

Modeling Hospital Evacuation for Infrastructure Disruptions

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Veterans Emergency Management Evaluation Center

Superstorm Sandy

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Superstorm Sandy highlighted the impacts infrastructure interruptions can have on hospital operations and evacuations.

Evacuation Decision Challenges

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- High Degree of Uncertainty
- Resource Competition
- High Consequences
- Models can help reason through complexities of evacuations

(www.cbsnews.com)



(www.thewildmagazine.com)



Sandia and Veterans Administration are creating modeling tools to support the hospital evacuation decision process.

Current Modeling Limitations

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- Don't address "Should we evacuate?"
- Assume full functionality of infrastructures
 - No impact to power, communications, etc. or dependent hospital operations such as evacuation, elevators, etc.
 - Underestimate resource needs and overestimate rapidity
- Don't represent staff and organizational adaptations
 - Miss impact of critical human behaviors
 - Underestimate resilience

Questions to Address

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- Given situational awareness, knowledge of infrastructure vulnerabilities, current available resources, and vulnerability of patient population
 - Is evacuation necessary?
 - If so, are current resources adequate to evacuate safely and efficiently?
 - How can resources be best allocated to ensure safe, efficient evacuation?
 - What adaptations can be made in a resource constrained environment?

Case Study: Memorial Hermann Hospital (MHH)

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Environment

- 450 bed adult Level 1 trauma hospital
- Serves 4 million people
- Part of Texas Medical Center, the largest medical center in the world



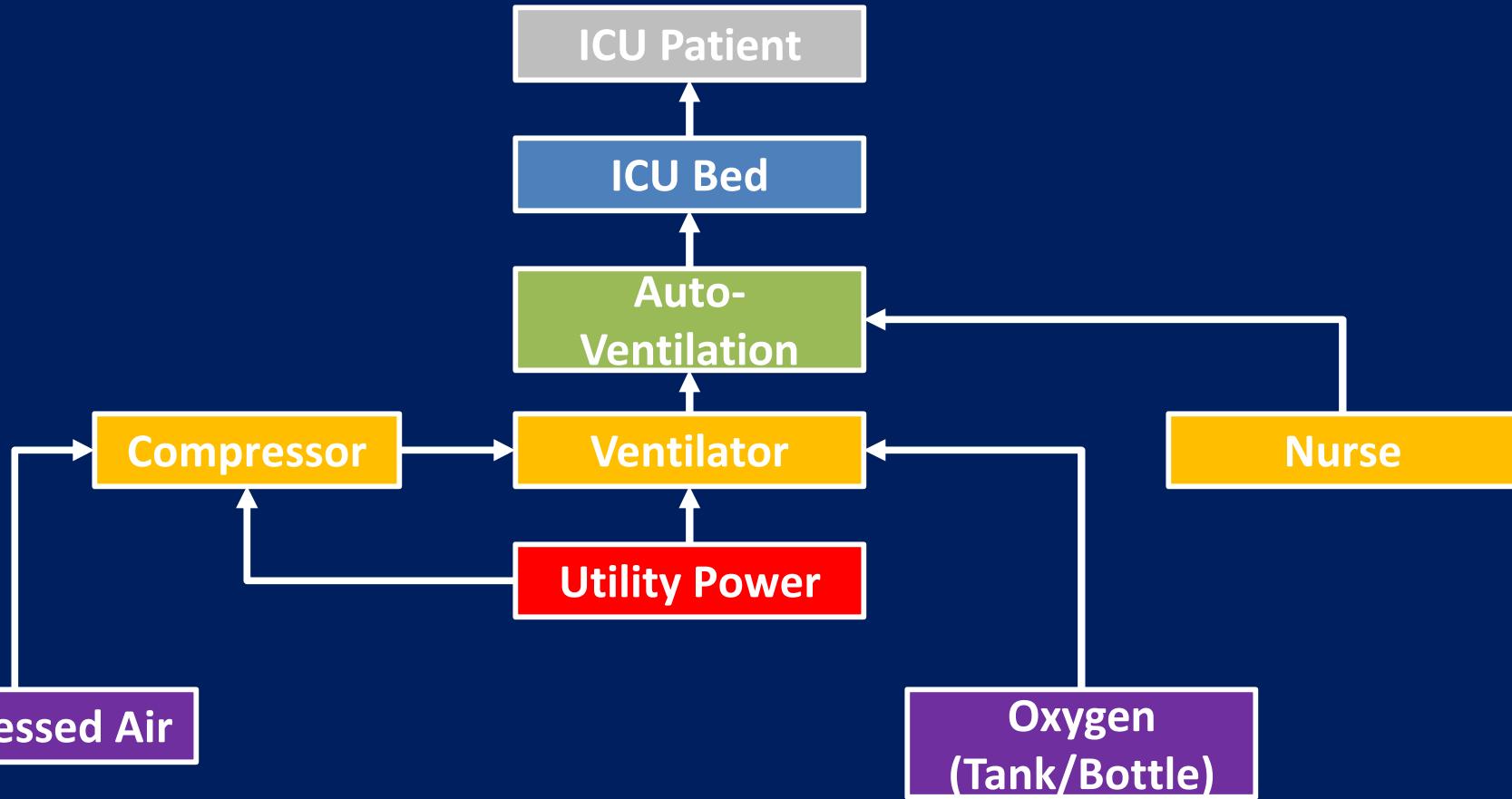
Event

- Hurricane Allison, June 2001
 - Electric power lost with no warning
 - 40 million gallons of water flood basement and electrical switchgear
 - Result: no generator power
 - Of the 575 patients: 106 discharged and 469 evacuated to 29 other facilities either by ambulance or helicopter

Photograph from Floodbreak.com

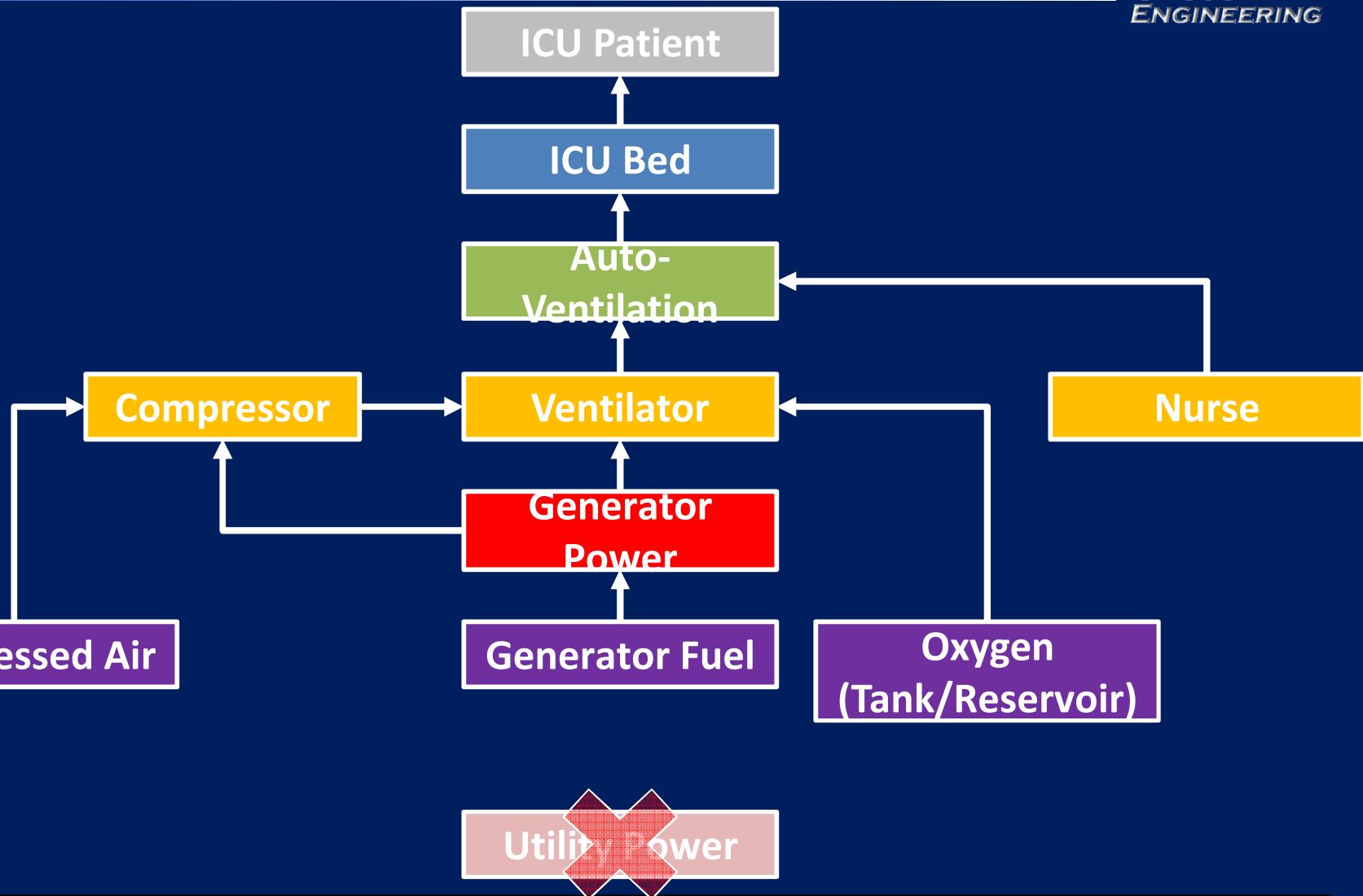
Ventilation Timeline: Nominal Conditions

