



# Multi-Objective Optimization of Hazardous Material Transportation

By:

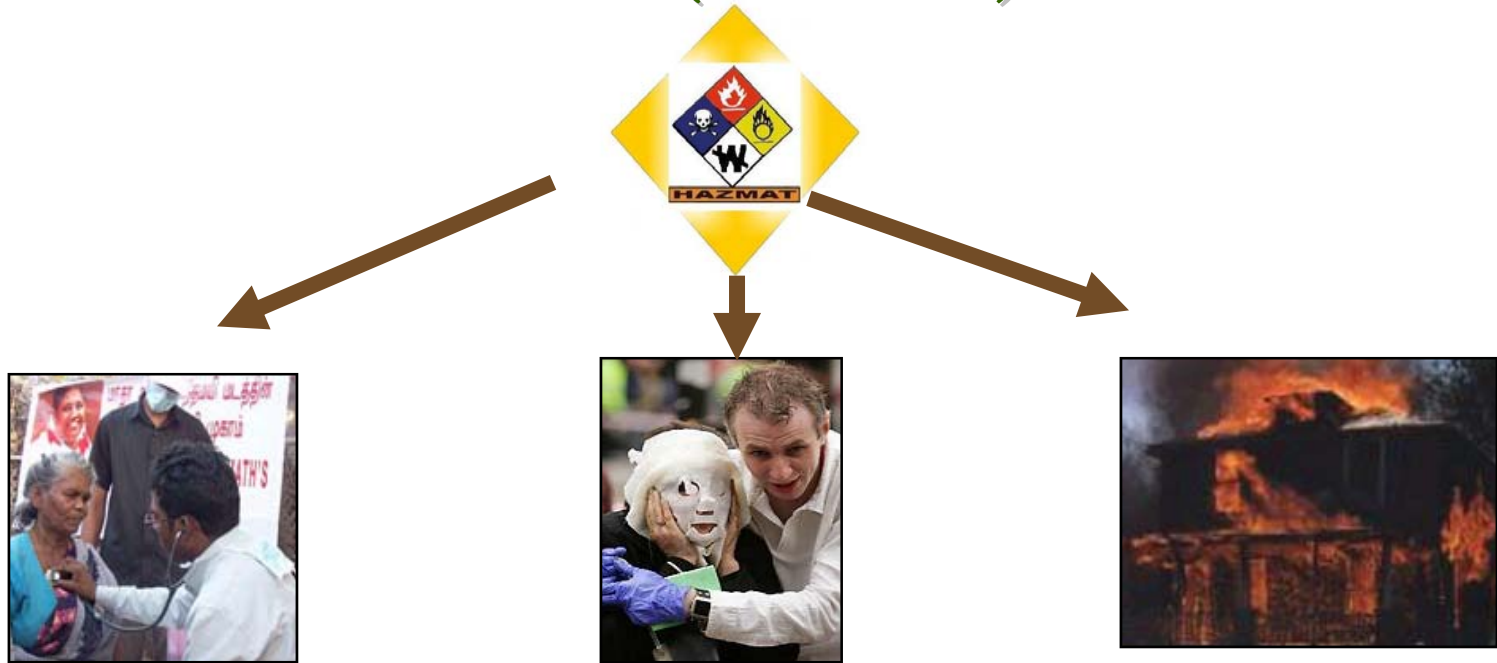
**R. Pradhananga, E. Taniguchi & T. Yamada**

**Department of Urban Management**

**Kyoto University**

24<sup>th</sup> October 2008

# Hazardous material (Hazmat)



## US Department of Transportation (2004):

“**Hazardous material** is a substance or material which has been determined by the Secretary of Transportation to be capable of posing an unreasonable **Risk to Health, Safety, and Property** when transported in commerce, and which has been so designated.”



