# Causation in Semantics and Grammatical Structure Week 10: Approaches to modeling causation

Prerna Nadathur

December 12, 2019

In "The Individuation of Events", Davidson (1969) is trying to do two things:

In "The Individuation of Events", Davidson (1969) is trying to do two things:

1. provide arguments in support of introducing events as elements in a semantic interpretation system (and thus as a conceptual object)

In "The Individuation of Events", Davidson (1969) is trying to do two things:

- 1. provide arguments in support of introducing events as elements in a semantic interpretation system (and thus as a conceptual object)
- 2. put events on a par with other conceptual/semantic objects, by providing a means of understanding how to identify and differentiate events

In "The Individuation of Events", Davidson (1969) is trying to do two things:

- 1. provide arguments in support of introducing events as elements in a semantic interpretation system (and thus as a conceptual object)
- put events on a par with other conceptual/semantic objects, by providing a means of understanding how to identify and differentiate events

## Davidson (1969):

builds on Davidson (1967)

In "The Individuation of Events", Davidson (1969) is trying to do two things:

- 1. provide arguments in support of introducing events as elements in a semantic interpretation system (and thus as a conceptual object)
- put events on a par with other conceptual/semantic objects, by providing a means of understanding how to identify and differentiate events

#### Davidson (1969):

- builds on Davidson (1967)
- ... but goes beyond the earlier paper, in connecting events with notions of causation

- (1) Brutus stabbed Caesar with a knife in the forum.
  - a. entails: Brutus stabbed Caesar with a knife.
  - b. **entails:** Brutus stabbed Caesar in the forum.
  - c. entails: Brutus stabbed Caesar.

- (1) Brutus stabbed Caesar with a knife in the forum.
  - a. entails: Brutus stabbed Caesar with a knife.
  - b. entails: Brutus stabbed Caesar in the forum.
  - c. entails: Brutus stabbed Caesar.

- ▶ (1) is represented by the verb STAB, with a set of arguments:
  - (2) (1)  $\equiv STAB(B, C, with a knife, in the forum)$

- (1) Brutus stabbed Caesar with a knife in the forum.
  - a. entails: Brutus stabbed Caesar with a knife.
  - b. entails: Brutus stabbed Caesar in the forum.
  - c. entails: Brutus stabbed Caesar.

- ▶ (1) is represented by the verb STAB, with a set of arguments:
  - (2) (1)  $\equiv STAB(B, C, with a knife, in the forum)$
- ▶ **problem 1:** not all of the NPs and PPs in (1) are *required* arguments of the verb *stab*

- (1) Brutus stabbed Caesar with a knife in the forum.
  - a. entails: Brutus stabbed Caesar with a knife.
  - b. entails: Brutus stabbed Caesar in the forum.
  - c. entails: Brutus stabbed Caesar.

- ▶ (1) is represented by the verb STAB, with a set of arguments:
  - (2)  $(1) \equiv STAB(B, C, with a knife, in the forum)$
- ▶ **problem 1:** not all of the NPs and PPs in (1) are *required* arguments of the verb *stab*
- ▶ problem 2: how can we explain the entailment relationships in (1) in a natural way?

- (1) Brutus stabbed Caesar with a knife in the forum.
  - a. entails: Brutus stabbed Caesar with a knife.
  - b. entails: Brutus stabbed Caesar in the forum.
  - c. entails: Brutus stabbed Caesar.

- ▶ (1) is represented by the verb STAB, with a set of arguments:
  - (2)  $(1) \equiv STAB(B, C, with a knife, in the forum)$
- ▶ problem 1: not all of the NPs and PPs in (1) are required arguments of the verb stab
- problem 2: how can we explain the entailment relationships in (1) in a natural way?
  - (that is, without simply stipulating a number of meaning postulates relating various different stab verbs)



Davidson's solution: action sentences describe events

▶ stab has certain 'core' arguments (AGENT, PATIENT)

- stab has certain 'core' arguments (AGENT, PATIENT)
- with a knife and in the forum are adjuncts which specify further information about the stabbing event

- stab has certain 'core' arguments (AGENT, PATIENT)
- with a knife and in the forum are adjuncts which specify further information about the stabbing event
- we can add this information with conjuncts relating the main event to additional participants (using semantic roles)

- ► stab has certain 'core' arguments (AGENT, PATIENT)
- with a knife and in the forum are adjuncts which specify further information about the stabbing event
- we can add this information with conjuncts relating the main event to additional participants (using semantic roles)
- (3) Brutus stabbed Caesar with a knife in the forum.

```
\equiv \exists e : STAB(e, B, C) \& INST(e, knife) \& LOC(e, forum)
```

- a. **entails:**  $\exists e : STAB(e, B, C) \& INST(e, knife)$
- b. entails:  $\exists e : STAB(e, B, C) \& LOC(e, forum)$
- c. **entails:**  $\exists e : STAB(e, B, C)$

- stab has certain 'core' arguments (AGENT, PATIENT)
- with a knife and in the forum are adjuncts which specify further information about the stabbing event
- we can add this information with conjuncts relating the main event to additional participants (using semantic roles)
- (3) Brutus stabbed Caesar with a knife in the forum.

```
\equiv \exists e : STAB(e, B, C) \& INST(e, knife) \& LOC(e, forum)
```

- a. **entails:**  $\exists e : STAB(e, B, C) \& INST(e, knife)$
- b. **entails:**  $\exists e : STAB(e, B, C) \& LOC(e, forum)$
- c. **entails:**  $\exists e : STAB(e, B, C)$
- ▶ the entailment relationships in (1) follow using basic logical principles



## **Events** in semantics

What are the basic objects in our semantic interpretation system?

- ▶ individuals (*Brutus, Caesar,* . . . )
- truth values (T, F)
- (functions from one type to another)

## **Events** in semantics

What are the basic objects in our semantic interpretation system?

- ▶ individuals (*Brutus, Caesar,* . . . )
- truth values (T, F)
- (functions from one type to another)

#### **Events** are like individuals, but abstract:

- are they referenced directly?
  - maybe by certain kinds of nominal: the killing of Caesar, the destruction of Carthage

## **Events** in semantics

What are the basic objects in our semantic interpretation system?

- ▶ individuals (*Brutus, Caesar,* . . . )
- truth values (T, F)
- (functions from one type to another)

#### **Events** are like individuals, but abstract:

- are they referenced directly?
  - maybe by certain kinds of nominal: the killing of Caesar, the destruction of Carthage
- ▶ Davidson's (1969) point: having events as a basic object isn't any stranger than having individuals

We have intuitions about when two individuals are identical:

do we have the same sense for events?

- do we have the same sense for events?
- no entity without identity:

- do we have the same sense for events?
- no entity without identity:
  - if events are real objects, we should 'know them when we see them'

- do we have the same sense for events?
- no entity without identity:
  - if events are real objects, we should 'know them when we see them'
  - even if we can't define events directly, we have ways of telling when events are the same or different

- do we have the same sense for events?
- no entity without identity:
  - if events are real objects, we should 'know them when we see them'
  - even if we can't define events directly, we have ways of telling when events are the same or different
  - just like with individuals, the descriptions may not be the same:
    - (4) The morning star is the evening star.
    - (5) a. Brutus stabbed Caesar.
      - b. Caesar was killed.

