Logical Story Representations via FrameNet + Semantic Parsing

Lane Lawley and Lenhart Schubert

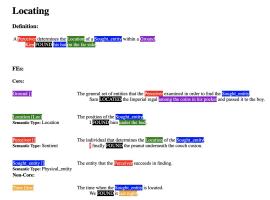
Schema/Script Representations

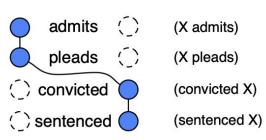
FrameNet:

- Rich semantics (inheritance, composition)
- Comprehensive semantic roles
- Difficult to create new frames
- Not directly usable for inference

Chambers & Jurafsky-style scripts:

- Easy to acquire from large text corpora
- Inexpressive event representation
- Simple, linear structure





Episodic Logic (EL) schemas

EL schemas use a rich, formal logic designed to closely resemble English syntax.

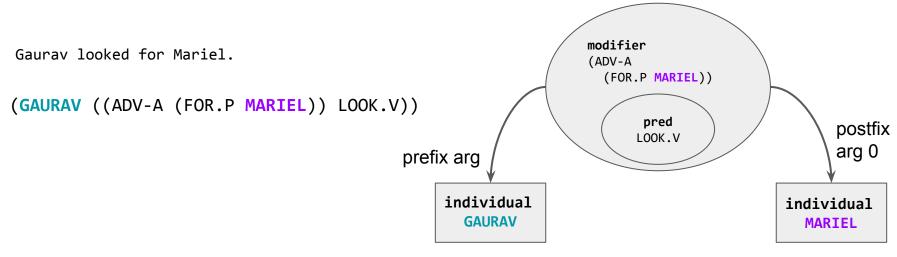
Gaurav looked for Mariel.

(GAURAV ((ADV-A (FOR.P MARIEL)) LOOK.V))

Schemas are collections of expressive logical formulas with shared variables to aid with inference.

Episodic Logic (EL) schemas

EL schemas use a rich, formal logic designed to closely resemble English syntax.



Schemas are collections of expressive logical formulas with shared variables to aid with inference.

```
(EPI-SCHEMA ((?X GO.2.V ?L) ** ?E)
      :Roles
             !R1 (?B BOOK.N)
             !R2 (?X PERSON.N)
             !R3 (?L LIBRARY.N)
      :Steps
             ?E1 (?X GO.V ?L)
             ?E2 (?X ((ADV-A (FOR.P ?B)) LOOK.V))
             ?E3 (?X FIND.V ?B)
             ?E4 (?X READ.V ?B)
      :Episode-relations
             !W1 (?E1 BEFORE ?E2)
             !W2 (?E2 BEFORE ?E3)
             !W3 (?E3 BEFORE ?E4)
      :Subordinate-constraints
             !S1 ((?E3-> ?Y) = ?L)
```

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Bootstrap schema learning with simple "protoschemas" (e.g. FIND.V)

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      :Roles
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```

Protoschemas

- Biological functions (eating, sleeping, etc.)
- Self-motion
- Transportation of objects
- Possession
- Object manipulation
- Social interaction (questions, asking for favors, etc.)

Schema Learning

Bootstrapping with protoschemas lets us progressively build more complex schemas...

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Bootstrapping with protoschemas lets us progressively build more complex schemas...

...but how do we get the initial protoschemas from text?

```
(?P TRAVEL.V ?D)
```

```
(?P TRAVEL.V ?D)
```

He went home.

```
(?P TRAVEL.V ?D)
```

He went home.

He ran to the store.

```
(?P TRAVEL.V ?D)
```

He went home.

He ran to the store.

He was on his way.

