

Dynamic Medical Risk Assessment Supported by Inference Networks

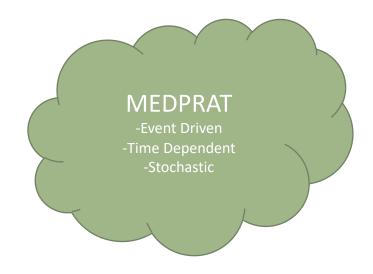
L. McIntyre¹, L. Leinweber², J. Myers¹

¹NASA Glenn Research Center ²ZIN Technologies, Inc.

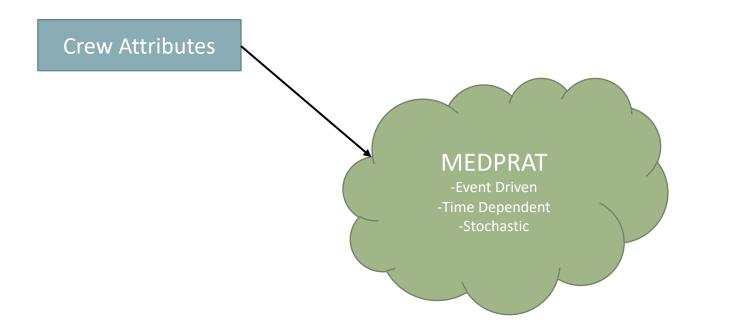








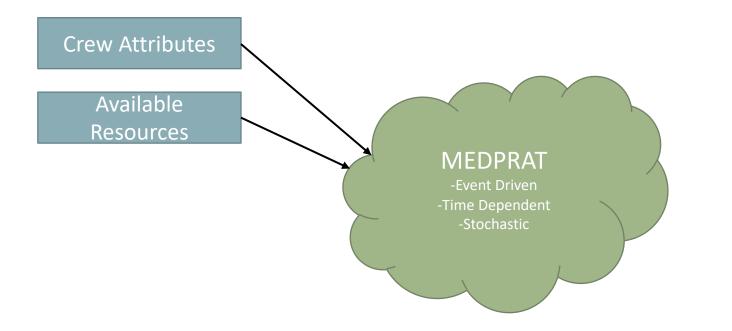




Crew Attributes

- Gender
- Dental Crowns
- Contacts
- H_x abdominal surgery
- o EVA

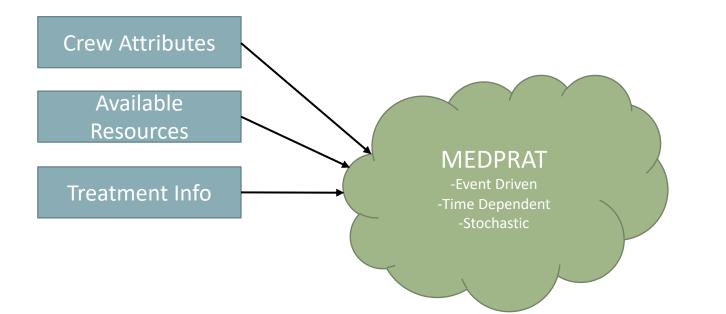




Available Resources

- Initial quantity
- Consumable
- Essential
- Mass
- Volume

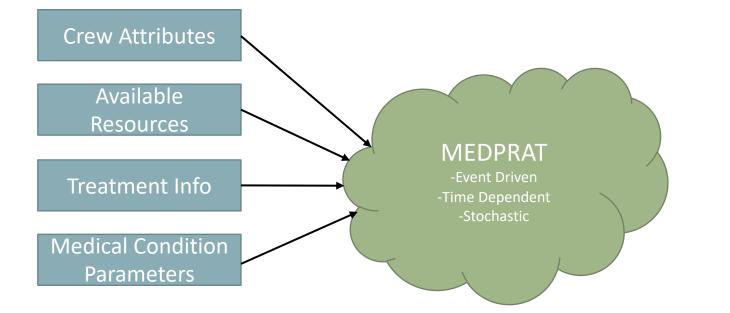




Treatment Info

- Condition
- Resource
- o Dose

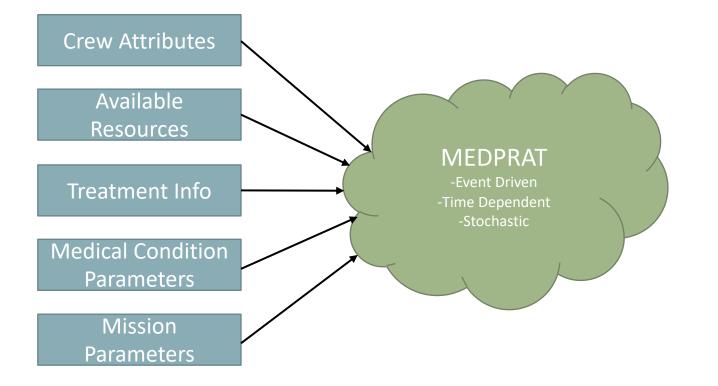




Medical Condition Parameters (RV's)

