

# **ODO: A Constraint-based Scheduling Shell**

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Philosophy

Approach

- Constraint-Based Problem Solving

Status



# Philosophy

Create a tool for scheduling research

- Model and solve real-world problems
- Test a variety of (constraint-based) scheduling methodologies

Therefore:

- General, extensible input language for describing problems
- General, extensible language for describing scheduling policies

Therefore, ODO is a scheduling “interpreter”. No set way to do scheduling. Heuristic follows our model, with parameters set at run-time



# Constraint-based Reasoning

## Variables

- Domains - typically discrete and finite
- Assigned values (or sets of values) in solutions

## Constraints

- Attached to variables
- Restrict mutually compatible values on variables

Net result: A “Constraint Graph”

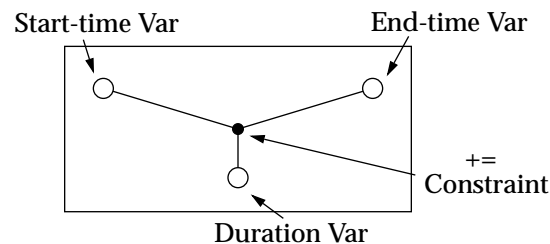


# Constraint Model of Scheduling

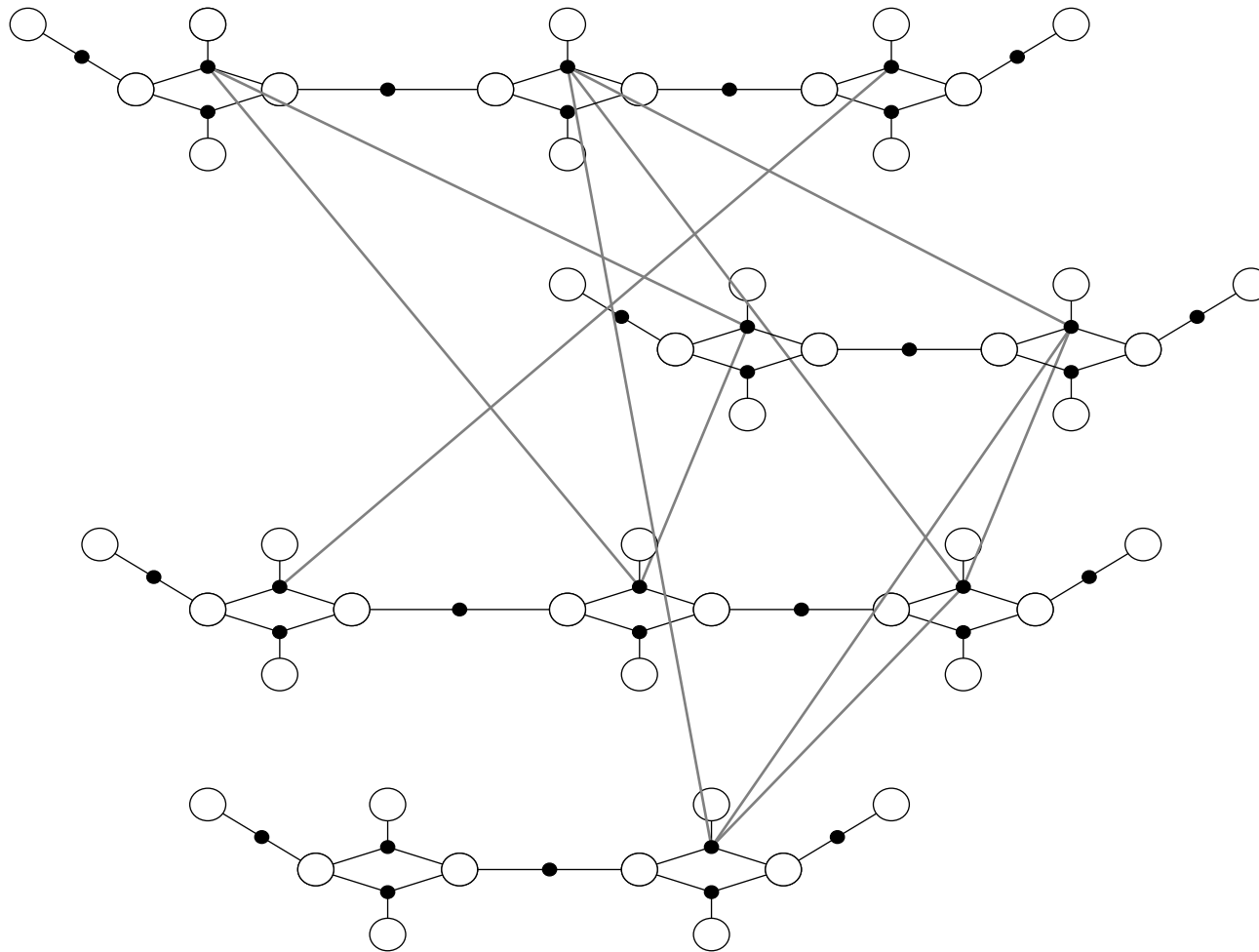
Variables are the start- and end-times of activities, and the resource assignments for activities (if any)