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Ventilation Timeline: Initial Power Loss

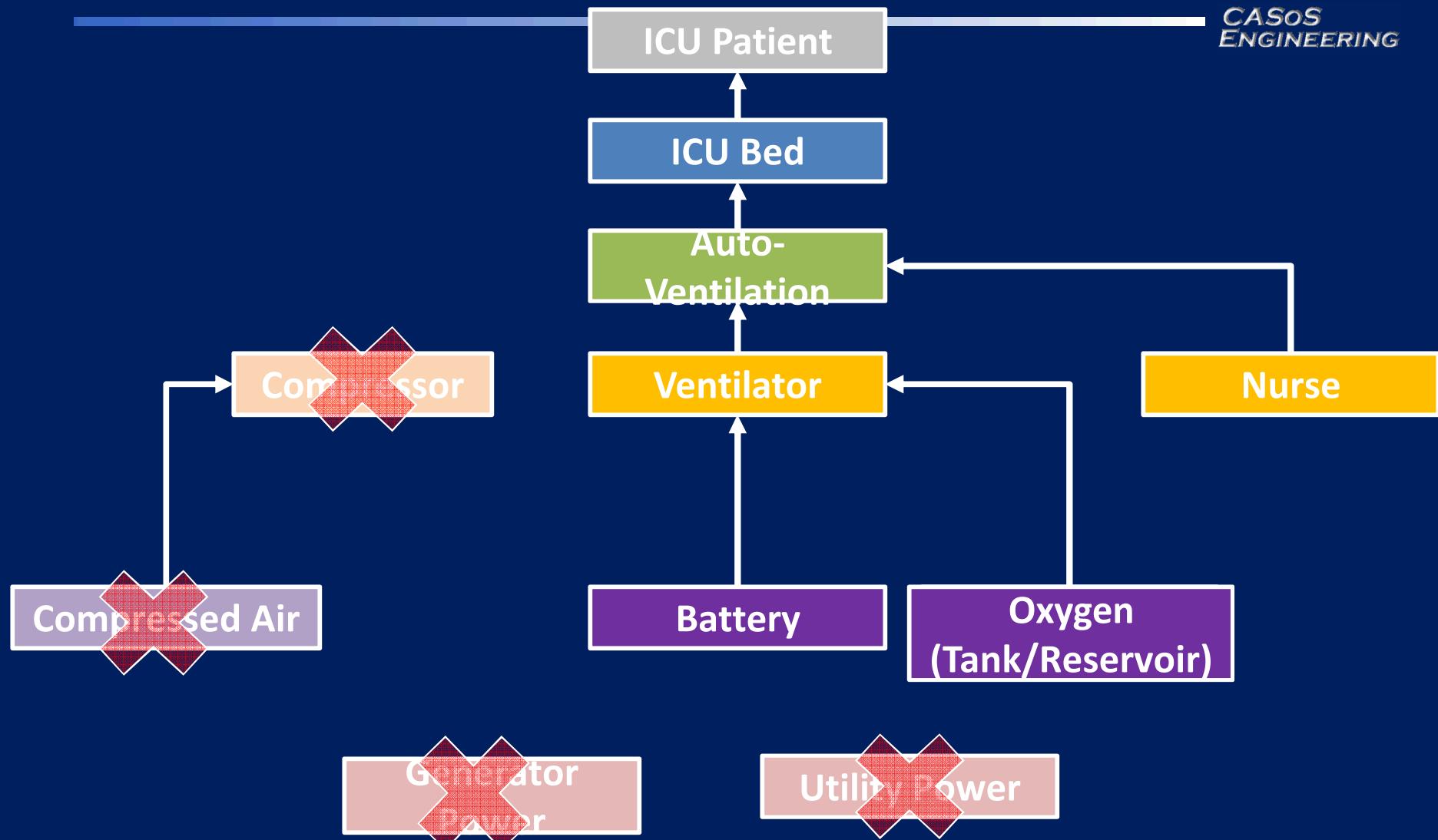
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Generator provides necessary power to continue ventilation

Ventilation Timeline: Loss of Generator

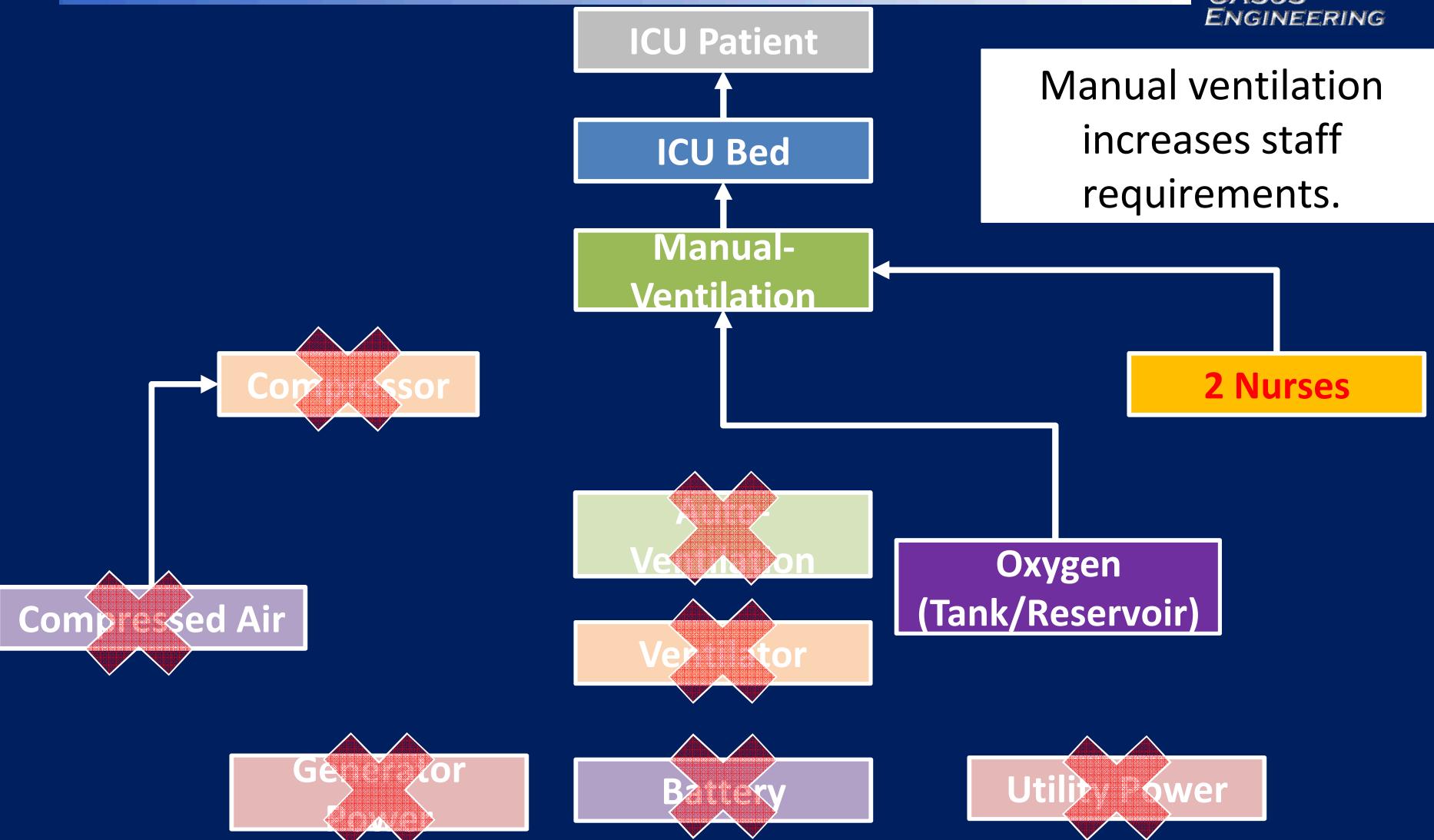
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Loss of generator power requires use of bottled oxygen, depleting oxygen supplies more rapidly