- Incidence rate (IR)
- Clinical phases
- Best/Worst case
- Functional Impairment
- Loss of Crew Life (LOCL)
- Removed To Definitive
 Care (RTDC)

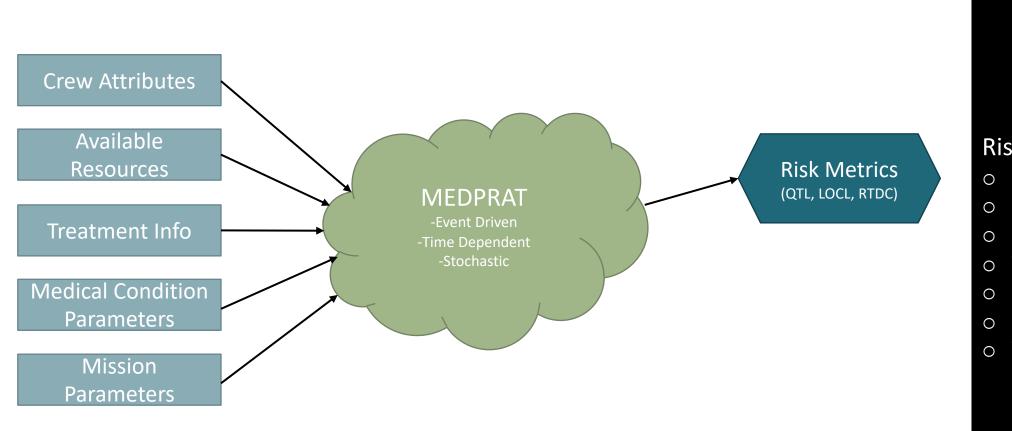




Mission Parameters

- o # Crew
- Mission duration
- \circ EVA schedule

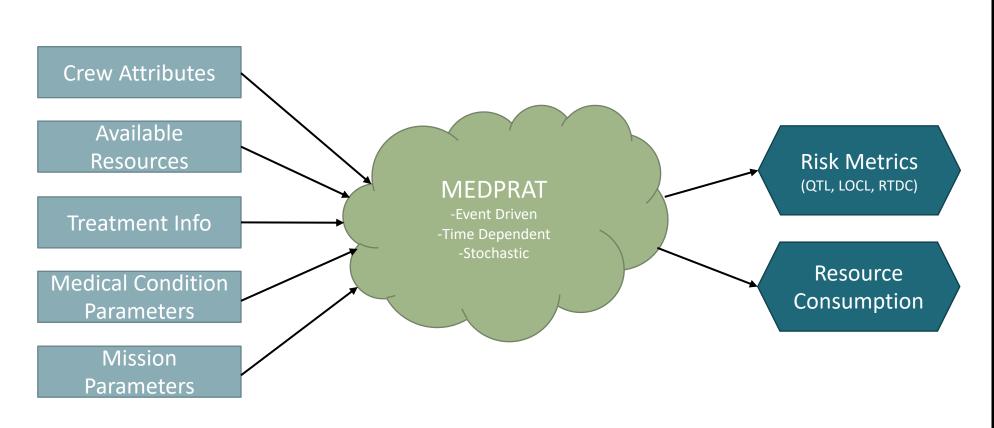




Risk Metrics

- \circ Occurrence
- Condition
- \circ Crew
- \circ Trial
- Sum, mean, std deviation
- Best/Worst case
- Treated/Untreated

