

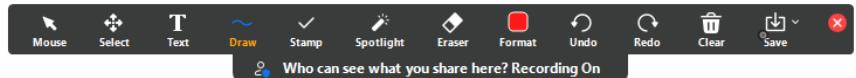
## Key Points



- Normal forms: definitions, know how to convert, applying basic laws and inference rules
- Theorem proving: basic approaches. forward and backward chaining concept, and resolution.
- know how to do resolution in propositional logic
- limitation of propositional logic

midterm  
exam range: up till here.  
S1: deo3-logic.

47



## Key Points



- Normal forms: definitions, know how to convert, applying basic laws and inference rules
- Theorem proving: basic approaches. forward and backward chaining concept, and resolution.
- know how to do resolution in propositional logic
- limitation of propositional logic

midterm  
exam range: up till here.  
S1: de03-logic.  
p47

Until yeah, he's 47 not 97 my poor hand

47

F.O.L

① Nat. Lang

→ F.DL

② Standard form

(a) prenex

(b) CNF  
Skolem

③ Resolution

↑ Unification  
 $\neg P(x) \vee P(f(y))$

## Unification Algorithm

1. If necessary, **rename** variables so that no pair  $(E_i, E_j)$  from different clauses has any variables in common.
2. Set  $k = 0, W_k = W, \sigma_k = \epsilon$  (empty substitution).
3. If  $W_k$  is a singleton (contains only one expr), stop;  $\sigma_k$  is a most general unifier for  $W$ . Otherwise, let  $D_k$  be the disagreement set for  $W_k$ .
4. If there exist elements  $v_k$  and  $t_k$  in  $D_k$  such that  $v_k$  is a variable that does not occur in term  $t_k$ , go to step 5. Otherwise, stop;  $W$  is not unifiable.
5. Let  $\sigma_{k+1} = \sigma_k \circ \{v_k/t_k\}$  and  $W_{k+1} = W_k \{v_k/t_k\}$ .

So we are done up to that point and we're going to look at the resolution step and actual algorithm

103



Choe, Yoonsuck

Resolution step.  
Substitution  
(b) Resolution step.  
(c) algorithm.



$$D = \{x, y\}$$

(case 1:  $v=x, t=y$ ) both are ok  
 (case 2:  $v=y, t=x$ )

Step 1

①  $D_1 = \{x, g(y)\}$

②  $v=x, t=g(y)$

$v=g(y) \cancel{t=x}$

⑤  $\theta = \{x/g(y)\}$

③  $\{ \dots \} \rightarrow \theta$

W(θ)

$W = \{ \begin{array}{l} P(x, f(x), z) \text{ vs. } \\ P(g(y), f(g(a)), y) \end{array} \}$

Unification Example

Step 2

1.  $\{x/g(y)\}:$   
 $P(g(y), f(g(y)), z)$   
 $P(g(y), f(g(a)), y)$
2.  $\{y/a\}:$   
 $P(g(a), f(g(a)), z)$   
 $P(g(a), f(g(a)), a)$
3.  $\{z/a\}:$   
 $P(g(a), f(g(a)), a)$

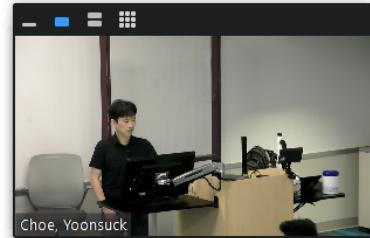
Unifier:  $\{x/g(a), y/a, z/a\}$

$= W \quad \text{① } D_2 = \{y, a\}$

②  $v=y, t=a$

$\theta \rightarrow \{y/a\} \rightarrow \theta$

③  $W \theta$



$$D = \{x, y\}$$

(case 1:  $v=x, t=y$ ) both are ok  
 (case 2:  $v=y, t=x$ )

Step 1

- ①  $D_1 = \{x, g(y)\}$
- ②  $v=x, t=g(y)$

$v=g(y) \cancel{t=x}$

~~③  $A = \{x/g(y)\}$~~

~~④  $\{ \} \dashv \dashv \{ \}$~~

$W(5)$

$$W = \{ \begin{array}{l} P(x, f(x), z) \text{ vs. } \\ P(g(y), f(g(a)), y) \end{array} \}$$

Unification Example

Step 2

1.  $\{x/g(y)\}$ :

$$\begin{aligned} &P(g(y), f(g(y)), z) \\ &P(g(y), f(g(a)), y) \end{aligned}$$

2.  $\{y/a\}$ :

$$\begin{aligned} &P(g(a), f(g(a)), z) \\ &P(g(a), f(g(a)), a) \end{aligned}$$

3.  $\{z/a\}$ :

$$P(g(a), f(g(a)), a)$$

Unifier:  $\{x/g(a), y/a, z/a\}$

105

$$= W \quad ① \quad D_2 = \{y, a\}$$

- ②  $v=y, t=a$

$\therefore \{y/a\} \rightarrow 5.$

③  $W 5$



$$D = \{x, y\}$$

(case 1:  $v=x, t=y$ ) both are ok  
(case 2:  $v=y, t=x$ )

Step 1

- ①  $D_1 = \{x, g(y)\}$   
②  $v=x, t=g(y)$

$v=g(y) \neq t=x$

⑤  $\{x/g(y)\}$

③  $\{ \dots \} \rightarrow \{ \dots \}$

W(5)

$$W = \{ \begin{array}{l} P(x, f(x), z) \text{ vs. } \\ P(g(y), f(g(a)), y) \end{array} \}$$

Unification Example

Step 2

1.  $\{x/g(y)\}$ :

$$\begin{array}{l} P(g(y), f(g(y)), z) \\ P(g(y), f(g(a)), y) \end{array}$$

2.  $\{y/a\}$ :

$$\begin{array}{l} P(g(a), f(g(a)), z) \\ P(g(a), f(g(d)), d) \end{array}$$

3.  $\{z/a\}$ :

$$P(g(a), f(g(a)), a)$$

Unifier:  $\{x/g(a), y/a, z/a\}$

$$= W \quad ① D_2 = \{y, a\}$$

- ②  $v=y, t=a$

$\sigma \circ \{y/a\} \rightarrow 5$

105

③ W 5  $\rightarrow W$

var const

Step 3 var

- ①  $D_3 = \{z, a\}$

const

- ②  $v=z, t=a$

$\sigma \circ \{z/a\} \rightarrow 5$



$$D = \{x, y\}$$

(case 1:  $v=x, t=y$ ) both are ok  
(case 2:  $v=y, t=x$ )

Step 1

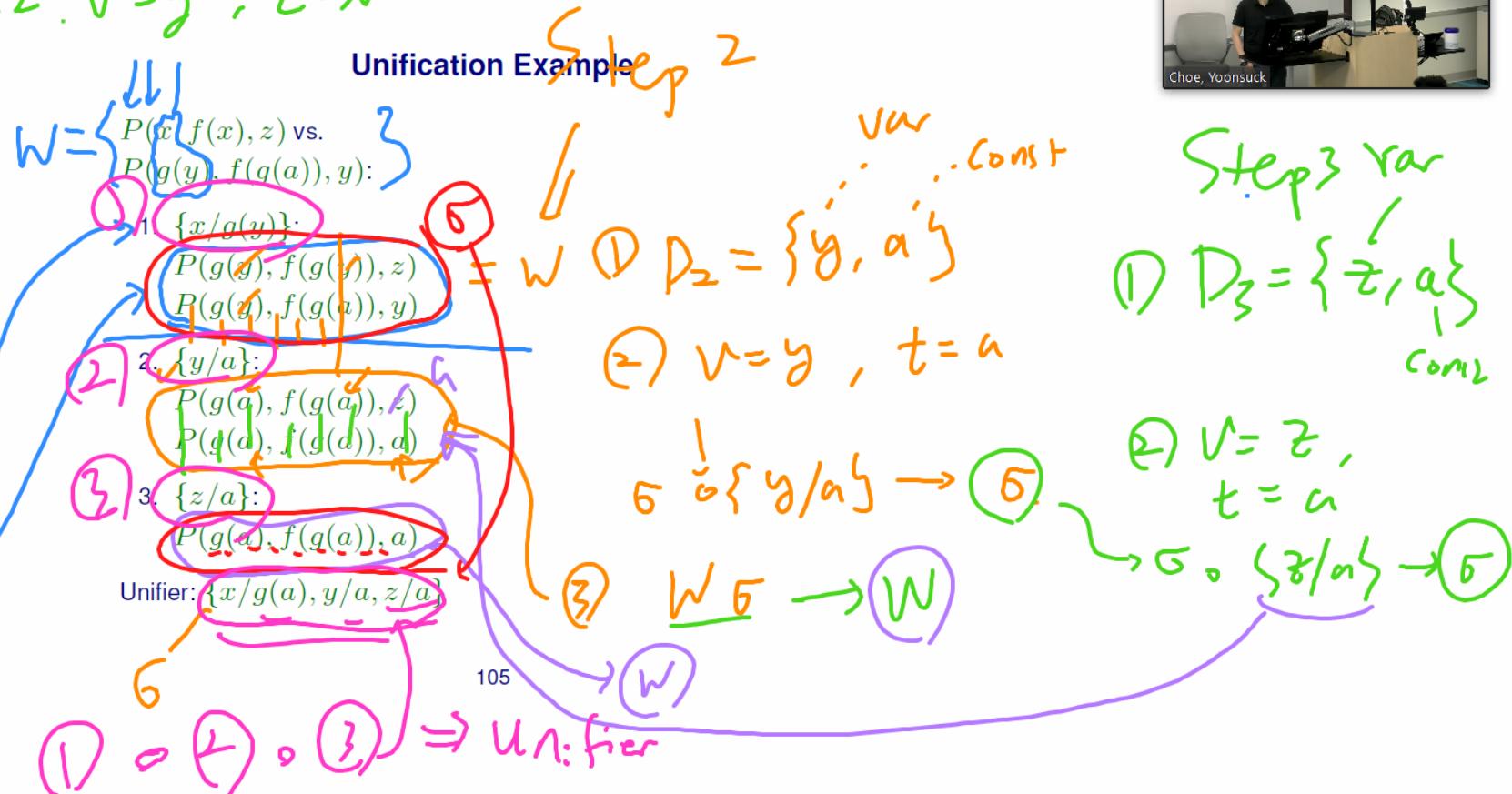
- ①  $D_1 = \{x, g(y)\}$
- ②  $v=x, t=g(y)$

~~$v=g(y), t=x$~~

~~$\{x/g(y)\}$~~

~~$\{ \dots \} \rightarrow \{ \dots \}$~~

$w(5)$





### Unification Example

$P(z, f(x), z)$  vs.  
 $P(g(y), f(g(a)), y)$ :

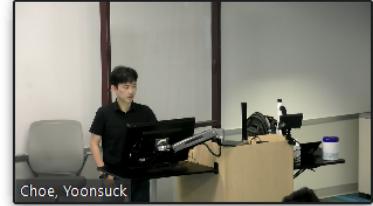
1.  $\{x/g(y)\}$ :  
 $P(g(y), f(g(y)), z)$   
 $P(g(y), f(g(a)), y)$
2.  $\{y/a\}$ :  
 $P(g(a), f(g(a)), z)$   
 $P(g(a), f(g(a)), a)$
3.  $\{z/a\}$ :  
 $P(g(a), f(g(a)), a)$

Unifier:  $\{x/g(a), y/a, z/a\}$

105

So X becomes g of a x becomes g of a, then y becomes a,  
the y becomes a, and then z becomes a

You are screen sharing Stop Share



**Unification Example**

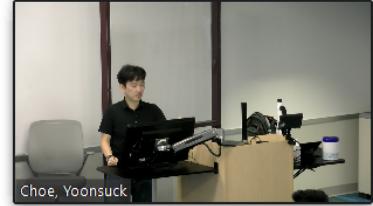
$P(z, f(x), z)$  vs.  $P(g(y), f(g(a)), y)$

1.  $\{x/g(y)\}$ :  
 $P(g(y), f(g(y)), z)$   
 $P(g(y), f(g(a)), y)$

2.  $\{y/a\}$ :  
 $P(g(a), f(g(a)), z)$   
 $P(g(a), f(g(a)), a)$

3.  $\{z/a\}$ :  
 $P(g(a), f(g(a)), a)$

Unifier:  $\{x/g(a), y/a, z/a\}$



**Unification Example**

$P(z, f(x), z)$  vs.  $P(g(y), f(g(a)), y)$

1.  $\{x/g(y)\}$ :  
 $P(g(y), f(g(y)), z)$   
 $P(g(y), f(g(a)), y)$

2.  $\{y/a\}$ :  
 $P(g(a), f(g(a)), z)$   
 $P(g(a), f(g(a)), a)$

3.  $\{z/a\}$ :  
 $P(g(a), f(g(a)), a)$

Unifier:  $\{x/g(a), y/a, z/a\}$

105

ATM 22 FALL CSCE 420 501: ARTIFICIAL INTELLIGENCE

Launch Meeting - Zoom

canvas.tamu.edu/courses/171555

Who can see what you share here? Recording On

Mouse Select Text Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

ATM 22 FALL CSCE 420 5... ATM 22 FALL CSCE 633 6... Video Conferencing...