# Hazmat Transportation

## □ Cause

Advance Technology

## □ Main Problems

- ❖ High volume shipments
- ❖ Potential adverse condition

## □ Hazmat transport accidents

- ❖ Relatively less number
- ❖ High severity

# Some Major Hazmat Accidents

- ❑ Wagon carrying fuel oil explosion in North Korea (2004)  
161 killed, 1300 injured
- ❑ Truck carrying gasoline explosion in Iran (2004)  
90 deaths, 114 injured & 6 vehicles crushed

**(Source: UNEP-APELL Program)**

- ❑ Truck carrying gasoline and diesel accident in Tokyo (3rd August 2008)



**Source: The Japan Times Online**



# Objectives of the Study

To determine a set of pareto-optimal paths in which both the cost of transportation and associated risk are minimized with equal consideration.

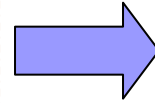


# Solution Techniques for Normal Vehicle Routing Problems with Time Windows (VRPTW)

## Route Choice:

### Shortest Path Techniques

- Dijkstra Method
- Adapted least path method
- Ant routing method

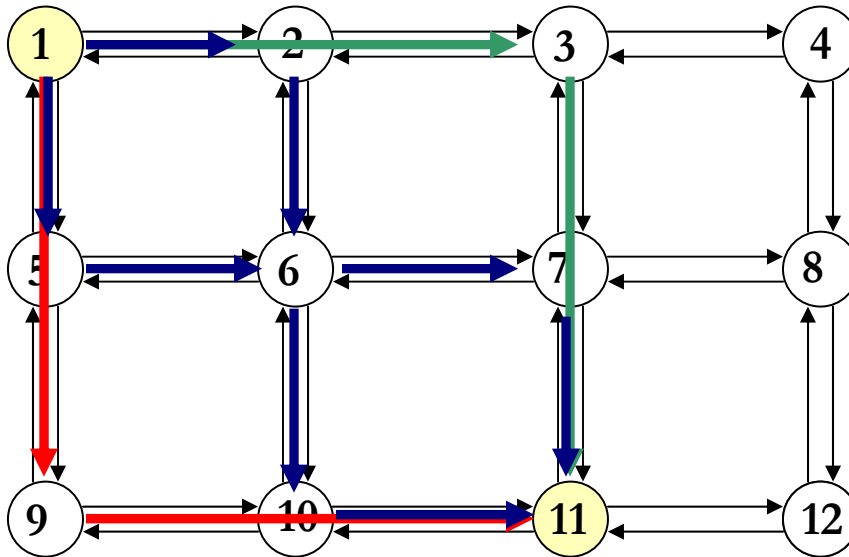


## Routing:

Order of customer to be visited

- Exact Algorithm
- Meta-heuristic Algorithms  
Genetic Algorithm, Simulated Annealing, Tabu Search, Ant Algorithm

# Normal VRPTW vs. Hazmat VRPTW



Route Choice:

Shortest travel  
time path or

Lowest risk path  
???

Route choice and routing process should be carried out simultaneously as a single process.



# Mathematical Model

## Objective Function

Minimize

$$Z(X, Y) = [Z_1(X, Y) \quad Z_2(X, Y) \quad Z_3(X, Y)]^T$$

$Z_1 =$  Total number of Vehicles in Use

$Z_2 =$  Total Travel Time

$Z_3 =$  Total Risk Exposure

$X =$  Order of Customers to be visited

$Y =$  Order of Paths to be followed



# Travel Time Calculation

$$Z_2(X, Y) = \sum_{l=1}^m C_t(x_l, y_{n(i), n(i+1)}^p) \quad \text{for } n(i) \in x_l$$

Average Travel Time from  
 $n(i)$  to  $n(j)$  using path  $p$

Unloading Time

$$C_t(x_l, y_{n(i), n(i+1)}^p) = \sum_{\substack{i=0 \\ j=i+1}}^{N_l} (\bar{T}_{n(i), n(j)}^p - t_{c, n(j)} + t_{w, n(j)}) \quad \text{where } p \in P$$

Waiting Time

$$t_{w, n(j)} = \begin{cases} (e_{n(j)} - t_{l, n(j)}) & \text{if } t_{l, n(j)} < e_{n(j)} \\ 0 & \text{otherwise} \end{cases}$$