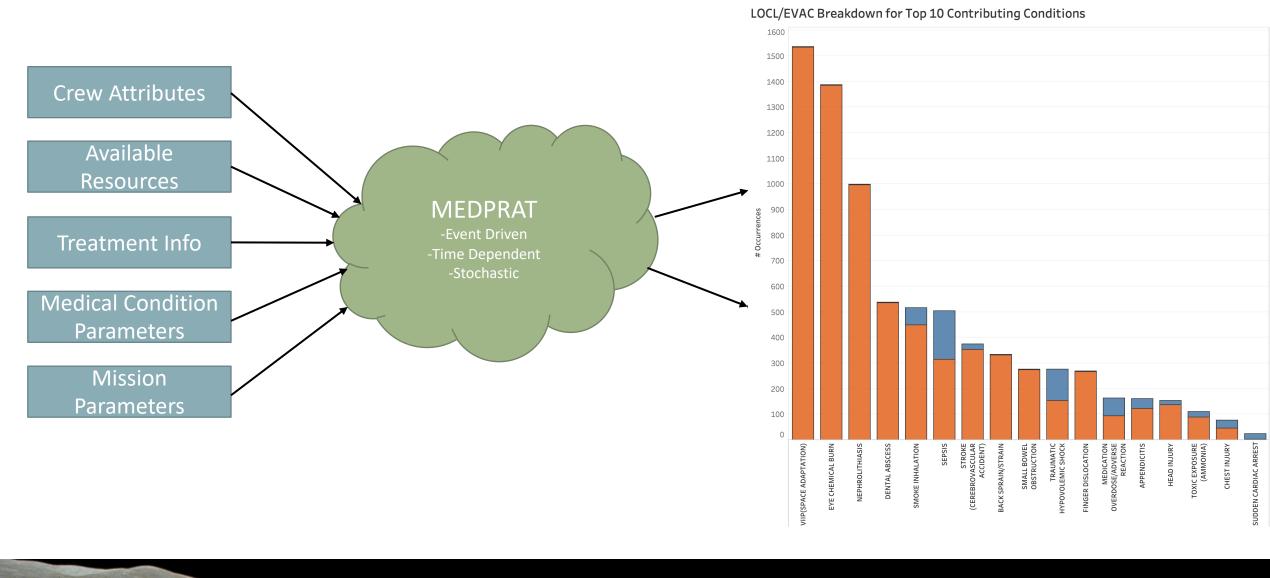




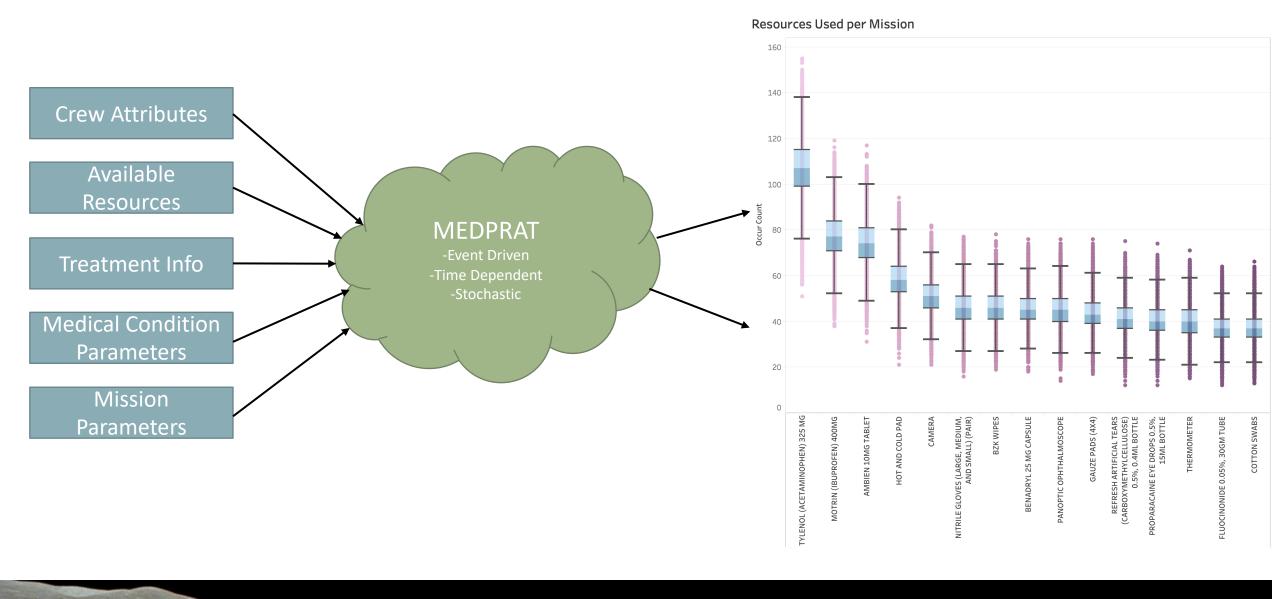
Resource Consumption

- Required quantity
- Resource exhausted
- Peak rate
- Min, max, sum, mean, sd
- Primary vs alternate

