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# Reducing Railroad Hazardous Materials Transportation Risk by Route Rationalization (08-2801)

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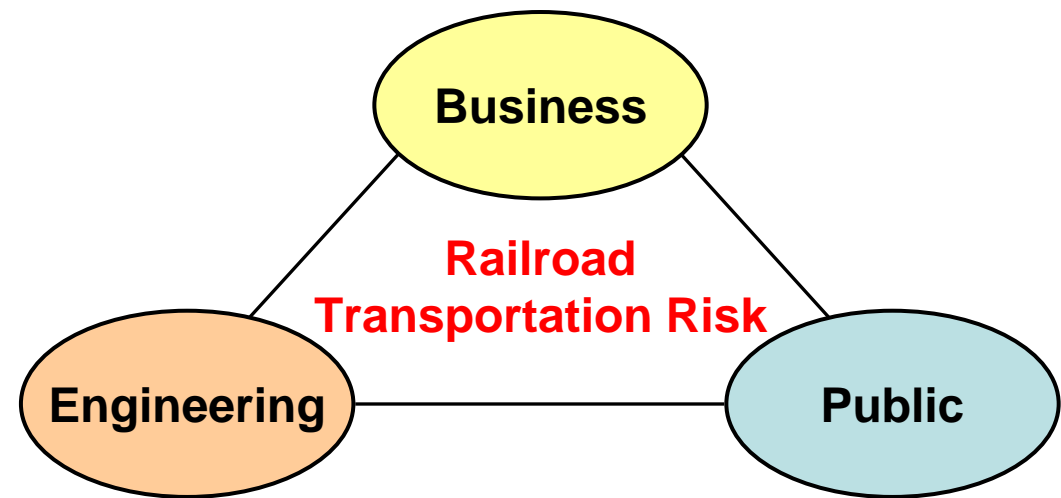
## Outline of Presentation

- **Introduction**
  - Overview
  - Research goals
  - Previous studies
- **Nature of Problem**
- **Case study**
- **Methodology**
  - Risk analysis
  - Rationalization of hazmat route structure
- **Results**
- **Conclusions and Discussion**



## The Importance of Railroad Transportation Risk Analysis

- There is increased attention from industry and government on effective approaches to risk reduction.
- The challenge is to balance the different aspects involved with hazardous material transportation risk.
- The objective is to develop actionable results regarding risk reduction options.



## Route Rationalization

- **Route rationalization** is defined here as evaluation of the entire route structure of a particular hazardous material with the objective of reducing risk by considering how the overall route mileage might be reduced.
- Route rationalization involves changing origin-destination (OD) pairs to decrease overall mileage while taking into account production and consumption levels at each OD pair and all major factors affecting risk
- In contrast to ordinary rerouting, route rationalization involves a comprehensive analysis of the entire route structure, rather than simply bypassing particular locations in a network.
- While ordinary rerouting will often increase hazmat mileage traveled, route rationalization will generally reduce this mileage



## Goals of the Paper

- Develop and present a basic, formal quantitative structure to enable consideration of route rationalization as an option for managing hazmat transport risk
- Use the model to consider a case study based on rail transport of a selected product
- Preliminarily consider the effect of different risk metrics as objective functions in the optimization process and gain a better understanding of the relationship among these metrics



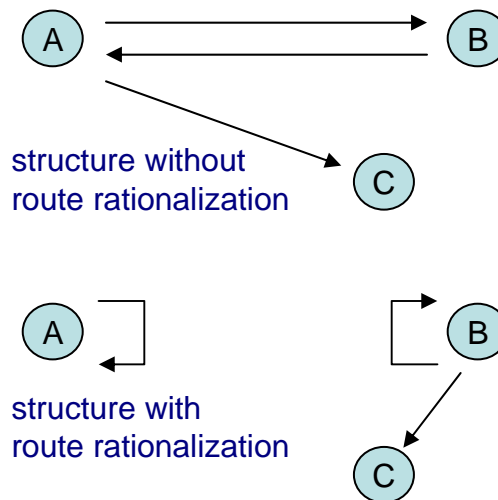
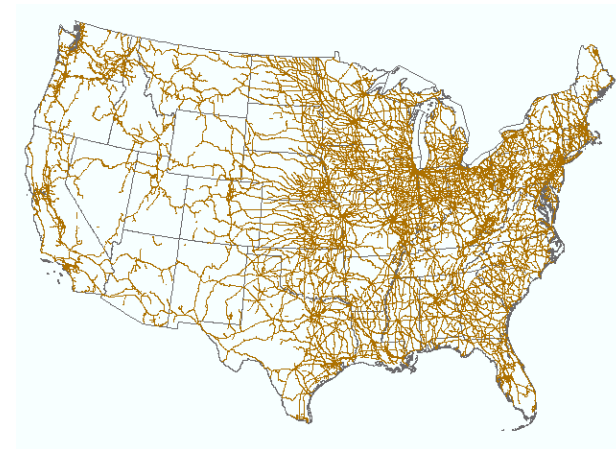
## Literature Review