We have intuitions about when two individuals are identical:

- do we have the same sense for events?
- no entity without identity:
  - if events are real objects, we should 'know them when we see them'
  - even if we can't define events directly, we have ways of telling when events are the same or different
  - just like with individuals, the descriptions may not be the same:
    - (4) The morning star is the evening star.
    - (5) a. Brutus stabbed Caesar.
      - b. Caesar was killed.

So, if we can specify identity conditions for events, this eliminates some arguments against including them in our semantics

for us, the identity conditions themselves are more interesting!



- ...if they occur at the same time
  - (6) Jones buttered the toast at midnight.
  - (7) The clock struck at midnight.

- ... if they occur at the same time
  - (6) Jones buttered the toast at midnight.
  - (7) The clock struck at midnight.
- ... the same time AND place
  - (8) Jones buttered the toast at midnight in the bathroom.
  - (9) The clock struck at midnight in the bathroom.

- ... if they occur at the same time
  - (6) Jones buttered the toast at midnight.
  - (7) The clock struck at midnight.
- ... the same time AND place
  - (8) Jones buttered the toast at midnight in the bathroom.
  - (9) The clock struck at midnight in the bathroom.
- ... same time, same place, AND involve the same participants
  - (10) Jones buttered the toast at midnight in the bathroom by candlelight.
  - (11) Jones heated the toast at midnight in the bathroom with a candle.

- ... if they occur at the same time
  - (6) Jones buttered the toast at midnight.
  - (7) The clock struck at midnight.
- ...the same time AND place
  - (8) Jones buttered the toast at midnight in the bathroom.
  - (9) The clock struck at midnight in the bathroom.
- ... same time, same place, AND involve the same participants
  - (10) Jones buttered the toast at midnight in the bathroom by candlelight.
  - (11) Jones heated the toast at midnight in the bathroom with a candle.
    - are the heating and buttering events the same?



#### Identity condition for events

Events,  $e_1$  and  $e_2$ , are identical if and only if they have the same causes and effects:

 $e_1 = e_2$  if and only if

 $\forall z. (z \text{ caused } e_1 \leftrightarrow z \text{ caused } e_2) \& \forall z. (e_1 \text{ caused } z \leftrightarrow e_2 \text{ caused } z)$ 

#### Identity condition for events

Events,  $e_1$  and  $e_2$ , are identical if and only if they have the same **causes** and **effects**:

```
e_1 = e_2 \text{ if and only if} \forall z. (z \text{ caused } e_1 \leftrightarrow z \text{ caused } e_2) \& \forall z. (e_1 \text{ caused } z \leftrightarrow e_2 \text{ caused } z)
```

 causal relationships define/identify events (not a particular description)

#### Identity condition for events

Events,  $e_1$  and  $e_2$ , are identical if and only if they have the same **causes** and **effects**:

```
e_1 = e_2 \text{ if and only if} \forall z. (z \text{ caused } e_1 \leftrightarrow z \text{ caused } e_2) \& \forall z. (e_1 \text{ caused } z \leftrightarrow e_2 \text{ caused } z)
```

- causal relationships define/identify events (not a particular description)
  - (12) a. Brutus stabbed Caesar
    - b. Brutus killed Caesar
    - c. Brutus betrayed Caesar
- ▶ (12)a-c can all describe the same event, provided:

#### Identity condition for events

Events,  $e_1$  and  $e_2$ , are identical if and only if they have the same **causes** and **effects**:

```
e_1 = e_2 \text{ if and only if} \forall z. (z \text{ caused } e_1 \leftrightarrow z \text{ caused } e_2) \& \forall z. (e_1 \text{ caused } z \leftrightarrow e_2 \text{ caused } z)
```

- causal relationships define/identify events (not a particular description)
  - (12) a. Brutus stabbed Caesar
    - b. Brutus killed Caesar
    - c. Brutus betrayed Caesar
- ▶ (12)a-c can all describe the same event, provided:
  - they have the same causes and effects

#### Identity condition for events

Events,  $e_1$  and  $e_2$ , are identical if and only if they have the same **causes** and **effects**:

```
e_1 = e_2 \text{ if and only if} \forall z. (z \text{ caused } e_1 \leftrightarrow z \text{ caused } e_2) \& \forall z. (e_1 \text{ caused } z \leftrightarrow e_2 \text{ caused } z)
```

- causal relationships define/identify events (not a particular description)
  - (12) a. Brutus stabbed Caesar
    - b. Brutus killed Caesar
    - c. Brutus betrayed Caesar
- ▶ (12)a-c can all describe the same event, provided:
  - they have the same causes and effects
  - as a result of which they must also involve the same participants, and take place at the same time and place



**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations . . . in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations ... in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

 both events and objects exist as part of collections of alike things

**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations ... in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

- ▶ both events and objects exist as part of collections of alike things
- these things relate to one another

**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations ... in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

- both events and objects exist as part of collections of alike things
- these things relate to one another
- concrete objects have spatial (concrete) relationships

**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations ... in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

- ▶ both events and objects exist as part of collections of alike things
- these things relate to one another
- concrete objects have spatial (concrete) relationships
- events have causal relationships

**Davidson's idea:** we perceive and distinguish events in terms of causal relationships

"Events are identical if and only if they have exactly the same causes and effects. Events have a unique position in the framework of causal relations ... in somewhat the same way objects have a unique framework in the spatial framework of objects." Davidson (1969, p.306)

- both events and objects exist as part of collections of alike things
- these things relate to one another
- concrete objects have spatial (concrete) relationships
- events have causal relationships

**Croft 1991:** pushes on this idea by proposing to account for internal event structure in terms of causal relationships



This gives us a new way of thinking about causation:

the analogy between concrete 'objects' and events is suggestive

- the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:

- the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:
  - ▶ they are forms of experience (Kant 1781), or ways in which we perceive the world

- the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:
  - ▶ they are forms of experience (Kant 1781), or ways in which we perceive the world
- causal relationships are also about cognition, and also constitute a way in which we perceive the world

- ► the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:
  - ▶ they are forms of experience (Kant 1781), or ways in which we perceive the world
- causal relationships are also about cognition, and also constitute a way in which we perceive the world
  - so, just like we have models for geometry that explain the way we perceive spatial relations

- the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:
  - ▶ they are forms of experience (Kant 1781), or ways in which we perceive the world
- causal relationships are also about cognition, and also constitute a way in which we perceive the world
  - so, just like we have models for geometry that explain the way we perceive spatial relations
  - we can understand something more about causation-as-cognition by building a model of relationships between events and seeing whether it predicts aspects of our understanding

- the analogy between concrete 'objects' and events is suggestive
- spatial (and temporal) relationships have to do with the way human cognition works:
  - ▶ they are forms of experience (Kant 1781), or ways in which we perceive the world
- causal relationships are also about cognition, and also constitute a way in which we perceive the world
  - so, just like we have models for geometry that explain the way we perceive spatial relations
  - we can understand something more about causation-as-cognition by building a model of relationships between events and seeing whether it predicts aspects of our understanding
  - linguistic judgements are one way of 'testing' models



philosophers have spent a lot of time arguing about what it means for one thing to cause another:

philosophers have spent a lot of time arguing about what it means for one thing to cause another:

"... we may define a cause to be an object followed by another, and where all the objects, similar to the first, are followed by objects similar to the second. Or, in other words, where, if the first object had not been, the second never had existed."

