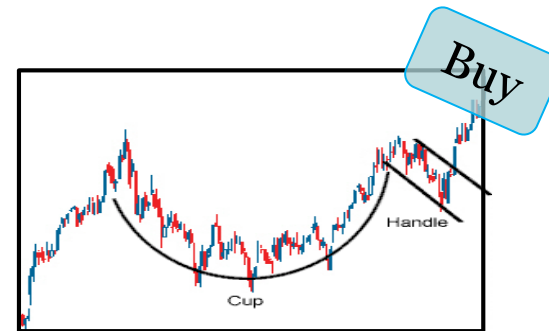


# HW2: An End-to-End Exact PBE

**Technical Analysis:**  
Predict price direction  
using current prices



**Patterns:** Special forms that  
signal whether to buy or sell



**Goal:** Synthesize a program  
(a model) detecting a pattern

```
P0=LLV(Close,W);
BP0=LLVBars(Close,W);
P1=HHV(Close,BP0);
BP1=HHVBars(Close,BP0);
P2=LLV(Close,BP1);
BP2=LLVBars(Close,BP1);
P3=HHV(Close,BP2);
BP3=HHVBars(Close,BP2);
P4=LLV(Close,BP3);
BP4=LLVBars(Close,BP3);
P5=HHV(Close,BP4);
BP5=HHVBars(Close,BP4);
P6=LLV(Close,BP5);
Filter= P0<P1 AND P2<P1 AND P1<P3 AND
P5<P3 AND P4<P5 AND P6<P5;
```

# Time-Series Patterns from Charts

- Goal: an exact PBE that learns patterns in time-series charts
- Time-series charts are used in many domains including financial analysis, medicine, and seismology.



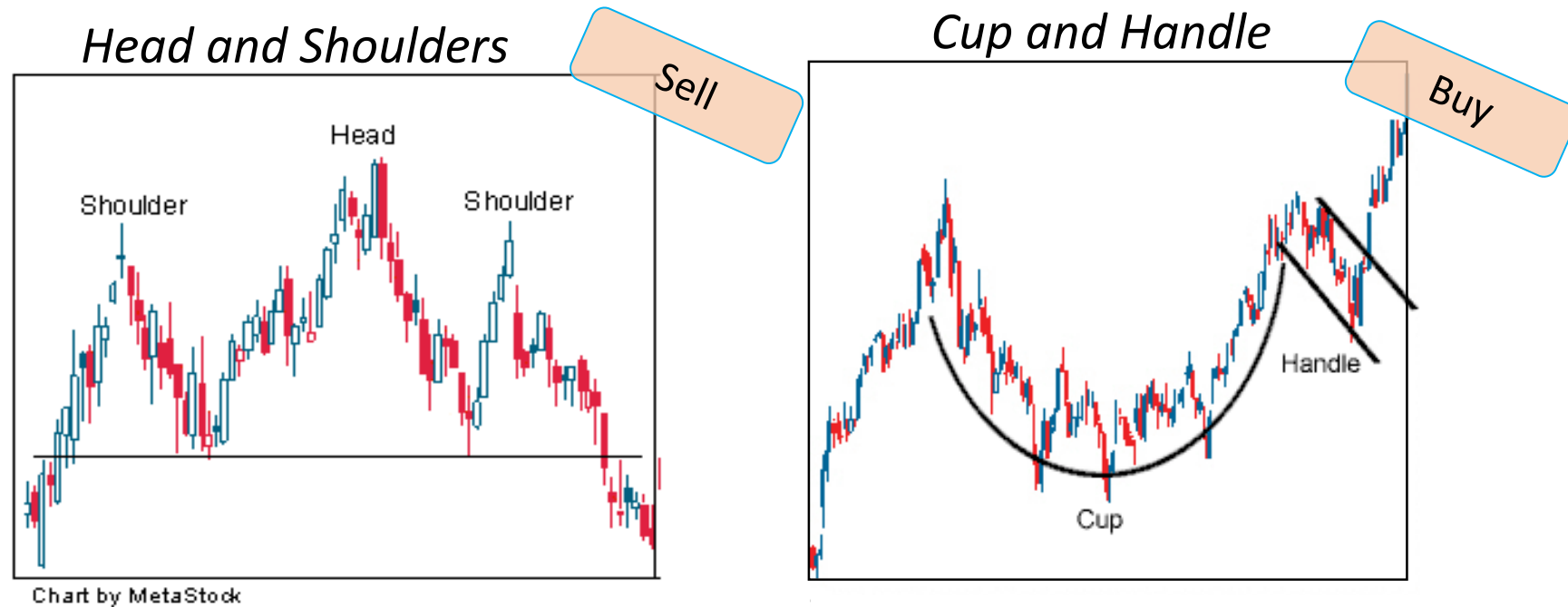
# Time-Series Patterns from Charts

- Experts use these charts to predict important events (e.g., trend changes in a stock price) indicated by special patterns