(?P TRAVEL.V ?D)

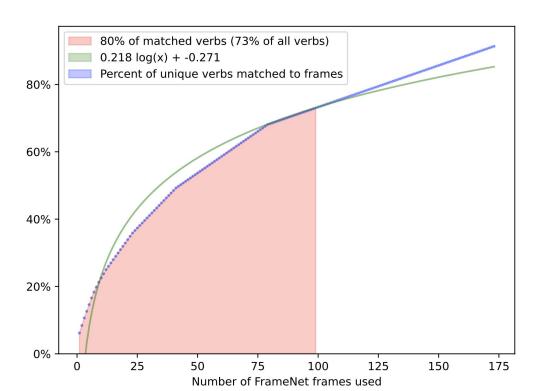
We need a non-brittle NL-to-schema invocation identifier.

He went home.

He ran to the store.

He was on his way.

Like how protoschemas should cover most actions, a relatively small set of FN frames covers a relatively large number of verbs.



These most frequent FN frames inspire some basic protoschemas:

Motion

Self_motion

Experiencer_focus

Perception_experience

Arriving

Locating

Request

Bringing

Ingestion

• • •

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These most frequent FN frames inspire some basic protoschemas:

Locating

```
Definition:
A Perceiver determines the Location of a Sought entity within a Ground.
      Kim FOUND his hat on the far side.
FEs:
Core:
Ground []
                                The general set of entities that the Perceiver examined in order to find the Sought entity.
                                      Sam LOCATED the Imperial regal among the coins in his pocket and passed it to the boy.
                                The position of the Sought_entity.
Location [Loc]
                                       I FOUND him under the bed
Semantic Type: Location
                                The individual that determines the Location of the Sought entity
Perceiver []
                                      finally FOUND the peanut underneath the couch cusion.
Semantic Type: Sentient
Sought entity []
                                The entity that the Perceiver succeeds in finding.
Semantic Type: Physical_entity
Non-Core:
```

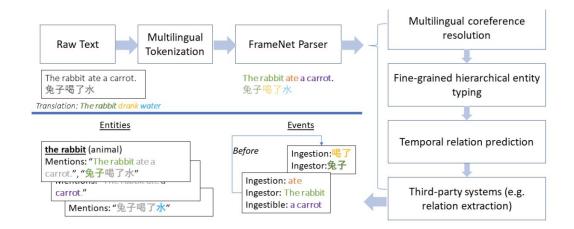
The time when the Sought_entity is located.