Hume, 1748

Challenge: how we should get access to the facts?

philosophers have spent a lot of time arguing about what it means for one thing to cause another:

- Challenge: how we should get access to the facts?
- Now: we can use language we want to build models to 'fit' two kinds of linguistic data:

philosophers have spent a lot of time arguing about what it means for one thing to cause another:

- Challenge: how we should get access to the facts?
- Now: we can use language we want to build models to 'fit' two kinds of linguistic data:
  - 1. variations in linguistic marking for different features of causal situations (up to now)

philosophers have spent a lot of time arguing about what it means for one thing to cause another:

- Challenge: how we should get access to the facts?
- Now: we can use language we want to build models to 'fit' two kinds of linguistic data:
  - 1. variations in linguistic marking for different features of causal situations (up to now)
  - 2. intuitions about when *cause* (or other causal language) is appropriate

#### Copley & Wolff (2014):

given a link between verbs, events, and causation, it must be the case that language structure and linguistic judgements reflect facts about (our conceptualization of) causation

#### Copley & Wolff (2014):

- given a link between verbs, events, and causation, it must be the case that language structure and linguistic judgements reflect facts about (our conceptualization of) causation
- SO:
  - if linguistic structure reflects our understanding of causation

### Copley & Wolff (2014):

- given a link between verbs, events, and causation, it must be the case that language structure and linguistic judgements reflect facts about (our conceptualization of) causation
- SO:
  - if linguistic structure reflects our understanding of causation
  - and causation is something like a form of cognitive experience

#### Copley & Wolff (2014):

given a link between verbs, events, and causation, it must be the case that language structure and linguistic judgements reflect facts about (our conceptualization of) causation

#### SO:

- if linguistic structure reflects our understanding of causation
- and causation is something like a form of cognitive experience
- then, a model of causal relationships that predicts our linguistic judgements models what we 'know' about causation

### Copley & Wolff (2014):

given a link between verbs, events, and causation, it must be the case that language structure and linguistic judgements reflect facts about (our conceptualization of) causation

#### SO:

- if linguistic structure reflects our understanding of causation
- and causation is something like a form of cognitive experience
- then, a model of causal relationships that predicts our linguistic judgements models what we 'know' about causation
- ... which, from this perspective, is all that there really IS to causation in the first place

Building a model isn't trivial:

▶ the data are complex (as we've seen), intuitions can be subtle

- ▶ the data are complex (as we've seen), intuitions can be subtle
- ► Copley & Wolff: linguists, philosophers can help each other

- ▶ the data are complex (as we've seen), intuitions can be subtle
- ► Copley & Wolff: linguists, philosophers can help each other
  - ► a good place for linguists to start is with existing theories (developed in philosophy, psych, comp sci . . . )

- ▶ the data are complex (as we've seen), intuitions can be subtle
- ► Copley & Wolff: linguists, philosophers can help each other
  - ► a good place for linguists to start is with existing theories (developed in philosophy, psych, comp sci . . . )
  - philosophers can refine their theories by seeing what is needed to explain language data

Building a model isn't trivial:

- the data are complex (as we've seen), intuitions can be subtle
- Copley & Wolff: linguists, philosophers can help each other
  - ► a good place for linguists to start is with existing theories (developed in philosophy, psych, comp sci . . . )
  - philosophers can refine their theories by seeing what is needed to explain language data

#### Today: major classes of causal theory

- dependency theories: pseudo-logical, abstract relationship between cause and effect
  - ▶ focus: Lewis's counterfactual theory of causation
  - next two weeks: network models and applications
- production theories: something is produced and/or transmitted from a cause to an effect
  - later: back to force dynamics and its applications

For Copley & Wolff, a **dependency theory** of causation involves the idea that there is a (pseudo-)logical, abstract relationship between a cause and an effect:

1. logical dependency theories define this relationship in the terms of formal logic

- 1. logical dependency theories define this relationship in the terms of formal logic
- counterfactual dependency theories (following Lewis 1973) use formal logic as a base, but add additional stipulations

- 1. logical dependency theories define this relationship in the terms of formal logic
- counterfactual dependency theories (following Lewis 1973) use formal logic as a base, but add additional stipulations
- probabilistic or statistical dependency theories define the cause-effect relationship in terms of conditional probabilities

- 1. logical dependency theories define this relationship in the terms of formal logic
- counterfactual dependency theories (following Lewis 1973) use formal logic as a base, but add additional stipulations
- probabilistic or statistical dependency theories define the cause-effect relationship in terms of conditional probabilities
- 4. network dependency theories (often) take a causal link to be abstract, but define (linguistically-relevant) causal relationships in terms of network configurations

1. Defining causal relationships in terms of classical logic

1. Defining causal relationships in terms of classical logic

Using formal logic, we have three basic options for defining causal dependence: **necessity, sufficiency**, or a combination

1. Defining causal relationships in terms of classical logic

Using formal logic, we have three basic options for defining causal dependence: **necessity, sufficiency**, or a combination

- (13) **Necessity**: A is logically necessary for B iff  $\neg A \rightarrow \neg B$  ... knowing that A fails, you can be sure that B fails
  - Jakub is male is logically necessary for Jakub is a bachelor

1. Defining causal relationships in terms of classical logic

Using formal logic, we have three basic options for defining causal dependence: **necessity, sufficiency**, or a combination

- (13) **Necessity**: A is logically necessary for B iff  $\neg A \rightarrow \neg B$  ... knowing that A fails, you can be sure that B fails
  - Jakub is male is logically necessary for Jakub is a bachelor
- (14) **Sufficiency:** A is logically sufficient for B iff  $A \rightarrow B$  ... knowing that A, you can be sure that B
  - Socrates is a man is logically sufficient for Socrates is mortal

1. Defining causal relationships in terms of classical logic

Using formal logic, we have three basic options for defining causal dependence: **necessity, sufficiency**, or a combination

- (13) **Necessity**: A is logically necessary for B iff  $\neg A \rightarrow \neg B$  ... knowing that A fails, you can be sure that B fails
  - Jakub is male is logically necessary for Jakub is a bachelor
- (14) **Sufficiency:** A is logically sufficient for B iff  $A \rightarrow B$  ... knowing that A, you can be sure that B
  - Socrates is a man is logically sufficient for Socrates is mortal

Note that neither of these relationships inherently invokes intuitions about causation



Late pre-emption scenarios show that causal dependency can't just be about logical necessity:

(15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is pre-empted by Suzy's throw
  - b. intuition: Suzy caused the bottle to break

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is pre-empted by Suzy's throw
  - b. intuition: Suzy caused the bottle to break
  - c. **problem:** Suzy's throw was not *necessary*: if she hadn't thrown, Billy's stone would have hit and broken the bottle