**ATM**

Account

Dashboard

Courses

Calendar

Inbox 7

History

Commons

Help 10

CS.Fall.2022

	Week	Start Date	End Date	Topic	Chapters	Chapters	HW Announced	HW Due	Slides	Notes
Home	2	8/30/2022	9/1/2022	Search (uninformed)	Ch 3.1-3.6	Ch 3.1-3.6	hw1 announced	8/30: last day for add/drop	slide02-search-and-gameplaying.pdf	
Syllabus	3	9/6/2022	9/8/2022	Search (informed)	Ch 4.1-4.3	Ch 4.1-4.3			slide02-search-and-gameplaying.pdf	
Pages	4	9/13/2022	9/15/2022	Game playing	Ch 5	Ch 5			slide02-search-and-gameplaying.pdf	
Files	5	9/20/2022	9/22/2022	Propositional logic and theorem proving	Ch 7	Ch 7	hw2 announced	hw1 due 9/25 11:59pm	slide03-logic	
Assignments	6	9/27/2022	9/29/2022	First-order logic and theorem proving	Ch 8, 9	Ch 8, 9			slide03-logic	
Grades	7	10/4/2022	10/6/2022	First-order logic and theorem proving; Prolog ; Planning;	Ch 8, 9	Ch 8, 9			slide03-logic, slide04-planning	
Accessibility Report	8	10/13/2022	Midterm Exam (Thu, in class)	no class	Ch 10	Ch 11	hw3 announced	hw2 due: 10/11 Tuesday 11:59pm!!	10/10: midsemester grades due	
Core Curriculum Assessment	9	10/18/2022	10/20/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13				
Course Evaluations	10	10/25/2022	10/27/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13				
Mediasite Collection	11	11/1/2022	11/3/2022	Machine learning	Ch 18.1-	Ch 19.1-	hw Looking forward to the full break. Good			

Today

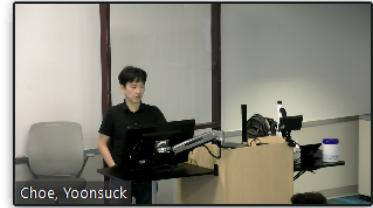
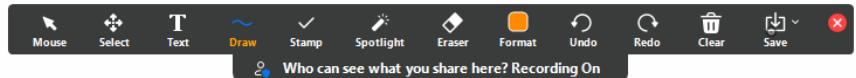
HW#1 Solution TBA: this week.

next Thu. Midterm exam!

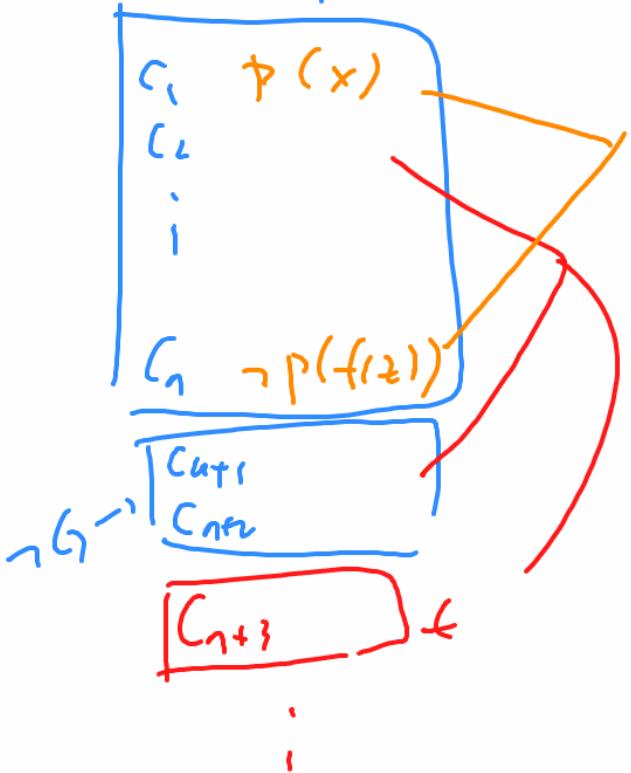
Fall Break

You are screen sharing Stop Share

11:10 AM 10/4/2022



$\text{KB}$



Unifiers

$$\delta = \{x/f(z)\}$$

$$\begin{aligned} & P(f(z)) \\ & \neg P(f(z)) \end{aligned} \rightarrow \text{False.}$$

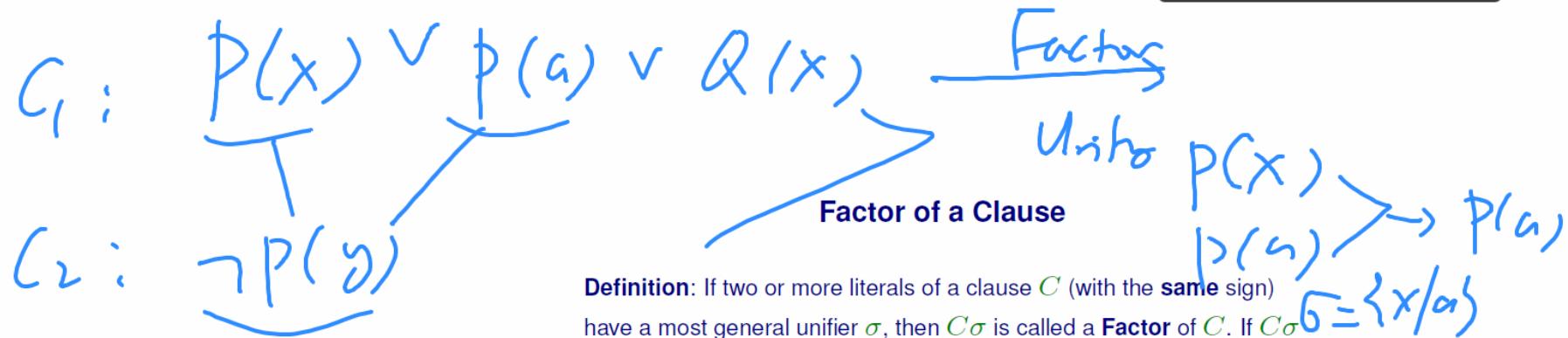
Resolution in Predicate Calculus

- Factors
- Binary resolvent
- Properties of resolution

106

Oh, I guess a little bit more complicated than this, but  
usually this is

You are screen sharing Stop Share

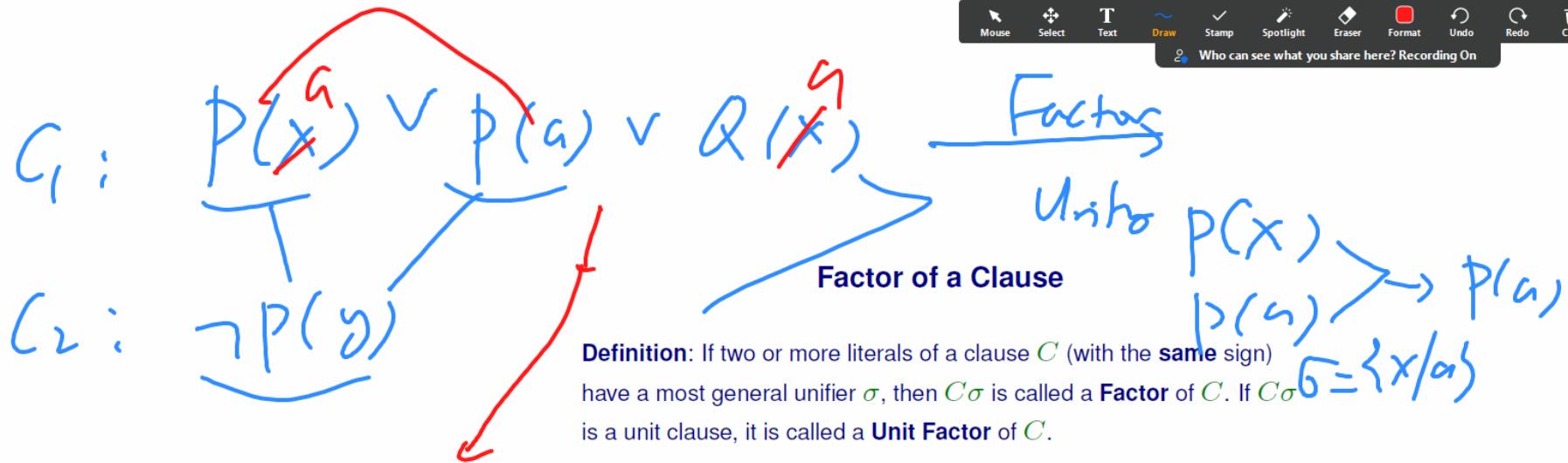


**Definition:** If two or more literals of a clause  $C$  (with the same sign) have a most general unifier  $\sigma$ , then  $C\sigma$  is called a **Factor** of  $C$ . If  $C\sigma$  is a unit clause, it is called a **Unit Factor** of  $C$ .

**Example:**  $C = P(x) \vee P(f(y)) \vee \neg Q(x)$ .

- The first two literals have a unifier  $\sigma = \{x/f(y)\}$ , so  $C$  has a factor  $C\sigma = P(f(y)) \vee \neg Q(f(y))$ .

**Note:** Factors of a clause are much succinct and when two clauses  $C_1$  and  $C_2$  cannot be resolved directly, their factors (let's call them  $C'_1$  and  $C'_2$ ) **can be** resolved.



Factor of  $C_1$ :  $P(a) \vee Q(a)$

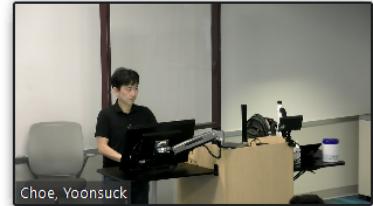
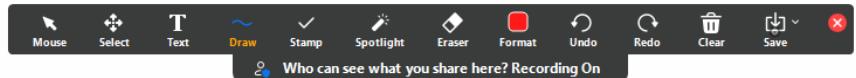
$C_L : \neg P(\beta)$

$\nwarrow$

(Q(a))

- The first two literals have a unifier  $\sigma = \{x/f(y)\}$ , so  $C$  has a factor  $C\sigma = P(f(y)) \vee \neg Q(f(y))$ .

**Note:** Factors of a clause are much succinct and when two clauses  $C_1$  and  $C_2$  cannot be resolved directly, their factors (let's call them  $C'_1$  and  $C'_2$ ) can be resolved.



## Factor of a Clause

**Definition:** If two or more literals of a clause  $C$  (with the **same** sign) have a most general unifier  $\sigma$ , then  $C\sigma$  is called a **Factor** of  $C$ . If  $C\sigma$  is a unit clause, it is called a **Unit Factor** of  $C$ .

**Example:**  $C = P(x) \vee P(f(y)) \vee \neg Q(x)$ .

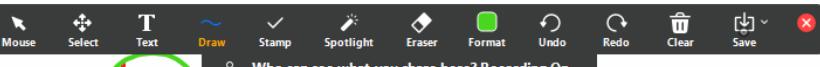
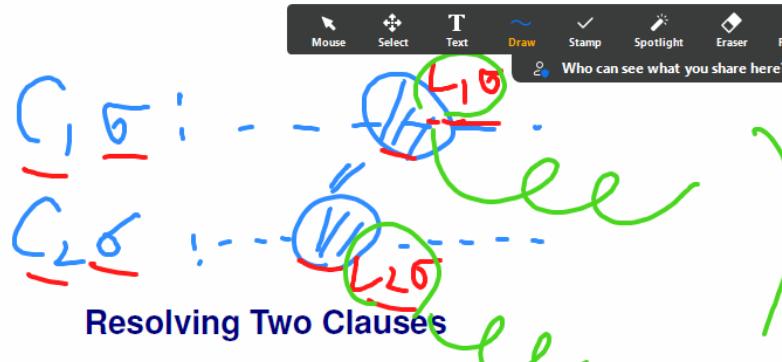
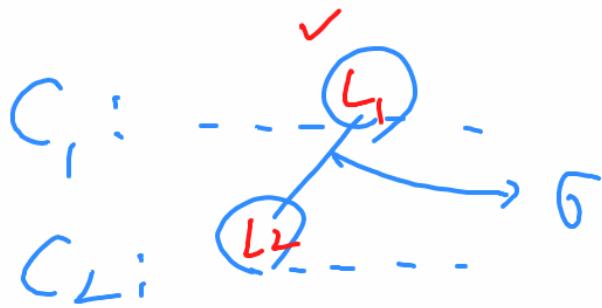
- The first two literals have a unifier  $\sigma = \{x/f(y)\}$ , so  $C$  has a factor  $C\sigma = P(f(y)) \vee \neg Q(f(y))$ .

**Note:** Factors of a clause are much succinct and when two clauses  $C_1$  and  $C_2$  cannot be resolved directly, their factors (let's call them  $C'_1$  and  $C'_2$ ) **can be** resolved.

107

So here's the it's a very simple example so actually this just shows you how to compute the vector

You are screen sharing Stop Share



**Definition:** Let  $C_1$  and  $C_2$  be two clauses (called *parent clauses*) with no variables in common, and with complementary literals  $L_1$  and  $L_2$  such that  $L_1$  and  $\neg L_2$  have a most general unifier  $\sigma$ . Then the clause

$$(C_1 \sigma \cup \neg L_1 \sigma) \cup (C_2 \sigma \cup \neg L_2 \sigma)$$

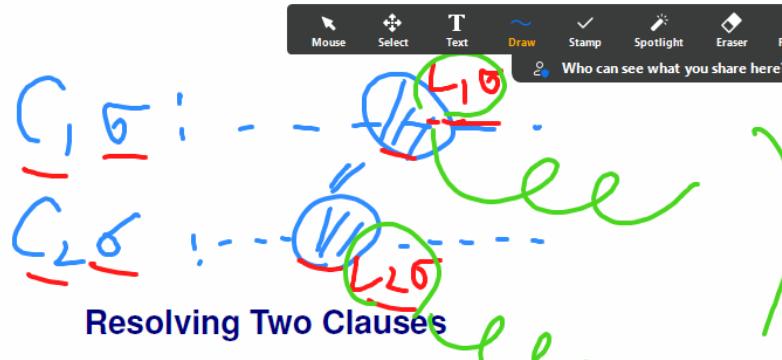
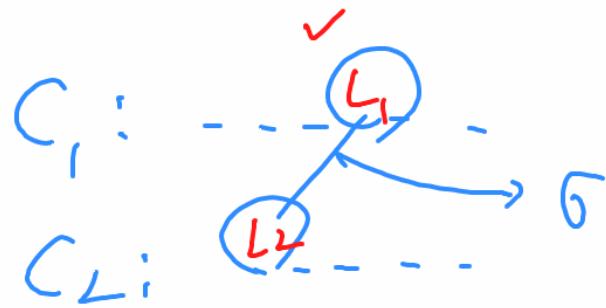
is called a **binary resolvent** of  $C_1$  and  $C_2$ . The literals  $L_1$  and  $L_2$  are called **the literals resolved upon**.