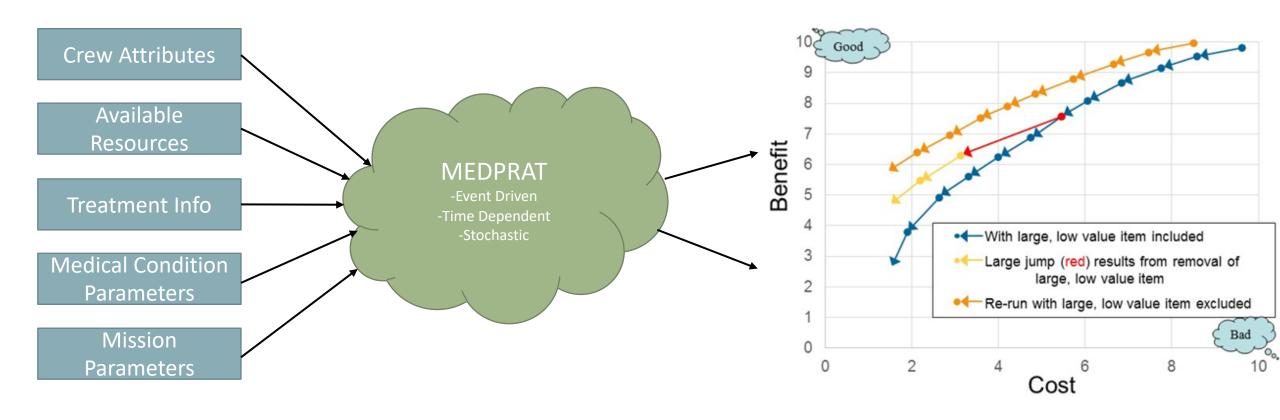




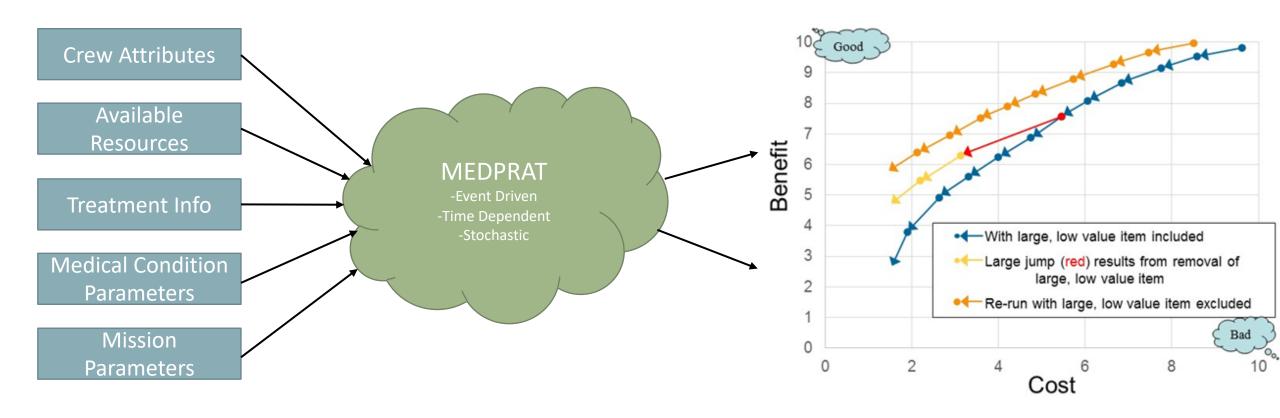






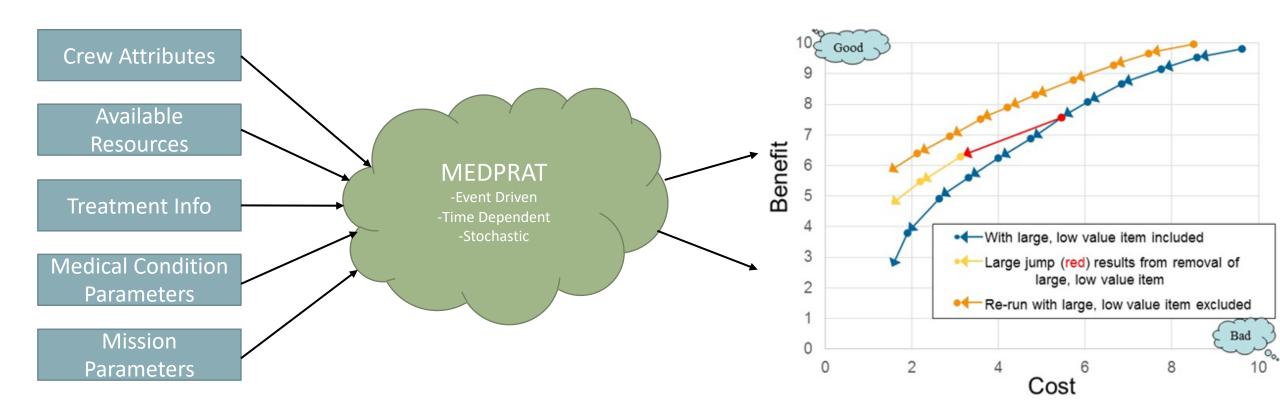






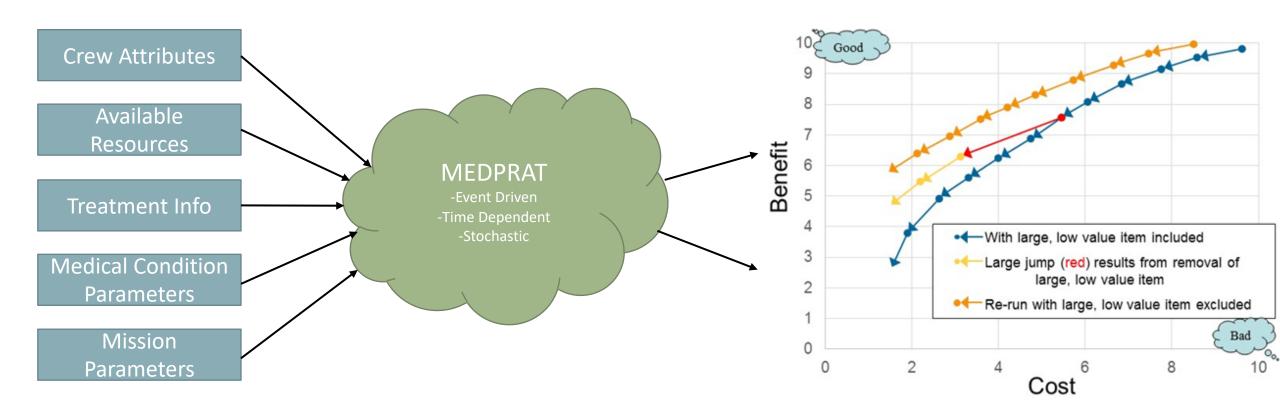
Given any Medical Equipment List (MEL) what is the level of risk?





How is my risk impacted if I reduce the overall mass of a capability/resource?





For a particular "allowable risk", what is the optimal MEL, given power, mass, and volume requirements?



HIP/PROXIMAL FEMUR FRACTURE MEDICATION OVERDOSE/ADVERSE REACTION FINGERNAIL DELAMINATION SEC TO EVA HERPES ZOSTER REACTIVATION (SHINGLES) ACUTE CHOLECYSTITIS/BILIARY COLIC LOWER EXTREMITY STRESS FRACTURE DECOMPRESSION SICKNESS SECONDARY TO EVA CARDIOGENIC SHOCK SEC TO MYOCARDIAL INFARCTION BAROTRAUMA (EAR/SINUS BLOCK) EYE PENETRATION (FOREIGN BODY) STROKE (CEREBROVASCULAR ACCIDENT) ACUTE COMPARTMENT SYNDROME ACUTE ANGLE-CLOSURE GLAUCOMA ATRIAL FIBRILLATION/ ATRIAL FLUTTER ACUTE COMPARTMENT SYNDROME ABNORMAL UTERINE BLEEDING SMALL