

Getting from Here to There: Interactive Planning and Agent Execution for Optimizing Travel

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Outline

- **Introduction:**
 - **Travel Planning**
 - **Information Integration, Planning & Monitoring**
- **The Travel Assistant**
- **Technologies:**
 - **Integration: Hierarchical Constraint Networks**
 - **Heracles**
 - **Information-Gathering and Monitoring Agents**
 - **Theseus**
- **Related Work, Future Work, Conclusions**

AIRwise

Airwise Travel

Book Flights, Hotels and Rental Cars

Flight Arrivals

Check Flight Arrival Times

Washington Dulles Airport

Index

Dulles Airport News

Washington D.C. Weather

Airlines

Getting to Dulles


Transportation from Dulles

Airport Parking

Restaurants and Bars

Car Rental

Airport Hotels



FOR [Dulles Airport Parking Lot Information](#)

Parking Costs

Area	First hour	Per hour	Daily rate
Short Term (hourly)	\$3	\$4	\$27
Daily (general)	\$5	\$5	\$10
Long Term (economy)	\$1	\$1	\$6
Valet	-	-	\$25*

* \$12 per day after the first day.

[American Airlines](#)

[British Airways](#)

[Continental Airlines](#)

[Delta Air Lines](#)

[Northwest Airlines](#)

[TWA](#)

[United Airlines](#)

[US Airways](#)

[Virgin Atlantic](#)

[Flight Schedules Worldwide](#)

[Airline web site list](#)

Airwise News Headlines

- [Hurricane Erin Moves On Bermuda](#)
- [Ansett Australia Cancels Advertising](#)
- [Northwest Fined For Mistreatment Of Passengers With Disabilities](#)
- [Losses Forecast For South African Airways](#)






Airwise News

Severe Weather Outlook for Friday-Update - (9/7/01 2:45 PM)

Erin is not Dead - (9/7/01 1:43 PM)

U.S. 24 Hour Forecast

[More Video...](#)

Today	Tomorrow	Sun	Mon	Tue
 Sunny	 Sunny	 Sunny	 Sunny	 Sunny
High: 32 Low: 19	High: 31 Low: 18	High: 33 Low: 16	High: 32 Low: 14	High: 33 Low: 16

Hotel Av

Orbitz: Flight Sea

Home

AIR

Car

Hotel

Help

Feedback

Web-only fare

(9 flights out of)

PER PERSON

\$1842

SELECT

\$1842

SELECT

\$1845

SELECT

ORBITZ

flight search >

THE Orbot

Your search:

Mon, Sep 10 a

Sat, Sep 15 a

Yahoo

Weather

Map

Mes

Weather

10 Free AA

Information Integration, Planning and Monitoring

Problem:

- **Need information in support of a particular task**
 - Travel planning
- **Many sources, hard to find, painful to use, and difficult to integrate**
 - Flights, Hotels, Car rentals, Airport parking, Weather ...
- **Gather information efficiently**
 - Given dates, query flights and hotels in parallel
- **Evaluate and choose among different actions**
 - Fly, rent a car, drive own car, or take a taxi?
- **Monitor and react to events that affect plan**
 - Fare changes, flight delays, ...

Information Integration, Planning and Monitoring

Solution: Framework for building information and planning assistants, domain-specific applications that extract and integrate data for a given task.

Two underlying technologies:

- **Heracles:** Hierarchical constraint planner
 - Organizes information
 - Decides what sources to query
 - Integrates results
 - Evaluates and suggests courses of action
- **Theseus:** Efficient dataflow plan execution
 - Information-gathering agents
 - Monitoring agents

The Travel Assistant

HERACLES

File New Cache Settings Help

HERACLES

TravelPlanner

- 1 Meeting (Round Trip)
 - Fly
 - Take a Taxi to Airport
 - Take a Taxi from Airport
 - Hotel
 - Fly Home
 - Take a Taxi to Airport
 - Take a Taxi from Airport
 - Flights (Complete Itinerary)
 - Monitor