We FOUND it last night.

```
(EPI-SCHEMA ((?P FIND.V ?0) ** ?E)
      :Roles
             !R2 (?P PERSON.N)
             !R3 (?O OBJECT.N)
             !R3 (?Y LOCATION.N)
       :Preconditions
             ?I1 (?O AT.P ?Y)
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Using FrameNet parsing to match protoschemas

LOME is a state-of-the-art information extraction system with FrameNet parsing at its core.



LOME: Large Ontology Multilingual Extraction

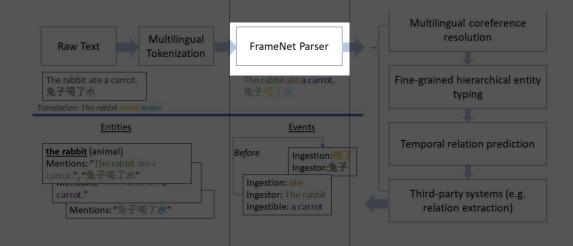
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Yunmo Chen¹, Tongfei Chen¹, Chandler May¹, Craig Harman¹
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This Work

1. Align FN parses with EL parses, situating semantic roles in logical domain

2. Map enriched FN frames to EL protoschemas

Aligning FN parses with EL parses

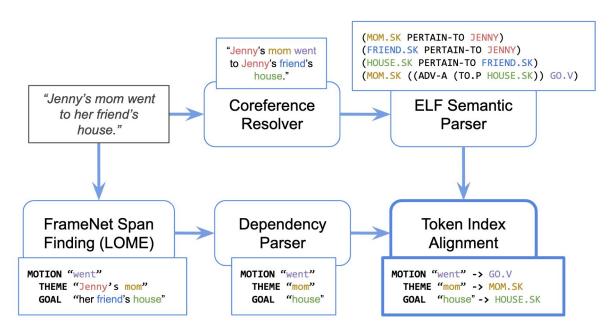


Figure 2: The architecture of the system. Raw story text is fed along two tracks: the logical-semantic parsing track, shown along the top, and the FrameNet parsing track, shown along the bottom. The FrameNet text spans are reduced to direct object tokens and correlated with logical individuals in the ELF parse via token index matching.

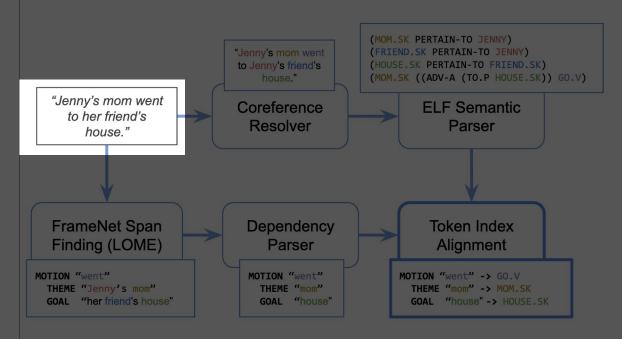


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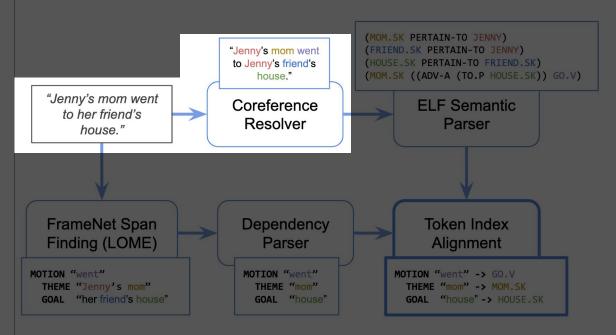


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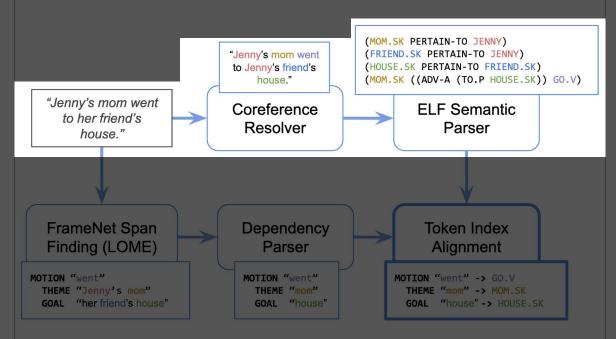


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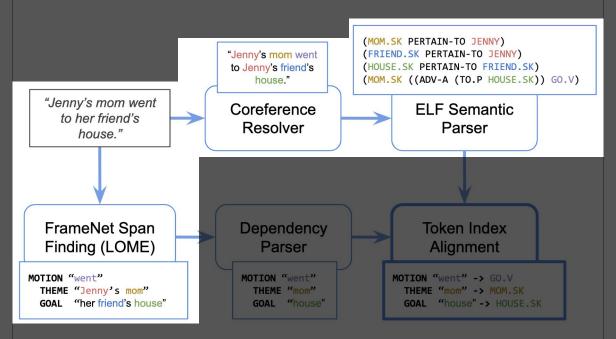


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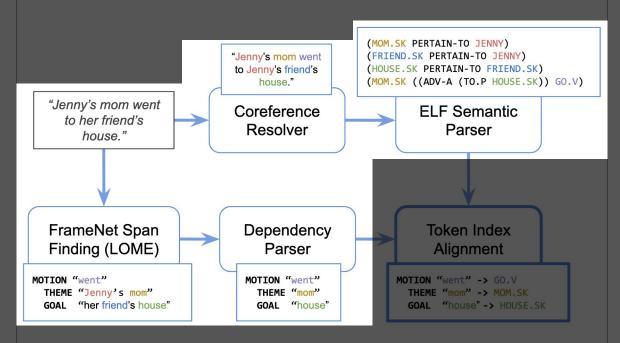


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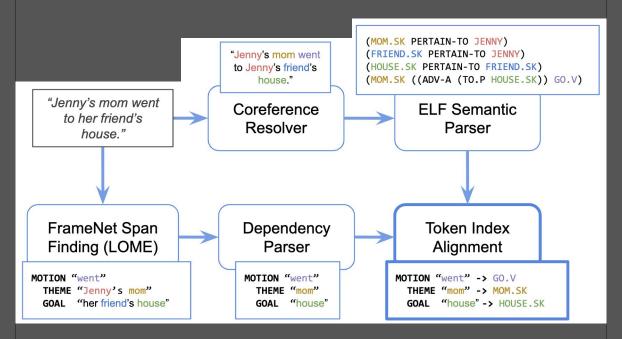


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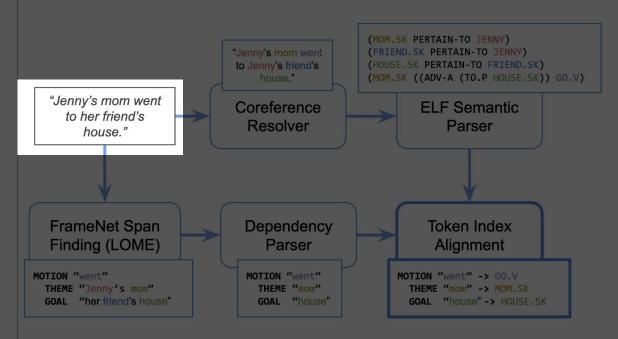


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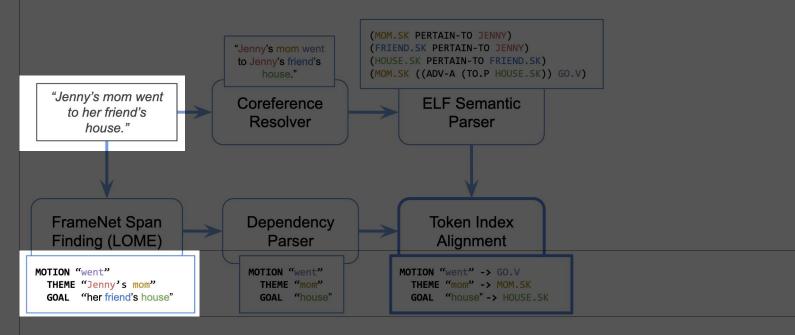


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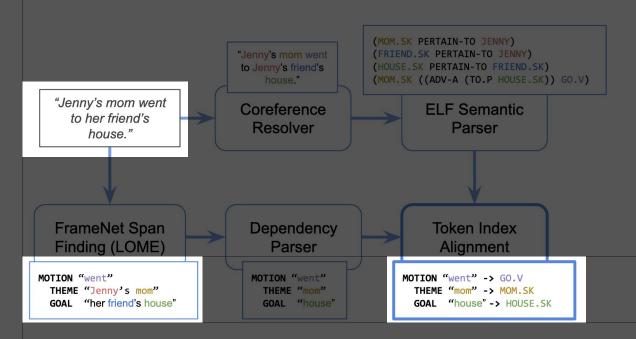


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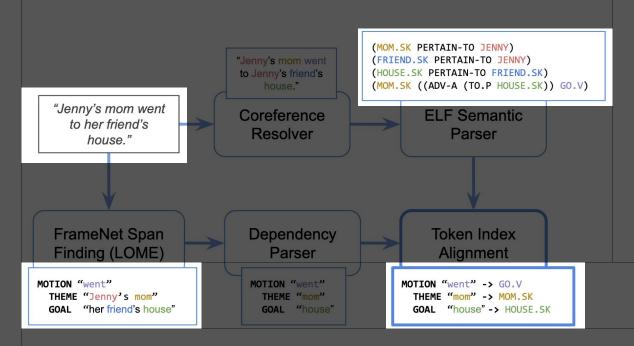


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MOTION GO.V

THEME MOM.SK

GOAL HOUSE.SK

MOTION GO.V
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GOAL HOUSE.SK

(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)

