

# Predicting Quality-of-Service for Nomadic Applications Using Intelligent Agents



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## Monads Research Project

### ★ Areas of interest

- ★ usefulness of agents in mobile computing?
- ★ agent communication in wireless environments
- ★ adaptability to available resources
- ★ short-term predictions of available resources

### ★ Experimental software

- ★ first prototype ready



## The Wireless Environment

- ★ The characteristics of wireless networks:
  - ★ long latencies
  - ★ highly variable delays
  - ★ sudden disconnections
- ★ Creates problems that are not met in the wireline networks
- ★ Applications must be able to adapt to sudden changes in the quality of data transmission over wireless connections

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## Minimal Adaptation

- ★ Detect changes in the Quality-of-Service
- ★ Adapt to the current QoS
  - ★ Abort data transmission tasks that may no longer be completed in a reasonable time
  - ★ Refuse to accept hopeless requests
  - ★ Use special data filtering and compression methods to minimize the amount of data
- ★ Example: a Web browser that shrinks large images when inadequate QoS

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## Reacting is Not Enough

- ★ Adaptation based solely on reacting to changes in QoS may come too late
- ★ Example: connectivity was lost
  - ★ nothing can be done afterwards
  - ★ something could have been done *beforehand*
- ★ Too slow reactions may result in 'adaptation' making the situation worse!



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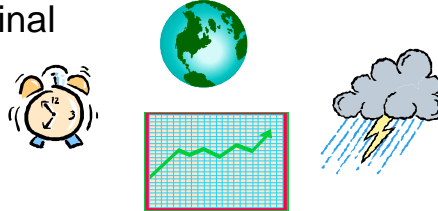
## Predicting QoS

- ★ Capability of predicting changes in the QoS is required for intelligent adaptation
- ★ Uses for QoS predictions:
  - ★ scheduling decisions
  - ★ data prefetching
  - ★ connection management
- ★ “How much data can we transfer within the next  $x$  seconds with  $p\%$  certainty?”

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## Learning to Predict QoS

- ★ Predictions can be achieved by learning how certain quantities affect the QoS
  - ★ location of the terminal
  - ★ time of day
  - ★ day of week
  - ★ recent QoS values
- ★ Division into sub-problems:
  - ★ predicting terminal movement
  - ★ predicting QoS at given location and time



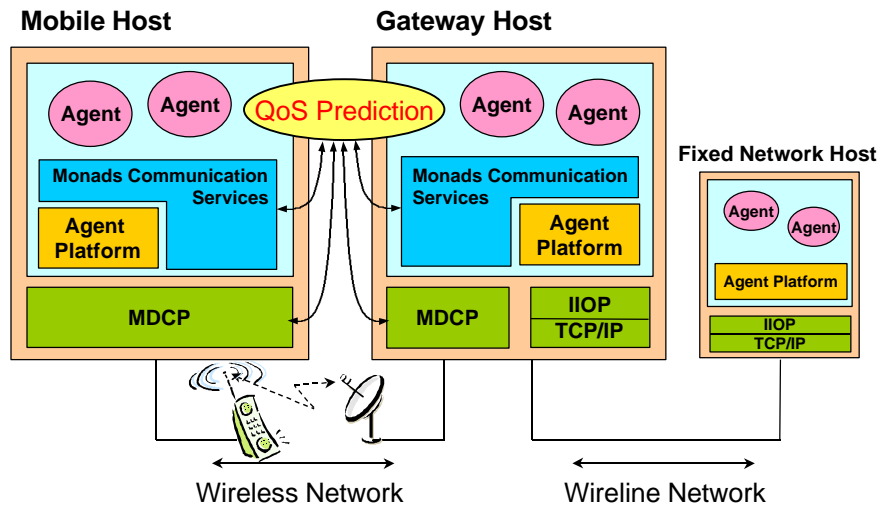
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## Monads System Architecture

- ★ Built upon existing software systems
  - ★ Mowgli, provides efficient protocols and methods for wireless communication
  - ★ Jade, a FIPA compatible agent platform
    - ★ Agents are implemented in Java
- ★ Simplifies making adaptive applications
  - ★ low-level communication optimized for wireless
  - ★ information about the current and future QoS
  - ★ support for learning and knowledge sharing