Round Trip

Week of: Apr 8 2002
Month Day Year

Meeting: Travel Planner Meeting DC
Subject Location

Starting At: Apr 19 2002 11:30 AM
Month Day Year Time

Ending At: Apr 20 2002 4:30 PM
Month Day Year Time

Meeting With: Robert Haskell LMI
First Name Last Name Company Name

Leaving From: 2700 University Park Los Angeles CA
Street City State

Traveling To: 1120 19th ST NW Washington DC
Street City State

Outbound Mode: Fly [? Click to Expand](#)

Hotel: Hotel [Click to Expand](#)

Supports Informed Choices



Fly

From

Street City State

To

Street City State

Getting to Airport

Parking

Lot Daily Rate(dollars) Duration(days) Total(dollars)

Taxi

Distance Taxi

Mode to Airport

Flights

Itinerary

From To Month Day



Fly

From

Street City State

To

Street City State

Getting to Airport

Parking

Lot Daily Rate(dollars) Duration(days) Total(dollars)

Taxi

Distance Taxi fare(dollars)

Mode to Airport

Flights

Itinerary

From To Month Day

Changes Propagate Throughout

Round Trip Flights

Preference: **Lowest Price**

Departs: **LAX** | **Los Angeles, CA**

Returns: **LGB** | **Wash, DC/Dulles,**

Price: **192**

Outbound Flight 1: **11:55 PM** | **7:36 AM**

Taxi

Leaving From: **2700 University Park** | **Los Angeles** | **CA**

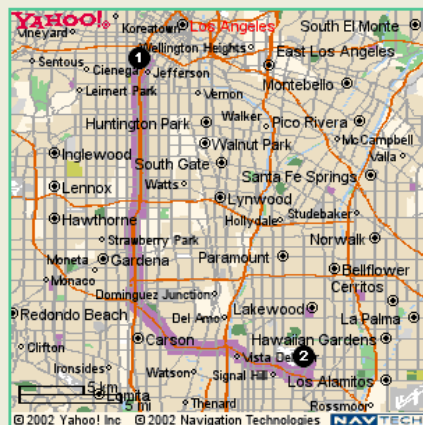
Driving To: **LGB** | **Los Angeles** | **CA**

Suggested Departure: **Apr 18 2002** | **08:22 PM**

Predicted Arrival: **Apr 18 2002** | **08:50 PM**

Taxi fare: **34.20**

Total Drive: **23.3** | **0** | **28**



Taxi

Leaving From: **2700 University Park** | **Los Angeles**

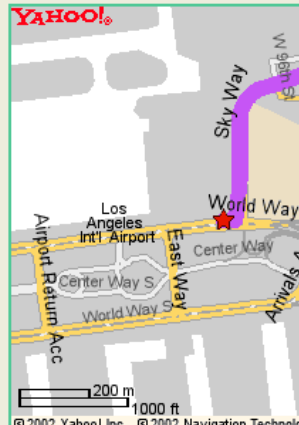
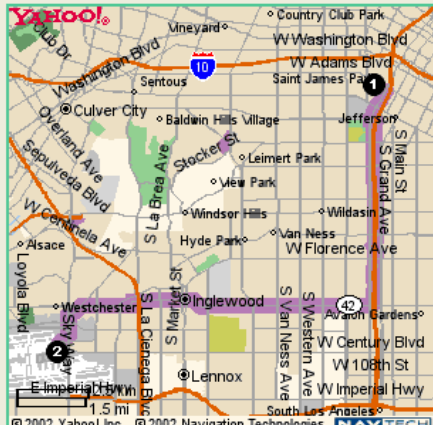
Driving To: **LAX** | **Los Angeles** | **CA**

Suggested Departure: **Apr 18 2002**

Predicted Arrival: **Apr 18 2002** | **10:55 PM**

Taxi fare: **19.50**

Total Drive: **12.7** | **0** | **24**



Maps

Maps

Monitoring Agents

□ Flight-Status Agent:

□ Flight delayed message:

Your United Airlines flight 190 has been delayed. It was originally scheduled to depart at 11:45 AM and is now scheduled to depart at 12:30 PM. The new arrival time is 7:59 PM.

