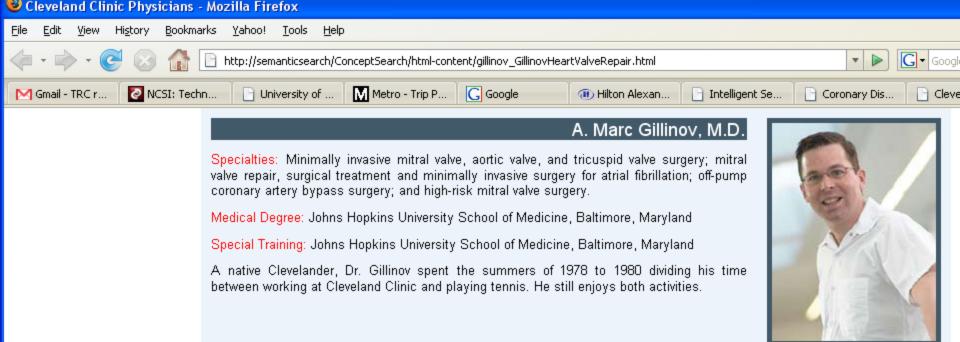
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Joseph F. Sabik III, M.D. Specialties: Adult cardiac surgery, valvular heart disease, coronary artery disease, thoracic aortic surgery, minimally invasive off-pump coronary artery bypass surgery, mitral and aortic valve repair and http://tomcat/html-content/sabik, html (cached)

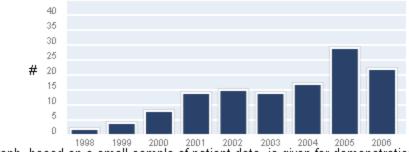
Eric E. Roselli, M.D.

Eric E. Roselli, M.D. Specialties: Adult cardiac surgery, thoracic aortic surgery, endovascular approaches to cardiothoracic diseases, minimally invas replacement, high-risk valve surgery, peripheral vascular surgery,

http://tomcat/html-content/roselli ..html (cached)



Gillinov, M.D. has performed 125 heart-valve repair operations at the Cleveland Clinic Foundation since 1998.



This graph, based on a small sample of patient data, is given for demonstration purposes only.

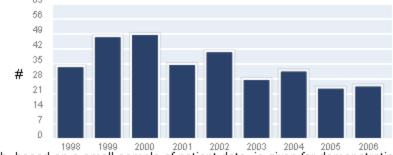


Coronary Artery Procedure Volumes for Gillinov, M.D.

0% Mortality for reoperative

CABG in 2006.

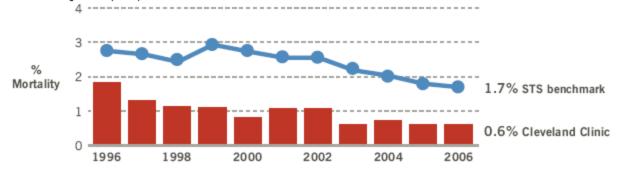
Gillinov, M.D. has performed 316 coronary artery operations at the Cleveland Clinic Foundation since 1998.



This graph, based on a small sample of patient data, is given for demonstration purposes only.

PRIMARY ISOLATED CABG

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Left Main Trunk Stenosis

diabetes, body mass index of 39.5, NYHA function class III, mitral valve regurgitation grade (MVRG) of 2+, and no aortic valve regurgitation (AVR is assigned to CABG surgery. RF+Cyc is consulted and the RF (randon forest statistical reasoning) component, having been trained on a large database identifies CARC along as the most likely treatment ention, citin

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CYC introduced the process of large-scale ontological engineering in 1984. We learned a large number of useful lessons during those 25 years (1000 person-years = 2 million person-hours building the ontology)

Errors in representation, in methodology, in inference, in scale.

Traps we fell into, decisions we had to back out of, half-finished off-ramps to nowhere.



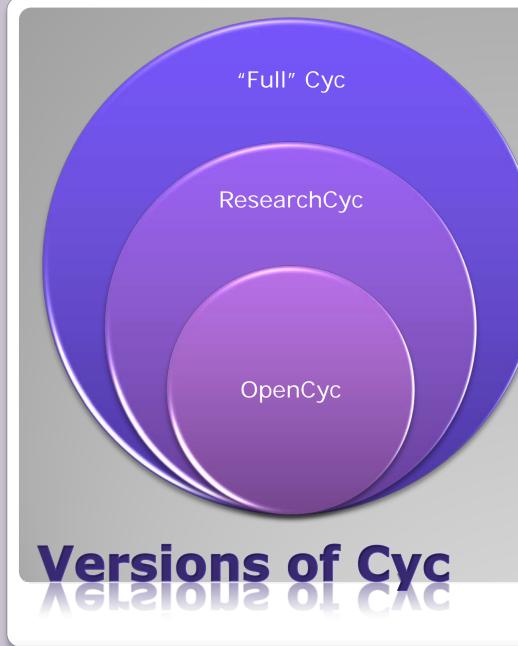
"Full" Cyc

ResearchCyc

Versions of Cyc

ResearchCyc

- Complete Cyc ontology and KB
- Cyc inference engine
- Natural language recognition and generation
- Ability to connect to external data sources
- No-cost license available for research-only purposes



OpenCyc

- Complete Cyc ontology and KB
 - All Cyc concepts and comments
 - Taxonomic relations
 - Constraints on relations
 - English for concepts
- Cyc inference engine
- Unrestricted usage (research/commercial)
- OWL version available
- Available at OpenCyc.org or SourceForge

OpenCyc

- Access or download via <u>www.opencyc.org</u>
- Available for Windows XP and Linux
- New OWL file will be available shortly

ResearchCyc

- License available at <u>researchcyc.cyc.com</u>
- Java version available
- Requires:
 - JRE
 - 64-bit OS
 - 8GB RAM (recommended)

Acquiring and Using Cyc