```
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THEME MOM.SK
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```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
       :Goals
             ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
       :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                        pre-arg
                        (theme (if not event))
                ((?s source)
                        (adv from.p)
                        (source (if not event))
                        path
                ((?d goal)
                        (adv to.p)
                        (post-arg (1 of any))
                        (goal (if not event))
                        path
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             ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
       :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                       pre-arg
                       (theme (if not event))
                ((?s source)
                       (adv from.p)
                       (source (if not event))
                       path
                ((?d goal)
                       (adv to.p)
                       (post arg (1 of any))
                       (goal (if not event))
                       path
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
       :Goals
             ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
       :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                       pre-arg
                       (theme (if not event))
                ((?s source)
                       (adv from.p)
                       (source (if not event))
                       path
                ((?d goal)
                       (adv to.p)
                       (post arg (1 of any))
                       (goal (if not event))
                       path
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
       :Goals
             ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
       :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                       pre-arg
                       (theme (if not event))
                ((?s source)
                       (adv from.p)
                       (source (if not event))
                       path
                ((?d goal)
                       (adv to.p)
                       (post arg (1 of any))
                       (goal (if not event))
                       path
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
       :Roles
              <del>!R</del>♪(?X PERSON.N)
              IR3 (?D LOCATION.N)
              !R3 (?S LOCATION.N)
       :Goals
              ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
              ?I1 (NOT (?X AT.P ?D))
              ?I2 (?X AT.P ?S)
       :Postconditions
              ?P1 (NOT (?X AT.P ?S))
              ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                       pre-arg
                       (theme (if not event))
                ((?s source)
                       (adv from.p)
                       (source (if not event))
                       path
                ((?d goal)
                       (adv to.p)
                       (post arg (1 of any))
                       (goal (if not event))
                       path
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
       :Goals
             ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
       :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
       :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
MOTION GO.V
THEME MOM.SK
GOAL HOUSE.SK
```

