

Identifying dying people using data

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I see dead people

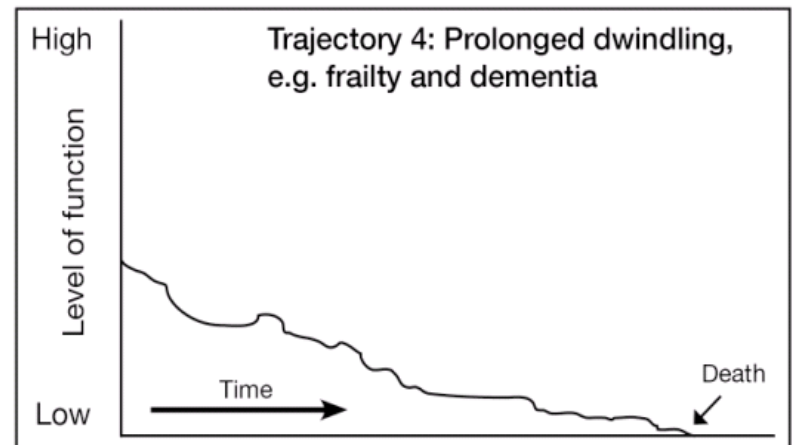
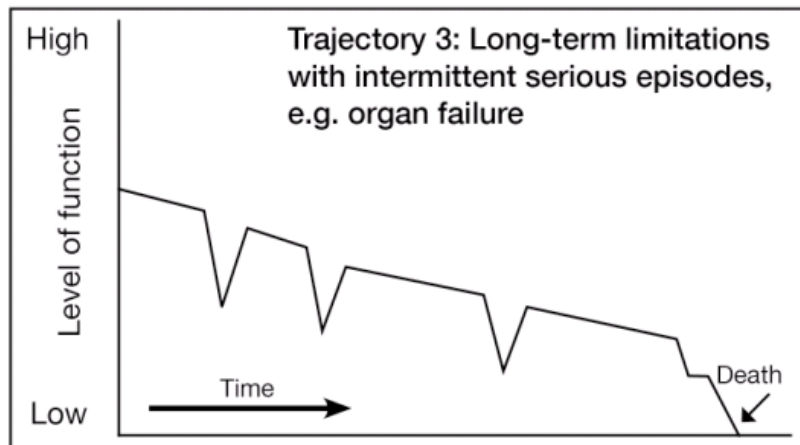
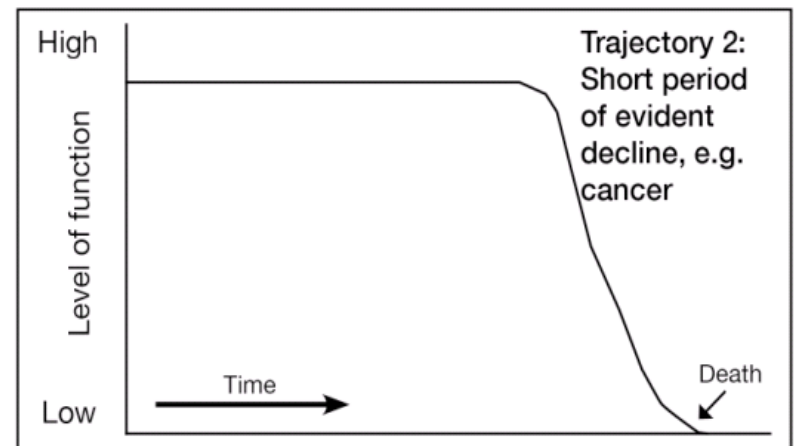
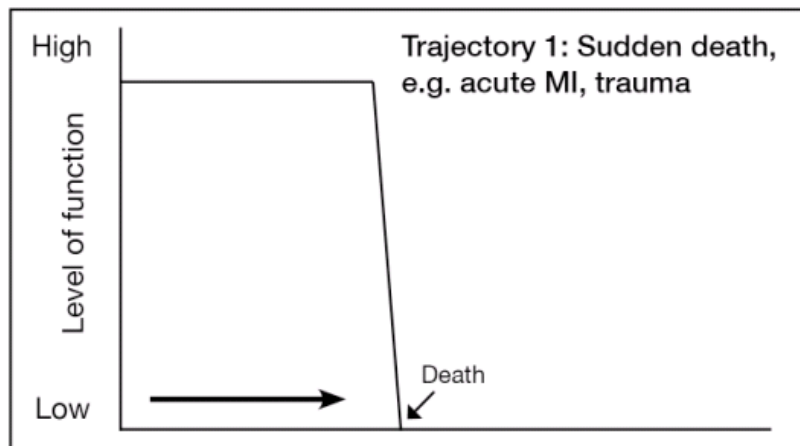
Overview