□ Flight cancelled message:

Your Delta Air Lines flight 200 has been cancelled.

□ Fax to hotel message:

Attention: Registration Desk

I am sending this message on behalf of David Pynadath, who has a reservation at your hotel. David Pynadath is on United Airlines 190, which is now scheduled to arrive at IAD at 7:59 PM. Since the flight will be arriving late, I would like to request that you indicate this in the reservation so that the room is not given away.

Monitoring Agents

- **Airfare Agent: Airfare dropped message**

The airfare for your American Airlines itinerary (IAD - LAX) dropped to \$281.

- **Earlier-Flight Agent: Earlier flights message**

The status of your currently scheduled flight is:

190 LAX (11:45 AM) - IAD (7:29 PM) 45 minutes Late

If you would like to return earlier, the following United Airlines flights will arrive earlier than your scheduled flights:

946 LAX (8:31 AM) - IAD (3:35 PM) 11 minutes Late

388 LAX (9:25 AM) - DEN (12:25 PM) 10 minutes Late

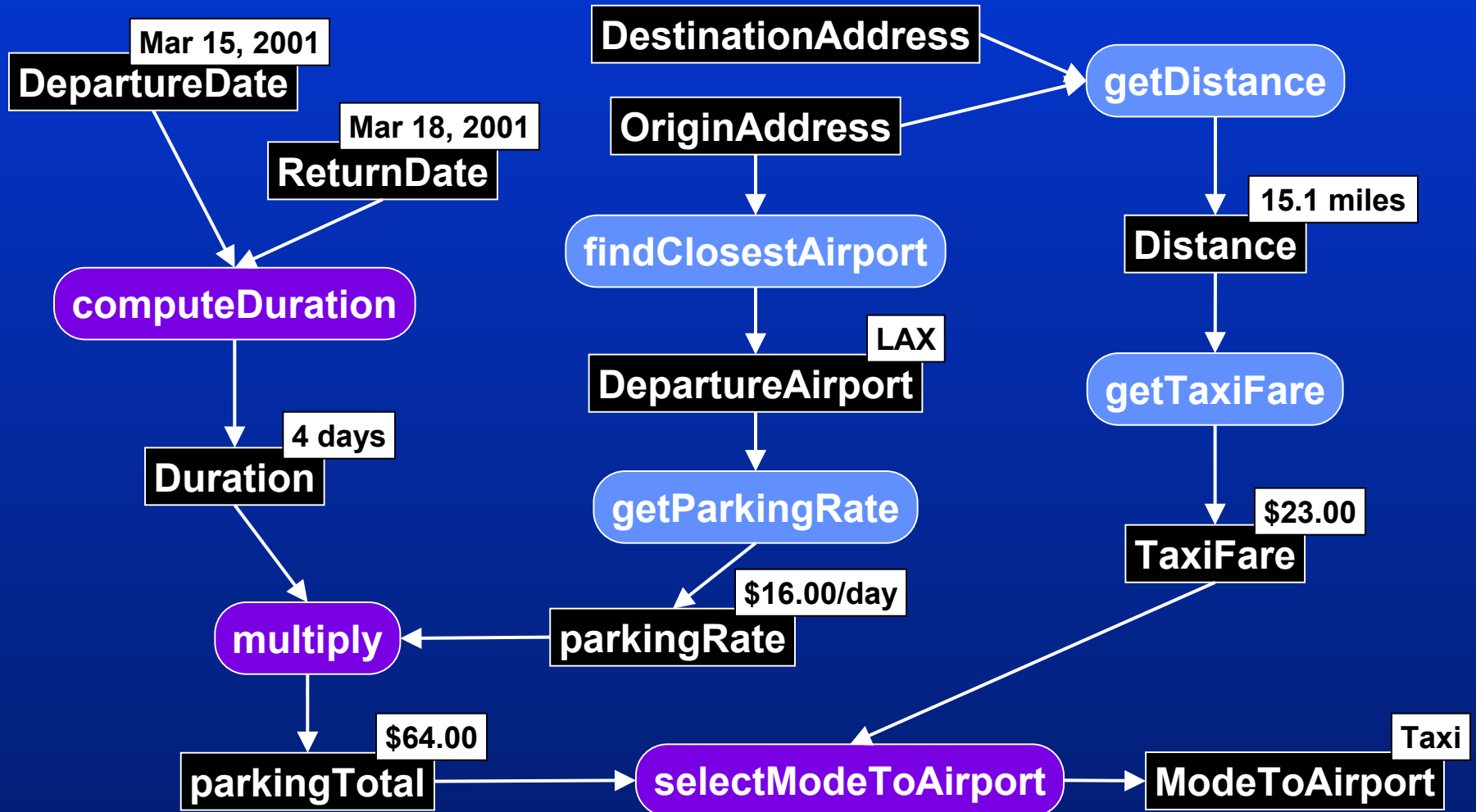
1534 DEN (1:20 PM) - IAD (6:06 PM) On Time