**Note:** A clause can be treated as a set of literals.

$$\{P(x)\} \cup \{Q(x)\} = \{P(x), Q(x)\} = P(x) \vee Q(x)$$

**Example:** Resolve the following (hint:  $\sigma = \{x/a\}$ )

$$C_1 = P(x) \vee Q(x) \text{ and } C_2 = \neg P(a) \vee R(y).$$



$C_1 : \{ P(x), Q(x) \}$

$C_2 : \{ \neg P(a), R(y) \}$

**Definition:** Let  $C_1$  and  $C_2$  be two clauses (called *parent clauses*) with no variables in common, and with complementary literals  $L_1$  and  $L_2$  such that  $L_1$  and  $\neg L_2$  have a most general unifier  $\sigma$ . Then the clause

$$(C_1 \sigma \cup L_1 \sigma) \cup (C_2 \sigma \cup \neg L_2 \sigma)$$

is called a **binary resolvent** of  $C_1$  and  $C_2$ . The literals  $L_1$  and  $L_2$  are called **the literals resolved upon**.

**Note:** A clause can be treated as a set of literals.

$$\{P(x)\} \cup \{Q(x)\} = \{P(x), Q(x)\} = P(x) \vee Q(x)$$

**Example:** Resolve the following (hint:  $\sigma = \{x/a\}$ )

$$C_1 = P(x) \vee Q(x) \text{ and } C_2 = \neg P(a) \vee R(y).$$



## Resolving Two Clauses: Example Revisited

Example: Resolve the following (hint:  $\sigma = \{x/a\}$ )

$$C_1 = P(x) \vee Q(x) \text{ and } C_2 = \neg P(a) \vee R(y)$$

$C_1 = P(x) \vee Q(x)$

$C_2 = \neg P(a) \vee R(y)$

$\sigma = \{x/a\}$

$C_1\sigma = P(a) \vee Q(a)$

$C_2\sigma = \neg P(a) \vee R(y)$

remove  $L_1\sigma = P(a)$

$(C_1\sigma - L_1\sigma) = Q(a)$

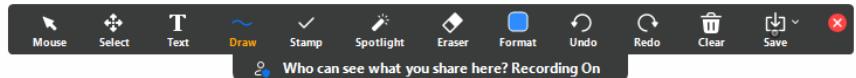
remove  $L_2\sigma = \neg P(a)$

$(C_2\sigma - L_2\sigma) = R(y)$

115

$$\begin{array}{c} P(x) \\ P(a) \end{array} \xrightarrow{6} \frac{}{x/a}$$

$$\left\{ \begin{array}{l} Q(a), R(y) \\ || \\ Q(a) \vee R(y). \end{array} \right.$$



## Resolvent

**Definition:** A *resolvent* of parent clauses  $C_1$  and  $C_2$  is one of the following binary resolvents:

- ✓ 1. a binary resolvent of  $C_1$  and  $C_2$
- 2. a binary resolvent of  $C_1$  and a factor of  $C_2$
- 3. a binary resolvent of a factor of  $C_1$  and  $C_2$
- 4. a binary resolvent of a factor of  $C_1$  and a factor of  $C_2$

**Example:** resolve the two clauses

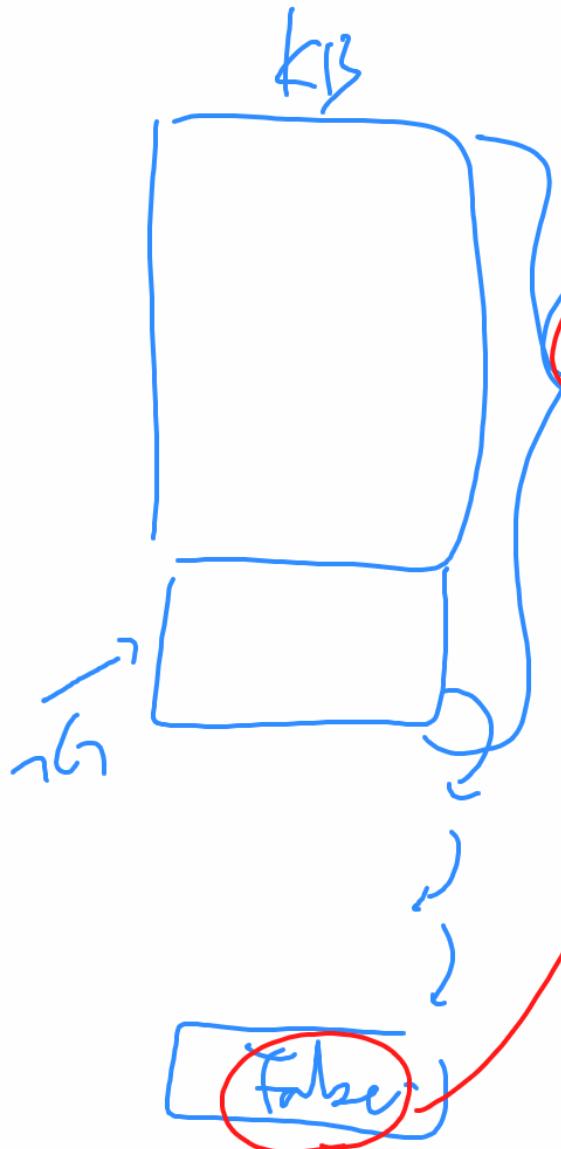
1.  $C_1 = P(x) \vee P(f(y)) \vee R(g(y))$  and 3
2.  $C_2 = \neg P(f(g(a))) \vee Q(b)$ .

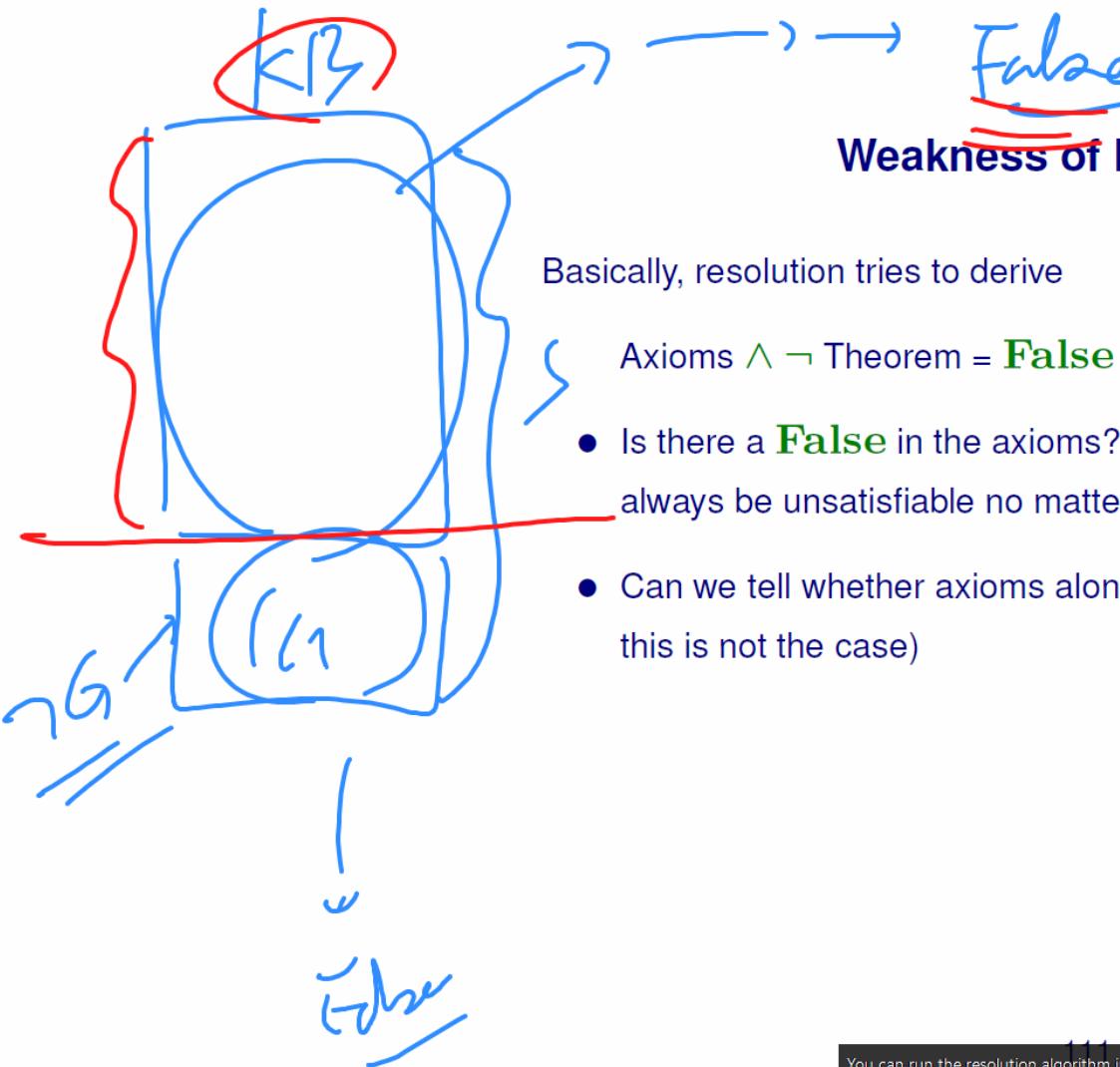
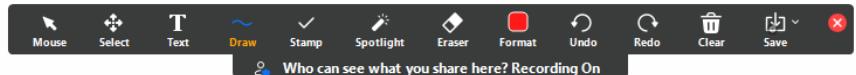
(hint: resolve the factor of  $C_1$  and clause  $C_2$ )



## Property of Resolution for First-Order Logic

- **Complete:** If a set of clauses  $S$  is unsatisfiable, resolution will eventually derive **False**.
  - *Everything that is true can be proved (eventually).*
- **Sound:** If **False** is derived by resolution, then the original set of clauses  $S$  is unsatisfiable.
  - *Everything that is proved is true.*





## Weakness of Resolution

Basically, resolution tries to derive

Axioms  $\wedge \neg$  Theorem = **False**

- Is there a **False** in the axioms? If there is, the whole formula will always be unsatisfiable no matter what.
- Can we tell whether axioms alone can derive **False**? (generally, this is not the case)

You can run the resolution algorithm just on this knowledge base and check whether there's any possibility of driving force right

You are screen sharing Stop Share

ATM 22 FALL CSCE 420 501: ARTIFICIAL INTELLIGENCE

Launch Meeting - Zoom

canvas.tamu.edu/courses/171555

Who can see what you share here? Recording On

Mouse Select T Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

CS.Fall.2022

	Week	Start Date	End Date	Topic	Chapters	HW	Slides	Due Date	Notes
Home	2	8/30/2022	9/1/2022	Search (uninformed)	Ch 3.1-3.6	hw1 announced	slide02-search-and-gameplaying.pdf	8/30: last day for add/drop	
Syllabus	3	9/6/2022	9/8/2022	Search (informed)	Ch 4.1-4.3		slide02-search-and-gameplaying.pdf		
Pages	4	9/13/2022	9/15/2022	Game playing	Ch 5	Ch 5	slide02-search-and-gameplaying.pdf		
Files	5	9/20/2022	9/22/2022	Propositional logic and theorem proving	Ch 7	Ch 7	hw1 due 9/25 11:59pm	slide03-logic	
Assignments	6	9/27/2022	9/29/2022	First-order logic and theorem proving	Ch 8, 9	Ch 8, 9	slide03-logic		
Grades	7	10/4/2022	10/6/2022	First-order logic and theorem proving; Prolog; Planning	Ch 8, 9	Ch 8, 9	slide03-logic, slide04-planning		
Accessibility Report	8	10/13/2022	Midterm Exam (Thu, in class)	Ch 10	Ch 11	hw3 announced	hw2 due: 10/11 Tuesday 11:59pm!!	10/10: midsemester grades due	
Core Curriculum Assessment	9	10/18/2022	10/20/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13			
Course Evaluations	10	10/25/2022	10/27/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13			
Mediasite Collection	11	11/1/2022	11/3/2022	Machine learning	Ch 18.1-	Ch 19.1-hw3 announced	hw3 due		So you can take a look at that and whom one solution will be announced, maybe today or tomorrow, so they can take

Choe, Yoonsuck

*TBA: this week.*

*HW#1 Solution*

*next Thu. Midterm exam!*

*Fall Break*

You are screen sharing

11:11 AM 10/4/2022



## Resolvent: A Full Example

**Example:** resolve the two clauses

1.  $C_1 = P(x) \vee P(f(y)) \vee R(g(y))$  and *Factor*
  2.  $C_2 = \neg P(f(g(a))) \vee Q(b)$ .
- $$F = \{x/f(\cdot)\}$$

1. Get the factor of  $C_1$ :

$$C_1\{x/f(y)\} = \boxed{P(f(y)) \vee R(g(y))}$$

2. Resolve factor of  $C_1$  and  $C_2$ :

$$\underbrace{P(f(y)) \vee R(g(y))}_{\text{remove}} \text{ vs. } \underbrace{\neg P(f(g(a))) \vee Q(b)}_{\text{remove}}$$

3.  $\sigma = \{y/g(a)\}$ :

$$\underbrace{P(f(g(a))) \vee R(g(g(a)))}_{\text{remove}} \text{ vs. } \underbrace{\neg P(f(g(a))) \vee Q(b)}_{\text{remove}}$$

4. Result:

$$R(g(g(a))) \vee Q(b)$$



## Resolvent: A Full Example

**Example:** resolve the two clauses

1.  $C_1 = P(x) \vee P(f(y)) \vee R(g(y))$  and
2.  $C_2 = \neg P(f(g(a))) \vee Q(b)$