- There have been a number of studies of hazardous material transportation risk and routing; however, most focus on highway transport.
- Some papers have considered railroad hazmat transportation risk:
  - Rerouting hazmat shipments: Glickman (1983)
  - Comparison of transportation options between road and rail: Glickman (1988), Saccomanno et al. (1989), Bubbico et al. (2004), Verman & Verter (2007)
  - Effects of tank car design: Saat & Barkan (2006), Barkan et al. (2007)



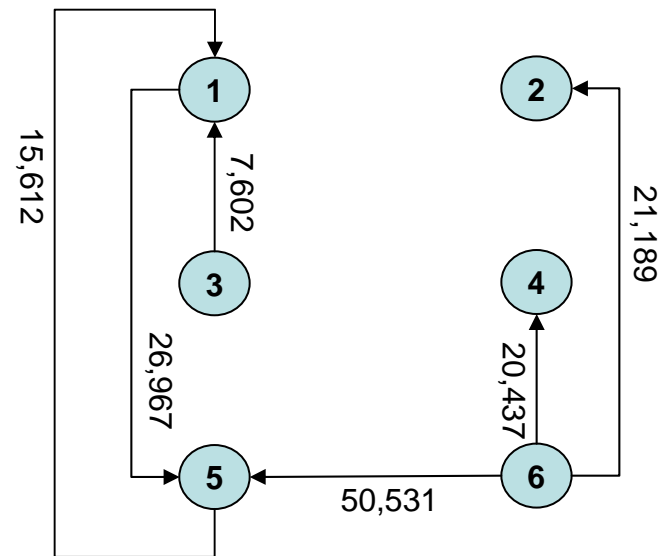
## Nature of the Problem

- Hazardous material traffic originates and terminates at numerous locations throughout the North American railroad network
- Route rationalization involves reducing transportation volume by minimizing the car-mileage required to transport the material to various destination points.



## Case Study : Baseline Network Flow

- Traffic flows based on a particular hazardous material being transported on the railroad network was considered.
- The Princeton Transportation Network Model (PTNM) was used to develop maps of traffic volume and directional flows.
- A rail routing software PC\*MILER|Rail was used to determine the route mileage between each OD pair.



**Baseline car-miles = 142,339**



## Simplified Example

- To rationalize the traffic flow pattern, population exposure, accident likelihood and other factors potentially affecting the risk were first assumed to be homogeneous throughout route structure.
- Under these assumptions risk will be proportional to the length of the route and carload volume on the network.
- The problem in this case reduces to the basic transportation problem in which the objective function is minimization of car-miles.



## Minimization of Car-miles

- The optimal network flow in which the total car-miles are minimized was determined by solving the LP problem.
- Using GAMS/Cplex, the optimal solution is 96,121 car-miles, which is 32% lower than the baseline case.

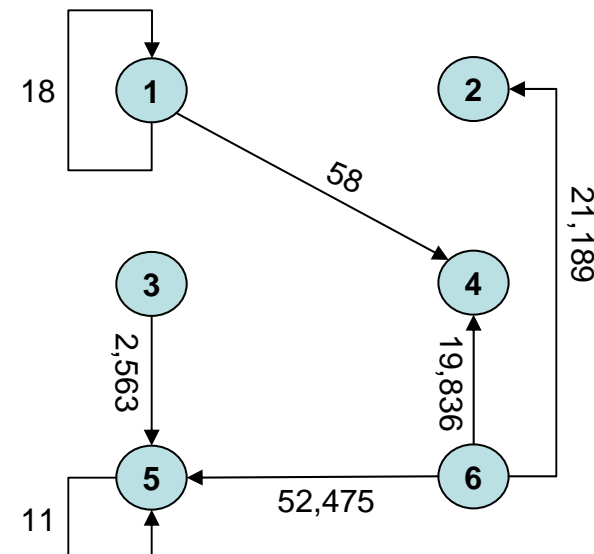
$$\text{Minimize total car-miles} = \sum_{o,d} V_{od} L_{od}$$