```
(motion * -> travel.v
                ((?x theme)
                       pre-arg
                       (theme (if not event))
                ((?s source)
                       (adv from.p)
                       (source (if not event))
                       path
                ((?d goal)
                       (adv to.p)
                       (post arg (1 of any))
                       (goal (if not event))
                       path
MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
      :Goals
           ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
      :Preconditions
             ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
             ?I2 (MOM.SK AT.P ?S)
      :Postconditions
             ?P1 (NOT (MOM.SK AT.P ?S))
             ?P2 (MOM.SK AT.P HOUSE.SK)
```

```
(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
      :Goals
           ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
      :Preconditions
             ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
             ?I2 (MOM.SK AT.P ?S)
      :Postconditions
             ?P1 (NOT (MOM.SK AT.P ?S))
```

?P2 (MOM.SK AT.P HOUSE.SK)

```
(MOM.SK PERTAIN-TO JENNY)

(FRIEND.SK PERTAIN-TO JENNY)

(HOUSE.SK PERTAIN-TO FRIEND.SK)

(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)
```

```
:Roles
      !R1 (MOM.SK PERSON.N)
      !R2 (HOUSE.SK LOCATION.N)
      !R3 (?S LOCATION.N)
:Goals
     ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
:Preconditions
      ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
      ?I2 (MOM.SK AT.P ?S)
:Postconditions
      ?P1 (NOT (MOM.SK AT.P ?S))
      ?P2 (MOM.SK AT.P HOUSE.SK)
```

(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)

```
(MOM.SK PERTAIN-TO JENNY)
(FRIEND.SK PERTAIN-TO JENNY)
(HOUSE.SK PERTAIN-TO FRIEND.SK)
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)

(MOM.SK MOM.N)
(FRIEND.SK FRIEND.N)
(HOUSE.SK HOUSE.N)
```

```
(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
       :Goals
           ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
      :Preconditions
             ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
             ?I2 (MOM.SK AT.P ?S)
      :Postconditions
             ?P1 (NOT (MOM.SK AT.P ?S))
```

?P2 (MOM.SK AT.P HOUSE.SK)