BOWEL OBSTRUCTION **DENTAL AVULSION (TOOTH LOSS)** TRAUMATIC HYPOVOLEMIC SHOCK ANGINA/MYOCARDIAL INFARCTION **RETINAL DETACHMENT RESPIRATORY INFECTION** DENTAL EXPOSED PULP EYE IRRITATION/ABRASION FINGER DISLOCATION HEADACHE (CO2 INDUCED) ACUTE ARTHRITIS SMOKE INHALATION TOXIC EXPOSURE (AMMONIA) **BURNS SECONDARY TO FIRE** NEUROGENIC SHOCK SKIN ABRASION SKIN LACERATION ABDOMINAL INJURY CHEST INJURY

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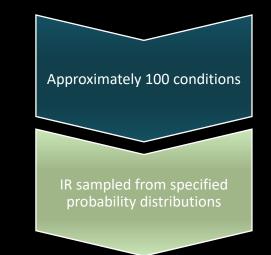




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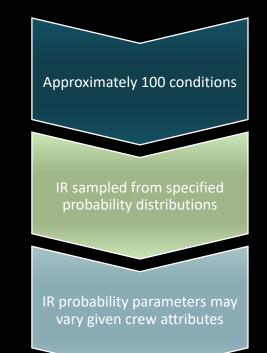




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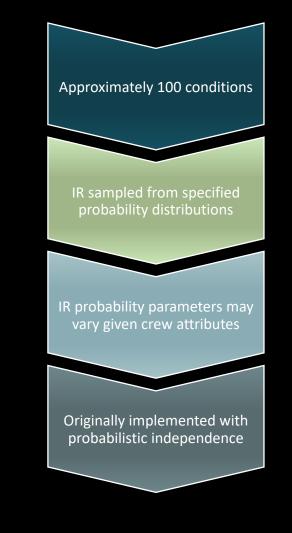




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MEDPRAT provides a means of capturing relationships and dependencies between events being modeled.

These relationships are quantified using a mathematical data structure referred to as the Susceptibility Inference Network (SIN).