Constraints restrict the acceptable values for the variables

- Temporal constraints
  - ★  $\text{start-time}(T1) + \text{duration}(T1) = \text{end-time}(T1)$
  - ★  $\text{start-time}(T2) \geq \text{end-time}(T1)$
- Resource constraints
  - ★ The assigned resource must be allocated to the activity from its start-time to its end-time



# Resulting Constraint Graph



# Search Styles in CSP

## Constructive

- start with “clean slate”
- may or may not be systematic
- Backtracking: a systematic approach (compare to branch and bound)

## Repair-based

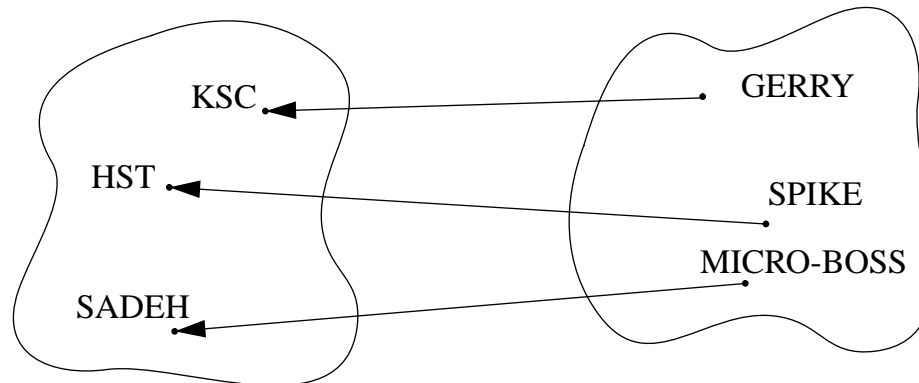
- Start with an initial assignment to all variables
- Use some metric (objective function) to measure quality of problem states
- Incrementally assign values until good enough solution is found
- Variations: Hill-climbing, simulated annealing (also genetic algorithms)



# So We Have:

Scheduling Problems  
(in constraint representation)

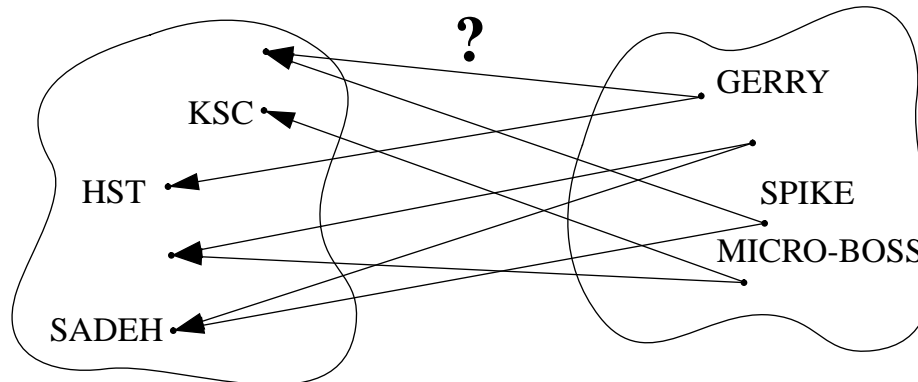
Scheduling Systems  
(in constraint representation)