# Risk Exposure Calculation

$$Z_3(X, Y) = \sum_{l=1}^m R_l(x_l, y_{n(i), n(i+1)}^p) \quad \text{for } n(i) \in x_l$$



$$R_l(x_l, y_{n(i), n(i+1)}^p) = \sum_{\substack{i=0 \\ j=i+1}}^{N_l} R_{n(i), n(j)}^p \quad \text{where } p \in P$$

Probability of  
explosive accident

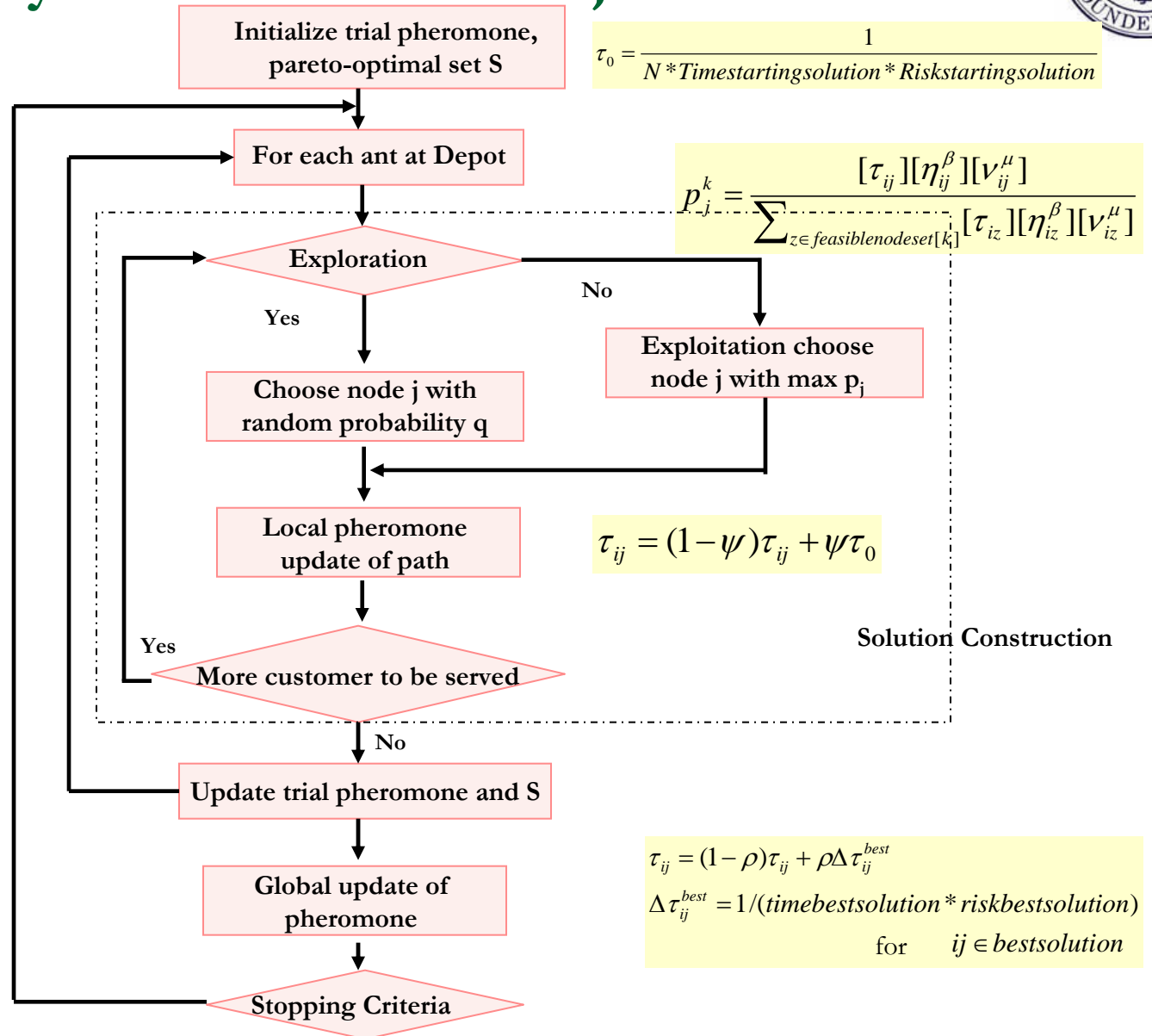
Exposure Population



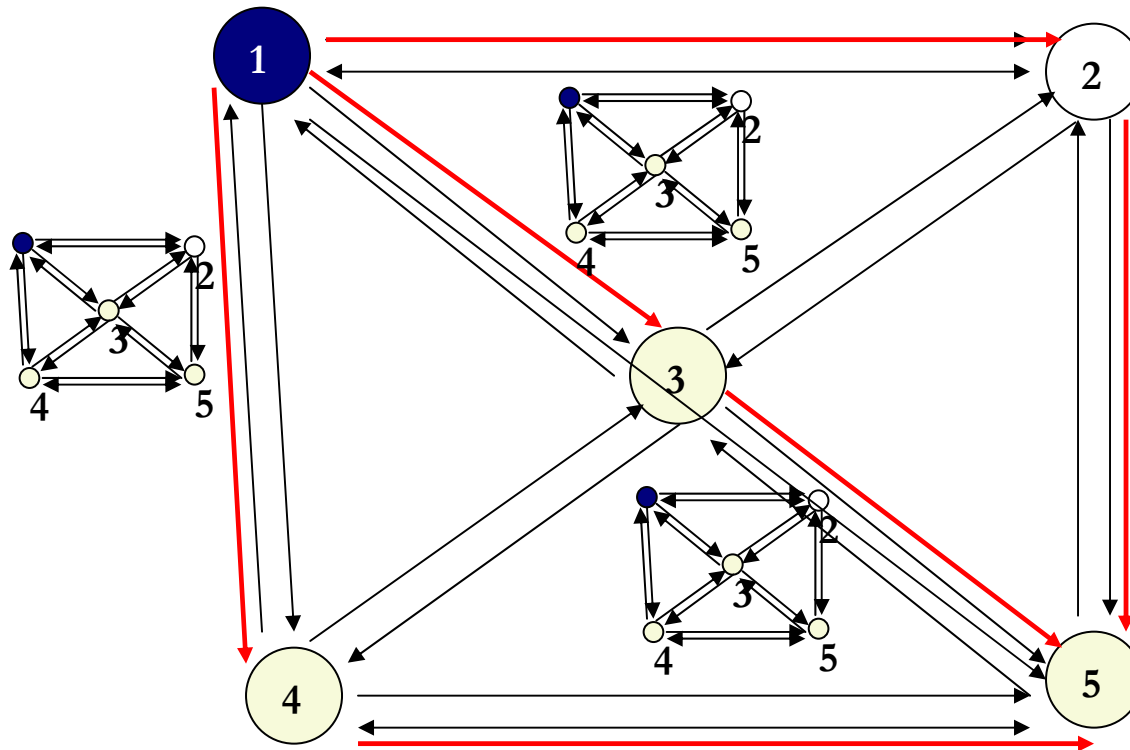
$$R_{n(i), n(j)}^p = \sum_{v(i)v(j) \in p} AR_{v(i)v(j)} EP_{v(i)v(j)}$$

# Ant Colony System for Multi-Objective VRPTW

- MACS-VRPTW  
Gambardella et.al,  
1999  
2Ant colonies , ACS-  
VEI, ACS-TIME
- Baran et.al,  
2003  
Single Ant colony



# Proposed Ant Colony System



1 - Depot

3,4,5 - Customer nodes

2 - Non customer node

## ❑ Previous ACS

Shortest path is already known. One path for one node to be considered.