- How often do patients die in hospital
- Trajectories of death
- Dying and the deteriorating patient
- Predicting in-hospital death
- 5 ways to use data to identify dying patients
 - Big data
 - Audit of resuscitation plans
 - Audit of your end of life care MET calls
 - Morbidity and mortality meetings
 - Audits of in-hospital cardiac deaths

How often do patients die in hospital

- Not widely published
- HOPE equation
 - Risk-adjusted **h**ospital **o**utcome **p**rediction **e**quation (HOPE)
 - Victoria wide data approx. 380,000 admissions
 - In-hospital mortality = 2.5%
- Austin Hospital long stay study
 - 22,094 admissions > 24hr amongst 15,623 patients
 - Mortality = 891 (4.0%)

Trajectories of death



Phase of end of life care

Palliative Care Service

Advance care planning

RRT / ICU

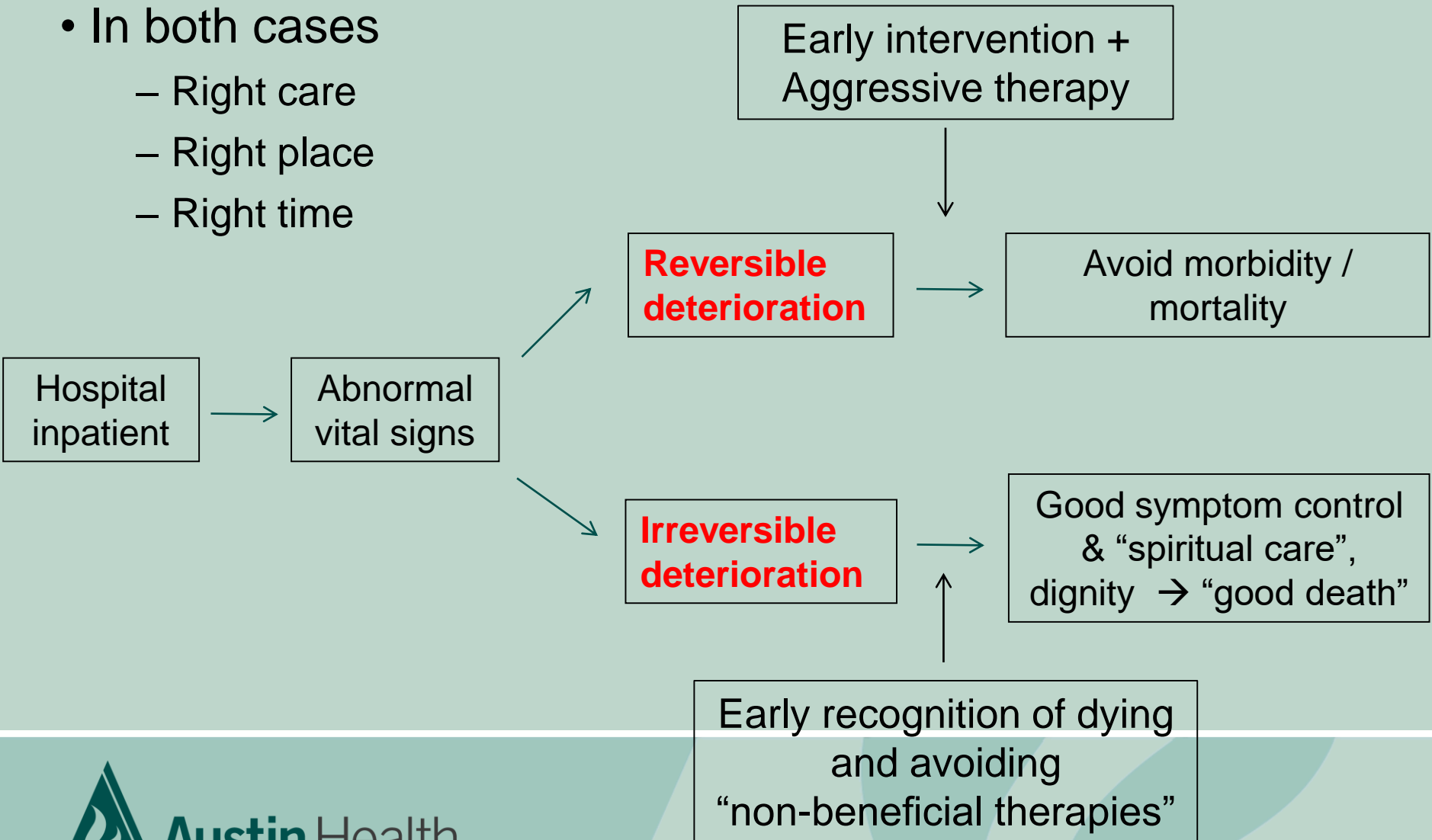
One year

Encounters with healthcare providers

Hospitalisation
but return to
independant
function at
discharge

Acutely deteriorating patients

- In both cases
 - Right care
 - Right place
 - Right time



Predicting in-hospital death

- HOPE equation
 - Risk-adjusted **h**ospital **o**utcome **p**rediction **e**quation (HOPE)

Table 3 Top 10 primary diagnostic categories according to mortality rate

Description	ICD-10AM	Frequency, n (%)	Died [†]
Pneumonia	J100-J199	10 225 (2.7)	681 (7.2)
Stroke	I630-I699	4946 (1.3)	580 (6.1)
Secondary malignancy	C760-C799	5044 (1.3)	551 (5.8)
Myocardial infarction	I210-I219	9264 (2.4)	498 (5.3)
Heart failure	I50-I599	7421 (1.9)	471 (5.0)
Intracranial haemorrhage	I600-I629	1573 (0.4)	442 (4.7)
Septicaemia	A40-A499	2868 (0.8)	421 (4.4)
Chronic pulmonary disease	J400-J449	9561 (2.5)	376 (4.0)
Respiratory malignancy	C30-C399	2361 (0.6)	298 (3.1)
Upper gastrointestinal malignancy	C150-C219	4276 (1.1)	271 (2.9)
Subtotal		57 539 (15)	4589 (48)

