

## Candidate Elimination Algorithm [Mitchell 78]

### Version Space Method

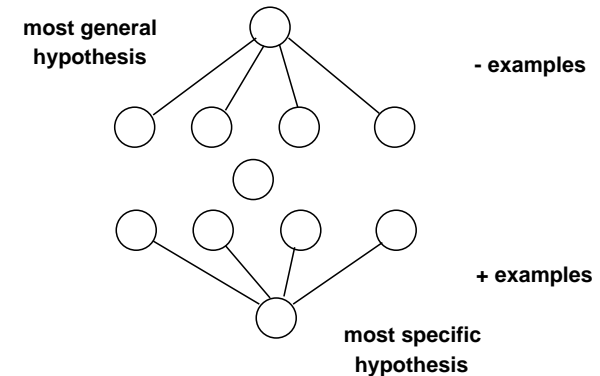
- Assumes  $f$  is a Boolean function.
- Requires noise-free positive and negative examples.
- Assumes that the concept can be described in terms of a conjunction of the available attributes. (No negation.)

Algorithm maintains a **version space** that keeps track of all concept descriptions,  $H$ , consistent with the training instances without remembering any of the instances. Processes the instances incrementally.

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## Learning in a Version Space

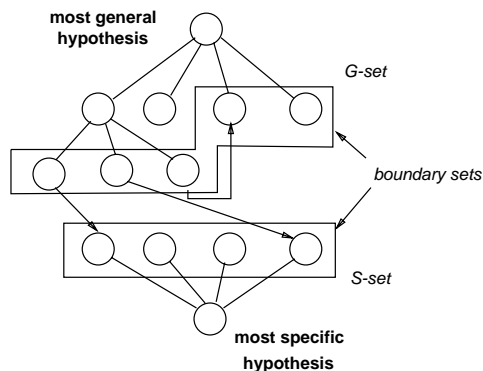
**Key idea:** Generalization of the specific concept descriptions and specialization of the general concept descriptions ultimately leads to just one concept description.



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## Details

Each specialization must be a generalization of some specific concept description. No specialization can be a specialization of another general concept description.



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## Example

Num	Restaurant	Meal	Day	Cost	Reaction
1	The Nines	bkfst	Fri	\$	sick (+)
2	Banfis	lunch	Fri	\$\$	ok (-)
3	The Nines	lunch	Sat	\$	sick (+)
4	Moosewood	bkfst	Sun	\$	ok (-)
5	The Nines	bkfst	Sun	\$\$	ok (-)

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## Generalization and Specialization Operators

**Specialization:** replace one “?” with a value

[? ? ? ?]

[9s ? ? ?] [Banfis ? ? ?] ... [? bkfst ? ?] [? lunch ? ?] ...

**Generalization:** replace one value with “?”

[? bkfst Fri \$] [9s ? Fri \$] [9s bkfst ? \$] [9s bkfst Fri ?]

[9s bkfst Fri \$]

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## Algorithm

Initialize  $S =$  \_\_\_\_\_,  $G =$  \_\_\_\_\_

Get next training instance,  $I$ . If  $I$  is +, then:

1. Retain in  $G$  only those descriptions that match  $I$ .
2. Generalize members of  $S$  that do not match  $I$ , only to the extent required to allow them to match  $I$ , producing a new set  $S'$ . ( $S'$  = matching  $S$  members plus new generalizations.)
3. Remove from  $S'$  all members that are more general than some other member of  $S'$ .
4. Remove from  $S'$  all members that aren't at least as specific as some member of  $G$ .
5. Set  $S$  to  $S'$ .

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If  $I$  is -, then:

1. Retain in  $S$  only those descriptions that do *not* match  $I$ .
2. Specialize members of  $G$  that match  $I$ , only to the extent required to keep them from matching  $I$ , producing a new set  $G'$ . ( $G'$  = non-matching  $G$  members plus new specializations.)
3. Remove from  $G'$  all members that are more specific than some other member of  $G'$ .
4. Remove from  $G'$  all members that aren't at least as general as some member of  $S$ .
5. Set  $G$  to  $G'$ .

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## Example

[? ? ? ?]

[9s bkfst Fri \$]

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