subject to:

$$\sum_o V_{od} = D_d, \forall d \quad (\text{shipment balance at destination } d)$$

$$\sum_d V_{od} = S_o, \forall o \quad (\text{shipment balance at origin } o)$$

and  $V_{od}, L_{od} \geq 0$  (nonnegative shipments)

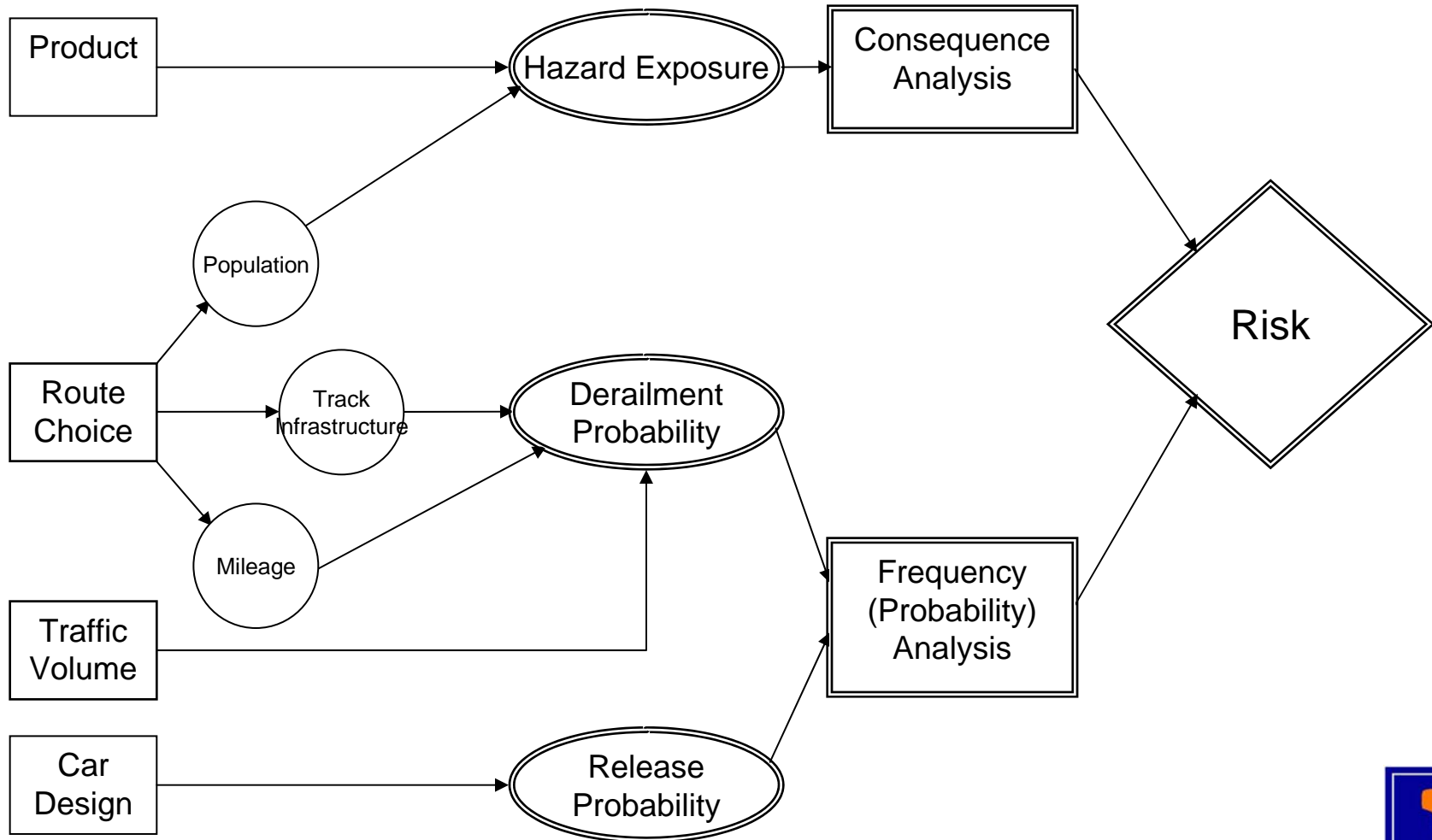


## Minimization of Car-miles (cont'd.)

- Minimization of car-miles does not necessarily guarantee minimization of risk.
- This is because the alternate, shorter routes may have higher accident rates and/or higher population density. These factors are, in fact, not homogeneous along the shipment routes.
- Therefore, a more comprehensive approach is necessary to properly consider the risk associated with alternative routing patterns



# Risk Model Formulation : Factors and Relationships Influencing Hazardous Materials Transportation Risk



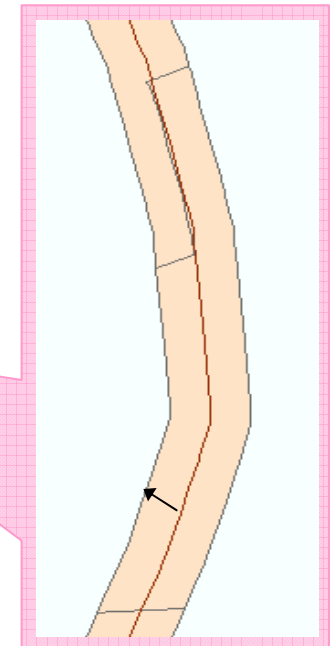
## Risk Model Formulation

- **Probability Analysis**
  - Probability of tank car derailment was estimated using FRA track-class-specific accident rates developed by Anderson and Barkan (2004).
  - Conditional probability of a hazardous material release from a tank car given derailment was determined from RSI-AAR Report RA 05-02 (2006).
- **Consequence Analysis**
  - Hazard was determined using the US DOT Emergency Response Guidebook (ERG) recommended evacuation distances for the selected chemical.
  - Population exposure was calculated using a Geographic Information System (GIS) overlay analysis along the routes under consideration



## Overlay Analysis using GIS

- An overlay of shipment routes and population density was created using US census tract data\* with ArcMap™.