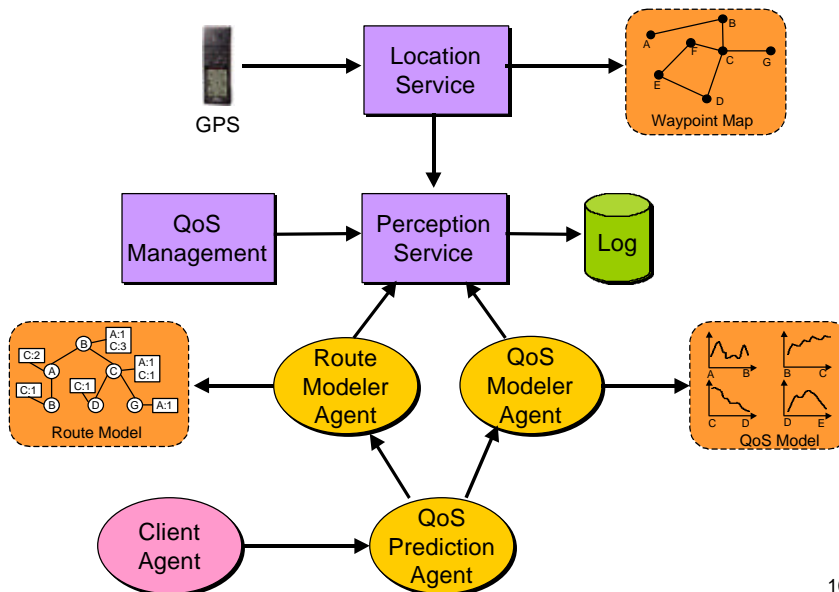
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## Overall Architecture



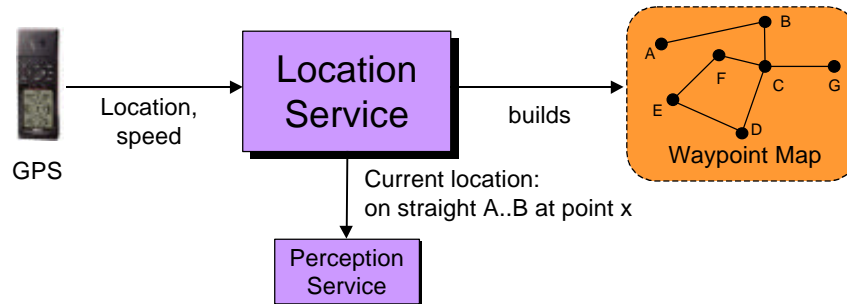
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## Monads System Components



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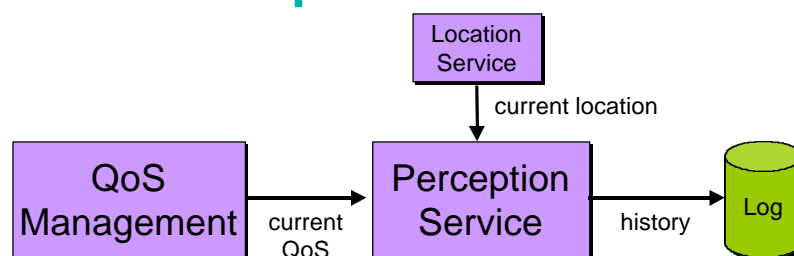
## Location Service



- ★ Reads location information from a GPS device
- ★ Builds a *Waypoint Map*
- ★ Represents the current location as a point on a straight between two waypoints

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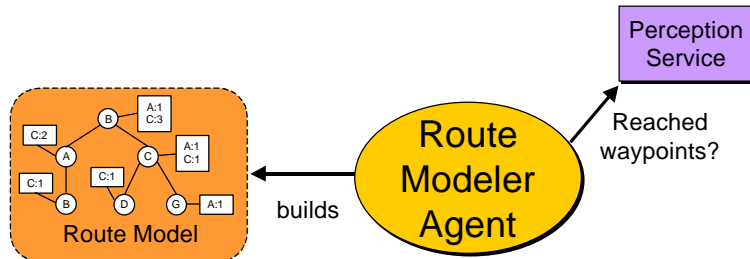
## QoS Management & Perception Service



- ★ QoS Management:
  - ★ Provides information about the current QoS
- ★ Perception Service:
  - ★ Centralized collection of observable values

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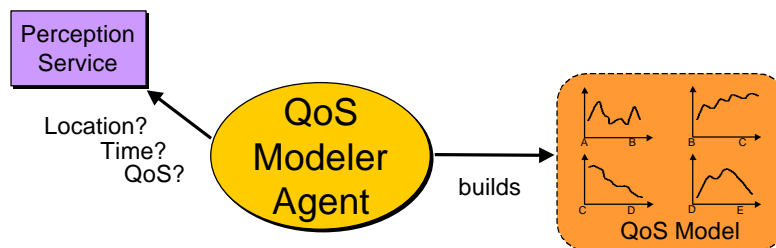
## Route Modeler Agent



- ★ Actively learns the regular routes of a user
- ★ Provides predictions about user movement
  - ★ given a sequence of waypoints, which will be the following waypoints?