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is pre-empted by Suzy's throw
  - b. **intuition:** Suzy caused the bottle to break
  - c. **problem:** Suzy's throw was not *necessary*: if she hadn't thrown, Billy's stone would have hit and broken the bottle
- to define causation, we'd like to identify a set of conditions that predict all and only those cases where causation is intuitively present

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Suzy caused the bottle to break
  - c. **problem:** Suzy's throw was not *necessary*: if she hadn't thrown, Billy's stone would have hit and broken the bottle
- to define causation, we'd like to identify a set of conditions that predict all and only those cases where causation is intuitively present
- so those conditions should (collectively) be both necessary and sufficient for a causal relationship

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Suzy caused the bottle to break
  - c. **problem:** Suzy's throw was not *necessary*: if she hadn't thrown, Billy's stone would have hit and broken the bottle
- to define causation, we'd like to identify a set of conditions that predict all and only those cases where causation is intuitively present
- so those conditions should (collectively) be both necessary and sufficient for a causal relationship
- ▶ (15) shows that we can judge causation to be present without logical necessity holding between cause and effect

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. **intuition:** Suzy caused the bottle to break
  - c. **problem:** Suzy's throw was not *necessary*: if she hadn't thrown, Billy's stone would have hit and broken the bottle
  - to define causation, we'd like to identify a set of conditions that predict all and only those cases where causation is intuitively present
  - so those conditions should (collectively) be both necessary and sufficient for a causal relationship
  - ▶ (15) shows that we can judge causation to be present without logical necessity holding between cause and effect
- so, logical necessity of a cause for an effect is not a necessary condition for causation



- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw

- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Billy did not cause the bottle to break

- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is pre-empted by Suzy's throw
  - b. intuition: Billy did not cause the bottle to break
  - c. **problem:** Billy's throw was sufficient for the bottle to break: if Suzy hadn't thrown, Billy would have broken the bottle

- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Billy did not cause the bottle to break
  - c. **problem:** Billy's throw was sufficient for the bottle to break: if Suzy hadn't thrown, Billy would have broken the bottle
  - ▶ since (16) shows that we fail to identify a causal dependency in the presence of logical sufficiency

- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Billy did not cause the bottle to break
  - c. **problem:** Billy's throw was sufficient for the bottle to break: if Suzy hadn't thrown, Billy would have broken the bottle
  - since (16) shows that we fail to identify a causal dependency in the presence of logical sufficiency
  - ...it shows that logical sufficiency of a cause for an effect is not a sufficient condition for causation

- (16) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. intuition: Billy did not cause the bottle to break
  - c. **problem:** Billy's throw was sufficient for the bottle to break: if Suzy hadn't thrown, Billy would have broken the bottle
  - since (16) shows that we fail to identify a causal dependency in the presence of logical sufficiency
  - ...it shows that logical sufficiency of a cause for an effect is not a sufficient condition for causation
  - combinations of necessity and sufficiency run into similar problems

The same scenario shows that causal dependency can't just be about logical sufficiency:

- A case of late pre-emption (Hall 2004). Billy and Suzy both (16)throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - a. Billy's throw is *pre-empted* by Suzy's throw
  - b. **intuition:** Billy did not cause the bottle to break
  - c. **problem:** Billy's throw was sufficient for the bottle to break: if Suzy hadn't thrown, Billy would have broken the bottle
  - ▶ since (16) shows that we fail to identify a causal dependency in the presence of logical sufficiency
  - ...it shows that logical sufficiency of a cause for an effect is not a sufficient condition for causation
  - combinations of necessity and sufficiency run into similar problems

In (16), we have to reason about alternatives to reality: this suggests the relevance of counterfactuals to causation



2. Defining causal relationships in terms of counterfactuals

2. Defining causal relationships in terms of counterfactuals

2. Defining causal relationships in terms of counterfactuals

- ▶ idea: capitalize on the intuition that statements like (17) are closely correlated with counterfactual claims
  - (17) The recession caused Jerry to lose his job.

    Counterfactual: If the recession had not happened, Jerry would not have lost his job.

2. Defining causal relationships in terms of counterfactuals

- ▶ idea: capitalize on the intuition that statements like (17) are closely correlated with counterfactual claims
  - (17) The recession caused Jerry to lose his job.

    Counterfactual: If the recession had not happened, Jerry would not have lost his job.
- the counterfactual relationship amounts to logical necessity

2. Defining causal relationships in terms of counterfactuals

- ▶ idea: capitalize on the intuition that statements like (17) are closely correlated with counterfactual claims
  - (17) The recession caused Jerry to lose his job.
    Counterfactual: If the recession had not happened, Jerry would not have lost his job.
- the counterfactual relationship amounts to logical necessity
- Lewis avoids the late pre-emption problem by using the counterfactual as a *diagnosis*, not a complete definition

2. Defining causal relationships in terms of counterfactuals

- ▶ idea: capitalize on the intuition that statements like (17) are closely correlated with counterfactual claims
  - (17) The recession caused Jerry to lose his job.
    Counterfactual: If the recession had not happened, Jerry would not have lost his job.
- the counterfactual relationship amounts to logical necessity
- Lewis avoids the late pre-emption problem by using the counterfactual as a diagnosis, not a complete definition
  - the distinction he makes between causal dependence and nomic dependence is a distinction between causal dependence and purely logical dependence



Prior to Lewis, philosophical theories of causation were focused on **regularities:** "... where all the objects, similar to the first, are followed by objects similar to the second ..."

Prior to Lewis, philosophical theories of causation were focused on **regularities:** "... where all the objects, similar to the first, are followed by objects similar to the second ..."

- ► Lewis's objections: regularity theories don't properly distinguish causes and effects (A), epiphenomena (B), and pre-empted causes (C)
  - (A) barometer readings and pressure change at the same time, so how can a regularity theory tell us which is the cause and which the effect
  - (B) changes in pressure change barometer readings and often cause rain, but there's no real causal link between rain and barometer readings
  - (C) similar to above: but Billy throws his stone only if Suzy misses (he didn't cause the bottle to break, but he would have if he had thrown)

Define causation in terms of counterfactuality, not regularity

- ► Hume: "... where, if the first object had not been, the second never had existed."
- ▶ Lewis, p.557: "We think of a cause as something that makes a difference, and the difference it makes must be a difference from what would have happened without it."

Define causation in terms of counterfactuality, not regularity

- ► Hume: "... where, if the first object had not been, the second never had existed."
- ▶ Lewis, p.557: "We think of a cause as something that makes a difference, and the difference it makes must be a difference from what would have happened without it."

The relevant notions for Lewis's theory:

Define causation in terms of counterfactuality, not regularity

- ► Hume: "... where, if the first object had not been, the second never had existed."
- ▶ Lewis, p.557: "We think of a cause as something that makes a difference, and the difference it makes must be a difference from what would have happened without it."

The relevant notions for Lewis's theory:

 possible worlds, which can differ with respect to historical facts and causal laws

Define causation in terms of counterfactuality, not regularity

- ► Hume: "... where, if the first object had not been, the second never had existed."
- ▶ Lewis, p.557: "We think of a cause as something that makes a difference, and the difference it makes must be a difference from what would have happened without it."