- A buffer was created using the ERG maximum evacuation (downwind) distance for the worst-case release scenario.
- Average population density in the buffer area corresponding to each track segment was estimated.



\* ESRI Data & Maps (2005)



## Rationalization of Route Structure

- The model was modified to incorporate the risk parameters of interest: the likelihood of tank car derailment, the likelihood of hazardous material release and the consequence of release.

$$\text{Minimize annual risk} = \sum_{s,i,o,d} \underbrace{P(I|R,A)_s}_1 \underbrace{P(R|A)}_2 \underbrace{Z_{iod}L_{iod}n_{od}}_3 \underbrace{H_s Y_{iod}}_4$$

subject to :

$$\left. \begin{aligned} \sum_o n_{od} &= N_d, \forall d \quad (\text{shipment balance at destination } d) \\ \sum_d n_{od} &= N_o, \forall o \quad (\text{shipment balance at origin } o) \end{aligned} \right\} 5$$

and  $n_{od}$  : nonnegative integer

- 1: specific release scenario probability
- 2: release probability
- 3: derailment probability
- 4: consequence (persons affected)
- 5: shipments between OD



## Model Flexibility

- The model can be modified to address various possible questions.
  - For example, if only release probability is of interest, the consequence term may be omitted.
  - If risk control is required for any particular OD pair, the maximum tolerable risk level can be specified as a constraint in the model.
  - The route rationalization model should allow flexibility in the analysis to inform policy and planning objectives of interest.