*Factor*

$$F = \{x/f(\cdot)\}$$

1. Get the factor of  $C_1$ :

$$C_1\{x/f(y)\} = [P(f(y)) \vee R(g(y))]$$



$$P(b)$$

2. Resolve factor of  $C_1$  and  $C_2$ :

$$P(f(y)) \vee R(g(y)) \text{ vs. } \neg P(f(g(a))) \vee Q(b)$$

3.  $\sigma = \{y/g(a)\}$ :

$$\underbrace{P(f(g(a)))}_{\text{remove}} \vee R(g(g(a))) \text{ vs. } \underbrace{\neg P(f(g(a)))}_{\text{remove}} \vee Q(b)$$

$$\neg P(f(g(a)))$$

4. Result:

$$R(g(g(a))) \vee Q(b)$$

$$\sigma = \{y/f(g(a))\}$$



## Resolvent: A Full Example

**Example:** resolve the two clauses

1.  $C_1 = P(x) \vee P(f(y)) \vee R(g(y))$  and
2.  $C_2 = \neg P(f(g(a))) \vee Q(b)$

*Factor*

$$F = \{x/f(\cdot)\}$$

1. Get the factor of  $C_1$ :

$$C_1\{x/f(y)\} = [P(f(y)) \vee R(g(y))]$$

2. Resolve factor of  $C_1$  and  $C_2$ :

$$P(f(y)) \vee R(g(y)) \text{ vs. } \neg P(f(g(a))) \vee Q(b)$$

3.  $\sigma = \{y/g(a)\}$ :

$$\underbrace{P(f(g(a))) \vee R(g(g(a)))}_{\text{remove}} \text{ vs. } \underbrace{\neg P(f(g(a))) \vee Q(b)}_{\text{remove}}$$

4. Result:

$$R(g(g(a))) \vee Q(b)$$

$$P(b)$$

$$\underline{\neg P(f(g(a)))}$$

$$\sigma = \{y/f(g(a))\}$$



## Resolvent: A Full Example

**Example:** resolve the two clauses

1.  $C_1 = P(x) \vee P(f(y)) \vee R(g(y))$  and
2.  $C_2 = \neg P(f(g(a))) \vee Q(b)$

*Factor*

$$\delta = \{x/f(\cdot)\}$$

1. Get the factor of  $C_1$ :

$$C_1\{x/f(y)\} = [P(f(y)) \vee R(g(y))]$$

$$P(b)$$

2. Resolve factor of  $C_1$  and  $C_2$ :

$$P(f(y)) \vee R(g(y)) \text{ vs. } \neg P(f(g(a))) \vee Q(b)$$

$$\neg P(f(g(a)))$$

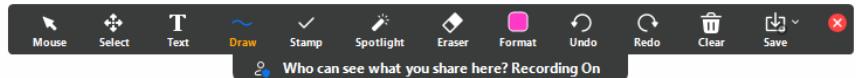
$$\sigma = \{y/g(a)\}$$

$$P(f(g(a))) \vee R(g(g(a))) \text{ vs. } \neg P(f(g(a))) \vee Q(b)$$

$$\sigma = \{y/f(g(a))\}$$

4. Result:

$$R(g(g(a))) \vee Q(b)$$



## Example Proof Using Resolution <sup>a</sup>

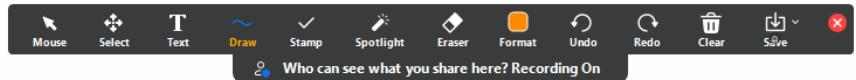
Given: (1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP.

Prove: (4) Some of the customs officials were drug dealers.



---

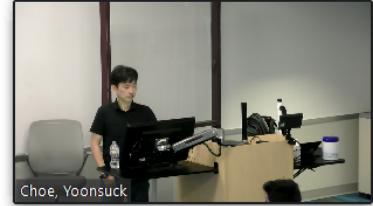
<sup>a</sup>Chang & Lee, Example 5.22



## Example: Predicates

1.  $C(x)$ :  $x$  is a customs official
2.  $E(x)$ :  $x$  entered the country
3.  $V(x)$ :  $x$  is a VIP
4.  $S(x, y)$ :  $x$  was searched by  $y$
5.  $D(x)$ :  $x$  is a drug dealer

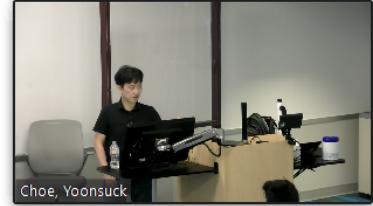
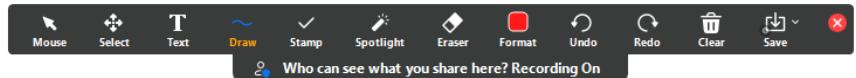
~~$S(x, y)$~~



## Example: English to First Order Logic

(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x(E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \rightarrow \neg V(x))$
4.  $\exists x(D(x) \wedge C(x))$



## Example: English to First Order Logic

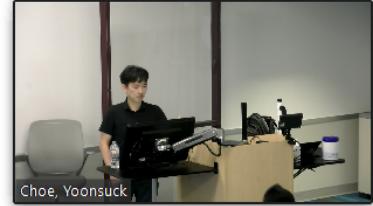
(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

$$1. \forall x(E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y))$$

$$2. \exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$$

$$3. \forall x(D(x) \rightarrow \neg V(x))$$

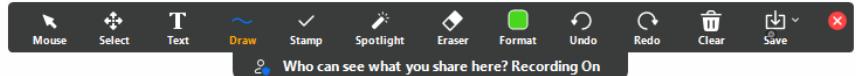
$$4. \exists x(D(x) \wedge C(x))$$



## Example: English to First Order Logic

(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x(E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \rightarrow \neg V(x))$
4.  $\exists x(D(x) \wedge C(x))$



## Example: English to First Order Logic



(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \rightarrow \neg V(x))$
4.  $\exists x(D(x) \wedge C(x))$

ATM 22 FALL CSCE 420 501: ARTIFICIA Launch Meeting - Zoom

ATM 22 FALL CSCE 420 5... ATM 22 FALL CSCE 633 6... Video Conferencing...

canvas.tamu.edu/courses/171555

Who can see what you share here? Recording On

Mouse Select T Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

CS.Fall.2022

Home Syllabus Pages Files Assignments Grades Accessibility Report Core Curriculum Assessment Course Evaluations Mediasite Collection Announcements Modules Discussions People Outcomes Rubrics Quizzes Collaborations Settings

CSCE 420-501: Artificial Intelligence

Syllabus: [\[Syllabus\]](#)

Quick links and info:

- Office hours:
  - Instructor: TF 2:30pm-4:00pm [\[Zoom\]](#)
  - TA: Jin Hyun Park, [jinhyun.park@tamu.edu](mailto:jinhyun.park@tamu.edu); MWF 9:30am-11:00am, [\[Zoom\]](#)
  - Grader: Vicente Balmaseda, [vibalcam@tamu.edu](mailto:vibalcam@tamu.edu) (grading related questions only)
- Lecture notes: [\[Lecture notes folder\]](#)
- Lecture recordings: [\[Link\]](#)
- Practice Exams: [\[TBA\]](#); Exam Rules [\[Link\]](#)

NEWS:

- [09/26] Homework 2 announced [\[Link\]](#)
  - IMPORTANT: Homework 2 is due on Tuesday! Right before the midterm exam.
  - Homework 2 does not include programming.
- [09/26]: slide04-planning uploaded [\[Lecture notes folder\]](#)
- [09/04]: Practice exams uploaded [\[Link\]](#)
  - Note: solutions will not be provided.
- [08/31]: Homework 1 announced [\[Link\]](#)
- [08/30]: Philosopher AI sample results [\[Link\]](#)
- [08/25]:
  - Lecture notes and screenshots: [\[Lecture notes folder\]](#)
  - Lecture recordings: [\[Link\]](#)

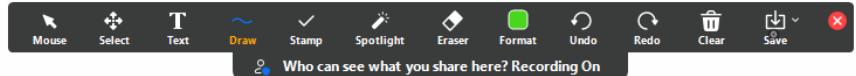
Weekly Schedule and Deadlines

Week	Tuesday	Thursday	Topic	Reading (3rd ed)	4th (ed)	Announcements	Dues	Lecture notes <a href="#">[Folder]</a>	Comment
1	no class	8/25/2022	Introduction	Ch 1, 26.1, 26.2	Ch 1, 27.1, 27.2				There are 2 things you wanna look at the practice exam actually well it's in the files. You can go

You are screen sharing Stop Share

11:11 AM 10/4/2022





## Example: English to First Order Logic

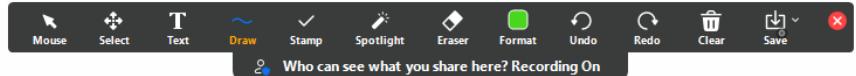


(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \rightarrow \neg V(x))$
4.  $\exists x(D(x) \wedge C(x))$

So you have to think about different ways. to paraphrase it.

You are screen sharing Stop Share



## Example: English to First Order Logic



(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

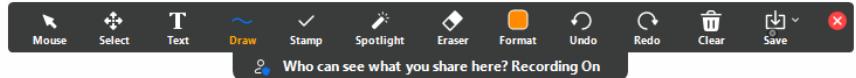


1.  $\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$

3.  $\forall x(D(x) \rightarrow \neg V(x))$

4.  $\exists x(D(x) \wedge C(x))$

$$\neg \exists x (D(x) \wedge V(x))$$



## Example: English to First Order Logic



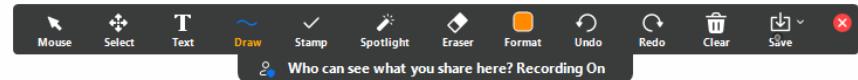
(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \rightarrow \neg V(x))$
4.  $\exists x(D(x) \wedge C(x))$

This is just straightforward to transfer so and customs official, and there's some

You are screen sharing Stop Share

$\forall$   $\exists$   $\exists$   $y$   
(1)  $\{y/f(x)\}$



## Example: Standard Form (I)



$$\begin{aligned}
\{rm \rightarrow\} &= \forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y))) \\
\{prenex\} &= \forall x \exists y (\neg E(x) \vee V(x) \vee (S(x, y) \wedge C(y))) \\
\{skol\} &= \forall x (\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x)))) \\
\{add()\} &= \forall x ((\neg E(x) \vee V(x)) \vee (S(x, f(x)) \wedge C(f(x)))) \\
\{dist\} &= \forall x (\underbrace{(\neg E(x) \vee V(x) \vee S(x, f(x))}_{\wedge (\neg E(x) \vee V(x) \vee C(f(x))))})
\end{aligned}$$

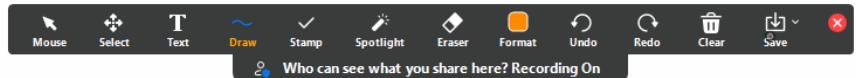
Clauses:

$$(1a) \neg E(x) \vee V(x) \vee S(x, f(x))$$

$$(1b) \neg E(x) \vee V(x) \vee C(f(x))$$

So you want to tell y into f of x okay so that's the result of turning all y into f of x that

You are screen sharing Stop Share



$\forall x \exists y$        $\{y/f(x)\}$

(1)

$$\begin{aligned}
 \{rm \rightarrow\} &= \forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y))) \\
 \{prenex\} &= \forall x \exists y(\neg E(x) \vee V(x) \vee (S(x, y) \wedge C(y))) \\
 \{skol\} &= \forall x(\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{NT\} \{add()\} &= \forall x((\neg E(x) \vee V(x)) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{dist\} &= \forall x(\underbrace{(\neg E(x) \vee V(x) \vee S(x, f(x)))}_{\wedge (\underbrace{\neg E(x) \vee V(x) \vee C(f(x))})})
 \end{aligned}$$

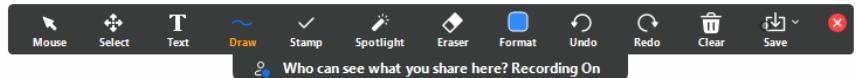


## Example: Standard Form (I)

Clauses:

$$(1a) \neg E(x) \vee V(x) \vee S(x, f(x))$$

$$(1b) \neg E(x) \vee V(x) \vee C(f(x))$$



## Example: Standard Form (I)



$$(1) \quad \forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$$

$$\{rm \rightarrow\} = \forall x(\neg(E(x) \wedge \neg V(x)) \vee \exists y(S(x, y) \wedge C(y)))$$

$$\{prenex\} = \forall x \exists y(\neg E(x) \vee V(x) \vee (S(x, y) \wedge C(y)))$$

$$\{skol\} = \forall x(\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x)))) \xrightarrow{\text{Simplify}}$$

$$\{add()\} = \forall x((\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x))))$$

$$\{dist\} = \forall x((\neg E(x) \vee V(x) \vee S(x, f(x)) \wedge (\neg E(x) \vee V(x) \vee C(f(x)))) \vee (Q \wedge Q))$$

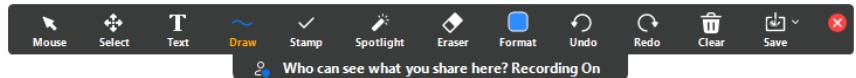
Clauses:

$$(1a) \neg E(x) \vee V(x) \vee S(x, f(x))$$

$$(1b) \neg E(x) \vee V(x) \vee C(f(x))$$

So this is in this phone. Then you can use the distributed law to get to these 2 clauses

You are screen sharing Stop Share



## Example: Standard Form (I)

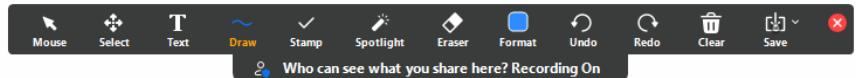


$$\begin{aligned}
 (1) \quad & \underline{\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))} \\
 \{rm\} \rightarrow & = \underline{\forall x(\neg(E(x) \wedge \neg V(x)) \vee \exists y(S(x, y) \wedge C(y)))} \\
 \{prenex\} & = \forall x \exists y (\neg E(x) \vee V(x) \vee (S(x, y) \wedge C(y))) \\
 \{skol\} & = \forall x (\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{add()\} & = \forall x ((\neg E(x) \vee V(x)) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{dist\} & = \forall x (\underbrace{(\neg E(x) \vee V(x) \vee S(x, f(x)))}_{\wedge (\underbrace{\neg E(x) \vee V(x) \vee C(f(x)))}) \\
 \end{aligned}$$