Ventilation Timeline: Beyond Battery Capacity

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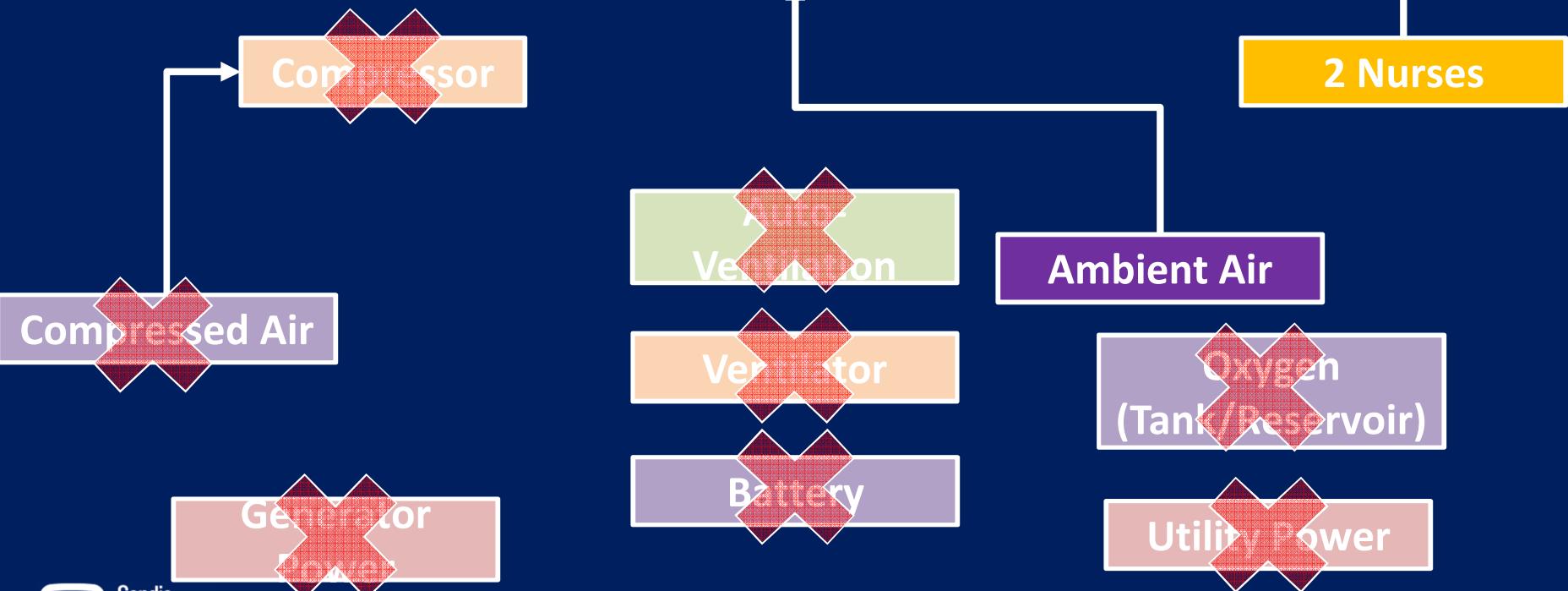


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Ventilation Timeline: Beyond Oxygen Capacity

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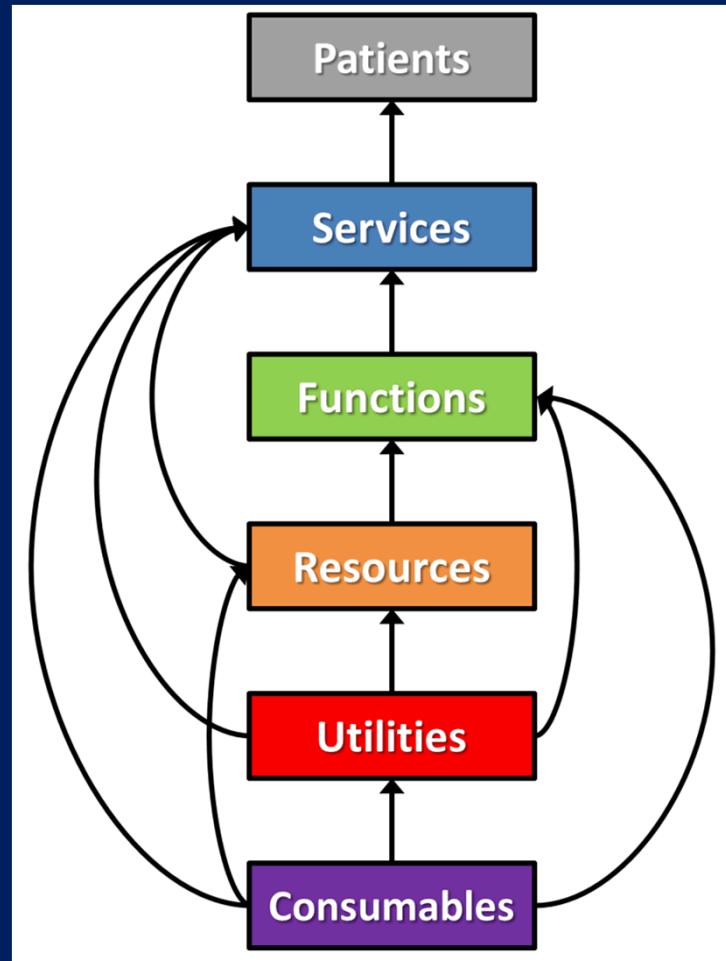
Reliance on room air can result in decreased quality of care.



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Modeling Constructs: Patient Care Hierarchy

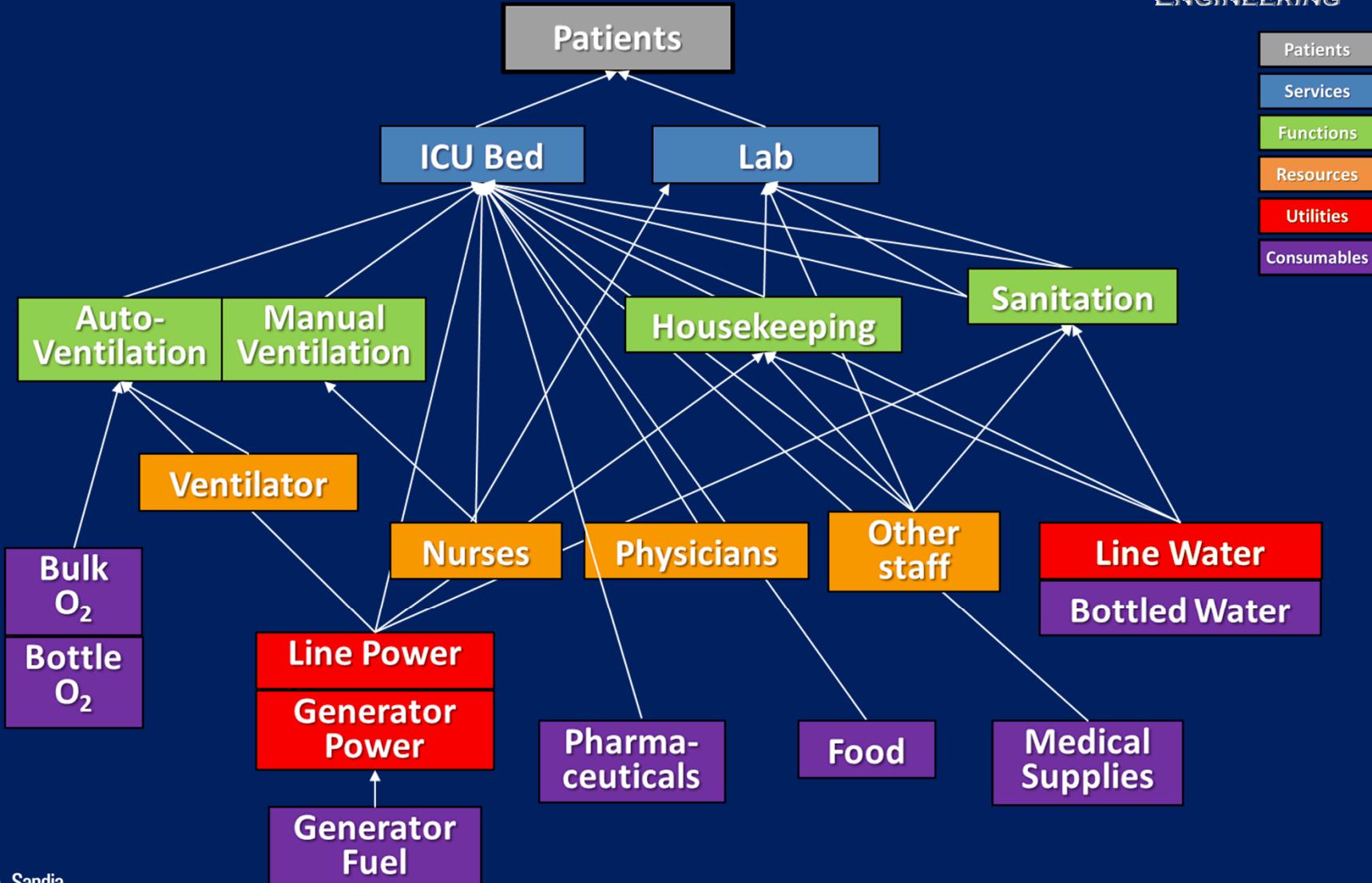
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Hierarchy provides conceptual, static view
of requirements and dependencies

Modeling Constructs: Notional ICU Example

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Modeling Constructs: Constrained Optimization Model

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- Simulate the disruption
 - “What did we lose and for how long?”
 - “What can’t we do?”
- Assess requirements
 - “What do patients need vs. what do we have?”
 - “When do we run out?”
- Account for adaptations
 - “How can we compensate?”
- Allocate resources to honor priorities
 - Maximize sustainable care
 - Minimize evacuations
 - Minimize costs