The relevant notions for Lewis's theory:

- possible worlds, which can differ with respect to historical facts and causal laws
- a similarity relationship, by which we can judge worlds as closer or farther away from one another
  - a world in which Suzy misses and Billy's stone breaks the bottle is 'closer to' the actual world than one in which Suzy's stone evaporates mid-flight

Define causation in terms of counterfactuality, not regularity

- ► Hume: "...where, if the first object had not been, the second never had existed."
- ▶ Lewis, p.557: "We think of a cause as something that makes a difference, and the difference it makes must be a difference from what would have happened without it."

The relevant notions for Lewis's theory:

- possible worlds, which can differ with respect to historical facts and causal laws
- a similarity relationship, by which we can judge worlds as closer or farther away from one another
  - a world in which Suzy misses and Billy's stone breaks the bottle is 'closer to' the actual world than one in which Suzy's stone evaporates mid-flight
- we judge the truth of a counterfactual by whether or not the most similar worlds (with some fact changed) support it



Connecting the evaluation of counterfactuals to causation:

Connecting the evaluation of counterfactuals to causation:

▶ the counterfactual dependence of C on A, written  $A \square \rightarrow C$ :

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of C on A, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to ¬C worlds than we do to get to C worlds

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of *C* on *A*, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to ¬C worlds than we do to get to C worlds
  - ▶ NB: we may already have to move away from the actual world to find an A world – similarity plays a role here as well

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of *C* on *A*, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to ¬C worlds than we do to get to C worlds
  - ▶ NB: we may already have to move away from the actual world to find an A world – similarity plays a role here as well

Some problems:

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of *C* on *A*, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to ¬C worlds than we do to get to C worlds
  - ▶ NB: we may already have to move away from the actual world to find an A world – similarity plays a role here as well

### Some problems:

what counts as 'closer': a world where Suzy misses entirely, or a world where Suzy hits the bottle but it doesn't break?

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of *C* on *A*, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to  $\neg C$  worlds than we do to get to C worlds
  - ▶ NB: we may already have to move away from the actual world to find an A world – similarity plays a role here as well

### Some problems:

- what counts as 'closer': a world where Suzy misses entirely, or a world where Suzy hits the bottle but it doesn't break?
- we have intuitions about this, but there's a circularity: our intuitions seem to be about what preserves causal laws

Connecting the evaluation of counterfactuals to causation:

- ▶ the counterfactual dependence of C on A, written  $A \square \rightarrow C$ :
  - if A holds in the evaluation world, then we have to go 'farther' to get to ¬C worlds than we do to get to C worlds
  - ▶ NB: we may already have to move away from the actual world to find an A world – similarity plays a role here as well

### Some problems:

- what counts as 'closer': a world where Suzy misses entirely, or a world where Suzy hits the bottle but it doesn't break?
- we have intuitions about this, but there's a circularity: our intuitions seem to be about what preserves causal laws
- ► (more recently, linguists have analyzed counterfactuals in terms of causation instead of the other way around)



How does Lewis avoid the problems of regularity and necessity?

How does Lewis avoid the problems of regularity and necessity?

► Claim: causation is transitive, but counterfactual dependence (□→) is not!

#### (18) causation:

- a. the recession caused Jerry's company to lose money
- b. losing money caused Jerry's company to fire Jerry
- c.  $\rightarrow$  the recession caused Jerry's company to fire him

#### (19) counterfactuality:

- a. if Hoover had been born in Russia, he would have been a communist
- b. if Hoover had been a communist, he would have been a traitor in the eyes of the US government
- c.  $\not\to$  if Hoover had been born in Russia, he would have been a traitor . . .

How does Lewis avoid the problems of regularity and necessity?

► Claim: causation is transitive, but counterfactual dependence (□→) is not!

### (18) causation:

- a. the recession caused Jerry's company to lose money
- b. losing money caused Jerry's company to fire Jerry
- c.  $\rightarrow$  the recession caused Jerry's company to fire him

#### (19) **counterfactuality**:

- a. if Hoover had been born in Russia, he would have been a communist
- b. if Hoover had been a communist, he would have been a traitor in the eyes of the US government
- c. if Hoover had been born in Russia, he would have been a traitor ...
- counterfactual dependence entails causation, but not vice versa



How does Lewis avoid the problems of regularity and necessity?

Claim: causation is transitive, but counterfactual dependence (□→) is not!

#### (18) causation:

- a. the recession caused Jerry's company to lose money
- b. losing money caused Jerry's company to fire Jerry
- c.  $\rightarrow$  the recession caused Jerry's company to fire him

#### (19) **counterfactuality**:

- a. if Hoover had been born in Russia, he would have been a communist
- b. if Hoover had been a communist, he would have been a traitor in the eyes of the US government
- counterfactual dependence entails causation, but not vice versa
- counterfactuality is a sufficient but not a necessary condition

An example involving early pre-emption:

- (19) Billy and Suzy are both ready with stones to throw at a bottle on the wall. Suzy throws her stone, breaking the bottle, and Billy stands by as backup he'll throw his stone if she doesn't throw hers (or if she misses)
  - a. Again, Billy's throw is pre-empted
  - b. intuition: Suzy caused the breaking
  - c. **problem:** there's no counterfactual dependence between Suzy's throw and the bottle breaking

An example involving early pre-emption:

- (19) Billy and Suzy are both ready with stones to throw at a bottle on the wall. Suzy throws her stone, breaking the bottle, and Billy stands by as backup he'll throw his stone if she doesn't throw hers (or if she misses)
  - a. Again, Billy's throw is pre-empted
  - b. **intuition**: Suzy caused the breaking
  - c. **problem:** there's no counterfactual dependence between Suzy's throw and the bottle breaking

Lewis's solution: stepwise counterfactual dependency

An example involving early pre-emption:

- (19) Billy and Suzy are both ready with stones to throw at a bottle on the wall. Suzy throws her stone, breaking the bottle, and Billy stands by as backup he'll throw his stone if she doesn't throw hers (or if she misses)
  - a. Again, Billy's throw is pre-empted
  - b. intuition: Suzy caused the breaking
  - c. **problem:** there's no counterfactual dependence between Suzy's throw and the bottle breaking

### Lewis's solution: stepwise counterfactual dependency

• we need to consider causation in terms of causal chains (familiar!)