# But What About:

Scheduling Problems  
(in constraint representation)

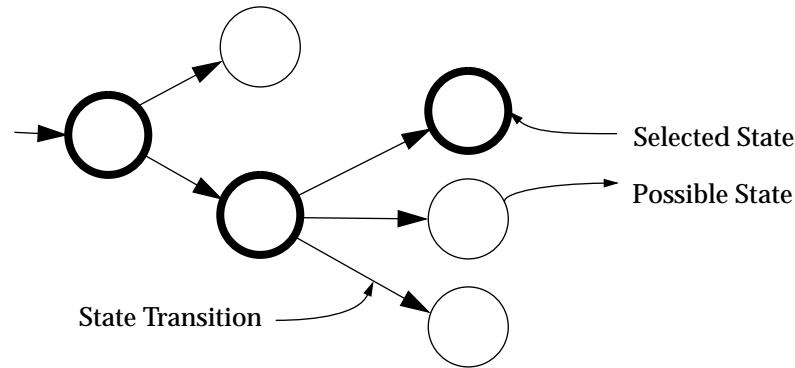
Scheduling Systems  
(in constraint representation)





# Our Model of Constraint-based Scheduling

Start with state-transition model:



Transition: assertion or retraction of a “commitment” (assign value to variable, etc.)

Most schedulers do not haphazardly wander through this search space. Rather, a strategy is followed for how to make commitments (and perhaps retract commitments)

