Low Overhead Dynamic QoS Optimization Under Variable Task Execution Times

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Motivation

Large, unpredictable load variations

- Large
 - Complex set of applications
 - Not all functionality runs at all times
- Unpredictable
 - Complex hardware platform
 - Software may change during the lifetime of the system

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Efficiency

- Not waste resources (power, memory, <u>CPU time</u>, cost ...)
- Optimize some Quality-of-Service metric

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On-line approaches:

Keep a certain reference Load

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- Optimize Quality-of-Service
- Low Overhead

Outline

System Model

Problem Formulation

Solutions Approaches Overhead Other Problems

Experiments

Conclusions and Future Work

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- System Model

System Model



- Execution times vary in unknown ways
- Task rates are decided by the QoS Controller

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Jobs are scheduled through EDF

- System Model

System Model



- Execution times vary in unknown ways
- Task rates are decided by the QoS Controller
- Jobs are scheduled through EDF

System Model

System Model



- System Model

Quality-of-Service

Each task posseses an abstract quality degradation curve:

- functions of rate
- decreasing, strictly monotonic curves
- higher rates \Rightarrow better quality \Rightarrow lower quality degradation.



System Model

Problem Formulation

Solutions Approaches Overhead Other Problems

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Conclusions and Future Work

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Problem Formulation

QoS Controller

- 1. Determines task rates:
 - Maximize overall Quality-of-Service
 - Keep a reference CPU load given by the designer

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- determine execution times
- determine number of jobs to be executed
- 2. Determines its next activation time.

Problem Formulation

QoS Controller



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Problem Formulation

QoS Controller



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Solutions

- Approaches



On-line approaches (QoS controllers):

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- Constant Bandwidth
- Uniform QoS
- QoS Derivative
- Corner Case

- Approaches

Constant Bandwitdh



- B_1, B_2 bandwidth
- $\sum_i B_1 = L_{ref}$



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-Solutions

- Approaches

Constant Bandwitdh



Low Overhead Dynamic QoS Optimization Under Variable Task Execution Times

Approaches

Uniform QoS



Low Overhead Dynamic QoS Optimization Under Variable Task Execution Times

- Approaches

Uniform QoS



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Approaches

QoS Derivative



Approaches

QoS Derivative



- Approaches

QoS Derivative



Optimum approach for convex quality degradation curves

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Convex optimization problem

- Approaches

Corner Case



For concave quality degradation curves, the optimum is one of the corner cases





Active set of tasks (no. of tasks to be considered)

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Complexity

Overhead

Active Set of Tasks



Overhead

Active Set of Tasks



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-Overhead

QoS Controller Complexity

QoS Controller	Complexity
Constant Bandwidth	<i>n</i> · <i>O</i> (1)
Uniform QoS	$O(n \cdot O(q))$
QoS Derivative	$O(n \cdot O(q))$
Corner Case	$O(n \cdot log(n))$

- n number of tasks (in the active set)
- O(q) complexity of calling the quality degradation function for a value

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Conter Problems



- Measure execution times
- Determine the number of jobs to execute (in the case of overload)
- Determine the QoS Controller's next activation point

- Experiments

System Model

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Setting

- 240 randomly generated test-cases with convex or concave quality degradation curves
- 5 to 100 tasks
- execution times variation $[c_{min}, c_{max}] = [c_{min}, 100 \cdot c_{min}]$

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- ▶ 3 different processors (*low*, *medium*, *high*)
- 6 different overhead setting (P1 to P6)

- Experiments

On-line Approaches



Amount of Resources

Experiments

Period Assignment



Period Assignment Policy

Experiments

Active Task Set and Overheads



Controller Overhead T(1)

- Conclusions and Future Work

Conclusions

 Solved the QoS problem for mono-processor systems with independent tasks

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- Proposed approaches for convex and concave quality degradation curves
- Determined Controller complexity
- Considered overheads
- Considered other practical problems

Conclusions and Future Work

Future Work

- More complex architectures
- Other types of resources
- More optimization criteria

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Conclusions and Future Work

Questions???

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