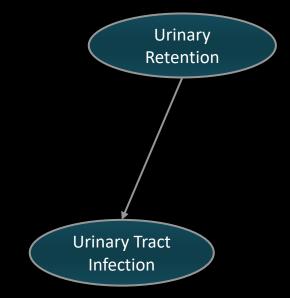
The SIN provides MEDPRAT with a "memory" which allows the system to use knowledge of what simulation events have occurred to appropriately alter the representative probability that future simulation events will occur. Urinary Retention



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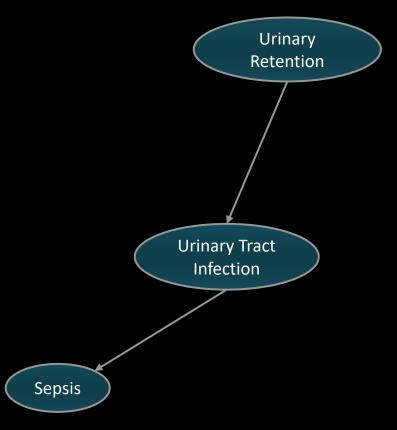




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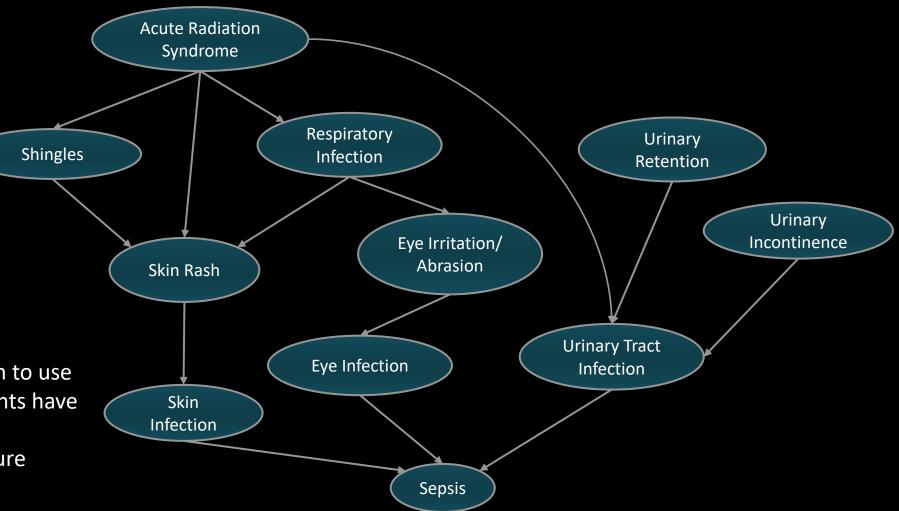




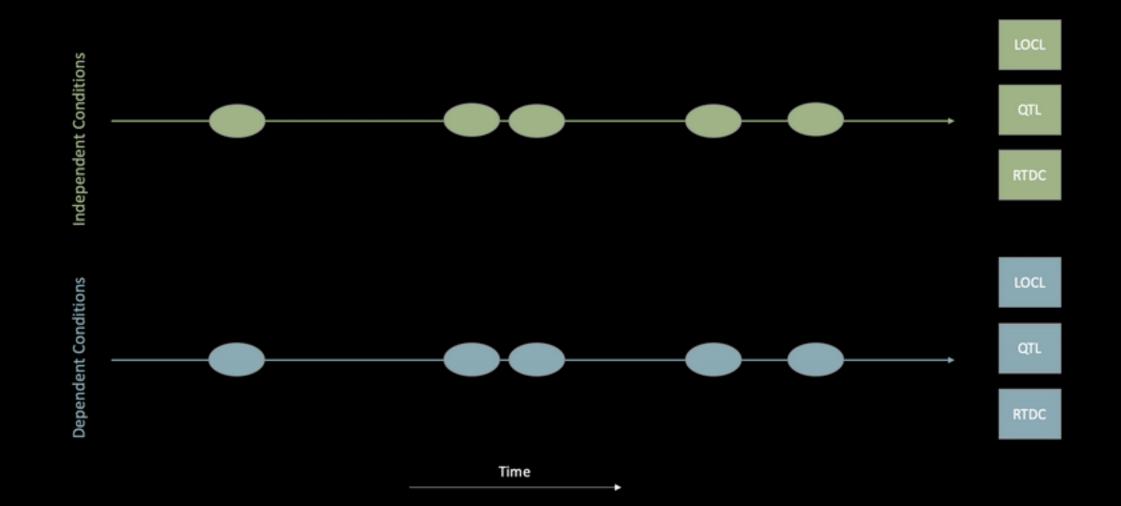
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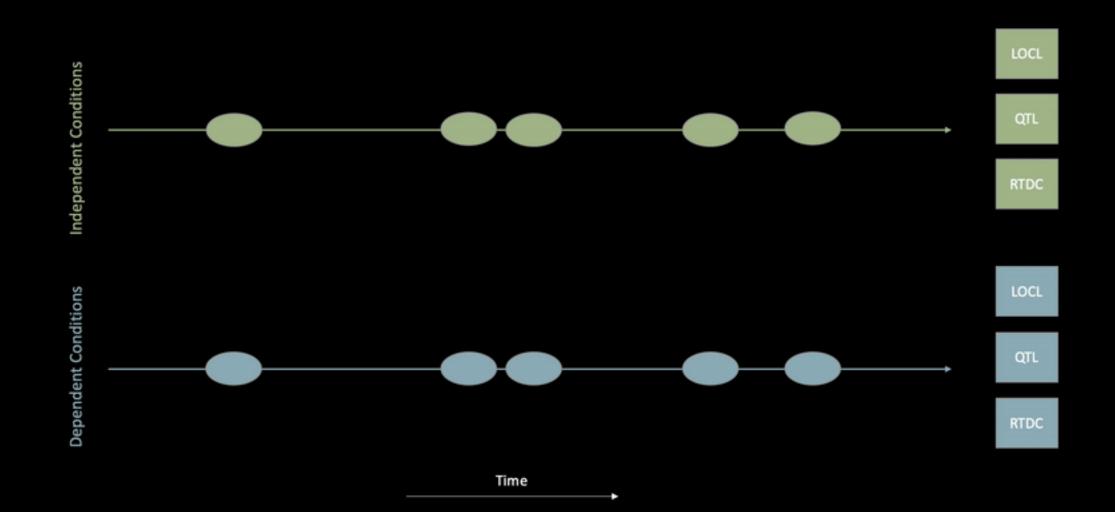
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Simulation with Independent Events