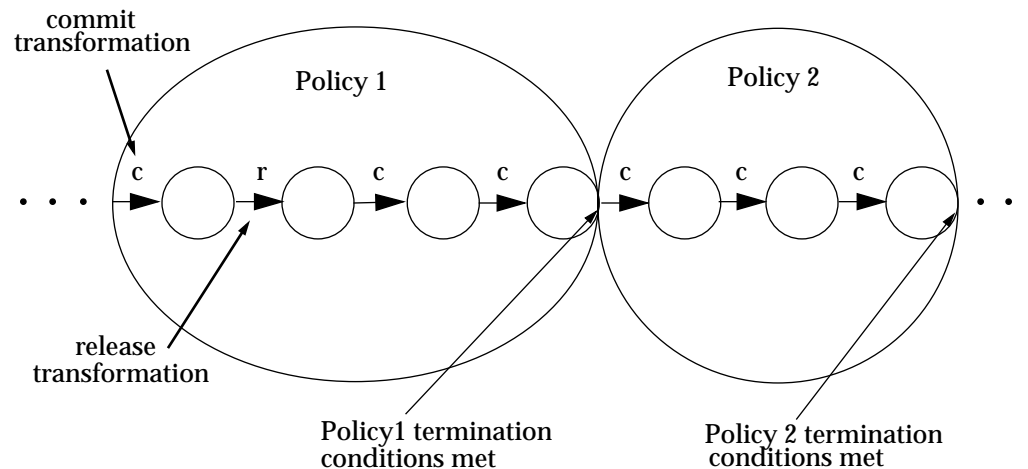


# Structured Commitment Transformation

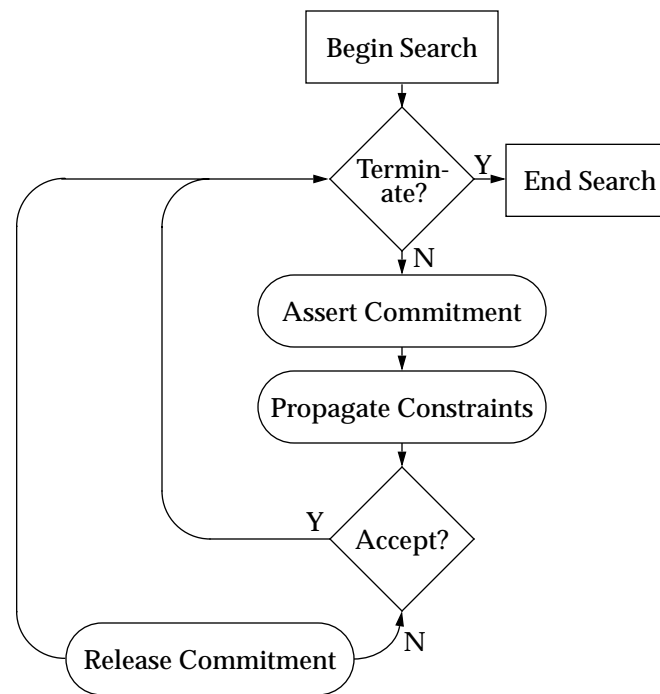
An overall strategy (“policy”) dictates how transitions are made

The strategy is followed until some termination condition occurs. At that point search can terminate or a new policy can begin

- Generalization of many observed scheduling systems
- Captures both constructive and repair-based paradigms



# Overall Loop



# Texture Measurements

The problem is still deciding what type of commitment to make and what specific instance should be made at a point in the search space.

Texture measurement - a measure of the evolving constraint graph that serves as the basis for heuristic decisions.

Two main ones:

- ★ **contention**: how much competition there is for a resource over a particular temporal interval
- ★ **reliance**: how much an activity “needs” a resource over a temporal interval

Have extended these to deal with, *e.g.*:

- ★ multiple and alternative resources
- ★ changeovers
- ★ temporal constraint posting as a commitment



## ODO Time-line

Feb '94: ODO:TOS - Eugene Davis

- ★ unification based on commitments
- ★ characteristics of repair vs. constructive search
- ★ constraint relaxation - Chris Beck

Sept '94: ODO:TNG Project begins

- ★ architecture, representation, project management - Chris
- ★ resource representation and reasoning - Sanket Agrawal
- ★ texture measurements - Hong Gao

Aug '95: Numetrix Prototype

- ★ solving industry problems - Ioan Popescu
- ★ logistics-level scheduling - Sanket
- ★ reasoning about uncertainty - Hong



## ODO Directions

Research driven by industrial problems from partnership with Numetrix.

- ★ multiple and alternative resources
- ★ dealing with changeovers (“inter-process plan constraints”)
- ★ reasoning about (continuous) inventory
- ★ more realistic cost model (differences between real cost and penalty cost?)
- ★ continuous/pre-emptable activities

Research driven by the research world.

- ★ (temporal) constraint posting as a commitment
- ★ advanced temporal propagation [Caseau & Labuthe 95] [Carlier & Pinson 94]

Needless to say (but I will), our approach is based on texture measurements.



# Research Job Opening

EIL has an opening for a Research Scientist in Constraint-Directed Scheduling to work with and extend our scheduling shell, ODO.

## Requirements & Details

- ★ PhD or MSc with relevant background
- ★ will play a leading role the design, implementation, and testing of and experimentation with future versions of ODO
- ★ initially year (renewable for another 4)

Send email to {chris, msf}@ie.utoronto.ca.



# Summary

Unifying constraint-based search with the concept of commitments.

Policy mechanism allows “shape changing”: emulation/combination of existing and future scheduling techniques.

Two general goals:

- ★ direct comparison of competing scheduling technology
- ★ ability to solve “real world” industry problems





## Ongoing and Future Work

Using ODO as the problem solver for many of the supply chain agents  
(Logistics, Resource Manager, Transportation, Factory Scheduler)

Extension to a general constraint-based problem solver - beyond the  
scheduling world

Optimization in the real-world: using a cost model

Extensions to representation and reasoning in order to get closer to the  
real-world (continuous manufacturing, resource calendars, ...)