## ❑ Proposed ACS

Network addition for each feasible node-> Complicate problem size



# Labeling Algorithm

- Obtain a set of dominant paths  $\mathbf{P}$  that can only contribute for optimal routing for each node pair.

- Steps:

## ❖ Label Initialization

-Define Set of Unprocessed labels  $\rightarrow L$  and Useful labels  $\rightarrow U$

$L_{N1} = \{\text{res}(L), t(L), r(L), \{\text{vis}(L)\}, \text{pre}(L), \text{clabel}\}$

{ 2 | 56 | 20.46 | {0 2 0 1 1 2 1 1 1 2 2 2} | 13 | 26 }

$\text{res}(L) \rightarrow$  resident vertex node

$t(L) \rightarrow$  Travel time at label  $L$

$r(L) \rightarrow$  Risk at label  $L$

$\{\text{vis}(L)\} \rightarrow$  A vector showing possibility of visit from resident vertex to all nodes

$\text{pre}(L) \rightarrow$  Preceding label of label  $L$

$\text{clabel} \rightarrow$  Current label



# Labeling Algorithm (Contd....)

## ❖ Label Selection

- Select label  $L_i$  with minimum time among set  $L$  to process

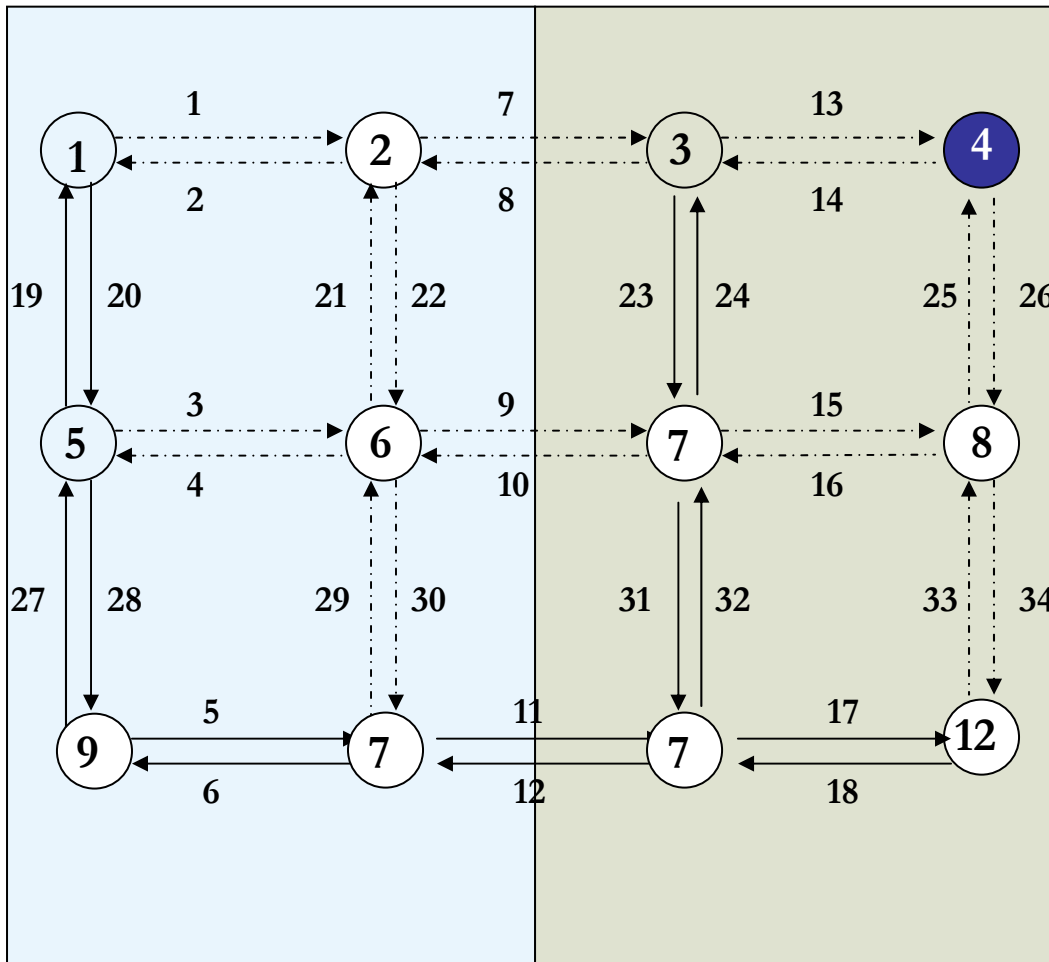
## ❖ Dominance Rule

- For labels with same resident nodes related with  $L_i$
- If  $t(L_2) \geq t(L_1) \ \& \ r(L_2) > r(L_1)$  OR  
 $t(L_2) > t(L_1) \ \& \ r(L_2) = r(L_1)$   $\rightarrow L_1$  dominates  $L_2$
- Remove all dominated labels from  $U$

## ❖ Path Extension

- Create new labels from all labels with resident node as of  $L_i$  to all nodes that are feasible for visit (vis value 1)