Sketch of Mathematical Model

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**Nonsustainable
care**

Evacuations

Resource costs

$$\min \sum_i \sum_t w_i z_i(t) + \sum_i \sum_t \sum_l c_{il} e_{il}(t) + \sum_i \sum_t C_i r_i(t)$$

subject to

$$p_i(t) = p_i(t-1) + a_i(t) - d_i(t) + \sum_{i' \neq i} x_{i'i}(t) - \sum_{i' \neq i} x_{ii'}(t) - \sum_l e_{il}(t) \quad \text{Track patients}$$

$$Y_s(t) = \sum_i \rho_{si} q_i(t) + \sum_i \zeta_{si} \sum_l e_{il}(t) \quad \text{for all } s, t \quad \text{Track service requirements}$$

$$\sum_{g' \in G_{ns}^f} \left[\frac{v_{g's}(t)}{\beta_{g's}} \right] = Y_s(t) \quad \text{for all sets } G_{ns}^f, \text{ for all } s, t \quad \text{Allow substitution}$$

$$r_i(t) < R_i(t)$$

Constrain resources

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Event

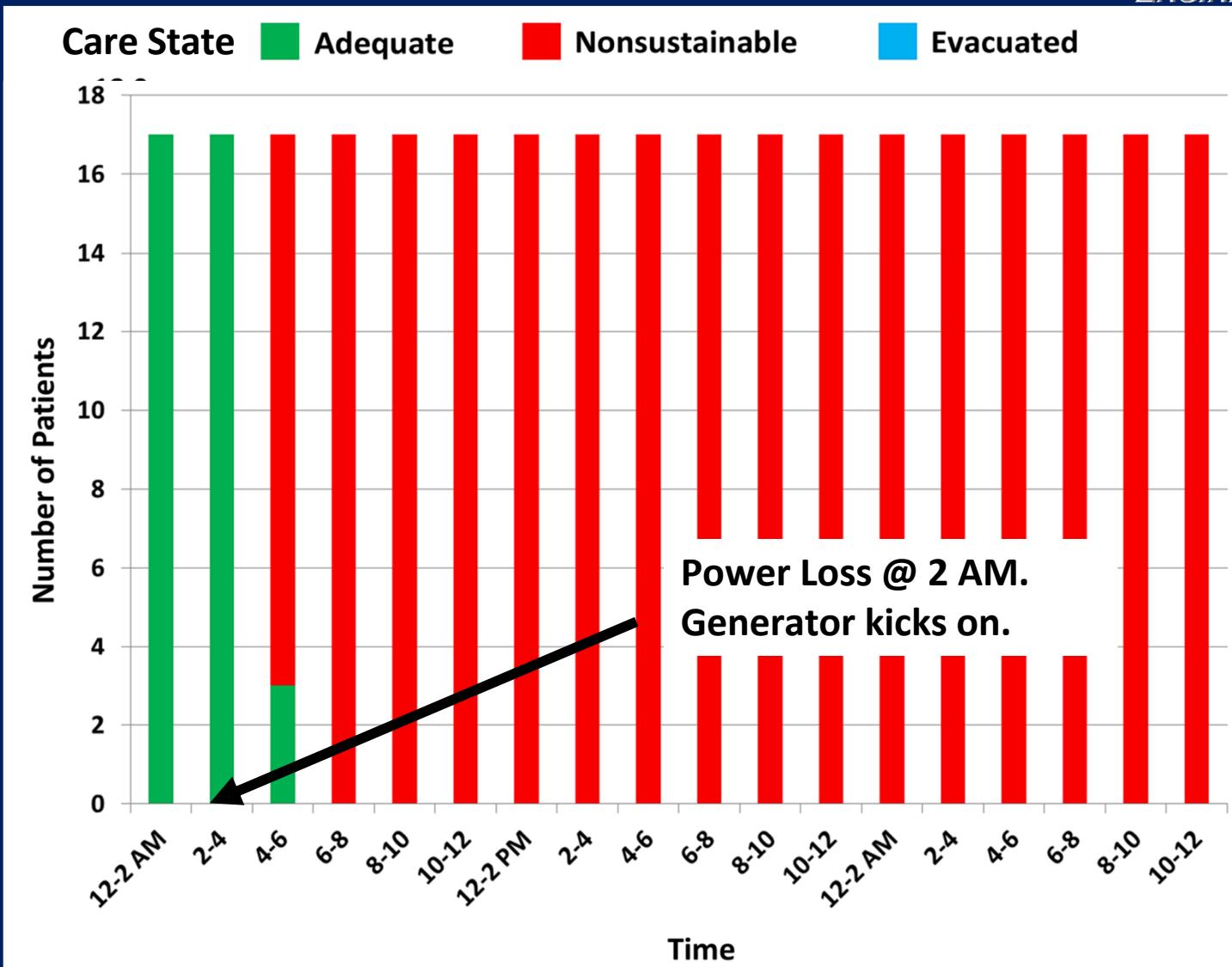
- Hurricane Allison, June 2001
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Photograph from Floodbreak.com

What if administrators chose to shelter in place and not evacuate?