An example involving early pre-emption:

- (19) Billy and Suzy are both ready with stones to throw at a bottle on the wall. Suzy throws her stone, breaking the bottle, and Billy stands by as backup he'll throw his stone if she doesn't throw hers (or if she misses)
  - a. Again, Billy's throw is pre-empted
  - b. intuition: Suzy caused the breaking
  - problem: there's no counterfactual dependence between Suzy's throw and the bottle breaking

### Lewis's solution: **stepwise counterfactual dependency**

- we need to consider causation in terms of causal chains (familiar!)
- ▶ Suzy's throw  $\square$  → Suzy's stone flies through the air → **cause**
- ightharpoonup Suzy's stone flies  $\square \rightarrow$  the bottle breaks  $\rightarrow$  cause

An example involving **early pre-emption**:

- (19) Billy and Suzy are both ready with stones to throw at a bottle on the wall. Suzy throws her stone, breaking the bottle, and Billy stands by as backup he'll throw his stone if she doesn't throw hers (or if she misses)
  - a. Again, Billy's throw is pre-empted
  - b. intuition: Suzy caused the breaking
  - problem: there's no counterfactual dependence between Suzy's throw and the bottle breaking

### Lewis's solution: **stepwise counterfactual dependency**

- we need to consider causation in terms of causal chains (familiar!)
- ▶ Suzy's throw  $\square$  → Suzy's stone flies through the air → **cause**
- ▶ Suzy's stone flies  $\square$ → the bottle breaks → **cause**
- the transitivity of causation then gives us causal dependence between Suzy throwing and the bottle breaking, even though we don't have counterfactual dependence



The problem of effects and spurious causes (p.565):

- Suppose: c causes e, but not the reverse
- Suppose: given the laws and circumstances, c could not but cause e
- ▶ problem: it follows that if e had not occurred, c would not have either ?→ cause

The problem of **effects** and spurious causes (p.565):

- ► Suppose: *c* causes *e*, but not the reverse
- Suppose: given the laws and circumstances, c could not but cause e
- ▶ problem: it follows that if e had not occurred, c would not have either ?→ cause

The problem of **epiphenomena** and spurious causes (p.566):

- Suppose: c causes e and f (subsequently)
- Suppose: given the laws and circumstances
  - (i) c could not but cause e
  - (ii) f could not have been caused by anything but c
- problem: if e had not occurred, we know that c could not have occurred, and thus f also does not hold
  - $\dots$  which makes it seem like e causes f
- ightharpoonup (e is epiphenomenal to the causal relationship between c and e)



Lewis's solution to the effect and epiphenomena problems (p.566):

"The proper solution to both problems, I think, is to flatly deny the counterfactuals that cause the trouble."

Lewis's solution to the effect and epiphenomena problems (p.566):

"The proper solution to both problems, I think, is to flatly deny the counterfactuals that cause the trouble."

- ► Claim: if e had been absent, it is not that c would have been absent (and f as well)
- this comes from the similarity relationship:

Lewis's solution to the effect and epiphenomena problems (p.566):

"The proper solution to both problems, I think, is to flatly deny the counterfactuals that cause the trouble."

- ► Claim: if e had been absent, it is not that c would have been absent (and f as well)
- this comes from the similarity relationship:
  - worlds where c occurs and fails to cause e are closer than worlds where c also does not occur

Lewis's solution to the effect and epiphenomena problems (p.566):

"The proper solution to both problems, I think, is to flatly deny the counterfactuals that cause the trouble."

- ► Claim: if e had been absent, it is not that c would have been absent (and f as well)
- this comes from the similarity relationship:
  - worlds where c occurs and fails to cause e are closer than worlds where c also does not occur
  - we want to preserve the facts of the world as much as possible in evaluating counterfactuals

"To get rid of an actual event e with the least over-all departure from actuality, it will normally be best not to diverge at all from the actual course of events until just before the time of e."

Problem? doesn't this rely on intuitions about facts vs. causal laws?



Late pre-emption is still an issue:

(15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.

### Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
- ► there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)

### Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
  - there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)
  - counterfactual dependence is still not necessary for causation

Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
- ► there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)
- counterfactual dependence is still not necessary for causation

Counterfactual dependence is also, contra Lewis, not **sufficient** for causation (i.e.,  $\square \rightarrow$  does NOT imply causation)

(20) **The assassin scenario** (Hall 2000). An assassin places a bomb under your desk, causing you to find it, which causes you to remove it. Removing it causes (ensures) your survival.

### Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
- ▶ there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)
- counterfactual dependence is still not necessary for causation

Counterfactual dependence is also, contra Lewis, not **sufficient** for causation (i.e.,  $\square \rightarrow$  does NOT imply causation)

- (20) **The assassin scenario** (Hall 2000). An assassin places a bomb under your desk, causing you to find it, which causes you to remove it. Removing it causes (ensures) your survival.
  - ▶ there IS stepwise counterfactual dependence along the whole chain

### Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
- ▶ there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)
- counterfactual dependence is still not necessary for causation

Counterfactual dependence is also, contra Lewis, not **sufficient** for causation (i.e.,  $\square \rightarrow$  does NOT imply causation)

- (20) **The assassin scenario** (Hall 2000). An assassin places a bomb under your desk, causing you to find it, which causes you to remove it. Removing it causes (ensures) your survival.
  - ▶ there IS stepwise counterfactual dependence along the whole chain
  - ▶ intuition: it is not the case that the assassin caused your survival

### Late pre-emption is still an issue:

- (15) A case of late pre-emption (Hall 2004). Billy and Suzy both throw stones at a bottle on the wall. Their throws are on target. Suzy throws first, so her stone reaches the bottle before Billy's, and the bottle breaks.
- ▶ there's no stepwise counterfactual dependency between Suzy and the bottle breaking (because Billy throws regardless of Suzy)
- counterfactual dependence is still not necessary for causation

Counterfactual dependence is also, contra Lewis, not **sufficient** for causation (i.e.,  $\square \rightarrow$  does NOT imply causation)

- (20) **The assassin scenario** (Hall 2000). An assassin places a bomb under your desk, causing you to find it, which causes you to remove it. Removing it causes (ensures) your survival.
  - there IS stepwise counterfactual dependence along the whole chain
  - intuition: it is not the case that the assassin caused your survival
  - more broadly: causation may not be transitive either



**Upshot:** intuitions about a connection between causation and counterfactuals are important, but there's more going on!

**Upshot:** intuitions about a connection between causation and counterfactuals are important, but there's more going on!

3. Defining causal relationships in terms of probability

**Upshot:** intuitions about a connection between causation and counterfactuals are important, but there's more going on!

3. Defining causal relationships in terms of probability

- main idea: certain events raise the probability of others
  - event C causes (or is causally involved) in event E if C's occurrence makes E more likely
  - ▶  $Pr(E|C) > Pr(E|\neg C)$  (Cheng & Novick 1992)
  - (21) You're more likely to get cancer if you smoke than if you do not smoke
    - a.  $Pr(cancer \mid smoker) > Pr(cancer \mid non-smoker)$
    - b. Smoking causes cancer

**Upshot:** intuitions about a connection between causation and counterfactuals are important, but there's more going on!