Simulation with Dependent Events

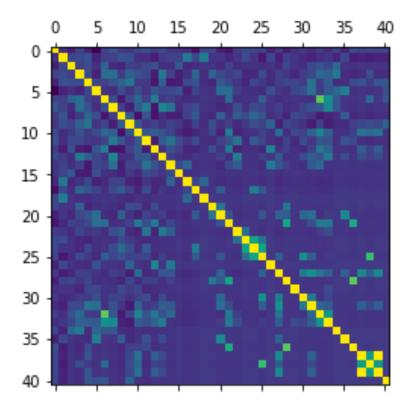






Data request made to and fulfilled by Lifetime Surveillance of Astronaut Health (LSAH)

- De-identified
- Shuttle/ISS



Pearson Correlation

A number between [-1,1] that indicates the extent to which two variables are linearly related.



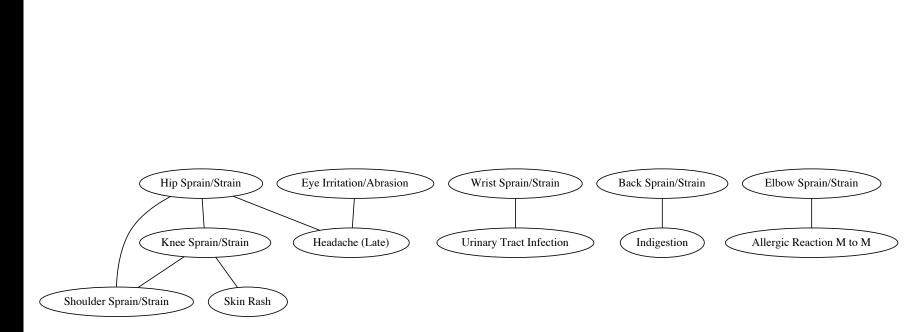
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Condition	Condition	Correlation	P Value	Significant? (0.1)		
Knee Sprain/Strain	Shoulder Sprain/Strain	0.701	0.00001	TRUE		
Wrist Sprain/Strain	UTI	0.7	0.0799	TRUE		
Wrist Sprain/Strain	Skin Infection	0.534	0.1728	FALSE		
Respiratory Infection	Indigestion	0.626	0.1326	FALSE		
UTI	Skin Infection	0.506	0.2465	FALSE		
Gastroenteritis	Insomnia (SA)	0.304	0.0049	TRUE	Insomnia = 84	Gastroenteritis = 1
Hip Sprain/Strain	Headache (Late)	0.339	0.0401	TRUE		
Hip Sprain/Strain	Shoulder Sprain/Strain	0.403	0.0973	TRUE		
Eye Irritation/Abrasion	Headache (Late)	0.339	0.016	TRUE		
Knee Sprain/Strain	Skin Rash	0.341	0.0203	TRUE		
Eye Corneal Ulcer	Paresthesias	0.318	0.0991	TRUE	Paresthesias = 27	Eye Corneal Ulcer = 1
Neck Sprain/Strain	Skin Laceration	0.302	0.3964	FALSE		
Neck Sprain/Strain	HZR (Shingles)	0.492	0.262	FALSE		
Indigestion	Neck Sprain/Strain	0.49	0.2177	FALSE		
Back Sprain/Strain	Indigestion	0.392	0.0002	TRUE	Back S/S = 30	Indigestion = 5
Elbow Sprain/Strain	Allergic Reaction (M to M)	0.394	0.0464	TRUE		
Anxiety	Allergic Reaction (M to M)	0.357	0.1746	FALSE		
VIIP	Allergic Reaction (M to M)	0.357	0.1746	FALSE		
Hip Sprain/Strain	Knee Sprain/Strain	0.411	0.0174	TRUE		
Respiratory Infection	Anxiety	0.442	0.7085	FALSE		
VIIP	Respiratory Infection	0.442	0.558	FALSE		