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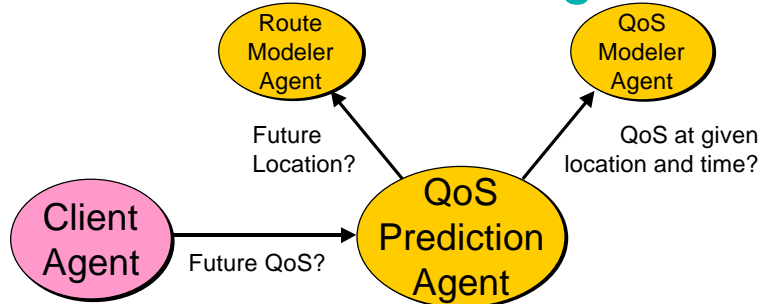
## QoS Modeler Agent



- ★ Actively learns the characteristics of the QoS on the routes traveled
- ★ Provides predictions about the QoS at given location and time

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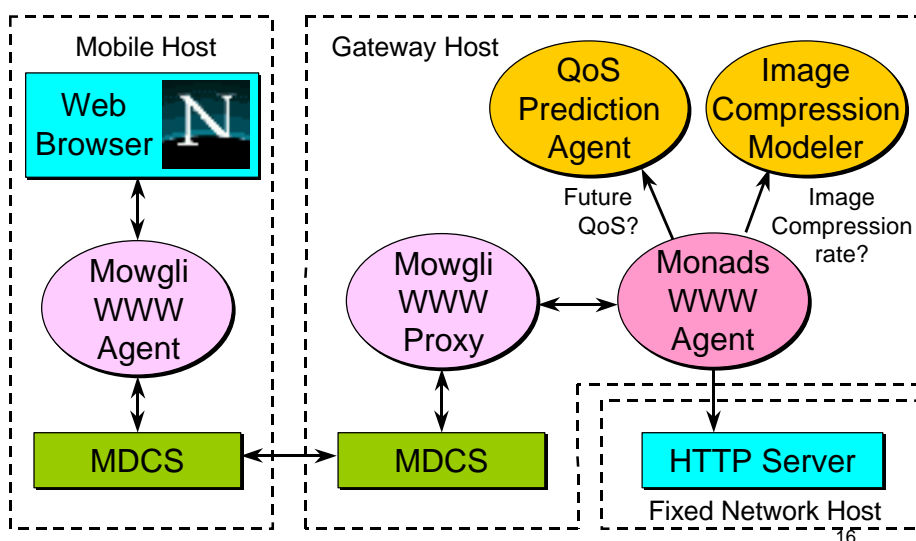
## QoS Prediction Agent



- ★ An intelligent agent that provides QoS predictions
  - ★ combines predictions made by the modeler agents
- ★ Selects between alternative ways to predict
- ★ Informs other agents when the QoS is about to change significantly

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## Example: Adaptive WWW Agent

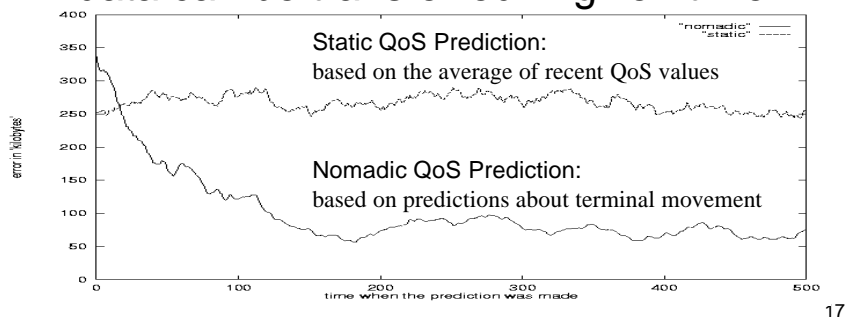


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## Simulation Results

- ★ The prototype was tested using simulated routes and QoS-map
- ★ Average error of prediction “how much data can be transferred in given time”:



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## Conclusions

- ★ Nomadic applications must be adaptive
  - ★ Reacting to changes in the QoS is not enough
  - ★ Predicting the changes is the key to intelligent adaptation
- ★ Predictions can be achieved by learning terminal movement and QoS at given location and time
- ★ Next phase is to share learned models between agents in different terminals

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