Heracles: Constraint Networks for Managing Information

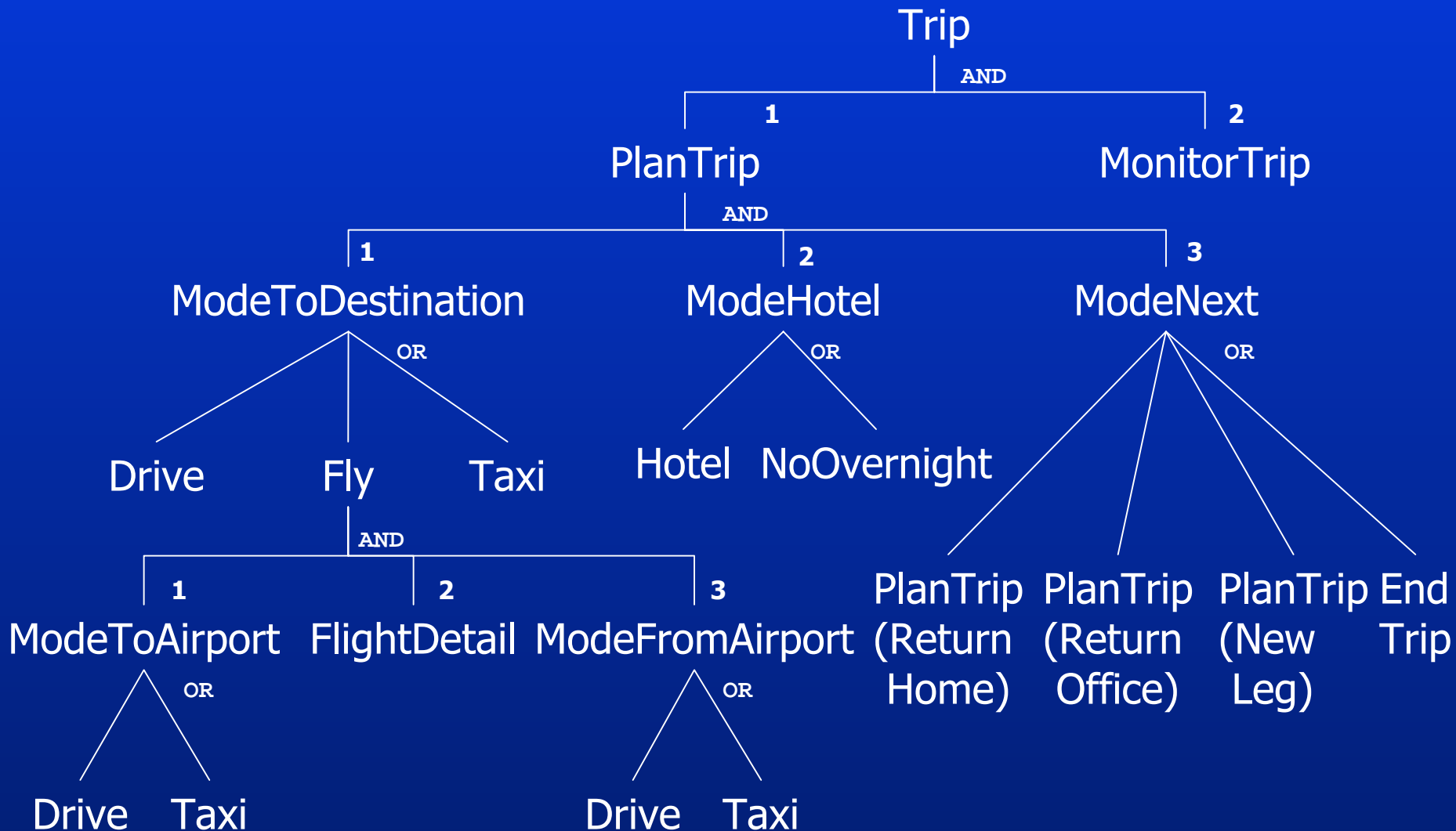
Hierarchical Constraint Reasoning System