```
(MOM.SK PERTAIN-TO JENNY)
(FRIEND.SK PERTAIN-TO JENNY)
(HOUSE.SK PERTAIN-TO FRIEND.SK)
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)

(MOM.SK MOM.N)
(FRIEND.SK FRIEND.N)
(HOUSE.SK HOUSE.N)
```

```
:Roles
      !R1 (MOM.SK PERSON.N)
      !R2 (HOUSE.SK LOCATION.N)
      !R3 (?S LOCATION.N)
      !R4 (MOM.SK MOM.N)
      !R5 (HOUSE.SK HOUSE.N)
      !R6 (MOM.SK PERTAIN-TO JENNY)
      !R7 (HOUSE.SK PERTAIN-TO FRIEND.SK)
      !R8 (FRIEND.SK FRIEND.N)
      !R9 (FRIEND.SK PERTAIN-TO JENNY)
:Goals
     ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
:Preconditions
      ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
      ?I2 (MOM.SK AT.P ?S)
:Postconditions
      ?P1 (NOT (MOM.SK AT.P ?S))
      ?P2 (MOM.SK AT.P HOUSE.SK)
```

(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)

```
(MOM.SK PERTAIN-TO JENNY)
(FRIEND.SK PERTAIN-TO JENNY)
(HOUSE.SK PERTAIN-TO FRIEND.SK)
(MOM.SK ((ADV-A (TO.P HOUSE.SK)) GO.V)

(MOM.SK MOM.N)
(FRIEND.SK FRIEND.N)
(HOUSE.SK HOUSE.N)
```

```
(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (MOM.SK MOM.N)
             !R5 (HOUSE.SK HOUSE.N)
             !R6 (MOM.SK PERTAIN-TO JENNY)
             !R7 (HOUSE.SK PERTAIN-TO FRIEND.SK)
             !R8 (FRIEND.SK FRIEND.N)
             !R9 (FRIEND.SK PERTAIN-TO JENNY)
      :Goals
           ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
      :Preconditions
             ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
             ?I2 (MOM.SK AT.P ?S)
```

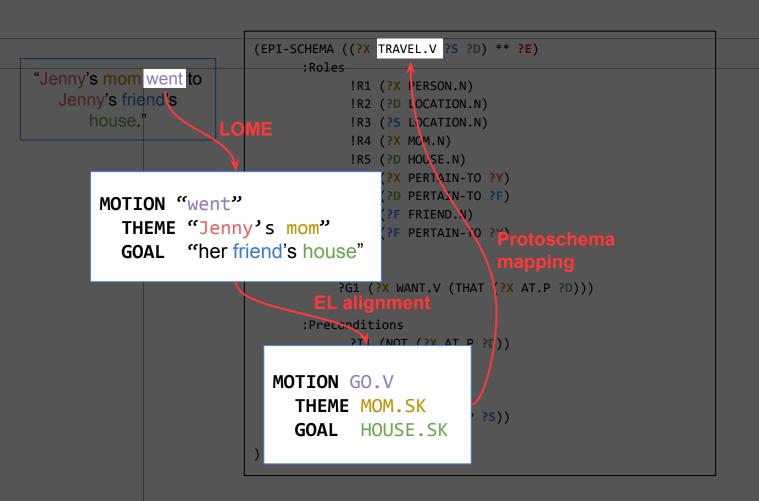
?P1 (NOT (MOM.SK AT.P ?S))
?P2 (MOM.SK AT.P HOUSE.SK)

:Postconditions