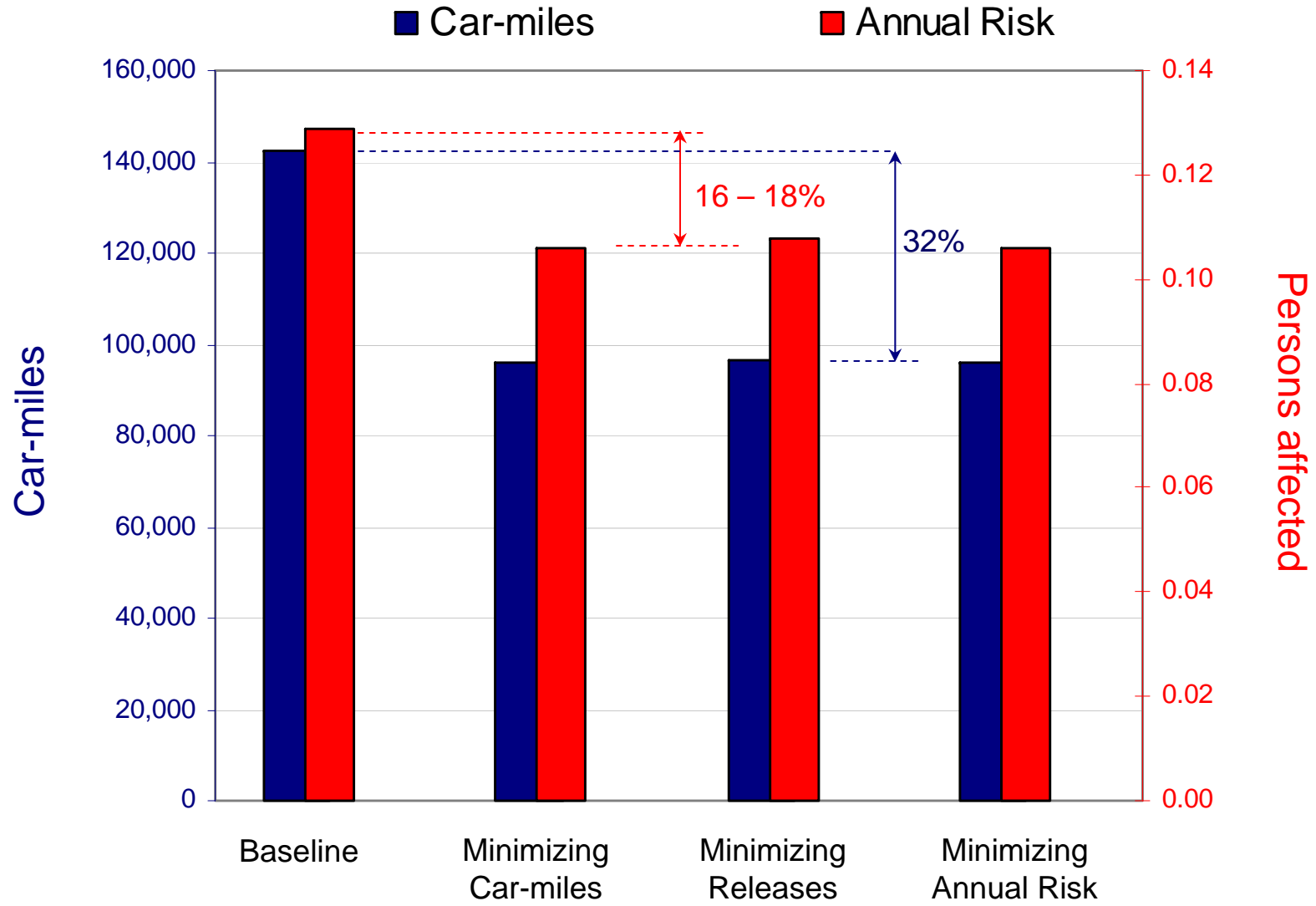
## Results

- The model was used to determine the set of optimal traffic flows for the case study, using minimization of three different objective functions: **Car-miles**, **Release Probability**, and **Annual Risk**.
- Each of these results in a different optimized route structure and correspondingly different values for the various risk metrics

### Optimal Traffic Flows

Metric	Baseline Case	Minimizing Car-miles	Minimizing Release Probability	Minimizing Annual Risk
Total car-miles	142,339	96,121	96,722	96,140
Likelihood of Derailment	$1.76 \times 10^{-2}$	$1.29 \times 10^{-2}$	$1.28 \times 10^{-2}$	$1.29 \times 10^{-2}$
Likelihood of Release	$1.22 \times 10^{-3}$	$8.91 \times 10^{-4}$	$8.85 \times 10^{-4}$	$8.90 \times 10^{-4}$
Annual Risk	$1.29 \times 10^{-1}$	$1.06 \times 10^{-1}$	$1.08 \times 10^{-1}$	$1.06 \times 10^{-1}$