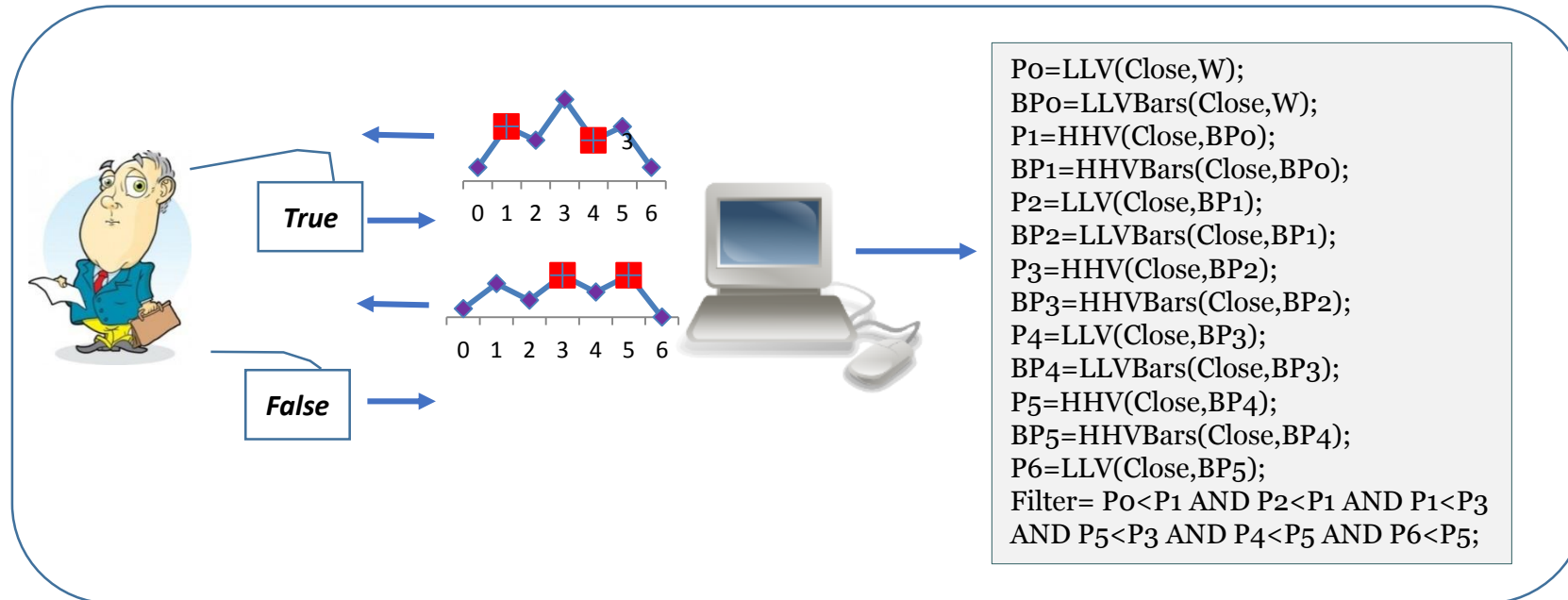
# Time-Series Patterns from Charts

- There is a lot of study on common patterns and there are many softwares that enable these experts to write a program that alerts upon detecting their customized pattern