```
(EPI-SCHEMA ((MOM.SK TRAVEL.V ?S HOUSE.SK) ** ?E)
      :Roles
             !R1 (MOM.SK PERSON.N)
             !R2 (HOUSE.SK LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (MOM.SK MOM.N)
             !R5 (HOUSE.SK HOUSE.N)
             !R6 (MOM.SK PERTAIN-TO JENNY)
             !R7 (HOUSE.SK PERTAIN-TO FRIEND.SK)
             !R8 (FRIEND.SK FRIEND.N)
             !R9 (FRIEND.SK PERTAIN-TO JENNY)
      :Goals
           ?G1 (MOM.SK WANT.V (THAT (MOM.SK AT.P HOUSE.SK)))
      :Preconditions
             ?I1 (NOT (MOM.SK AT.P HOUSE.SK))
             ?I2 (MOM.SK AT.P ?S)
      :Postconditions
             ?P1 (NOT (MOM.SK AT.P ?S))
             ?P2 (MOM.SK AT.P HOUSE.SK)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
      :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
      :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```



```
(PT-SCHEMA ((?X TRAVEL.V ?S ?D) ** PE)
:Roles

!R1 (?X PERSON.N)
!R2 (?D LOCATION.N)
!R3 (?S LOCATION.N)
!R4 (?X MOM.N)
!R5 (?D HOUSE.N)
!R6 (?X PERTAIN-TO ?Y)
!R7 (?D PERTAIN-TO ?F)
!R8 (?F FRIEND.N)
!R9 (?F PERTAIN-TO ?Y)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
      :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
      :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

"Maria went to Jeff's friend's house."

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
      :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
"Jenny's mom went to
Jenny's friend's
house."
```

"Maria went to Jeff's

friend's house."

```
(EPI-SCHEMA ((?X TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (?X PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (?X MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (?X PERTAIN-TO ?Y)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO ?Y)
       :Goals
           ?G1 (?X WANT.V (THAT (?X AT.P ?D)))
      :Preconditions
             ?I1 (NOT (?X AT.P ?D))
             ?I2 (?X AT.P ?S)
      :Postconditions
             ?P1 (NOT (?X AT.P ?S))
             ?P2 (?X AT.P ?D)
```

```
"Jenny's mom went to
Jenny's friend's
house."
```

"Maria went to Jeff's

friend's house."

```
(EPI-SCHEMA ((MARIA TRAVEL.V ?S ?D) ** ?E)
      :Roles
             !R1 (MARIA PERSON.N)
             !R2 (?D LOCATION.N)
             !R3 (?S LOCATION.N)
             !R4 (MARIA MOM.N)
             !R5 (?D HOUSE.N)
             !R6 (MARIA PERTAIN-TO JEFF)
             !R7 (?D PERTAIN-TO ?F)
             !R8 (?F FRIEND.N)
             !R9 (?F PERTAIN-TO JEFF)
      :Goals
           ?G1 (MARIA WANT.V (THAT (MARIA AT.P ?D)))
      :Preconditions
             ?I1 (NOT (MARIA AT.P ?D))
             ?I2 (MARIA AT.P ?S)
      :Postconditions
             ?P1 (NOT (MARIA AT.P ?S))
             ?P2 (MARIA AT.P ?D)
```

```
(EPI-SCHEMA ((MARIA TRAVEL.V ?S ?D) ** ?E)
                                    :Roles
"Jenny's mom went to
                                           !R1 (MARIA PERSON.N)
   Jenny's friend's
                                           !R2 (?D LOCATION.N)
       house."
                                           !R3 (?S LOCATION.N)
                                           !R4 (MARIA MOM.N)
                                           !R5 (?D HOUSE.N)
                                           !R6 (MARIA PERTAIN-TO JEFF)
                                           !R7 (?D PERTAIN-TO ?F)
                                           !R8 (?F FRIEND.N)
                                           !R9 (?F PERTAIN-TO JEFF)
                                     :Goals
                                         ?G1 (MARIA WANT.V (THAT (MARIA AT.P ?D)))
                                     :Preconditions
"Maria went to Jeff's
                                           ?I1 (NOT (MARIA AT.P ?D))
                                           ?I2 (MARIA AT.P ?S)
   friend's house."
                                    :Postconditions
                                           ?P1 (NOT (MARIA AT.P ?S))
                                           ?P2 (MARIA AT.P ?D)
```

Info on Wider Schema Learning Project

Mining Logical Event Schemas From Pre-Trained Language Models

Lane Lawley, Lenhart Schubert

https://aclanthology.org/2022.acl-srw.25/



Thank you!