Two  
Clauses:  
(1a)  $\neg E(x) \vee V(x) \vee S(x, f(x))$   
(1b)  $\neg E(x) \vee V(x) \vee C(f(x))$

Finally, So, as a result, you started from this, and then you have 2 clues

You are screen sharing Stop Share



## Example: Standard Form (I)

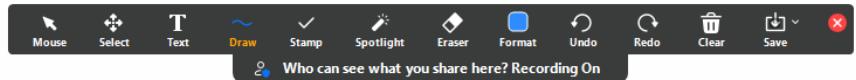


$$\begin{aligned}
 (1) \quad & \underline{\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))} \\
 \{rm \rightarrow\} & = \underline{\forall x(\neg(E(x) \wedge \neg V(x)) \vee \exists y(S(x, y) \wedge C(y)))} \\
 \{prenex\} & = \forall x \exists y (\neg E(x) \vee V(x) \vee (S(x, y) \wedge C(y))) \\
 \{skol\} \checkmark & = \forall x (\neg E(x) \vee V(x) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{add()\} & = \forall x ((\neg E(x) \vee V(x)) \vee (S(x, f(x)) \wedge C(f(x)))) \\
 \{dist\} & = \forall x (\underbrace{(\neg E(x) \vee V(x) \vee S(x, f(x))}_{\text{Two}} \\
 & \quad \wedge \underbrace{(\neg E(x) \vee V(x) \vee C(f(x)))}_{\text{Clauses}})
 \end{aligned}$$

Two  
Clauses:  
 (1a)  $\neg E(x) \vee V(x) \vee S(x, f(x))$   
 (1b)  $\neg E(x) \vee V(x) \vee C(f(x))$

Now str those across 2 different closes

You are screen sharing Stop Share



## Example: Standard Form (III)



$$(3) \quad \forall x(D(x) \not\rightarrow \neg V(x)) \\ \{rm \rightarrow\} = \forall x(\exists D(x) \underline{\vee} \neg V(x))$$

Clause:

$$(3) \underline{\neg D(x)} \vee \underline{\neg V(x)}$$

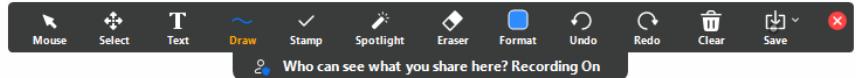
$$(4) \quad \exists x(D(x) \wedge C(x)) \\ \{negate\} \Rightarrow \neg(\exists x(D(x) \wedge C(x))) \\ \{prenex\} = \forall x \neg(D(x) \wedge C(x)) \\ \{CNF\} = \forall x(\neg D(x) \vee \neg C(x))$$

Clause:

$$(4) \neg D(x) \vee \neg C(x)$$

Then you have this, so that's fine there's not close yeah, this  
so that which is just the the

You are screen sharing Stop Share



## Example: English to First Order Logic



(1) The customs officials searched everyone who entered the country who was not a VIP. (2) Some of the drug dealers entered the country, and they were only searched by drug dealers. (3) No drug dealer was a VIP. (4) Some of the customs officials were drug dealers.

1.  $\forall x((E(x) \wedge \neg V(x)) \rightarrow \exists y(S(x, y) \wedge C(y)))$
2.  $\exists x(E(x) \wedge D(x) \wedge \forall y(S(x, y) \rightarrow D(y)))$
3.  $\forall x(D(x) \not\rightarrow \neg V(x))$   
   D(x)     $\neg V(x)$
4.  $\exists x(D(x) \wedge C(x))$

So let's just go back and see what the third one is so you have a negation, and then d assumptions you have not T.

You are screen sharing Stop Share

ATM 22 FALL CSCE 420 501: ARTIFICIA Launch Meeting - Zoom

ATM 22 FALL CSCE 420 5... ATM 22 FALL CSCE 633 6... Video Conferencing...

canvas.tamu.edu/courses/171555

CS.Fall.2022

**CSCE 420-501: Artificial Intelligence**

Syllabus: [\[Syllabus\]](#)

**Quick links and info:**

- Office hours:
  - Instructor: TF 2:30pm-4:00pm [\[Zoom\]](#)
  - TA: Jin Hyun Park, [jinhyun.park@tamu.edu](mailto:jinhyun.park@tamu.edu); MWF 9:30am-11:00am, [\[Zoom\]](#)
  - Grader: Vicente Balmaseda, [vibalcam@tamu.edu](mailto:vibalcam@tamu.edu) (grading related questions only)
- Lecture notes: [\[Lecture notes folder\]](#)
- Lecture recordings: [\[Link\]](#)
- Practice Exams: [\[TBA\]](#); Exam Rules [\[Link\]](#)

**NEWS:**

- [09/26]: Homework 2 announced [\[Link\]](#)
  - IN PDR(A/W) Homework 2 is due on Tuesday! Right before the midterm exam.
  - Homework 2 does not include programming.
- [09/26]: slide04-planning uploaded [\[Lecture notes folder\]](#)
- [09/04]: Practice exams uploaded [\[Link\]](#)
  - Note: solutions will not be provided.
- [08/31]: Homework 1 announced [\[Link\]](#)
- [08/30]: Philosopher AI sample results [\[Link\]](#)
- [08/25]:
  - Lecture notes and screenshots: [\[Lecture notes folder\]](#)
  - Lecture recordings: [\[Link\]](#)

**Weekly Schedule and Deadlines**

Week	Tuesday	Thursday	Topic	Reading (3rd ed)	4th (ed)	Announcements	Dues	Lecture notes <a href="#">[Folder]</a>	Comment
1	no class	8/25/2022	Introduction	Ch 1, 26.1, 26.2	Ch 1, 27.1, 27.2			slide01.pdf	You can go there, hold on, name, did I say?

**To Do**

- 92 Grade Homework 1 100 points • Sep 25 at 11:59pm
- 2 Grade Homework 2 100 points • Oct 11 at 11:59pm

**Coming Up**

View Calendar

Nothing for the next week

**Fall Break**

**HW#1 Solution TBA: this week.**

**next Thu. midterm exam!**

Import from Commons  
Choose Home Page  
View Course Stream  
Course Setup Checklist  
New Announcement  
New Analytics  
View Course Notifications

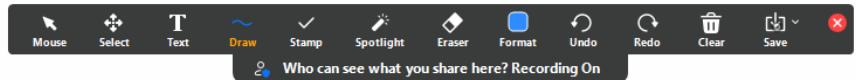
Who can see what you share here? Recording On Saved as PNG Show in Folder

Mouse Select Text Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

Choe, Yoonsuck

You are screen sharing Stop Share

11:11 AM 10/4/2022



## Example: Standard Form (III)



$$(3) \quad \forall x(D(x) \rightarrow \neg V(x))$$

$$\{rm \rightarrow\} = \forall x(\neg D(x) \vee \neg V(x))$$

Clause:

$$(3) \neg D(x) \vee \neg V(x)$$

(4)

{negate}

{prenex}

{CNF}

$$\exists x(D(x) \wedge C(x))$$

$$\neg(\exists x(D(x) \wedge C(x)))$$

$$\forall x \neg(D(x) \wedge C(x))$$

$$\forall x(\neg D(x) \vee \neg C(x))$$

Clause:

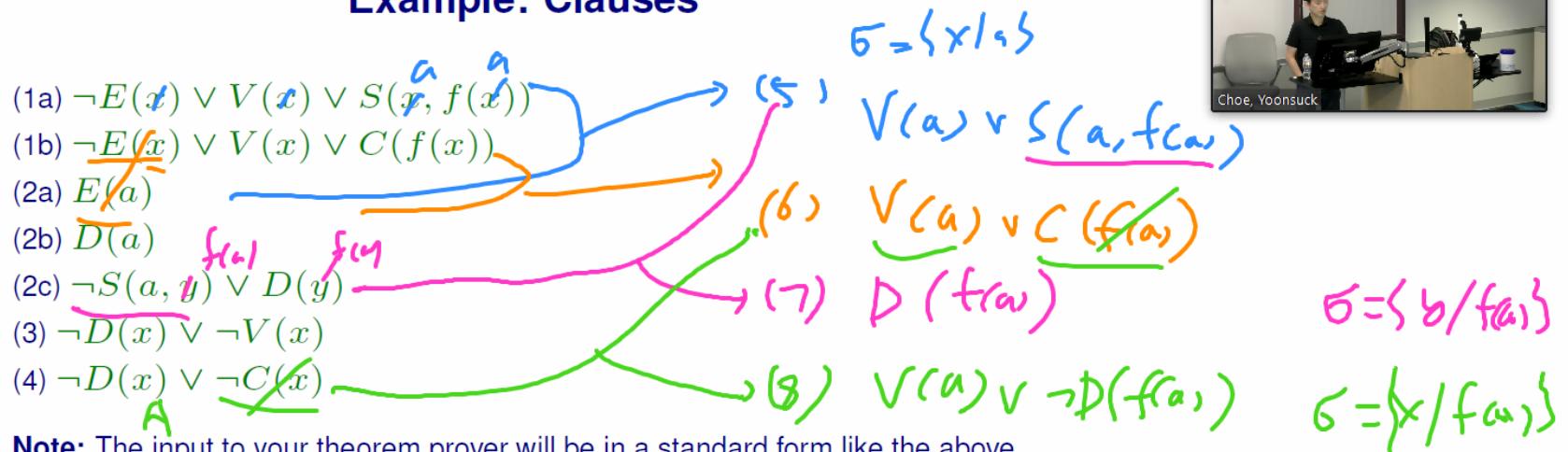
$$(4) \neg D(x) \vee \neg C(x)$$

Of X or not, c. of X. So in this case you just have a single clause as a result of negation of the final wow.

You are screen sharing Stop Share



## Example: Clauses



Note: The input to your theorem prover will be in a standard form like the above.

**Exercise 1:** rewrite the above in LISP representation.

**Exercise 2:** use resolution to derive **False**.



## Example: Clauses

- (1a)  $\neg E(x) \vee V(x) \vee S(x, f(x))$
- (1b)  $\neg E(x) \vee V(x) \vee C(f(x))$
- (2a)  $E(a)$
- (2b)  $D(a)$
- (2c)  $\neg S(a, y) \vee D(y)$
- (3)  $\neg D(x) \vee \neg V(x)$
- (4)  $\neg D(x) \vee \neg C(x)$

$$\sigma = \{x/a\}$$

$$V(a) \vee S(a, f(a))$$

$$V(a) \vee C(f(a))$$

$$D(f(a))$$

$$\sigma = \{y/f(a)\}$$

$$\sigma = \{x/f(a)\}$$

Note: The input to your theorem prover will be in a standard form like the above.

**Exercise 1:** rewrite the above in LISP representation.

**Exercise 2:** use resolution to derive **False**.

123

Q4:

$$S(a, b) \vee D(b)$$

$$\Gamma = \{x/b\}$$

$$(3): \neg D(x) \vee \neg V(x)$$

$$(2): \neg S(a, y) \vee \neg V(y)$$

$$(1a) \neg E(x) \vee V(x) \vee S(x, f(x))$$

$$(1b) \neg E(x) \vee V(x) \vee C(f(x))$$

$$(2a) E(a)$$

$$(2b) D(a)$$

$$(2c) \neg S(a, y) \vee D(y)$$

$$(3) \neg D(x) \vee \neg V(x)$$

$$(4) \neg D(x) \vee \neg C(x)$$

$$(5) V(a) \vee S(a, f(a))$$

$$(6) V(a) \vee C(f(a))$$

$$(7) D(f(a))$$

$$(8) V(a) \vee \neg D(f(a))$$

$$(9) V(a)$$

$$(10) \neg D(a)$$

$$(11) \text{False}$$

## Example: Clauses



$$\Sigma = \{b/f(a)\}$$

$$\sigma = \{x/f(a)\}$$

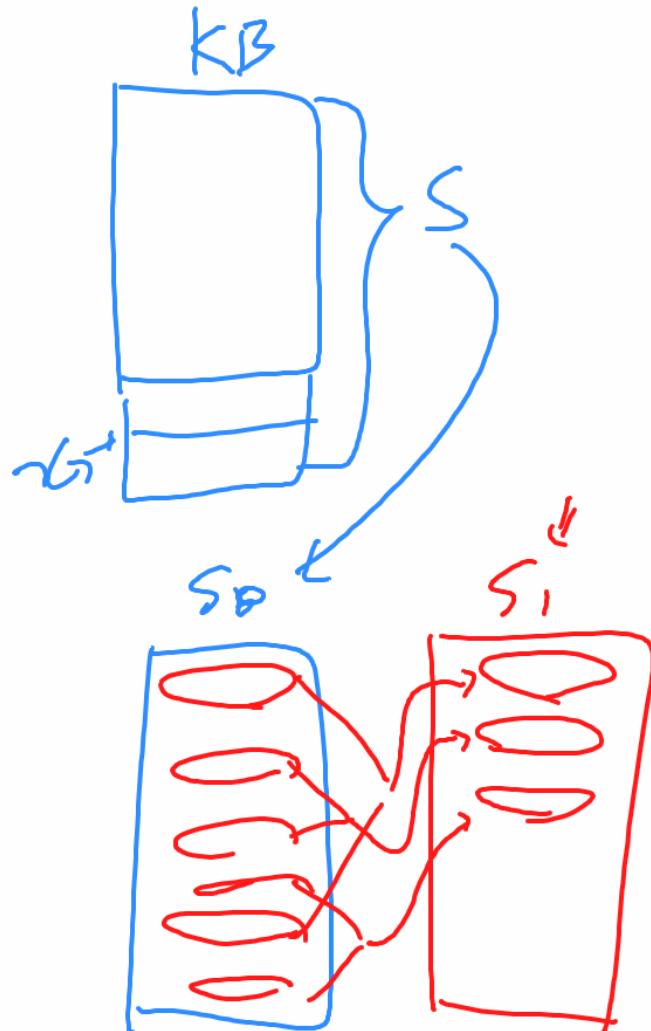
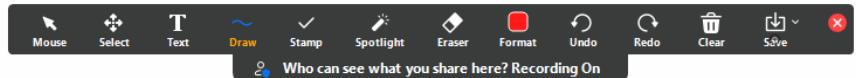
$$\tau = \{x/c\}$$

Note: The input to your theorem prover will be in a standard form like the above.