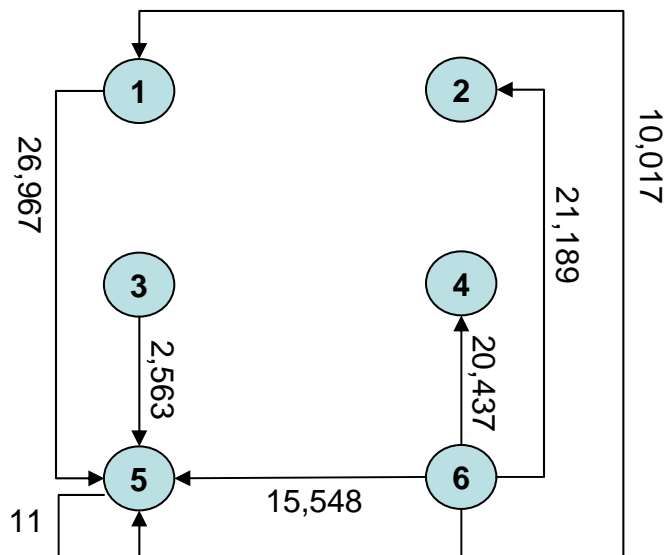
# Graphical Depiction of Results : Annual Risk vs. Car-miles



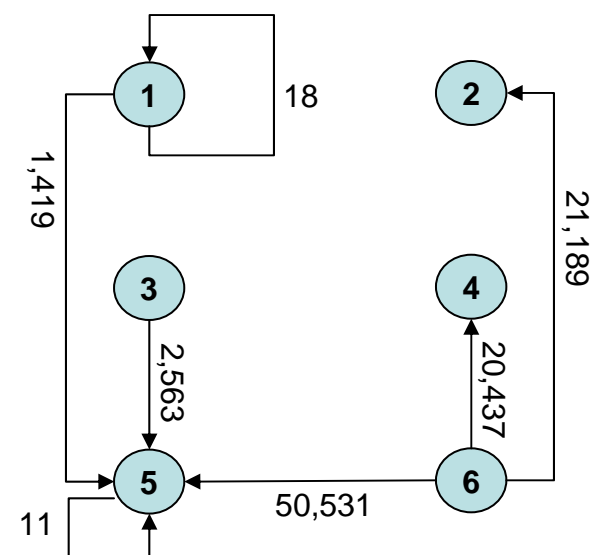
## Effect of Different Objective Function on Routing

- Minimized derailment/release probability car flows vs. minimized risk car flows