- Organizes and integrates information
- Decides when to launch data requests
- Evaluates constraints
- Propagates information
- Computes preferences
- All run as asynchronous processes to support the user

Constraint Network: Drive or Taxi?

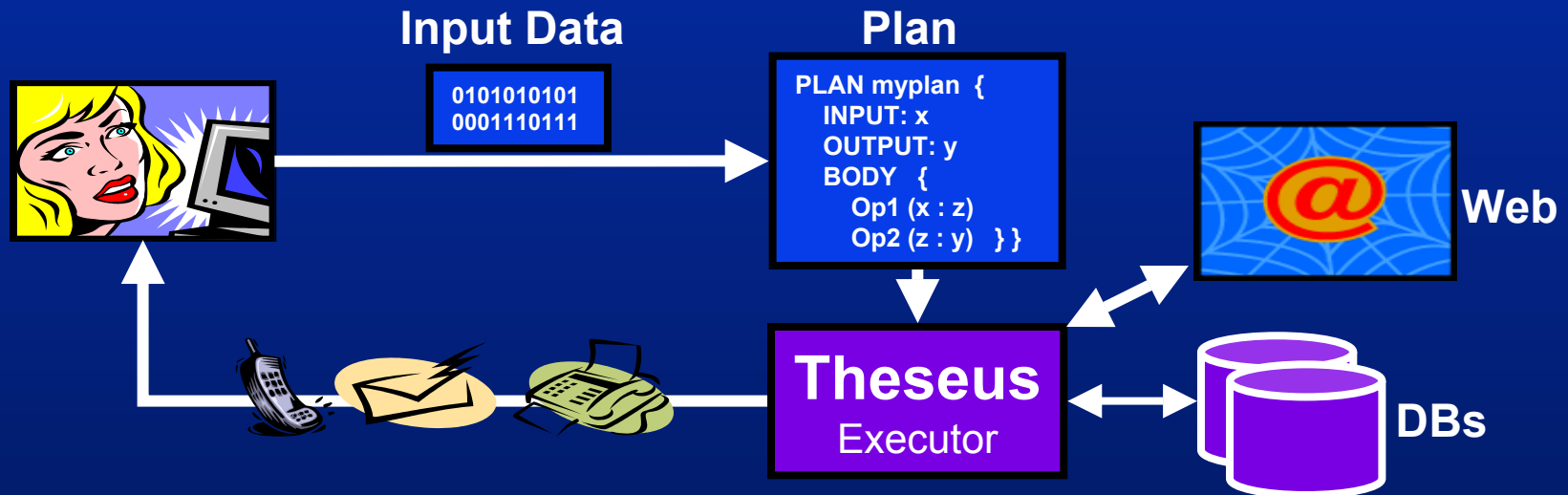


Template Hierarchy



Theseus

- A plan language and execution system for building Web-based information-gathering and monitoring agents
 - *Efficient* enough for near-real-time monitoring: streaming dataflow
 - *Expressive* enough for integrating a variety of sources (web sites, XML, databases, ...)