**Exercise 1:** rewrite the above in LISP representation.

**Exercise 2:** use resolution to derive **False**.

Yeah. But if you implement this in a program and assist to do this all in a very systematic manner, then expressions like this would be easily generated.



## Basic Theorem Proving Algorithm

### Level saturation resolution method (or two-pointer method)

Generate all possible resolvents:

- Generate sequences of clause sets  $S^0, S^1, S^2, \dots$ , where

$$S^0 = S \quad (\text{original set of clauses})$$

$$S^n = \{ \text{all possible resolvents of clauses} \\ C_1 \in (S^0 \cup \dots \cup S^{n-1}) \text{ and } C_2 \in S^{n-1} \}$$

- This is basically a **breadth first search** method, and it can be extremely inefficient except for small problems.
- The problem is that **irrelevant derivations** are made: in generating an n-step proof, we also generate **all possible derivations** of n-1 steps.

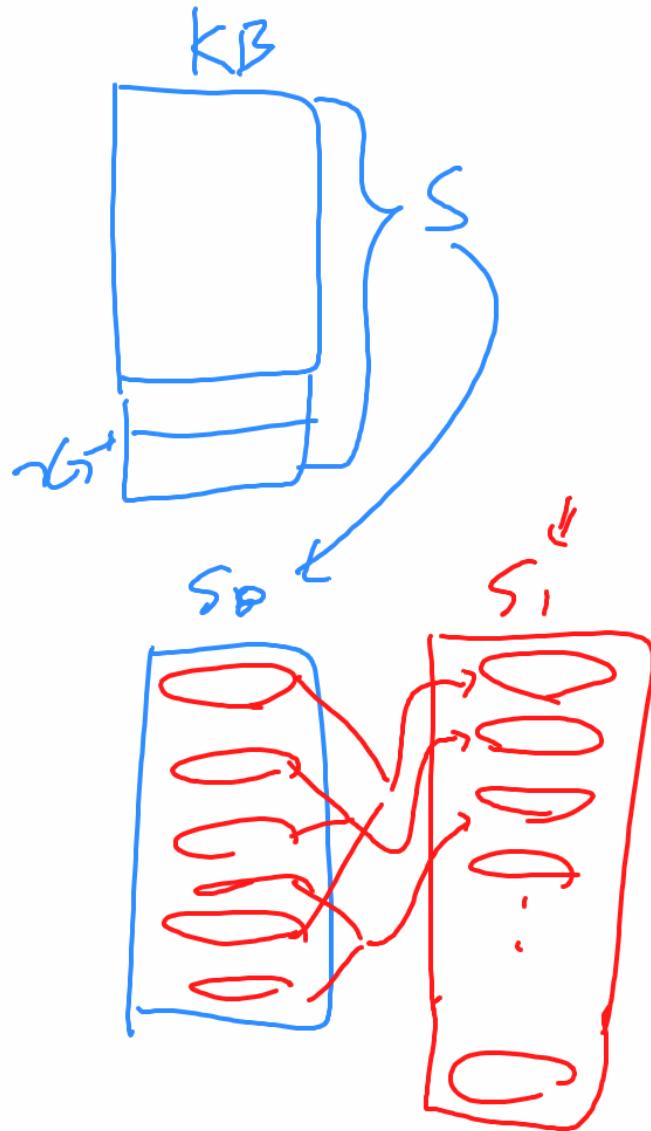
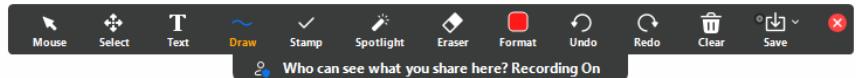
$n=1$

$n=1$

$$C_1 \in S^0 \cup \dots \cup S^{l-1} = S^0 \cup \dots \cup S^0 = S^0$$

0 resolve it. let's say these 2 are resolvable, and you plug it in

You are screen sharing Stop Share



## Basic Theorem Proving Algorithm

### Level saturation resolution method (or two-pointer method)

Generate all possible resolvents:

- Generate sequences of clause sets  $S^0, S^1, S^2, \dots$ , where
 
$$S^0 = S \quad (\text{original set of clauses})$$

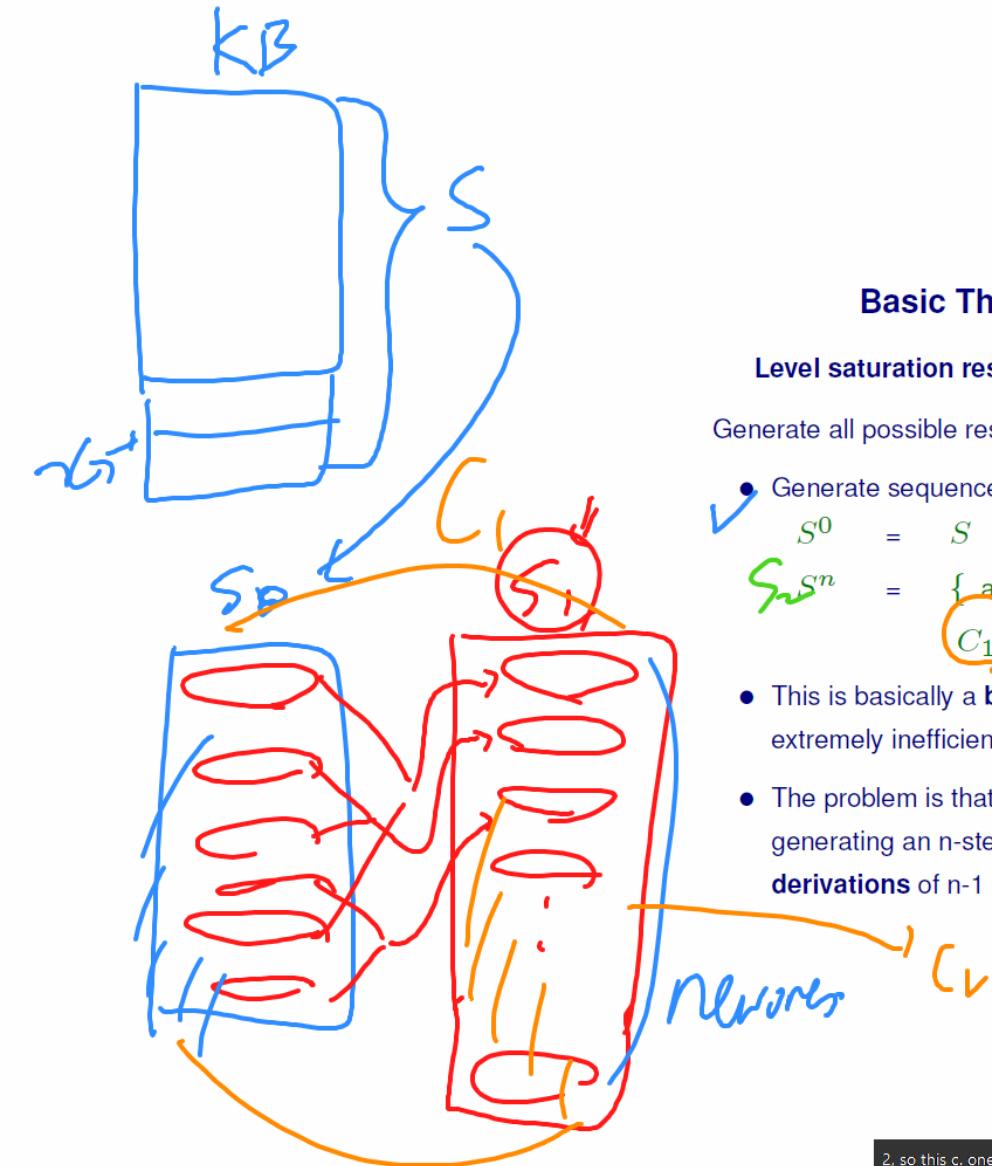
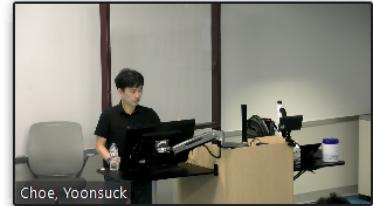
$$S^n = \{ \text{all possible resolvents of clauses} \\ C_1 \in (S^0 \cup \dots \cup S^{n-1}) \text{ and } C_2 \in S^{n-1} \}$$
- This is basically a **breadth first search** method, and it can be extremely inefficient except for small problems.
- The problem is that **irrelevant derivations** are made: in generating an  $n$ -step proof, we also generate **all possible derivations** of  $n-1$  steps.

$h=1$

$n=1$

$$C_1 \in S^0 \cup \dots \cup S^{h-1} = S^0 \cup \dots \cup S^0 = S^0$$

124



## Basic Theorem Proving Algorithm

### Level saturation resolution method (or two-pointer method)

Generate all possible resolvents:

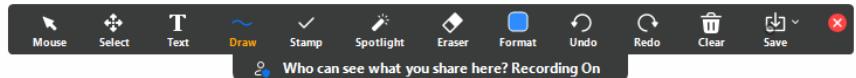
- Generate sequences of clause sets  $S^0, S^1, S^2, \dots$ , where
 
$$S^0 = S \quad (\text{original set of clauses})$$

$$S^n = \{ \text{all possible resolvents of clauses} \\ C_1 \in (S^0 \cup \dots \cup S^{n-1}) \text{ and } C_2 \in S^{n-1} \}$$
- This is basically a **breadth first search** method, and it can be extremely inefficient except for small problems.
- The problem is that **irrelevant derivations** are made: in generating an n-step proof, we also generate **all possible derivations** of n-1 steps.

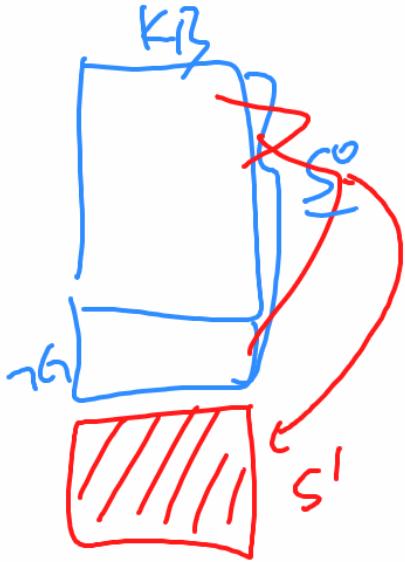
124

2, so this c. one will come from the entire set, and so on.

$$\begin{aligned}
 S_2 : \\
 C_1 &\in S^0 \cup \dots \cup S^{2-1} \\
 &= S^0 \cup S^1 \\
 C_2 &\in S^{2-1} = S^1
 \end{aligned}$$



Who can see what you share here? Recording On



## Basic Theorem Proving Algorithm

### Level saturation resolution method (or two-pointer method)

Generate all possible resolvents:

- Generate sequences of clause sets  $S^0, S^1, S^2, \dots$ , where

$$S^0 = S \quad (\text{original set of clauses})$$

$$S^n = \{ \text{all possible resolvents of clauses} \}$$

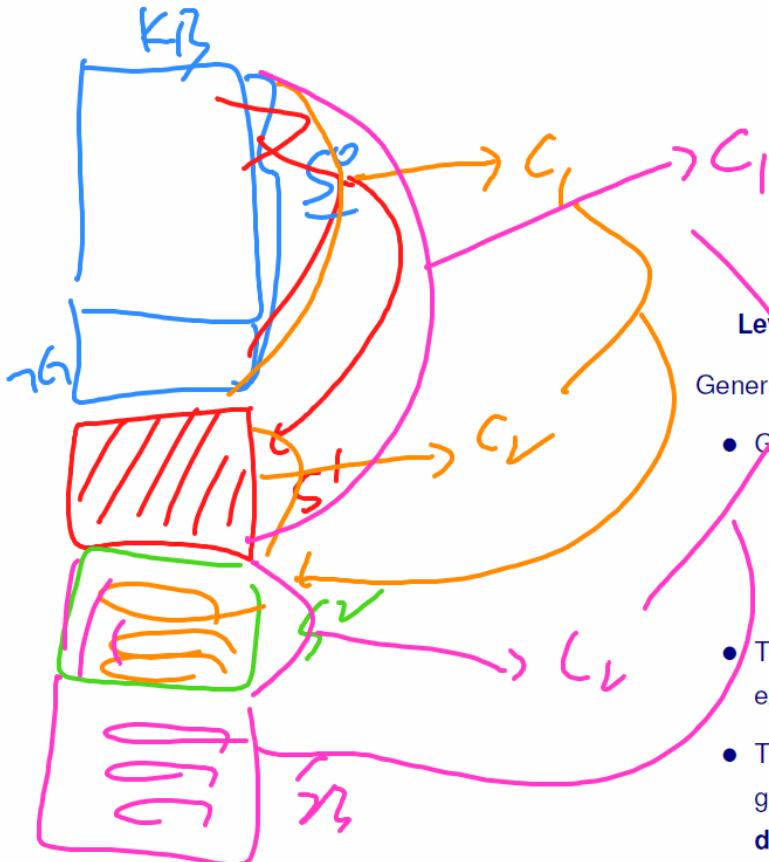
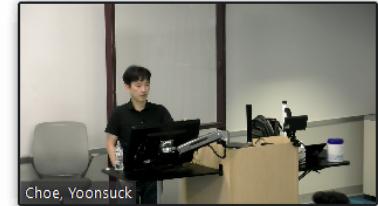
$$C_1 \in (S^0 \cup \dots \cup S^{n-1}) \text{ and } C_2 \in S^{n-1}$$

- This is basically a **breadth first search** method, and it can be extremely inefficient except for small problems.
- The problem is that **irrelevant derivations** are made: in generating an n-step proof, we also generate **all possible derivations** of n-1 steps.