3. Defining causal relationships in terms of probability

- main idea: certain events raise the probability of others
  - event C causes (or is causally involved) in event E if C's occurrence makes E more likely

  - (21) You're more likely to get cancer if you smoke than if you do not smoke
    - a.  $Pr(cancer \mid smoker) > Pr(cancer \mid non-smoker)$
    - b. Smoking causes cancer
- probability theories build on Hume's (first) regularity theory



#### Correlation is not causation!

- events can be probabilistically correlated because C is a cause of E, because E is a cause of C, or because both C and E are caused by some other event, F
- ▶ these are the *effect* and *epiphenomena* problems, again

#### Correlation is not causation!

- events can be probabilistically correlated because C is a cause of E, because E is a cause of C, or because both C and E are caused by some other event, F
- ▶ these are the *effect* and *epiphenomena* problems, again
- probability-raising is not sufficient for causation

#### Correlation is not causation!

- events can be probabilistically correlated because C is a cause of E, because E is a cause of C, or because both C and E are caused by some other event, F
- ▶ these are the *effect* and *epiphenomena* problems, again
- probability-raising is not sufficient for causation

### Probability raising is also not **necessary** for causation:

- early pre-emption:
  - suppose Suzy doesn't have great aim, and only has a 25% chance of hitting the bottle
  - ▶ Billy has better aim, with a 70% chance

#### Correlation is not causation!

- events can be probabilistically correlated because C is a cause of E, because E is a cause of C, or because both C and E are caused by some other event, F
- ▶ these are the *effect* and *epiphenomena* problems, again
- probability-raising is not sufficient for causation

### Probability raising is also not **necessary** for causation:

- early pre-emption:
  - suppose Suzy doesn't have great aim, and only has a 25% chance of hitting the bottle
  - ▶ Billy has better aim, with a 70% chance
  - if Suzy doesn't throw, Billy will throw, increasing the likelihood that the bottle will break

#### Correlation is not causation!

- events can be probabilistically correlated because C is a cause of E, because E is a cause of C, or because both C and E are caused by some other event, F
- these are the effect and epiphenomena problems, again
- probability-raising is not sufficient for causation

### Probability raising is also not **necessary** for causation:

- early pre-emption:
  - suppose Suzy doesn't have great aim, and only has a 25% chance of hitting the bottle
  - ▶ Billy has better aim, with a 70% chance
  - if Suzy doesn't throw, Billy will throw, increasing the likelihood that the bottle will break
  - so Suzy's throw actually REDUCES the likelihood that the bottle breaks, but we still feel that Suzy caused the breaking



4. Causal network models

# Dependency theories of causation

4. Causal network models

#### The basic ideas:

- events are connected in a network, represented as a directed acyclic graph
- 'arrows' just indicate a causal link, which is unanalyzed
- probability distributions or structural equations tell us how the various events determine one another
- only 'upstream' events can influence downstream ones

# Dependency theories of causation

4. Causal network models

#### The basic ideas:

- events are connected in a network, represented as a directed acyclic graph
- 'arrows' just indicate a causal link, which is unanalyzed
- probability distributions or structural equations tell us how the various events determine one another
- only 'upstream' events can influence downstream ones

#### Some positives:

- having a network instead of just a chain lets us make sense of complex relationships (epiphenomena, late pre-emption)
- Lewis's intuitions about preserving facts up until the time of an effect can be related to 'intervention' tests



#### The late pre-emption example in a network model:

```
SH := ST
BH := BT
BS := SH v BH
BH := BT and \sim S
```

Fig. 2.2 An example of late pre-emption in terms of a direct graph (Hitchcock 2010)

The late pre-emption example in a network model:

```
SH := ST
BH := BT
BS := SH v BH
BH := BT and \sim S
BT \longrightarrow BH
```

Fig. 2.2 An example of late pre-emption in terms of a direct graph (Hitchcock 2010)

the network model allows us to include the influence that Suzy's hit (SH) has on Billy's hit (BH)

The late pre-emption example in a network model:

```
SH := ST
BH := BT
BS := SH v BH
BH := BT and \sim S
BT \longrightarrow BH
```

Fig. 2.2 An example of late pre-emption in terms of a direct graph (Hitchcock 2010)

- the network model allows us to include the influence that Suzy's hit (SH) has on Billy's hit (BH)
- ► Suzy's throw (ST) only influences Suzy's hit (SH), but the value of SH determines the value of BH (assuming we don't change the facts about whether or not Billy throws)

The late pre-emption example in a network model:

```
SH := ST
BH := BT
BS := SH v BH
BH := BT and \sim S
BT \longrightarrow BH
```

Fig. 2.2 An example of late pre-emption in terms of a direct graph (Hitchcock 2010)

- the network model allows us to include the influence that Suzy's hit (SH) has on Billy's hit (BH)
- Suzy's throw (ST) only influences Suzy's hit (SH), but the value of SH determines the value of BH (assuming we don't change the facts about whether or not Billy throws)
- this explains why we think Suzy's throw is the cause and Billy's throw is not: there's an asymmetry in the arrows in the model

The late pre-emption example in a network model:

```
SH := ST
BH := BT
BS := SH v BH
BH := BT and \sim S
BT \longrightarrow BH
```

Fig. 2.2 An example of late pre-emption in terms of a direct graph (Hitchcock 2010)

- the network model allows us to include the influence that Suzy's hit (SH) has on Billy's hit (BH)
- Suzy's throw (ST) only influences Suzy's hit (SH), but the value of SH determines the value of BH (assuming we don't change the facts about whether or not Billy throws)
- this explains why we think Suzy's throw is the cause and Billy's throw is not: there's an asymmetry in the arrows in the model

(We'll spend more time on network models in the next two weeks)



- ▶ Back to Hume:
  - causation is often associated with (physical or mental) force, and (kinetic or potential) energy
  - for Hume, these associations are the way in which we perceive the thing that we call causation
  - production theories reverse this idea: causation is a name for certain kinds of transfers of force and energy (correlation and regularity are epiphenomena, p.25)

- Back to Hume:
  - causation is often associated with (physical or mental) force, and (kinetic or potential) energy
  - for Hume, these associations are the way in which we perceive the thing that we call causation
  - production theories reverse this idea: causation is a name for certain kinds of transfers of force and energy (correlation and regularity are epiphenomena, p.25)
- properties that a production theory might explain:
  - ▶ temporal orderings between cause and effect (cf. Shibatani 1976): dependency theories alone cannot explain the relevance of temporal order
  - physical links: why is it difficult for us to accept "spooky action at a distance"?

- Back to Hume:
  - causation is often associated with (physical or mental) force, and (kinetic or potential) energy
  - for Hume, these associations are the way in which we perceive the thing that we call causation
  - production theories reverse this idea: causation is a name for certain kinds of transfers of force and energy (correlation and regularity are epiphenomena, p.25)
- properties that a production theory might explain:
  - ▶ temporal orderings between cause and effect (cf. Shibatani 1976): dependency theories alone cannot explain the relevance of temporal order
  - physical links: why is it difficult for us to accept "spooky action at a distance"?
- upshot: causal links have real, tangible correlates



#### 1. Transmission theories

- ▶ mark transmission (Salmon 1984): causal processes propagate some kind of modification, or mark something that starts in one place and has a reflection or realization elsewhere at the end of the process
  - example: shining a light through a red filter causes a red mark to appear on a screen

## 1. Transmission theories

- ▶ mark transmission (Salmon 1984): causal processes propagate some kind of modification, or mark something that starts in one place and has a reflection or realization elsewhere at the end of the process
  - example: shining a light through a red filter causes a red mark to appear on a screen
- transmission of conserved properties (Dowe 2000, Kistler 2006):
  - physical laws tells us that heat and momentum are conserved quantities
  - causal processes transmit these properties from one object to another, in keeping with the conservation laws
  - example: a billiard ball can only start to move if it gets an input of kinetic energy from something else (a causer)