Live Access to Web Sources

- HTML sources turned into queryable XML

Wrapper

The screenshot shows a Yahoo! Weather page for Toledo, Spain. The current temperature is 25°C, with a high of 32°C and a low of 19°C. The outlook is sunny. The 5-day forecast shows sunny conditions with high and low temperatures ranging from 14°C to 33°C.

Today	Tomorrow	Sun	Mon	Tue
Sunny	Sunny	Sunny	Sunny	Sunny
High: 32 Low: 19	High: 31 Low: 18	High: 33 Low: 16	High: 32 Low: 14	High: 33 Low: 16

```

<YAHOO_WEATHER>
- <ROW>
  <TEMP>25</TEMP>
  <OUTLOOK>Sunny</OUTLOOK>
  <HI>32</HI>
  <LO>19</LO>
  <APPARTEMP>25</ APPARTEMP >
  <HUMIDITY>35%</HUMIDITY>
  <WIND>E/10 km/h</WIND>
  <VISIBILITY>20 km</VISIBILITY>
  <DEWPOINT>9</DEWPOINT>
  <BAROMETER>959 mb</BAROMETER>
</ROW>
</YAHOO_WEATHER>

```


Machine Learning for Constructing Wrappers

Wrapper Builder - detail.trn - [Teaching and Learning]

File Edit Mark-Up Tools View Window Help

New Open Save Fetch Define Teach Learn Verify Link

detail

- Page3.html
 - 3
 - Mostly Cloudy
 - 3
 - 11
 - 2
 - 80%
 - NE/38 km/h
 - 6 km
 - 6
 - 1022.00 mb

Yahoo! Weather - Beijing [Add to My Yahoo!](#)

[Weather](#) > [Asia](#) > [China](#) > Beijing

Today	F° or C°	Sat	Sun	Mon	Tue
<div style="display: flex; justify-content: space-between;"> <div style="background-color: #4b0082; color: white; padding: 10px; border-radius: 5px;">-3°</div> <div style="text-align: center;"> Mostly Cloudy </div> <div style="background-color: #00008b; color: white; padding: 10px; border-radius: 5px;">Hi 3°</div> </div> <div style="display: flex; justify-content: space-between; margin-top: 5px;"> <div style="text-align: center;">at: 10:00pm GMT</div> <div style="text-align: center;">LO -11°</div> </div>	Wind Chill: -2° Humidity: 80% Wind: NE/3 km/h Visibility: 6 km Dewpoint: -6° Barometer: 1022.00 mb Records & Averages	 Partly Cloudy Hi 8 Lo -6	 Partly Cloudy Hi 8 Lo 1	 Partly Cloudy Hi 10 Lo -4	 Partly Cloudy Hi 7 Lo -1

<-10 -10 -5 0 5 10 15 20 25 30 35+>

Current conditions and forecasts provided by Weathernews Inc.

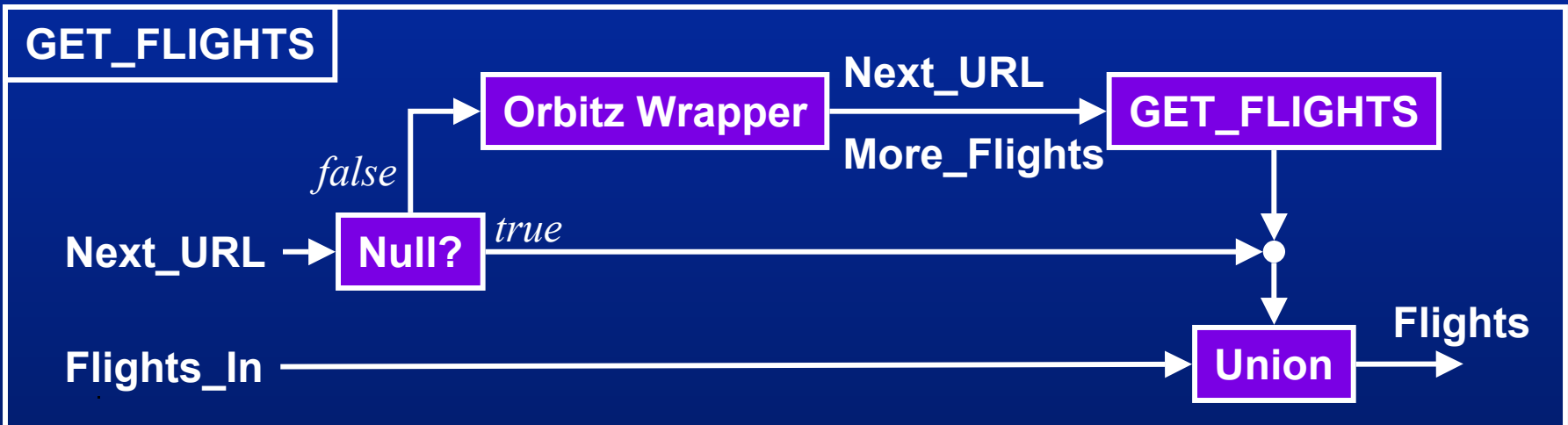
Node Name	Rule Type	Rule Content
temp	Extract	Begin_Rule _FE_ [0] __ST__ 2 " face = " Arial " > <no> End_Rule _FE_ [1] __ST__ °
outlook	Extract	Begin_Rule _FE_ [0] __ST__ > End_Rule FE