124

So this would be now s one, and this is assume

You are screen sharing Stop Share



## Basic Theorem Proving Algorithm

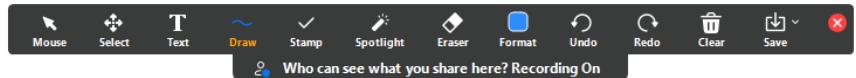
### Level saturation resolution method (or two-pointer method)

Generate all possible resolvents:

- Generate sequences of clause sets  $S^0, S^1, S^2, \dots$ , where
 
$$S^0 = S \quad (\text{original set of clauses})$$

$$S^n = \{ \text{all possible resolvents of clauses} \}$$

$$C_1 \in (S^0 \cup \dots \cup S^{n-1}) \text{ and } C_2 \in S^{n-1}$$
- This is basically a **breadth first search** method, and it can be extremely inefficient except for small problems.
- The problem is that **irrelevant** derivations are made: in generating an n-step proof, we also generate **all possible derivations** of n-1 steps.



## Deletion Strategy

To reduce the huge number of generated clauses, we would like to delete clauses whenever possible. We can delete:

1. Any tautology, e.g.  $R(a) \vee \neg P(a) \vee Q(x)$ .
2. Any clause which duplicates an existing clause.
3. Any clause which is subsumed by an existing clause.

A clause  $C$  subsumes a clause  $D$  iff there is a substitution  $\sigma$  such that  $C\sigma \subseteq D$  (recall that a clause can be represented as a set of literals).  $D$  is called a **subsumed clause**.

Deletion strategy will be complete if it is used with certain resolution algorithms (such as level saturation).

125

Sigma that's makes this close c a subset all that original, cool.

You are screen sharing Stop Share

ATM 22 FALL CSCE 420 501: ARTIFICIAL INTELLIGENCE Launch Meeting - Zoom canvas.tamu.edu/courses/171555 Who can see what you share here? Recording On

ATM 22 FALL CSCE 420 5... ATM 22 FALL CSCE 633 6... Video Conferencing...

**ATM** Home Syllabus Pages Files Assignments Grades Accessibility Report Core Curriculum Assessment Course Evaluations Mediasite Collection Announcements Modules Discussions People Outcomes Rubrics Quizzes Collaborations Settings

CS.Fall.2022

				UNIFORMED	4.3	4.3			gameplaying.pdf	
4	9/13/2022	9/15/2022	Game playing	Ch 5	Ch 5				slide02-search-and-gameplaying.pdf	
5	9/20/2022	9/22/2022	Propositional logic and theorem proving	Ch 7	Ch 7	hw2 announced	hw1 due 9/25 11:59pm	hw2 announced 9/25 11:59pm	slide03-logic	
6	9/27/2022	9/29/2022	First-order logic and theorem proving	Ch 8, 9	Ch 8, 9				slide03-logic	
7	10/4/2022	10/6/2022	First-order logic and theorem proving; Prolog; Planning;	Ch 8, 9	Ch 8, 9				slide03-logic, slide04-planning	
8	10/13/2022	no class	Midterm Exam (Thu, in class)	Ch 10	Ch 11	hw3 announced	hw2 due: 10/11 Tuesday 11:59pm!!	hw2 due: 10/11 Tuesday 11:59pm!!	10/10: midsemester grades due	
9	10/18/2022	10/20/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13					
10	10/25/2022	10/27/2022	Uncertainty and probabilistic reasoning	Ch 13, 14	Ch 12, 13					
11	11/1/2022	11/3/2022	Machine learning intro	Ch 18.1-18.2	Ch 19.1-19.2	hw4 announced	hw3 due	hw4 announced	hw3 due	
12	11/8/2022	11/10/2022	Machine learning : decision tree	Ch 18.3	Ch 19.3					
			Machine learning:	Ch	Do this.					11/18: O-

Fall Break

TODAY

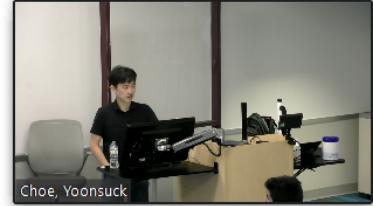
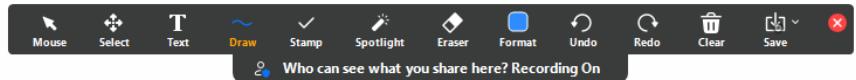
next Thu. Midterm exam!

HW#1 Solution TBA: this week.

Choe, Yoonsuck

You are screen sharing Stop Share

11:11 AM 10/4/2022



## Subsumed Clause: Example (I)

Example:

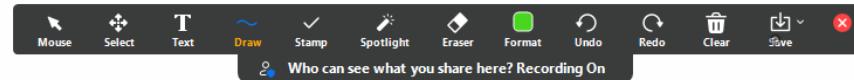
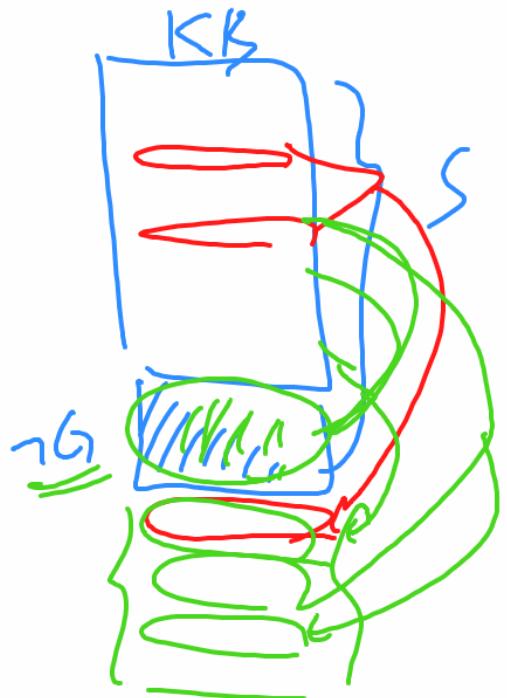
- $C = \underline{P(x)}$   $\sigma = \{x/a\}$
- $D = \underline{P(a)} \vee Q(a)$
- If  $\sigma = \{x/a\}$ , then  
 $C\sigma = P(a) = \{P(a)\}$   
 $\subseteq \{P(a), Q(a)\} = P(a) \vee Q(a) = D.$
- Since  $C\sigma \subseteq Q$ ,  $C$  subsumes  $D$ , and  $D$  can be deleted.

~~Skip~~

126

So maybe we'll skip this

You are screen sharing Stop Share



## Strategies to Improve Resolution

1. **Deletion strategy:** remove tautology, duplicates, and subsumed clauses.
2. **Unit preference:** resolve with clauses with the fewest literals.
3. **Set of support:** begin with set  $T$  consisting of the clauses from the **negated conclusion**. Each resolution step must involve a member of  $T$ , and the result is added to  $T$ .
4. **Linear resolution (Depth First):** Each step must be a resolution step involving the clause produced by the last step.

127

But again, now you have all of the issues with steps for search so it's not complete it's not up

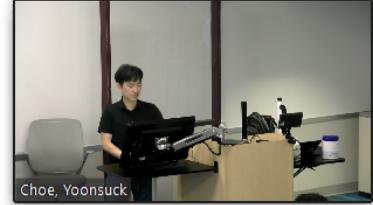
You are screen sharing Stop Share



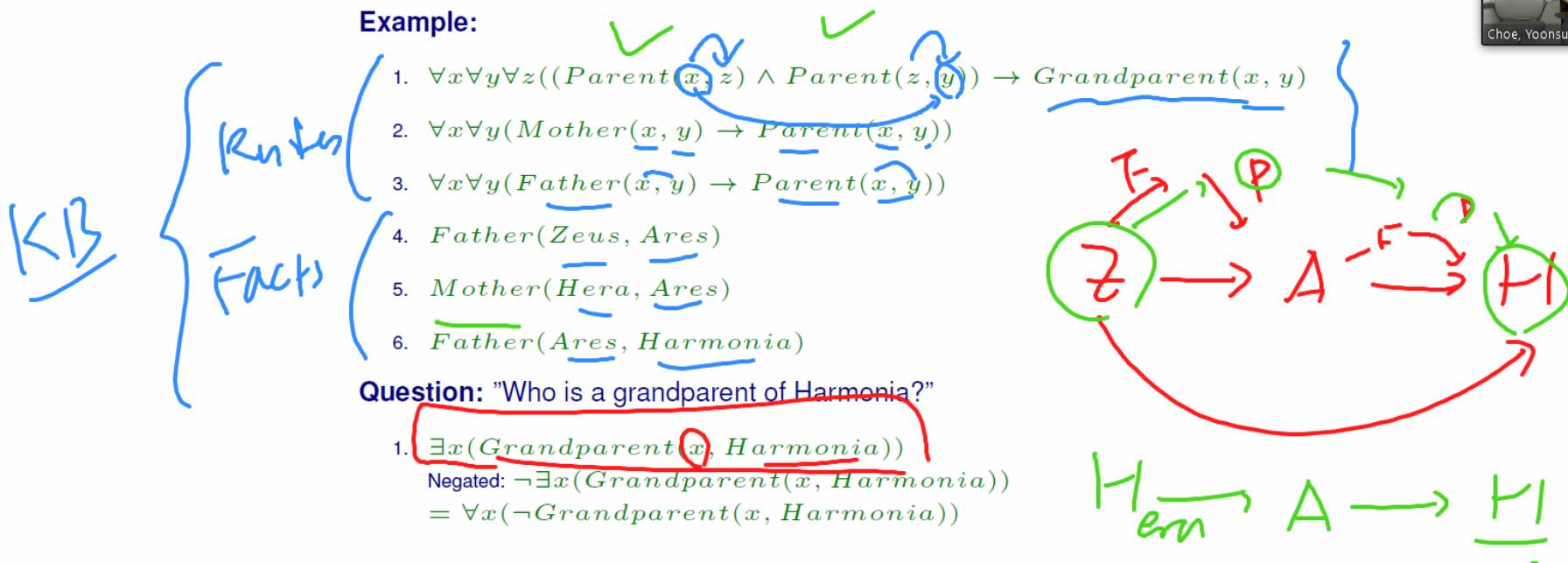
## Advantages and Disadvantages of Resolution

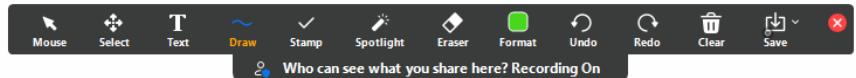
- **Advantages:** (1) Resolution is universally applicable to problems which can be described in first-order logic. (2) The theorem proving engine can be decoupled from any particular domain.
- **Disadvantage:** (1) Resolution is too inefficient to be generally applicable. (2) This is partly because resolution is purely syntactic, and it does not consider what the predicates mean. For this reason, developing a domain-dependent heuristic is impossible. (3) A contradiction in the axiom set may allow anything to be proved. (4) It is difficult for a human to understand proof by resolution prover.

Strength &  
Weakness



## Question Answering: Example





## Question Answering: Example

**Example:**

1.  $\forall x \forall y \forall z ((\text{Parent}(x, z) \wedge \text{Parent}(z, y)) \rightarrow \text{Grandparent}(x, y))$
2.  $\forall x \forall y (\text{Mother}(x, y) \rightarrow \text{Parent}(x, y))$
3.  $\forall x \forall y (\text{Father}(x, y) \rightarrow \text{Parent}(x, y))$
4.  $\text{Father}(\text{Zeus}, \text{Ares})$
5.  $\text{Mother}(\text{Hera}, \text{Ares})$
6.  $\text{Father}(\text{Ares}, \text{Harmonia})$

Skolemization

**Question:** "Who is a grandparent of Harmonia?"

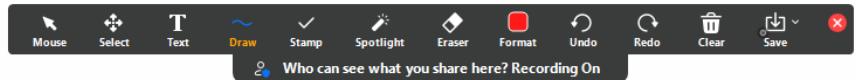
1.  $\exists x (\text{Grandparent}(x, \text{Harmonia}))$
- Negated:  $\neg \exists x (\text{Grandparent}(x, \text{Harmonia}))$   
 $= \forall x (\neg \text{Grandparent}(x, \text{Harmonia}))$



130

So by just looking at when the substitution was made, and  
who was substituted in

You are screen sharing Stop Share



## Question Answering: Result

- Resolution on the previous example generates **False** in the end, but what that answers is the question “**Is there a grandparent of Harmonia?**”. Of course the answer is **yes**, but the question is **who?**
- The negated question in the above examples was  $\neg \text{Grandparent}(x, \text{Harmonia})$ . Clearly, the binding which  $x$  ultimately receives is the desired answer!
- Observation: one substitution along the way, starting from  $\neg \text{Grandparent}(x, \text{Harmonia})$ , the negated conclusion, is  $\{x/\text{Hera}\}$ , thus **Hera** must be an answer.

**Exercise:** use resolution to derive **False** in the example in the previous slide.



## Answer Extraction

We can introduce special predicates to extract the answers.

- Answer predicate: *Hera*

$\neg \text{Grandparent}(x, \text{Harmonia}) \vee \text{Answer}(x)$

- The answer predicate has these properties:

- It does not resolve with anything, but it keeps track of variable bindings.
- The theorem prover recognizes a clause consisting only of the *Answer* predicate as **False**.

- For example, resolution on the previous example results in:

*Answer(Hera)*

as the final clause.

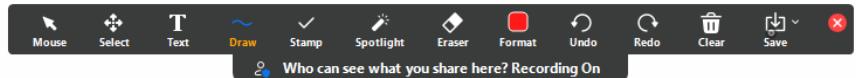


*Answer(Hera)*

132

Then they'll now become your answer because this is a very simple approach, because, using this, you can only extract

You are screen sharing Stop Share



① Add facts first

↳ group them.