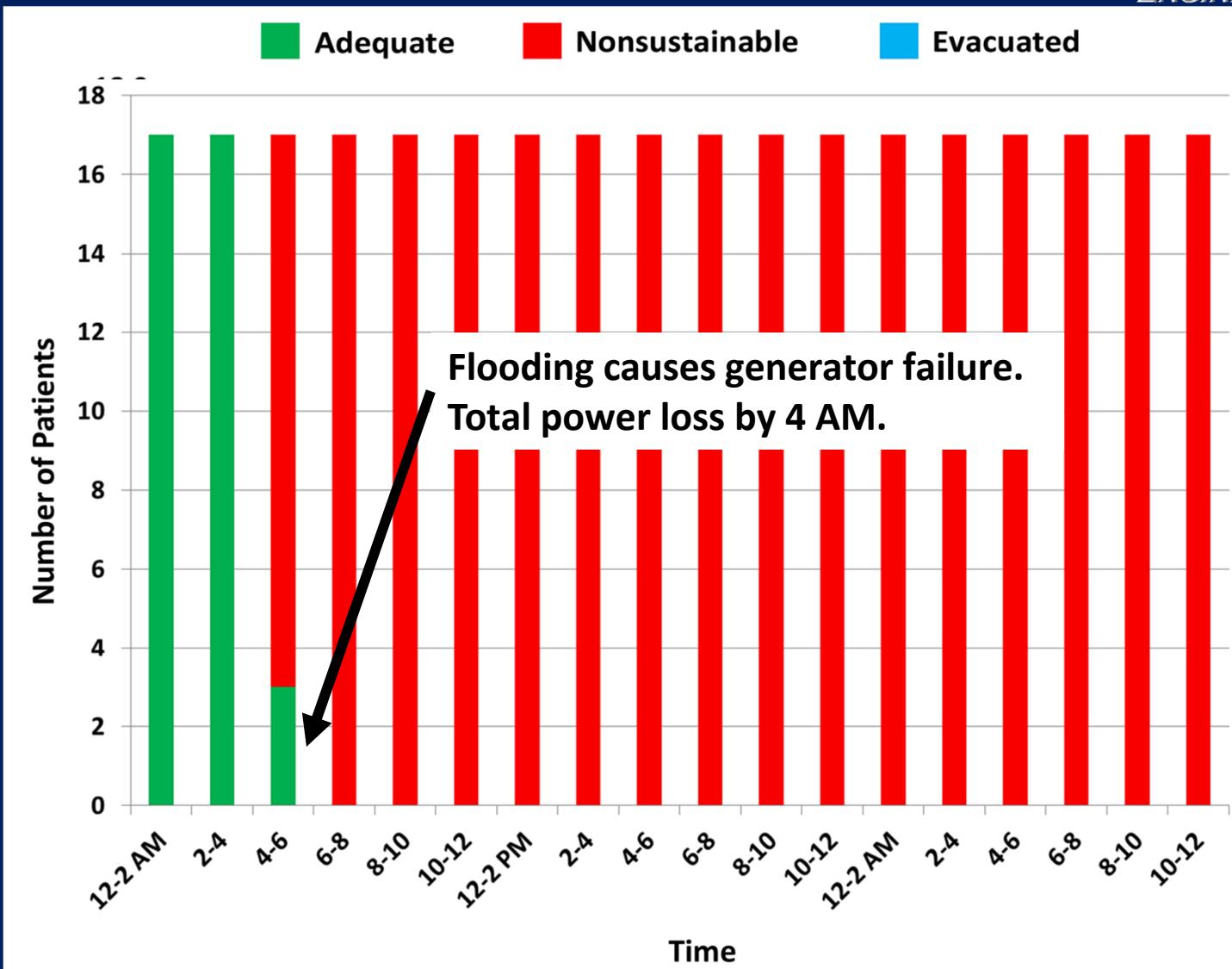
Results: Shelter in Place Decision

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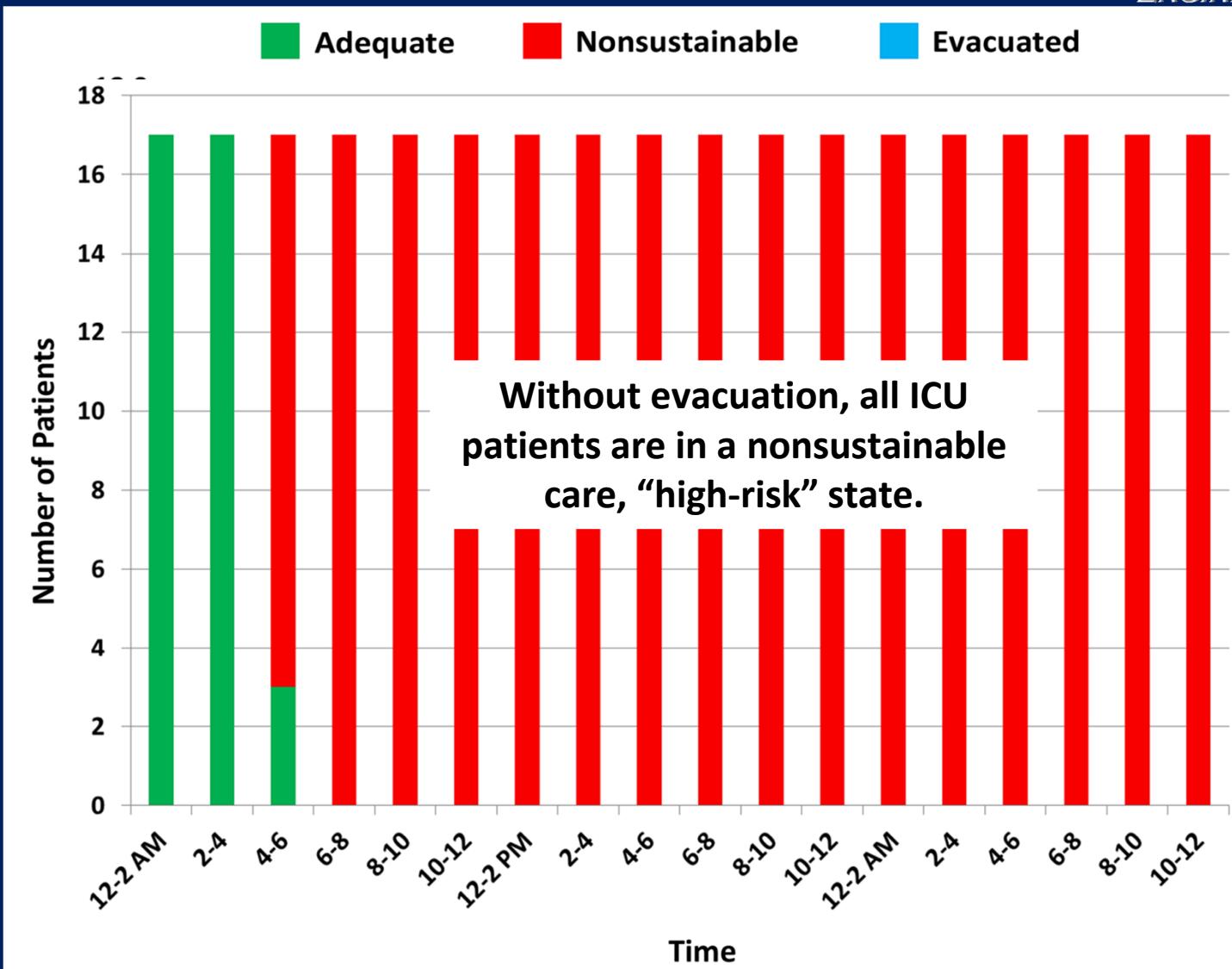
Results: Shelter in Place Decision

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Results: Shelter in Place Decision

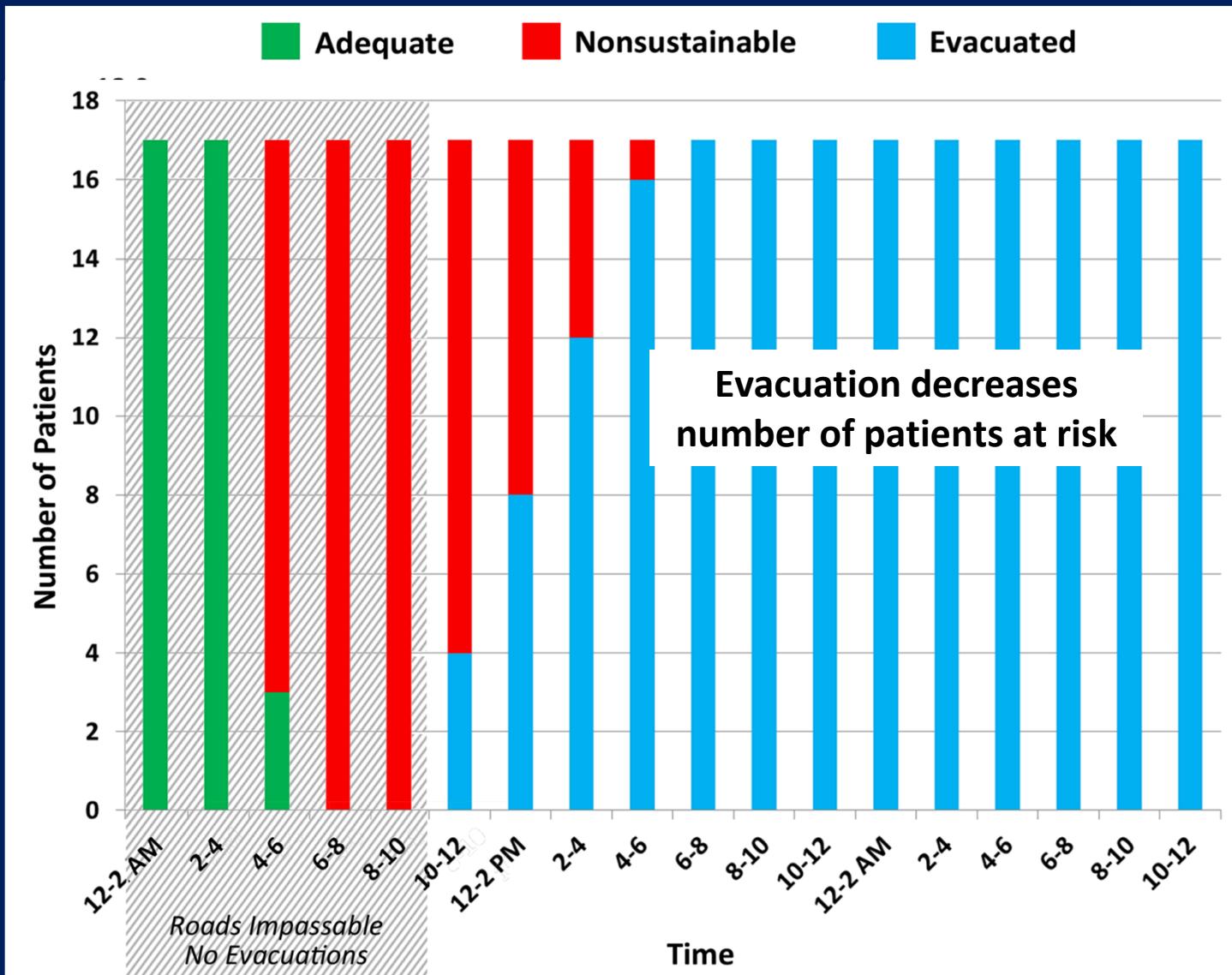
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Evacuation Recreation