Pages **Rules** Messages

Project: weather; Site: yahoo Markup samples and train. Created on 2/16/2001

Theseus Information Agent: Orbitz Plan

Recursive plan to collect all flights from Orbitz



Theseus: Efficiency Streaming Dataflow

- **Dataflow-style execution**
 - Operators execute when inputs become available
 - Optimizes horizontal parallelism
 - Plan is as parallel as its data dependencies allow
- **Data Streaming**
 - Data in the system represented as *relations*
 - Producer operators pipeline *tuples* to consumers
 - Optimizes vertical parallelism
 - Multiple operators can work on same relation concurrently

Theseus: Expressivity

Plan Language (I)

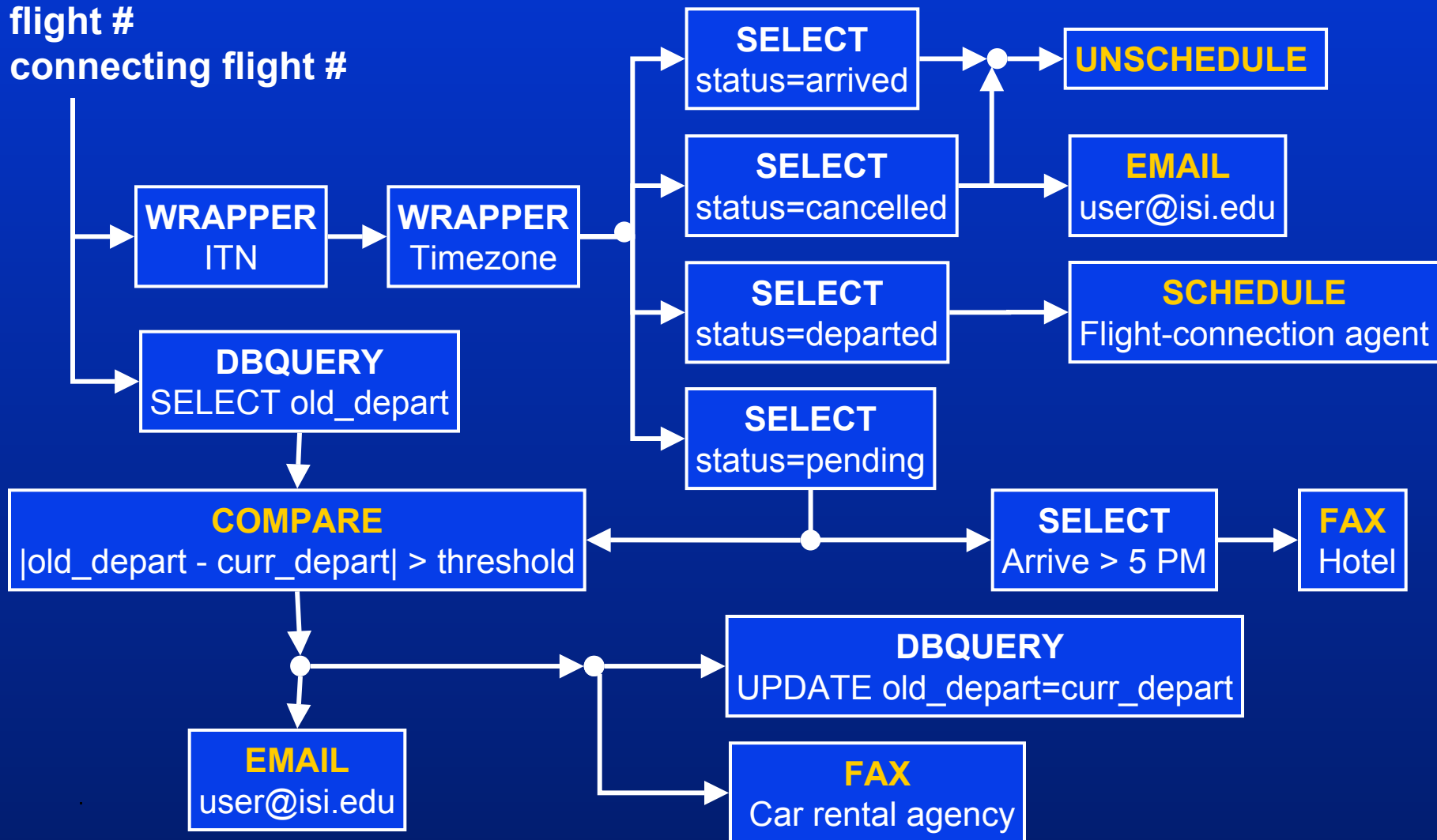
- **Basic relational-style operators**
 - Select, Project, Join, Union, ...
- **Operators for gathering Web data**
 - Wrapper
 - Database-like access to a Web source
 - XQuery, Rel2Xml, and Xml2Rel
 - Enables better integration with XML sources
- **Operators for monitoring Web data**
 - DbExport, DbQuery, DbAppend, DbUpdate
 - Facilitates the tracking of online data
 - Email, Phone, Fax
 - Facilitates asynchronous notification

Theseus: Expressivity

Plan Language (II)

- **Operators for extensibility**
 - Apply: single-row functions
 - Ex: arithmetic, string ops, user-defined functions, ...
 - Aggregate: multi-row functions (ex: SUM)