# Test Network



Zone 1

Zone 2

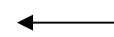
## Distribution of Gasoline



Depot



Customer



Type-1 Link (20Km/hr)



Type-2 Link (15Km/hr)

## Potential Impact Area :

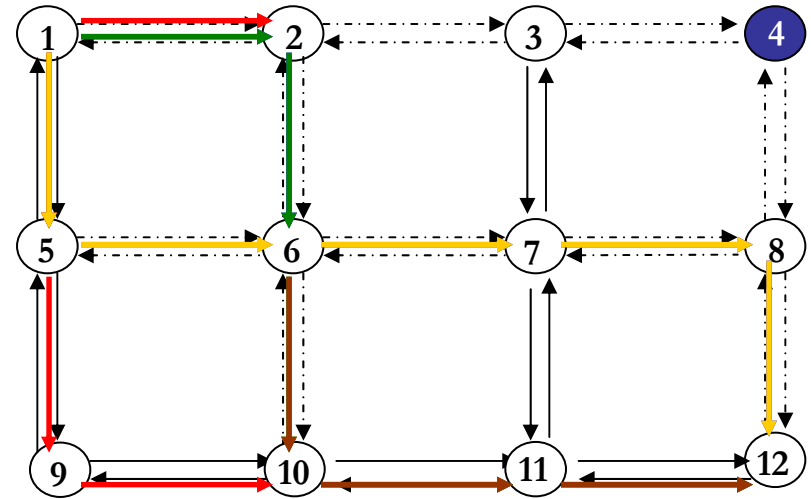
0.5Km in all direction

## 2006 Accident data from :

[http://www.unescap.org/ttdw/roadsafety/Reports2007/Japan\\_RSpresentation](http://www.unescap.org/ttdw/roadsafety/Reports2007/Japan_RSpresentation)

# Paths by Labeling Algorithm vs. Other Shortest Path Approach

From	To	Algorithm	Path	Travel time (min)	Risk (in 1000)
1	2	Dijkstra for time	1->2	16	4.52
1	2	Dijkstra for risk	1->2	16	4.52
1	2	Labeling	1->2	16	4.52
1	12	Dijkstra for time	1->5->9->10->11->12	60	26.92
1	12	Dijkstra for risk	1->2->6->7->8->12	80	24.24
1	12	Labeling	1->5->9->10->11->12	60	26.92
			1->5->6->10->11->12	68	25.63
			1->2->6->10->11->12	72	24.99
			1->5->6->7->8->12	76	24.88
			1->2->6->7->8->12	80	24.24



Dominant set of Paths from node to node-> P small for nearby nodes but increased for farther nodes.

Approach	Dijkstra	Labeling Alg.
No. of Paths	144	250

73.61% increase





# What Next?

- ❑ **Ant Colony System** with simultaneous route choice and routing for minimizing both time and risk.
- ❑ Set of **pareto-optimal paths** with equal consideration of multiple objectives involved.
- ❑ Results-> Expected to provide more precise alternative solutions.



Thank You