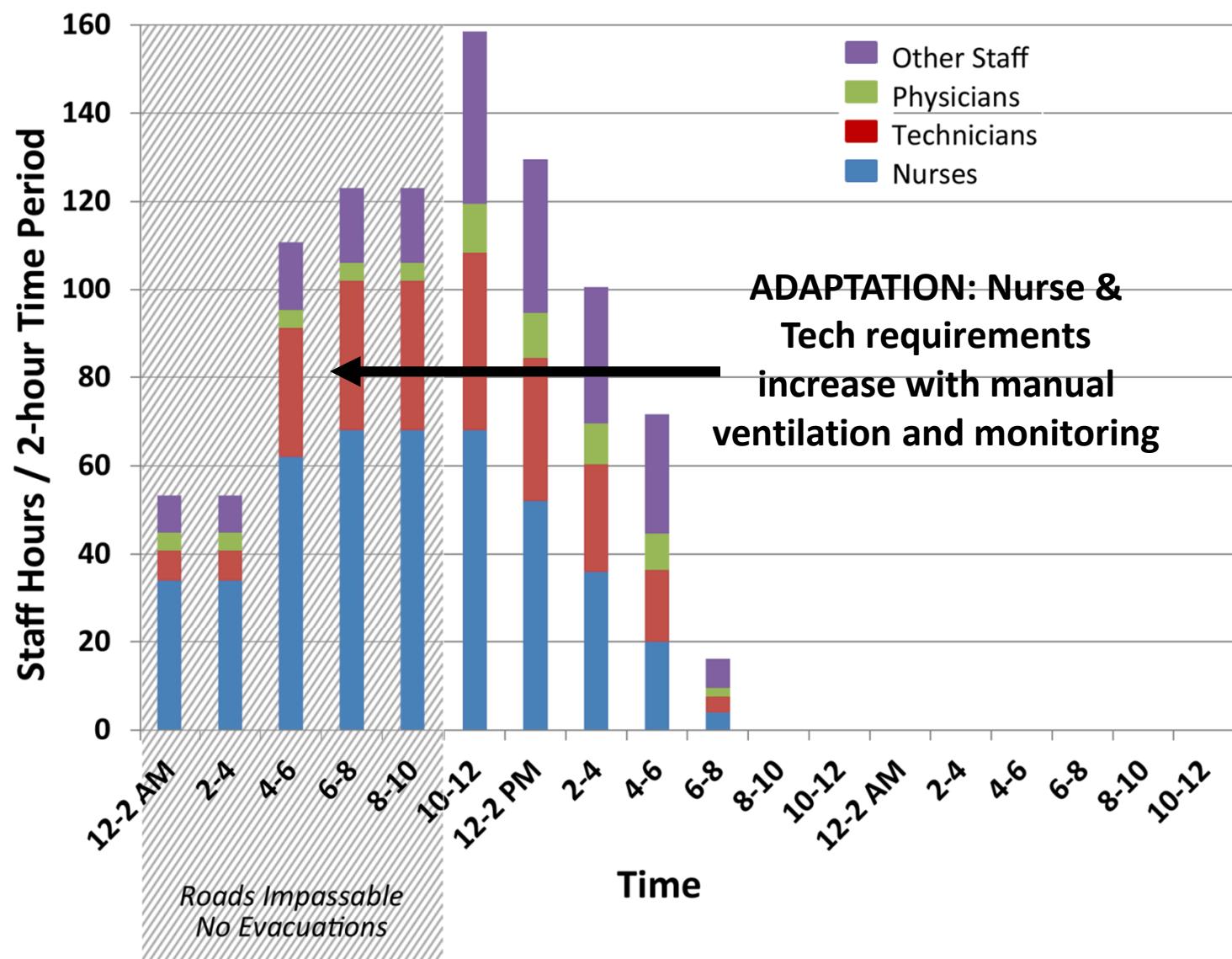
Results: Nominal Evacuation Scenario

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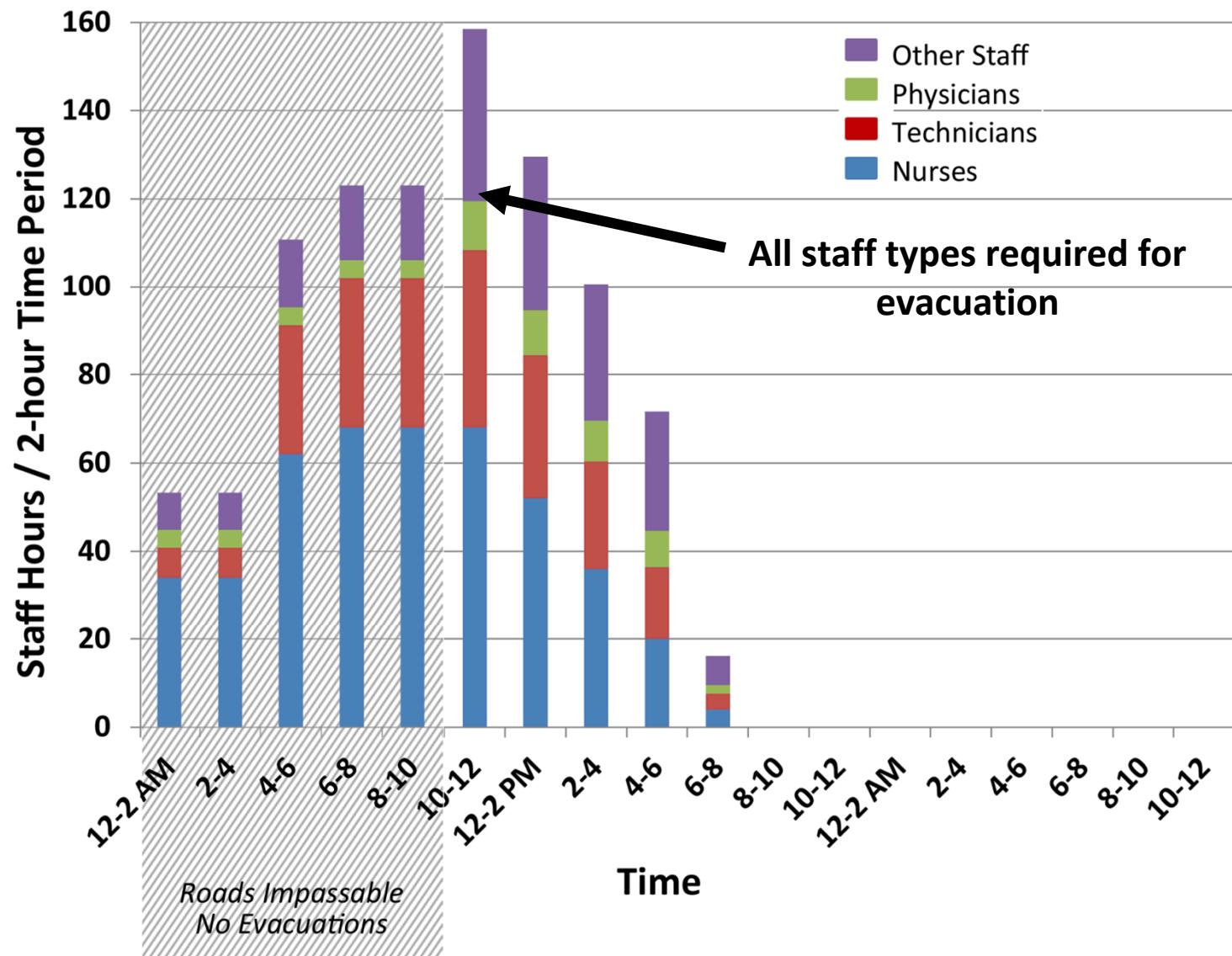
Results: Staff Usage for Evacuation

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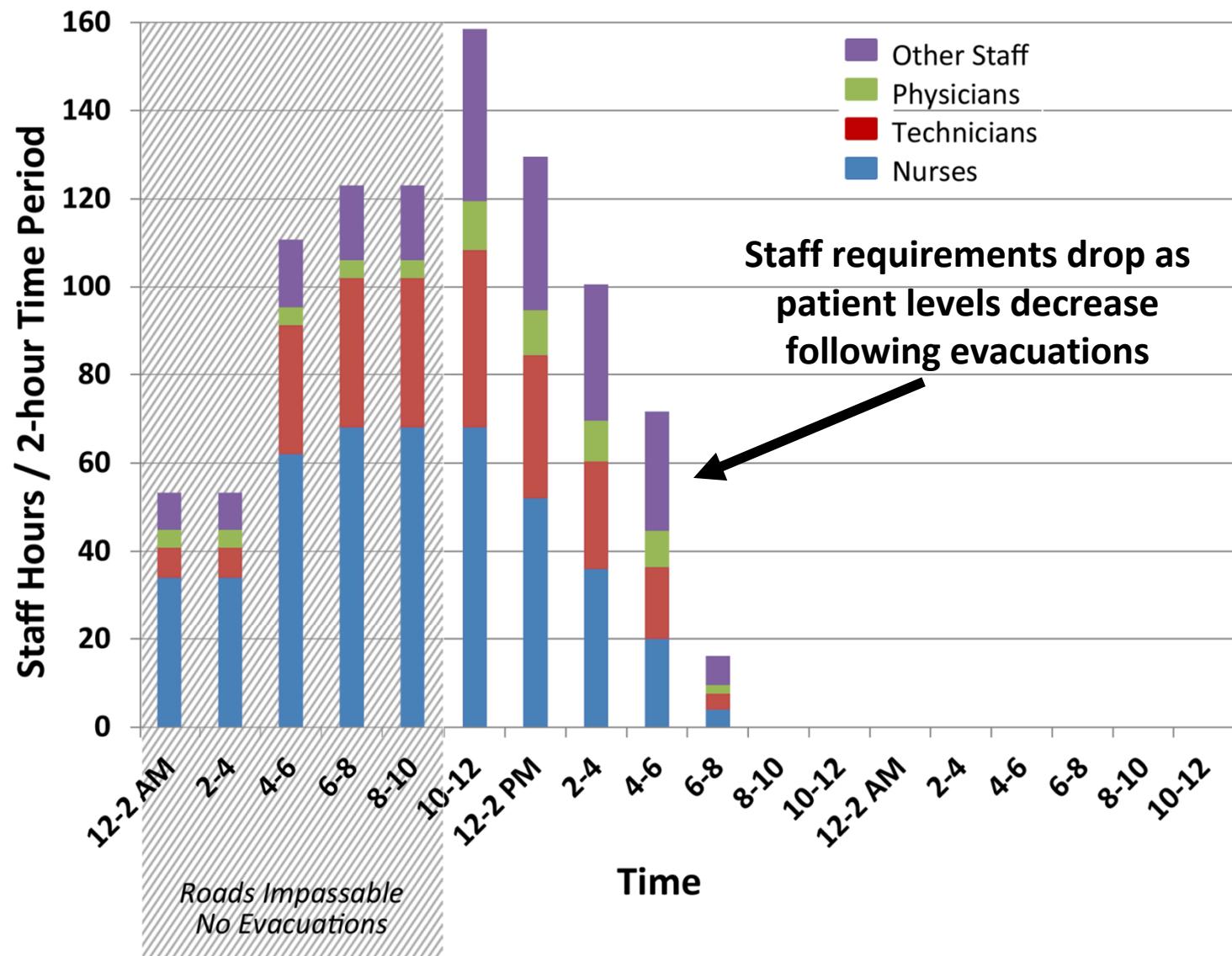
Results: Staff Usage for Evacuation

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Results: Staff Usage for Evacuation