2. Force dynamics

#### Basic ideas:

- (physical) objects are associated with forces: inertia, momentum, dispositions
- causation/causal processes have to do with the convergence of forces from various objects in an interaction
- to evaluate causation, we look at the difference between starting and ending force vectors
- ▶ Wolff (2003): the 'tendency' of the causer, causee, etc

2. Force dynamics

#### Basic ideas:

- (physical) objects are associated with forces: inertia, momentum, dispositions
- causation/causal processes have to do with the convergence of forces from various objects in an interaction
- ▶ to evaluate causation, we look at the difference between starting and ending force vectors
- ▶ Wolff (2003): the 'tendency' of the causer, causee, etc

(We'll look more closely at modern versions of force dynamics and its applications in January)

Positives for production theories:

Positives for production theories:

 by looking at 'resultant' forces, we can explain the similarity between causing and prevention, causing and enabling (causation by omission), causation and maintenance (N&vdK)

Positives for production theories:

- by looking at 'resultant' forces, we can explain the similarity between causing and prevention, causing and enabling (causation by omission), causation and maintenance (N&vdK)
- we can do many of the same things as network models:
  - pre-emption: Suzy is the cause of the bottle-breaking (in both pre-emption scenarios), and Billy is not, because Suzy's force/energy is actually transmitted to the bottle

#### Positives for production theories:

- by looking at 'resultant' forces, we can explain the similarity between causing and prevention, causing and enabling (causation by omission), causation and maintenance (N&vdK)
- we can do many of the same things as network models:
  - pre-emption: Suzy is the cause of the bottle-breaking (in both pre-emption scenarios), and Billy is not, because Suzy's force/energy is actually transmitted to the bottle

#### But challenges remain:

- we often (correctly) infer causation in cases where we can't 'track' the transmitted quantity
- how can you track the transmission of mental (as opposed to physical) influence?
  - (25) **Persuasion.** John talked the children into dancing.
    - a. intuition: John caused the dancing
    - b. **problem:** no physical force or momentum transmitted



If the way we talk about events is shaped by our causal cognition:

If the way we talk about events is shaped by our causal cognition:

it's not just that a good theory or model of causation should explain or predict linguistic judgements

If the way we talk about events is shaped by our causal cognition:

- ▶ it's not just that a good theory or model of causation should explain or predict linguistic judgements
- linguistic phenomena are a way to investigate the cognitive parameters of causation

If the way we talk about events is shaped by our causal cognition:

- ▶ it's not just that a good theory or model of causation should explain or predict linguistic judgements
- linguistic phenomena are a way to investigate the cognitive parameters of causation
- e.g., if linguistic phenomena distinguish between cases of early and late pre-emption, it's clear that the way we model (mentally represent) causation must also be able to distinguish these things

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model
  - question: do we distinguish between latent properties (e.g., potential energy) and realized properties (e.g., momentum)?

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model
  - question: do we distinguish between latent properties (e.g., potential energy) and realized properties (e.g., momentum)?
- a related question: defeasibility
  - (22) a. Billy insulted Suzy, but she wasn't offended.
    - The low salary offer insulted Suzy, #but she wasn't offended

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model
  - question: do we distinguish between latent properties (e.g., potential energy) and realized properties (e.g., momentum)?
- a related question: defeasibility
  - (22) a. Billy insulted Suzy, but she wasn't offended.
    - The low salary offer insulted Suzy, #but she wasn't offended
    - ▶ if *insult* is a causal verb, what kind of theory best accounts for the difference in (22)?

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model
  - question: do we distinguish between latent properties (e.g., potential energy) and realized properties (e.g., momentum)?
- a related question: defeasibility
  - (22) a. Billy insulted Suzy, but she wasn't offended.
    - The low salary offer insulted Suzy, #but she wasn't offended
    - ▶ if *insult* is a causal verb, what kind of theory best accounts for the difference in (22)?
- direct vs. indirect causal chains

- agentive causation ('less marked', DeLancey 1984)
  - by looking at the edge cases, we can narrow in on what the underlyingly relevant notion is (C&W: dispositions)
  - these kinds of properties might be well represented in a force dynamics model
  - question: do we distinguish between latent properties (e.g., potential energy) and realized properties (e.g., momentum)?
- a related question: defeasibility
  - (22) a. Billy insulted Suzy, but she wasn't offended.
    - The low salary offer insulted Suzy, #but she wasn't offended
    - ▶ if *insult* is a causal verb, what kind of theory best accounts for the difference in (22)?
- direct vs. indirect causal chains
  - what counts as a link in a network vs. a probability-raising model vs. the force dynamics?



# Overview and road map Today:

#### Today:

▶ in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world

- in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world
- ▶ part of what has made the data so far difficult is that it's hard to get a handle on what causation *is*

- in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world
- part of what has made the data so far difficult is that it's hard to get a handle on what causation is
- instead of taking causation as a black box, and then trying to encode features like  $\pm$  VOL in our linguistic/lexical representations

- in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world
- part of what has made the data so far difficult is that it's hard to get a handle on what causation is
- $\blacktriangleright$  instead of taking causation as a black box, and then trying to encode features like  $\pm~\mathrm{VOL}$  in our linguistic/lexical representations
- ...the notion of causation is constituted by the features that language cares about

- in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world
- part of what has made the data so far difficult is that it's hard to get a handle on what causation is
- $\blacktriangleright$  instead of taking causation as a black box, and then trying to encode features like  $\pm~\mathrm{VOL}$  in our linguistic/lexical representations
- ... the notion of causation is constituted by the features that language cares about
- so, by building a model which predicts linguistic data, we find out how we represent causation
- caveat: this may or may not reflect reality (e.g. quantum mechanics)

- in a Davidsonian event-based semantics, basic sentential descriptions invoke our causal understanding of the world
- part of what has made the data so far difficult is that it's hard to get a handle on what causation is
- ▶ instead of taking causation as a black box, and then trying to encode features like  $\pm$  VOL in our linguistic/lexical representations
- ▶ ... the notion of causation is *constituted* by the features that language cares about
- ▶ so, by building a model which predicts linguistic data, we find out how we represent causation
- caveat: this may or may not reflect reality (e.g. quantum) mechanics)
- ► different models may be good at different things



- next week: we'll take a look at how network models are formally defined
  - ...and then see some applications of these models in explaining periphrastic and lexical causatives, including 'directness' and 'agency' contrasts

- next week: we'll take a look at how network models are formally defined
  - ...and then see some applications of these models in explaining periphrastic and lexical causatives, including 'directness' and 'agency' contrasts
- in January: we'll revisit the force dynamics
  - ...and look at how cases of defeasible causation are treated with forces

- next week: we'll take a look at how network models are formally defined
  - ...and then see some applications of these models in explaining periphrastic and lexical causatives, including 'directness' and 'agency' contrasts
- in January: we'll revisit the force dynamics
  - ...and look at how cases of defeasible causation are treated with forces
- finally: we'll look outside of overtly causal language, and see how causal modeling approaches can help with other lexical semantic questions (counterfactuals, modals, implicatives)

If you're interested in doing the AP, now is a good time to start thinking about topics!

- ▶ a good empirical topic would be to gather some data on a causal construction (in German or another language)
- use the data to argue for or against a particular kind of model
- or to extend one of the applications we look at