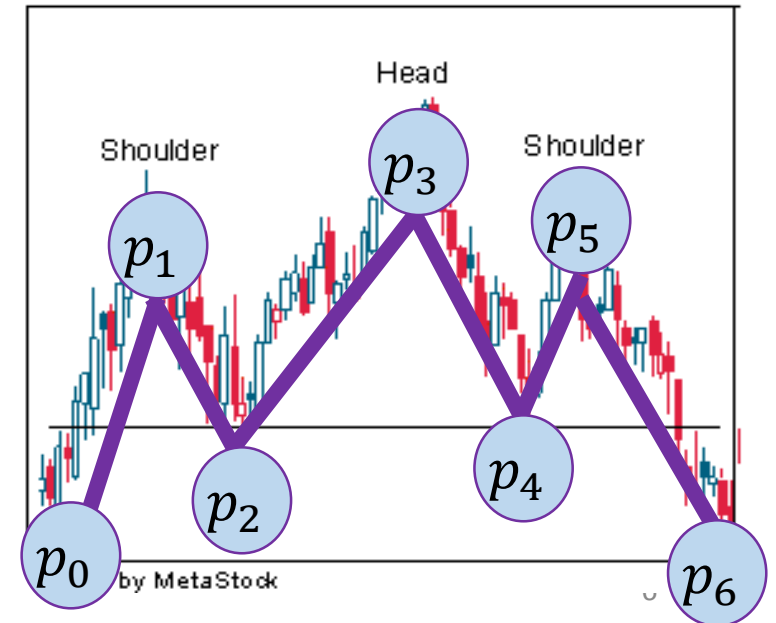
# Time-Series Patterns from Charts

- Unfortunately, writing programs is a complex task for these experts, who are not programmers
- Goal: learn the specifications from chart examples, then synthesize a program



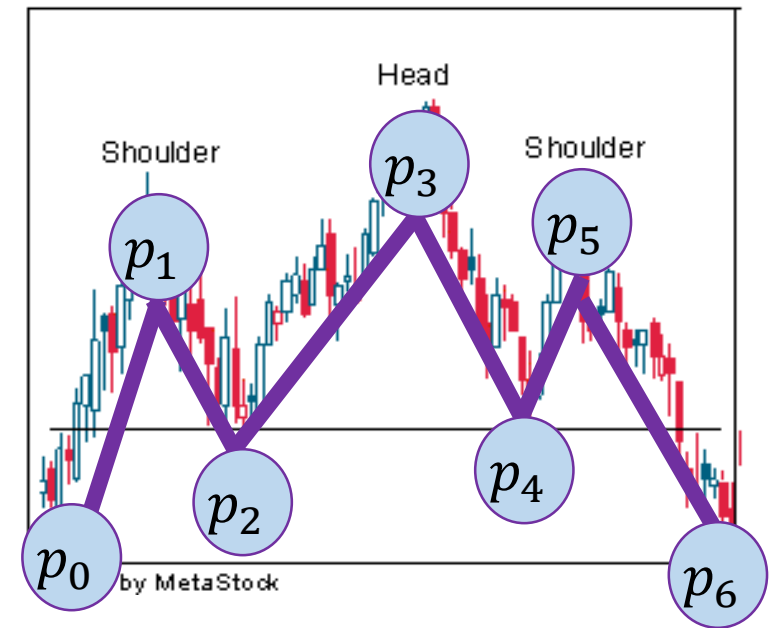
# Time-series Patterns

- A chart is a function over time
  - $p_i$  is the price at time point  $i$
- A pattern is a conjunction over  $Q = \{p_i < p_j | i \neq j\}$ 
  - $\varphi_{HS} = (p_0 < p_2) \wedge (p_2 < p_1) \wedge (p_1 < p_3) \wedge (p_2 < p_4) \wedge (p_4 < p_5) \wedge (p_6 < p_5) \wedge (p_5 < p_3) \wedge (p_6 < p_0)$



# Exact PBE for Time-series Patterns

- We will assume a slightly different setting
- The learning begins from the user who provides an initial chart example  $e$
- Then, the set of predicates is:
- $Q_e = \{p_i < p_j \mid e \models p_i < p_j\}$
- The conjunctive formula is over  $Q_n$
- Note that  $Q_{e,\wedge}$  cannot contain cyclic constraints
  - $p_i < p_j \in Q_{e,\wedge} \Rightarrow p_j < p_i \notin Q_{e,\wedge}$



# Questions

1. Define C-SPEX, a variation of D-SPEX for learning conjunctions
  - Hint: What is the search space? How do the lemma change?
2. Let  $e$  be a chart example and  $Q_e = \{p_i < p_j \mid e \models p_i < p_j\}$ 
  - a) Define how to compute the children of a node. What is the time complexity?
    - Hint: represent the constraints in a graph whose nodes are  $p_i$
  - b) Define how to find the witnesses. What is the time complexity?
    - Hint: topological sorting
  - c) Determine how many membership queries C-SPEX can present.
    - Hint: the bound is much better...