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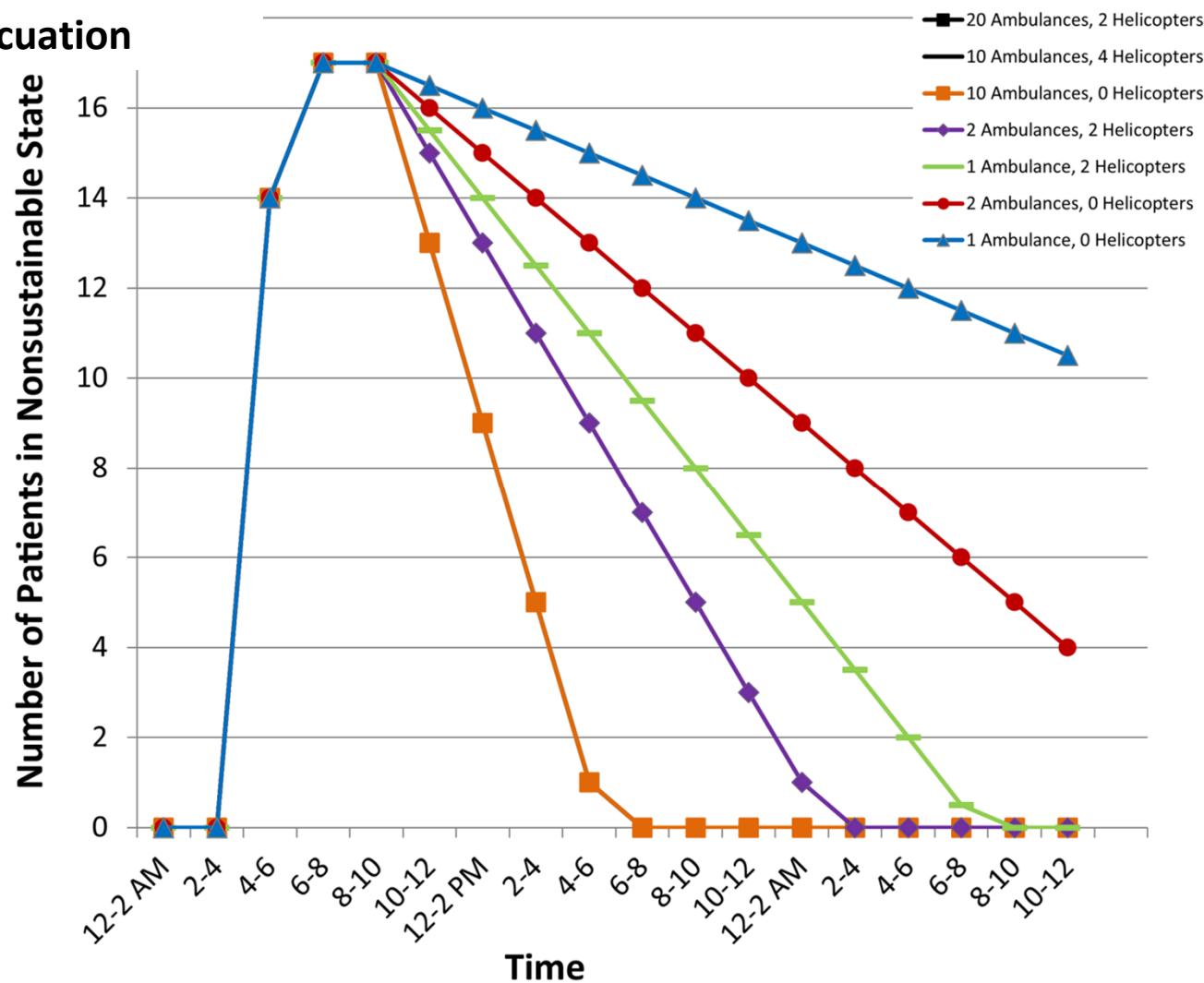


How could increases/decreases in
transportation resources affect the
evacuation?

Results: Impact of Transportation Resources

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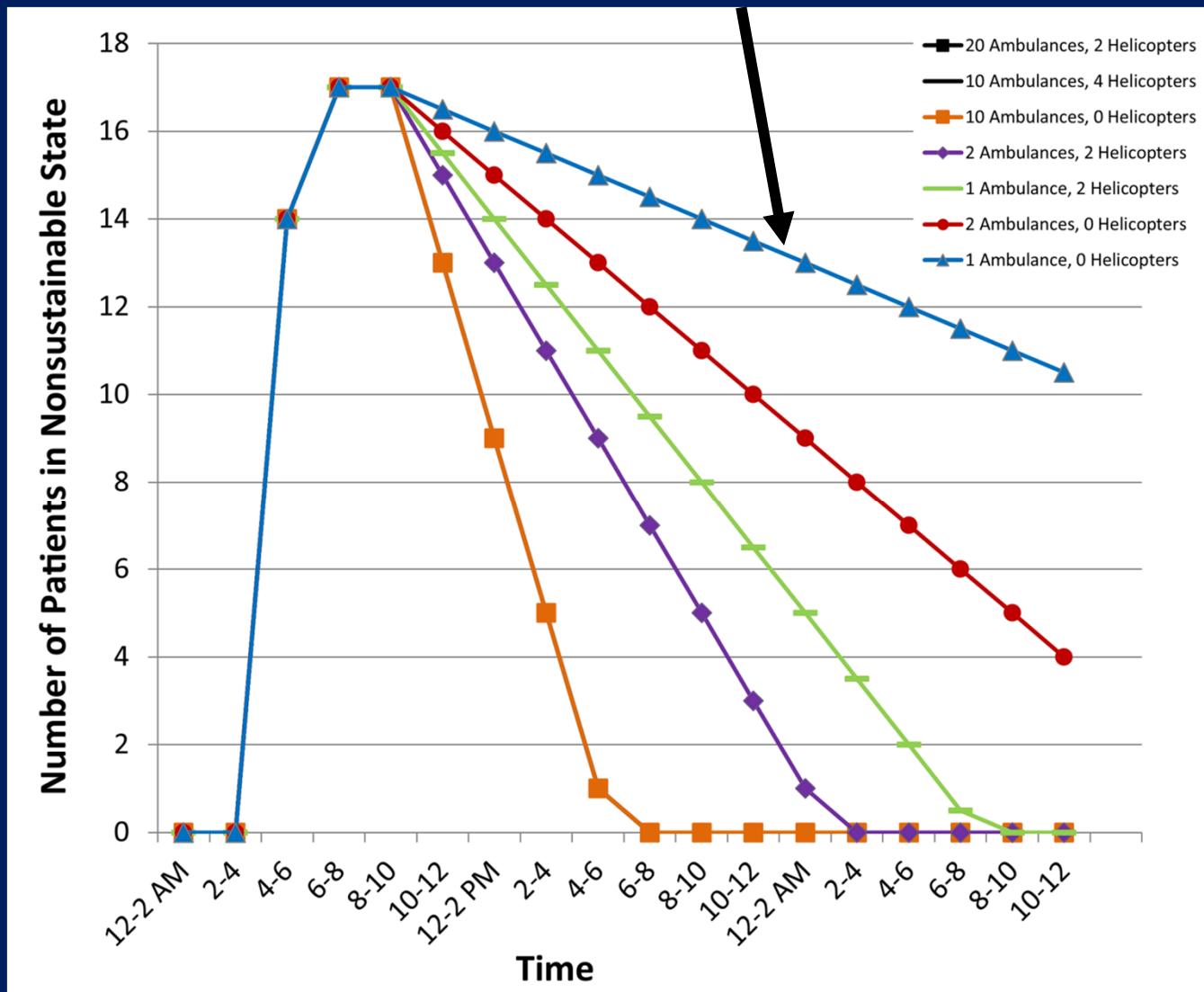
Transportation constraints
can slow/prevent
complete evacuation



Results: Impact of Transportation Resources

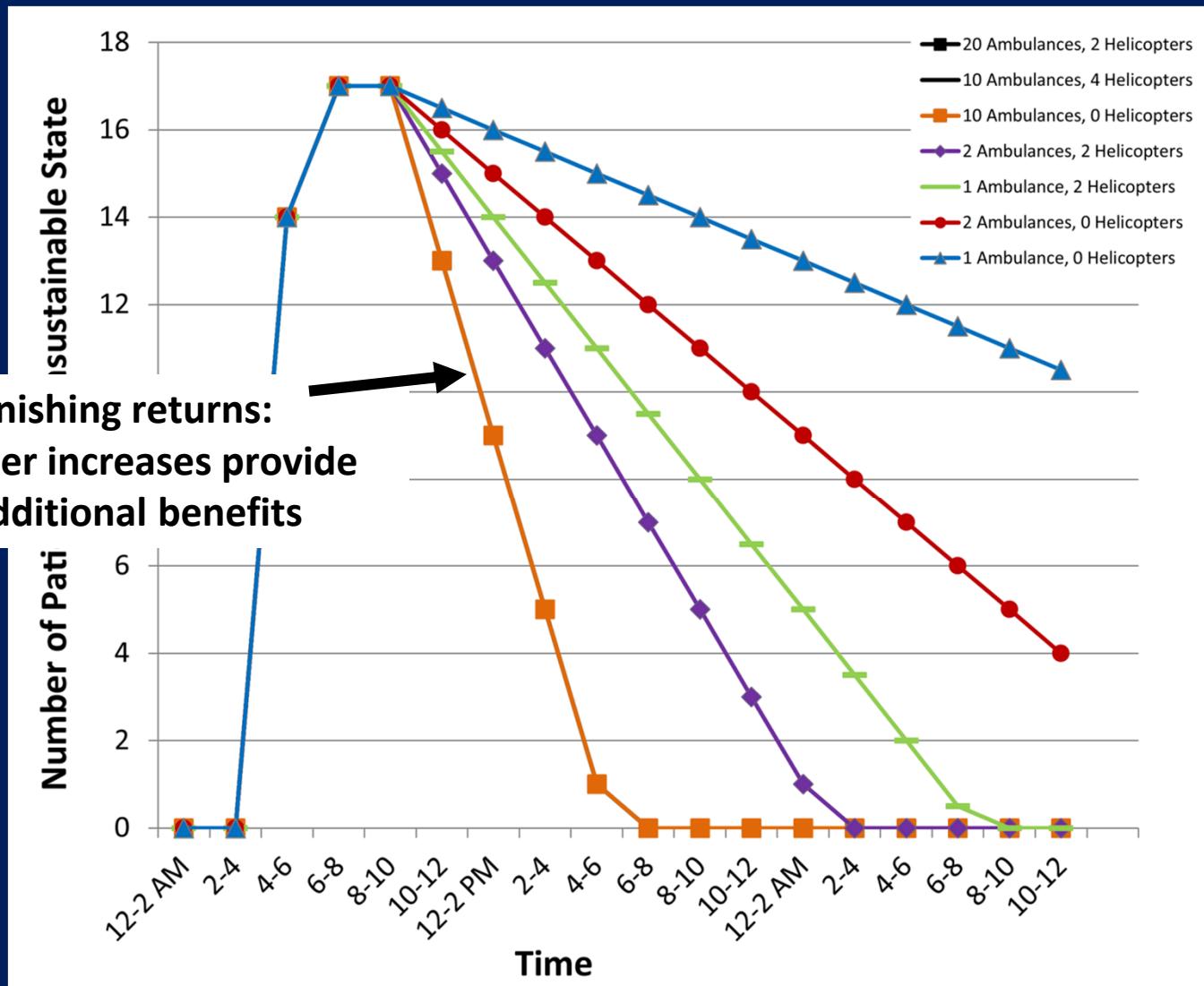
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Not enough resources