- **Operators for conditional plan execution**
 - Null: Tests and routes data accordingly
- **Subplans and recursion**
 - Plans are named and have INPUT & OUTPUT
 - Can be operators in other plans → subplans
 - Subplans make recursion possible
 - Ex: “next page” links
 - Subplans encourage modularity & reuse

Theseus Monitoring Agent: Flight Status Plan



Related Work

- **Commercial Tools**
 - MyTrip XTRA Online
 - I:OFAI (Faltings) [Torrens 2002]
 - Airline flight reminders
- **Electric Elves** [Chalupsky et al 2002]
- **Heracles**
 - Dynamic constraint satisfaction [Mittal & Falkenhainer 1990]
 - Planning as dynamic CSP [Kambhampati 2000]
 - Interactive constraint satisfaction [Lamma et al. 1999]
 - Constraint logic programming applied to information integration [Bressan & Goh 1997]
- **Theseus**
 - Network query engines: Tukwila [Ives et al. 1999], Niagara [Naughton et al. 2001], Telegraph [Hellerstein et al. 2000]
 - General agent executors: RAPS [Firby94], PRS [Myers96]

Discussion

- **The Travel Assistant:**
 - Interactive, real-time, efficient travel planning
 - Monitors travel plans
- **General framework for building information, planning, and monitoring assistants**
 - **Heracles:**
 - Hierarchical Constraint Network
 - Mixed-Initiative GUI
 - **Theseus:**
 - Information gathering and monitoring agents
 - Expressive plan language
 - Efficient dataflow execution