NASA

- 40 out of ~100 conditions are observed
- 15 conditions observed 20 or more times
- Of those, 6 are space adaptation conditions

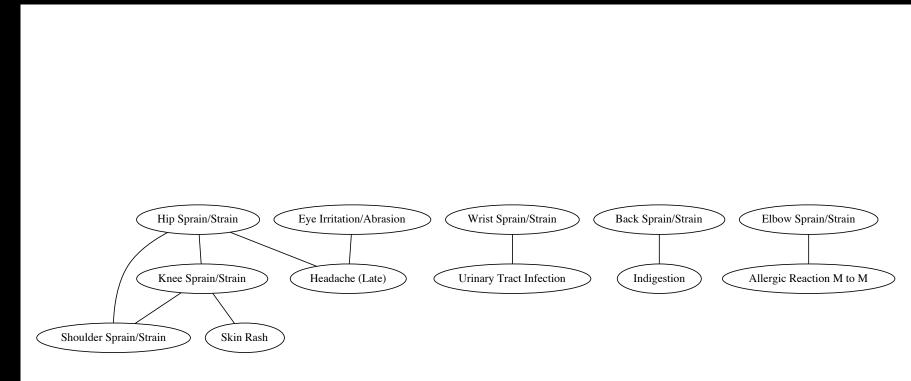


NASA

Conclusion:

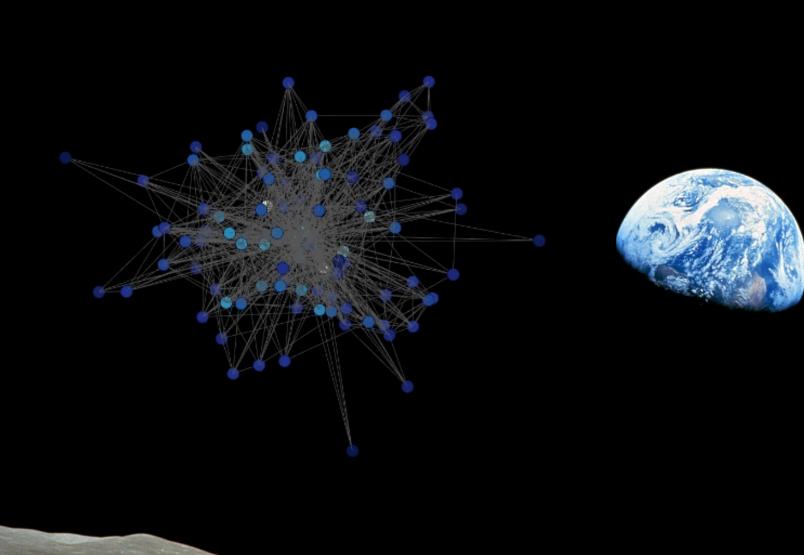
This data set is not robust enough to inform the SIN. Even with more spaceflight data, we cannot accurately capture the associated risk, particularly to LOCL, without data for high impact conditions such as sepsis, shock, and myocardial infarction.

In order to obtain a data-driven model, we will need significantly more data, likely in the form of spaceflight data, terrestrial data, and medical literature.



Result of Clinician Specified SIN





- 1078 connections identified
- 275 connections as a result of
 - Anxiety
 - Atrial Fibrillation/Atrial Flutter
 - Medication Overdose/Adverse Reaction
- Median of 7 connections per condition
- Maximum number of parents 97 (Anxiety)
- Maximum number of children 43 (Acute Radiation Syndrome)
- Sufficiently complex to require change in MEDPRAT architecture
- May provide roadmap for data acquisition in highly connected or high impact areas

Future Work



- MEDPRRAT V1.0 Delivery 3/2020
 - Architecture update: calculate incidence rate updates as needed as opposed to during preprocessing to accommodate potentially large numbers of parent conditions
 - Finalize documentation
 - Review and deliver to ExMC
- MEDPRAT V2.0
 - Expand to integrate risks across HRP Elements
 - Proposed 2 to 3-year development plan
 - Within 6 Months Identify and prioritize capabilities to characterize (iPRR) discipline risk
 - Likely supply intermediate development versions for discipline testing



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