Minimizing Release Probability



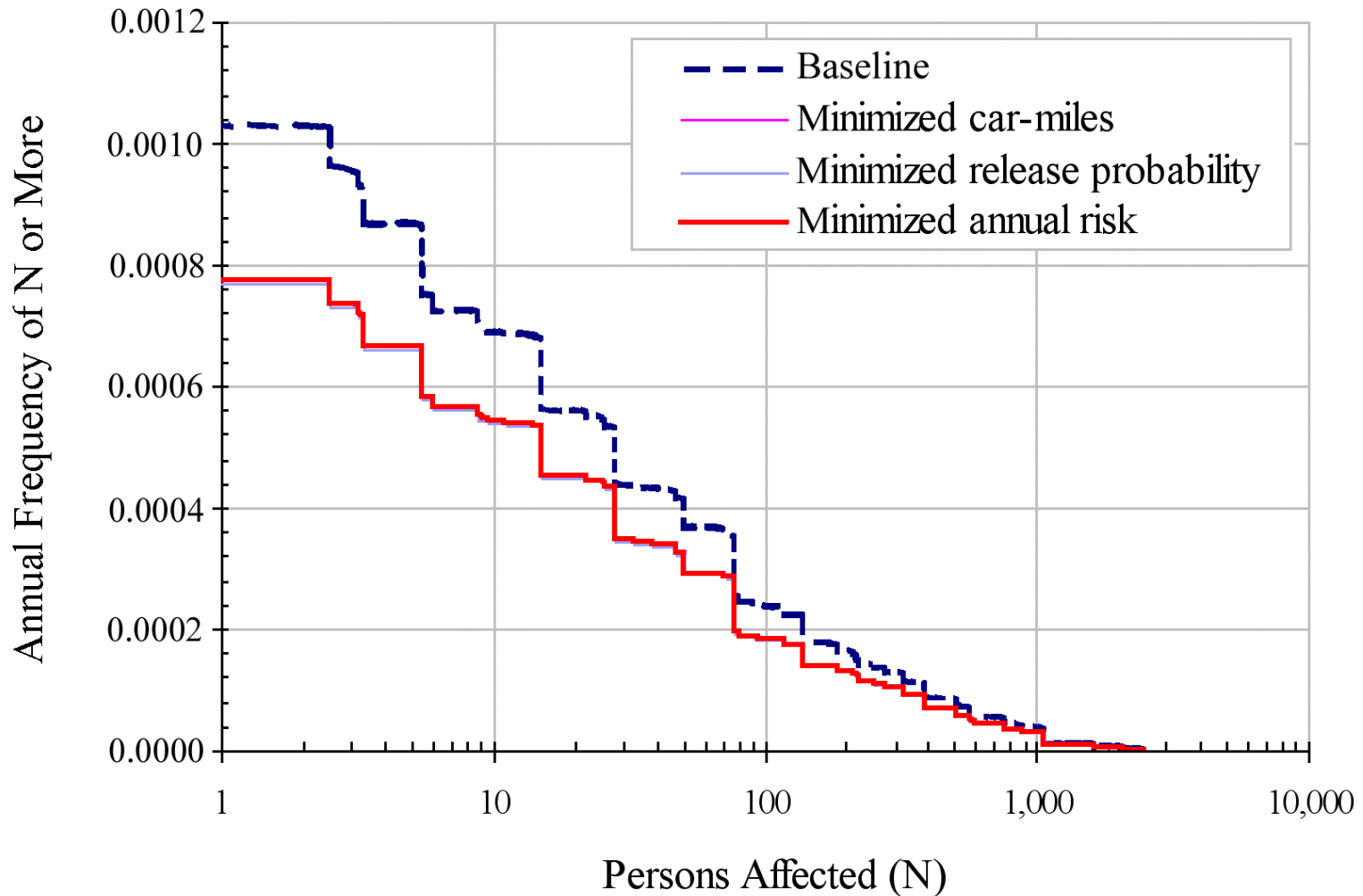
Minimizing Annual Risk



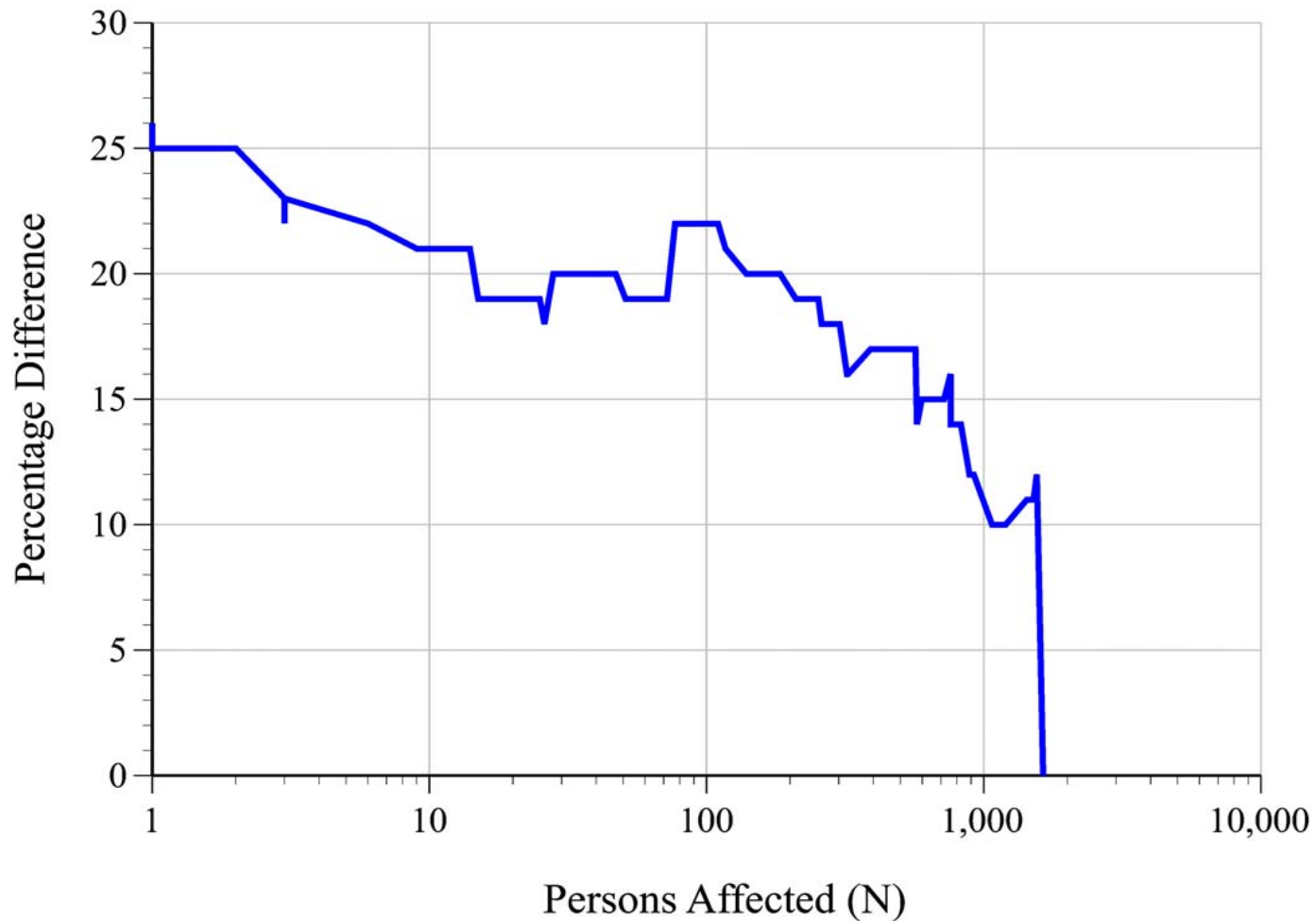
- 'Risk profiles' show the distribution of risk in terms of various magnitudes of consequence vs. the probability (or frequency) of the corresponding consequence.



## Risk Profile Showing Effects of Different Objective Functions on Risk



## Percentage Reduction in Annual Frequency of N or More Persons Affected (Rationalized Route Structure Compared to Baseline Case)



## Conclusions

- For the product evaluated, route rationalization provided a 32% potential reduction in car-miles and a 16-18% reduction in risk.
- The rationalized route structure for this particular hazmat tended to disproportionately reduce exposure to lower population density segments compared to higher population segments.
- Use of different objective functions did not result in major differences in risk for the product studied.
- Depending on the circumstances, route rationalization may be worth consideration as a means of managing hazmat transport risk