Results: Impact of Transportation Resources

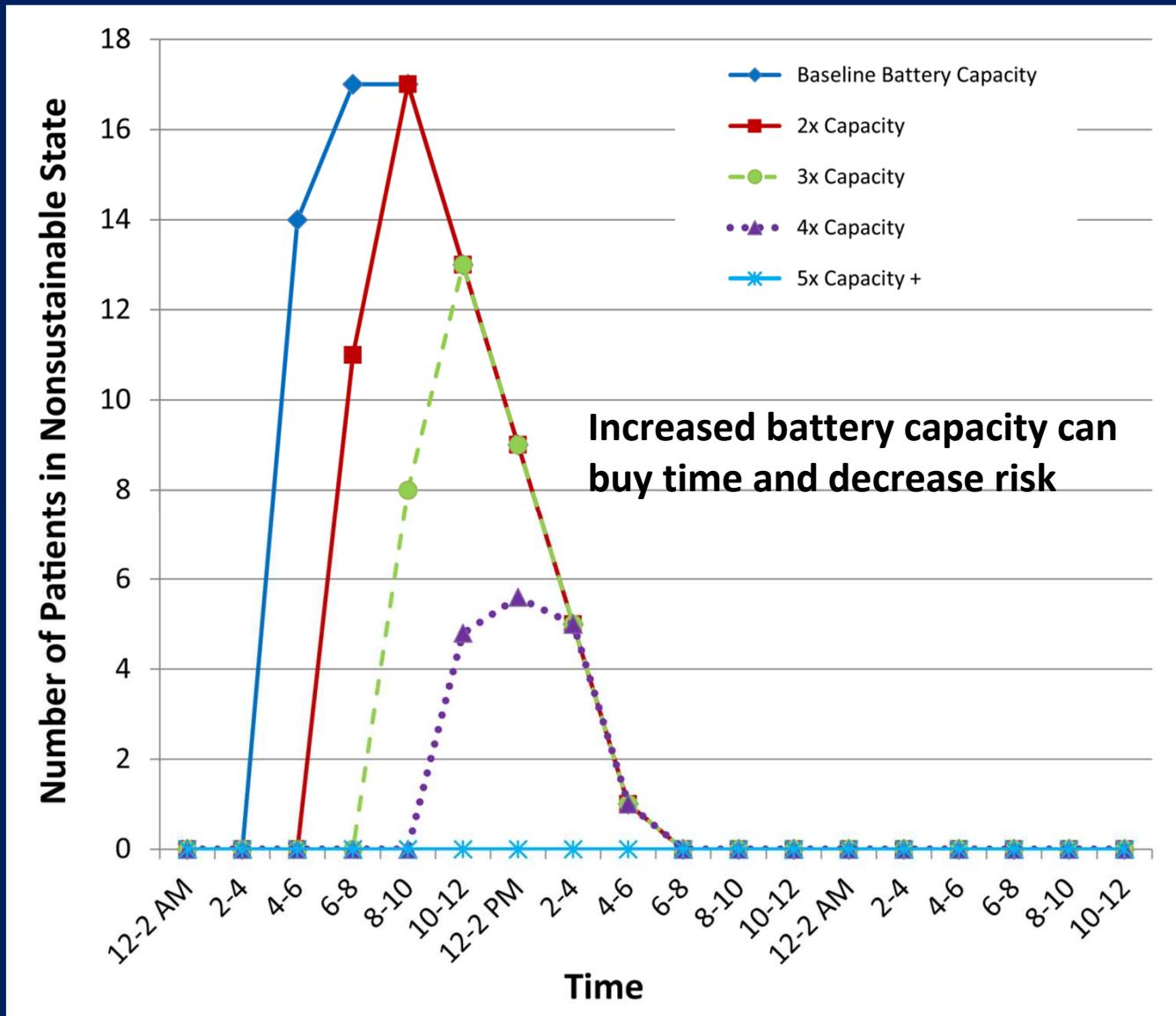
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How could increased battery capacities affect the evacuation?

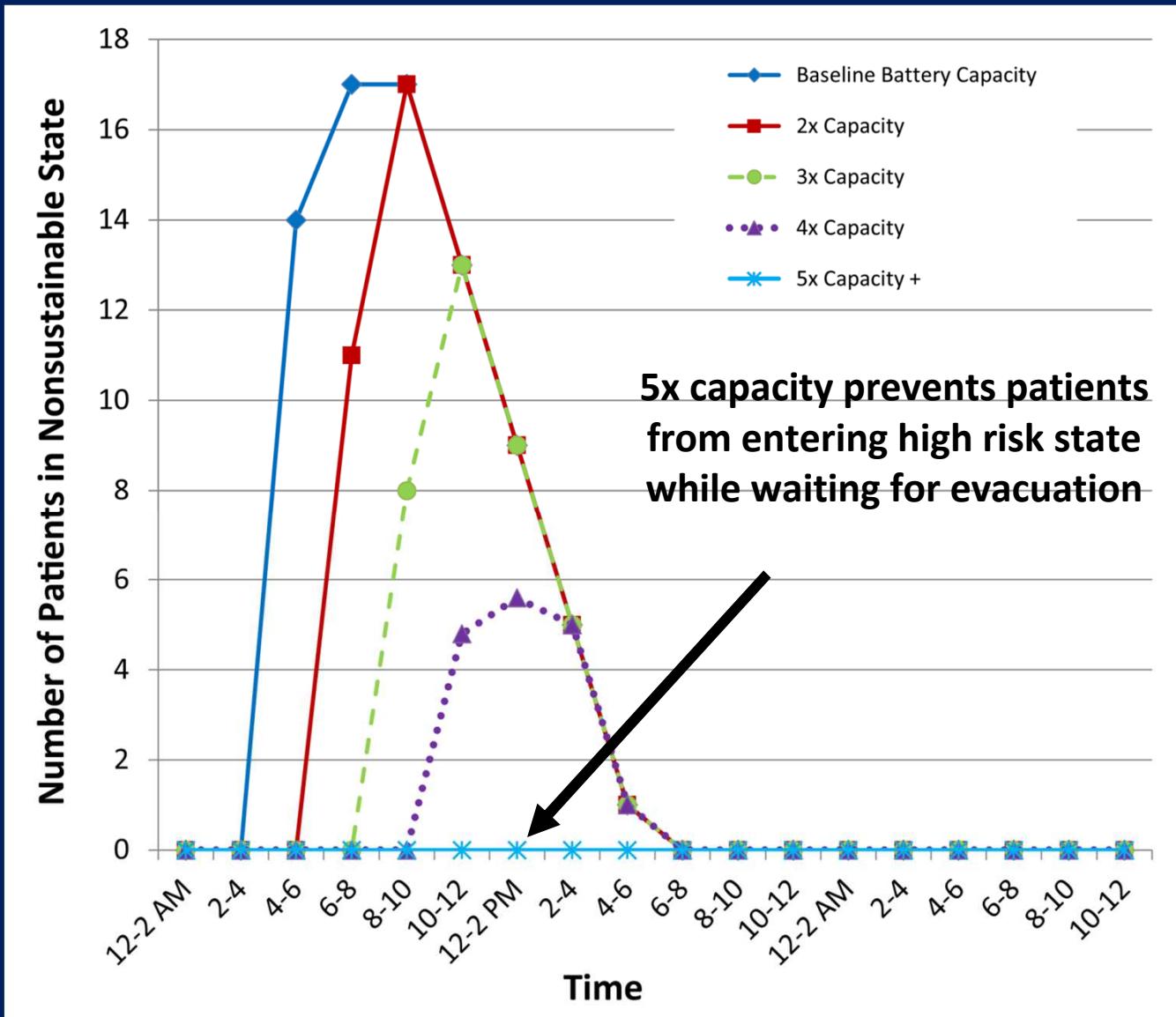
Results: Increase Battery Capacity

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Results: Increase Battery Capacity

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Current Activities

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- Model extensions
 - Uncertainty
 - Discrete formulation
 - Different kind of shock: introduction of infectious disease patients
- Seeking opportunities to support emergency planning for real facilities

Additional Information

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■ Publications:

- Model formulation: **Modeling Hospitals' Adaptive Capacity during a Loss of Infrastructure Services**, Vugrin et al. (2015). *J of Healthcare Engineering*, 6(1): 105-140.
- Case study: **Modeling Evacuation of a Hospital without Electric Power**, Vugrin et al. (2015). *Prehospital and Disaster Medicine*

Website: CASOS Engineering

<http://www.sandia.gov/CasosEngineering/resilience.html>