Example:

### Question Answering: Example



1.  $\forall x \forall y \forall z ((\text{Parent}(x, z) \wedge \text{Parent}(z, y)) \rightarrow \text{Grandparent}(x, y))$

2.  $\forall x \forall y (\text{Mother}(x, y) \rightarrow \text{Parent}(x, y))$

3.  $\forall x \forall y (\text{Father}(x, y) \rightarrow \text{Parent}(x, y))$

4.  $\text{Father}(\text{Zeus}, \text{Ares})$

5.  $\text{Mother}(\text{Hera}, \text{Ares})$

6.  $\text{Father}(\text{Ares}, \text{Harmonia})$

Question: "Who is a grandparent of Harmonia?"

1.  $\exists x (\text{Grandparent}(x, \text{Harmonia}))$

2. Negated:  $\neg \exists x (\text{Grandparent}(x, \text{Harmonia}))$   
 $= \forall x (\neg \text{Grandparent}(x, \text{Harmonia}))$

f. M

↳ P



```
linux2.cse.tamu.edu - PuTTY
> refer to Texas A&M University System Policy 29.01.03.
| To report an issue with this machine please email: linux-engr-hel
| du and include your department, netid, computer location and comp
| ****
| ****
| If you get the error message: Failed to create home directory
| Then you will need to first create your home directory. Directori
| ble in your browser by visiting the following web page: http://bi
| medoc
|
| COMPUTER NAME: linux2.cs.tamu.edu
|
| End of banner message from server
| choe@sun.cs.tamu.edu's password:
linux2:/home/faculty/c/choe> gprolog
GNU Prolog 1.4.4 (64 bits)
Compiled Jan 15 2014, 20:38:19 with gcc
By Daniel Diaz
Copyright (C) 1999-2013 Daniel Diaz
| ?- [user].
compiling user for byte code...
```

① Add facts

$$A \vee B \rightarrow C$$

## Question Answering: Example

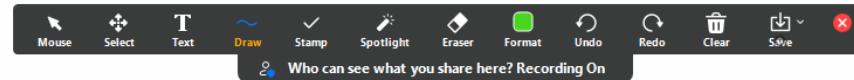
Example:

$$\neg A \vee B.$$

1.  $\forall x \forall y \forall z ((\text{Parent}(x, z) \wedge \text{Parent}(z, y)) \rightarrow \text{Grandparent}(x, y))$
2.  $\forall x \forall y (\text{Mother}(x, y) \rightarrow \text{Parent}(x, y))$
3.  $\forall x \forall y (\text{Father}(x, y) \rightarrow \text{Parent}(x, y))$
4.  $\text{Father}(\text{Zeus}, \text{Ares})$
5.  $\text{Mother}(\text{Hera}, \text{Ares})$
6.  $\text{Father}(\text{Ares}, \text{Harmonia})$

Question: "Who is a grandparent of Harmonia?"

1.  $\exists x (\text{Grandparent}(x, \text{Harmonia}))$
- Negated:  $\neg \exists x (\text{Grandparent}(x, \text{Harmonia}))$   
 $= \forall x (\neg \text{Grandparent}(x, \text{Harmonia}))$



```
linux2.cse.tamu.edu - PuTTY
> refer to Texas A&M University System Policy 29.01.03.
| To report an issue with this machine please email: linux-engr-hel
| du and include your department, netid, computer location and comp
| ****
| If you get the error message: Failed to create home directory
| Then you will need to first create your home directory. Directori
| ble in your browser by visiting the following web page: http://bi
| medoc
|
| COMPUTER NAME: linux2.cs.tamu.edu
|
| End of banner message from server
| choe@sun.cs.tamu.edu's password:
linux2:/home/faculty/c/choe> gprolog
GNU Prolog 1.4.4 (64 bits)
Compiled Jan 15 2014, 20:38:19 with gcc
By Daniel Diaz
Copyright (C) 1999-2013 Daniel Diaz
| ?- [user].
compiling user for byte code...
```

130

And then this is all

You are screen sharing Stop Share

ATM 22 FALL CSCE 420 501: ARTIFICIA × Launch Meeting - Zoom × | +

canvas.tamu.edu/courses/171555

Who can see what you share here? Recording On

Mouse Select T Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

CS.Fall.2022

**Home**

Syllabus

Pages

**Files** (circled)

Assignments

Grades

Accessibility Report

Core Curriculum

Assessment

Course Evaluations

Mediasite Collection

Announcements

Modules

Discussions

People

Outcomes

Rubrics

Quizzes

Collaborations

Settings

Quick links and info:

- Office hours:
  - Instructor: TF 2:30pm-4:00pm [\[Zoom\]](#)
  - TA: Jin Hyun Park, [jinhyun.park@tamu.edu](mailto:jinhyun.park@tamu.edu); MWF 9:30am-11:00am, [\[Zoom\]](#)
  - Grader: Vicente Balmaseda, [vibalcam@tamu.edu](mailto:vibalcam@tamu.edu) (grading related questions only)
- Lecture notes: [\[Lecture notes folder\]](#)
- Lecture recordings: [\[Link\]](#)
- Practice Exams: [\[TBA\]](#); Exam Rules [\[Link\]](#)

NEWS:

- [09/26] Homework 2 announced [\[Link\]](#)
  - IMPORTANT: Homework 2 is due on Tuesday! Right before the midterm exam.
  - Homework 2 does not include programming.
- [09/26]: slide04-planning uploaded [\[Lecture notes folder\]](#)
- [09/04]: Practice exams uploaded [\[Link\]](#)
  - Note: solutions will not be provided.
- [08/31]: Homework 1 announced [\[Link\]](#)
- [08/30]: Philosopher AI sample results [\[Link\]](#)
- [08/25]:
  - Lecture notes and screenshots: [\[Lecture notes folder\]](#)
  - Lecture recordings: [\[Link\]](#)

Weekly Schedule and Deadlines

Week	Tuesday	Thursday	Topic	Reading (3rd ed)	4th (ed)	Announcements	Dues	Lecture notes [Folder]	Comment
1	no class	8/25/2022	Introduction	Ch 1, 26.1, 26.2	Ch 1, 27.1, 27.2			slide01.pdf	
2	8/30/2022	9/1/2022	Search (uninformed)	Ch 3.1-3.6	Ch 3.1-3.6	hw1 announced Okay.		slide02-search-and-gameplaying.pdf	8/30: last day for add/drop

View Course Stream

Course Setup Checklist

New Announcement

New Analytics

View Course Notifications

To Do

92 Grade Homework 1 100 points • Sep 25 at 11:59pm

2 Grade Homework 2 100 points • Oct 11 at 11:59pm

Coming Up

View Calendar

Nothing for the next week

You are screen sharing Stop Share

https://canvas.tamu.edu/courses/171555/gradebook/speed\_grader?assignment\_id=1425199

11:12 AM 10/4/2022

ATM 22 FALL CSCE 420 501: ARTIFICIA × Launch Meeting - Zoom × | +

canvas.tamu.edu/courses/171555

Who can see what you share here? Recording On

Mouse Select T Draw Stamp Spotlight Eraser Format Undo Redo Clear Save

CS.Fall.2022

**Home**

Syllabus

Pages

**Files** (circled)

Assignments

Grades

Accessibility Report

Core Curriculum

Assessment

Course Evaluations

Mediasite Collection

Announcements

Modules

Discussions

People

Outcomes

Rubrics

Quizzes

Collaborations

Settings

Quick links and info:

- Office hours:
  - Instructor: TF 2:30pm-4:00pm [\[Zoom\]](#)
  - TA: Jin Hyun Park, [jinhyun.park@tamu.edu](mailto:jinhyun.park@tamu.edu); MWF 9:30am-11:00am, [\[Zoom\]](#)
  - Grader: Vicente Balmaseda, [vibalcam@tamu.edu](mailto:vibalcam@tamu.edu) (grading related questions only)
- Lecture notes: [\[Lecture notes folder\]](#)
- Lecture recordings: [\[Link\]](#)
- Practice Exams: [\[TBA\]](#); Exam Rules [\[Link\]](#)

NEWS:

- [09/26] Homework 2 announced [\[Link\]](#)
  - IMPORTANT: Homework 2 is due on Tuesday! Right before the midterm exam.
  - Homework 2 does not include programming.
- [09/26]: slide04-planning uploaded [\[Lecture notes folder\]](#)
- [09/04]: Practice exams uploaded [\[Link\]](#)
  - Note: solutions will not be provided.
- [08/31]: Homework 1 announced [\[Link\]](#)
- [08/30]: Philosopher AI sample results [\[Link\]](#)
- [08/25]:
  - Lecture notes and screenshots: [\[Lecture notes folder\]](#)
  - Lecture recordings: [\[Link\]](#)

Weekly Schedule and Deadlines

Week	Tuesday	Thursday	Topic	Reading (3rd ed)	4th (ed)	Announcements	Dues	Lecture notes [Folder]	Comment
1	no class	8/25/2022	Introduction	Ch 1, 26.1, 26.2	Ch 1, 27.1, 27.2			slide01.pdf	
2	8/30/2022	9/1/2022	Search (uninformed)	Ch 3.1-3.6	Ch 3.1-3.6	hw. And also it's very important to read the exam rules very carefully, and	slide02-search-gameplaying.pdf	8/30; last add/drop	

You are screen sharing Stop Share

11:12 AM 10/4/2022



63 Student View

CS.Fall.2022

View All Pages

Published

Edit

⋮



Choe, Yoonsuck

Home

Syllabus

Pages

Files

Assignments

Grades

Accessibility Report

Core Curriculum

Assessment

Course Evaluations

Mediasite Collection

Announcements

Modules

Discussions

People

Outcomes

Rubrics

Quizzes

Collaborations

Settings

## Exam Rules

Please read these instructions very carefully.

1. Bring your TAMU ID or driver's license. You will not be allowed to take the exam without your ID.
2. This is a closed book exam. Phone / calculator use is prohibited. Put those in your bag.
3. You may prepare 1 sheet (US letter size = printer paper, both sides) of hand-written notes, for reference during the exam
  - PLEASE use US letter paper (printer paper: 11in x 8.5in). Do not use pages ripped off from your notebook.
  - Must be hand-written! Printouts, photocopies will be confiscated.
    - Exception: notes directly hand-written on iPad or tablet with reasonable text size may be printed out and used
  - Submit your notes with your exam.
  - Write your name at the top left corner of both sides.
    - Notes without the name will be confiscated.
4. Blank scratch paper will be provided. You are only allowed to use the provided scratch paper.
  - DO NOT write your answers on the scratch paper. Those will not be graded.
5. Exam materials:
  - Exam materials will only be from the lecture notes and notes written on the screen during the lecture (screenshots), and from the homeworks.
    - Midterm: materials up to and including those covered by the lecture prior to the midterm exam.
    - Final exam: It will not be cumulative. Materials will be those covered after the midterm exam.
6. Practice exams:
  - Some materials on the practice exams have not been covered during this semester. These will not be on the exam.

Details are here, and extend material will be as I

You are screen sharing Stop Share

ATM 22 FALL CSCE 420 501: ARTIFICIAL INTELLIGENCE

ATM 22 FALL CSCE 420 501: ARTIFICIAL INTELLIGENCE

Launch Meeting - Zoom

canvas.tamu.edu/courses/171555

ATM 22 FALL CSCE 420 5... ATM 22 FALL CSCE 633 6... Video Conferencing...

Mouse
Select
T
Draw
✓
Stamp
Spotlight
Eraser
Format
Undo
Redo
Clear
Save

Who can see what you share here? Recording On

CS.Fall.2022

- [Home](#)
- [Syllabus](#)
- [Pages](#)
- [Files](#)
- [Assignments](#)
- [Grades](#)
- [Accessibility Report](#)
- [Core Curriculum Assessment](#)
- [Course Evaluations](#)
- [Mediasite Collection](#)
- [Announcements](#)
- [Modules](#)
- [Discussions](#)
- [People](#)
- [Outcomes](#)
- [Rubrics](#)
- [Quizzes](#)
- [Collaborations](#)
- [Settings](#)

Week	Tuesday	Thursday	Topic	Reading (3rd ed)	4th (ed)	Announcements	Dues	Lecture notes [Folder]	Comment
1	no class	8/25/2022	Introduction	Ch 1, 26.1, 26.2	Ch 1, 27.1, 27.2			slide01.pdf	
2	8/30/2022	9/1/2022	Search (uninformed)	Ch 3.1-3.6	Ch 3.1-3.6	hw1 announced		slide02-search-and-gameplaying.pdf	8/30: last day for add/drop
3	9/6/2022	9/8/2022	Search (informed)	Ch 4.1-4.3	Ch 4.1-4.3			slide02-search-and-gameplaying.pdf	
4	9/13/2022	9/15/2022	Game playing	Ch 5	Ch 5			slide02-search-and-gameplaying.pdf	
5	9/20/2022	9/22/2022	Propositional logic and theorem proving	Ch 7	Ch 7	hw2 announced	hw1 due 9/25 11:59pm	slide03-logic	
6	9/27/2022	9/29/2022	First-order logic and theorem proving	Ch 8, 9	Ch 8, 9			slide03-logic	
7	10/4/2022	10/6/2022	First-order logic and theorem proving; Prolog ; Planning;	Ch 8, 9	Ch 8, 9			slide03-logic, slide04-planning	
8	no class	10/13/2022	Midterm Exam (Thu, in class)	Ch 10	Ch 11	hw3 announced	hw2 due: 10/11 Tuesday 11:59pm!!		10/10: midsemester grades due
9	10/18/2022	10/20/2022	Uncertainty and probabilistic	Ch 13, 14	Ch 12, 13	I'll send out a separate announcement just to put it on the back			



Choel, Yoonsuck

Exam range  
 sl:de01  
 ~sl:de03 (propositional logic)

You are screen sharing
Stop Share

Windows
Type here to search
File Explorer

11:13 AM
10/4/2022