- The model presented provides an objective approach to evaluating the possible benefits of this approach

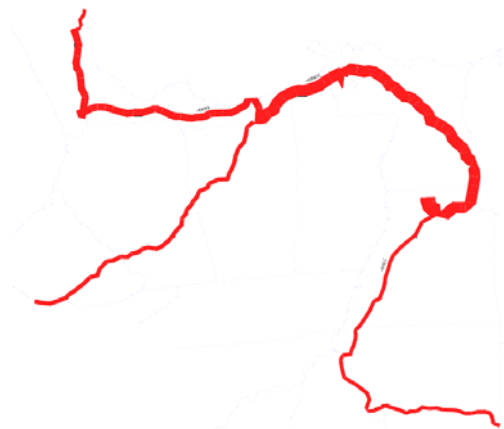


## Constraints & Limitations of Route Rationalization

- The model and results in this paper represent an idealized case, intended to facilitate consideration of this approach.
- In practice, rerouting may involve more complicated constraints that will limit changes in hazmat distribution patterns.
- For products with complex, overlapping routes, route rationalization may have substantial potential benefits, but for others with simpler, non-overlapping route structures, this technique may offer little opportunity for risk reduction.



VS.



## Future Study

- Apply the model to larger, more complex shipment patterns of other products on the North American railroad network.
- Determine other possible factors to consider and develop applicable techniques to refine the model.



## Acknowledgements