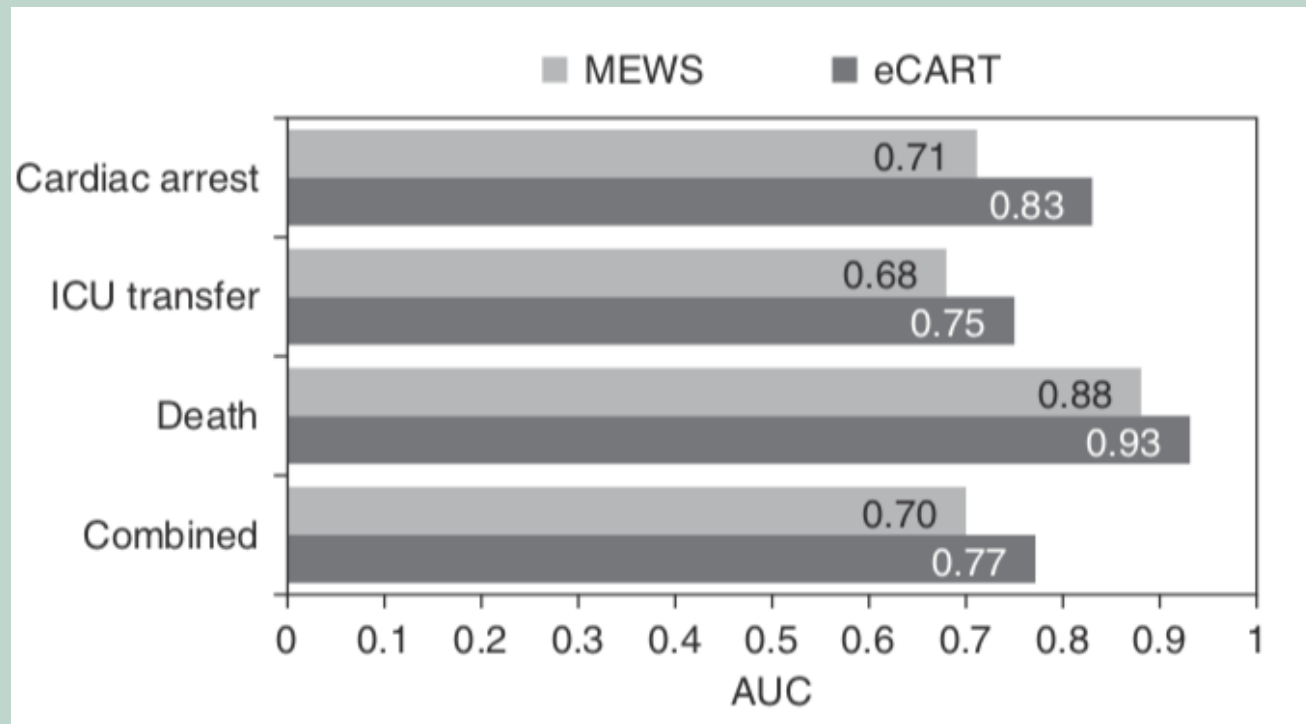
[†]Absolute number (percent of all deaths). ICD-10AM, International Classification of Diseases, version 10, Australian modification.

Calculation of hospital outcome prediction equation (HOPE)

Variable	Definition	Format
A Age	Patient age	Years
B Primary Diagnosis	Diagnosis on admission to hospital	Diagnostic coefficient (available on request)
C Inter-hospital transfer	Transfer from another acute health care facility	Yes = 1; No = 0
D RACF	Resident from an aged care facility prior to admission	Yes = 1; No = 0
E Unplanned admission	Admission that was not planned, booked, or elective	Yes = 1; No = 0
M Sex	Male	Yes = 1; No = 0

Machine learning – real time algorithms

- E-CART



Churpek et al Am J Resp Crit Care Med 2014

5 ways to use data to identify dying patients

1. Big-data – e.g. E-CART, HOPE equation
2. Audit of your resuscitation plans
 - Do you have a policy for completion
 - How often are they completed
 - Are they completed in accordance with policy
 - Are they completed in patients who have died
 - Timeliness of completion (in relation to admission & death)

- ### 3. Audit of your end of life care MET calls
- Approx. 1/3 MET calls have EOLC issues
 - Mortality \approx 50-60% cf: \approx 10-15% if no EOLC issues
 - Some teams over-represented
 - » Focus of QI initiatives to improve ACP and EOLC
 - Did the patient have a limitation of medical Rx
 - » Before the call / After the call
 - Nature and quality of palliative care given
 - ? Agreement between MET and parent team
 - What were the in-hospital outcomes

4. Morbidity and mortality meetings

- “The clinicians who provided the care should ideally not be the people who decide if the death was preventable”
- Regular
- Transparent and open
- Standardised tool
- Peer review
- Free from blame – focus on learnings and QI cycle
- Process of escalation

SARC = surgical audit review committee

- Unit meetings = internal review
- Regular M+M Thurs morning with all surgeons
 - Deaths presented in open forum (up to 100)
 - Robust discussion
 - Notes documented
- Tool completed & Case summarized → submitted to SARC

Admission Diagnosis	Pyoderma gangrenosum/chronic leg ulcers	
Cause of Death (on death certificate)	Respiratory failure	
Discussion at Weekly Surgical Audit	Nil issues identified.	
Are any of the following present?	Yes	No
Coroner's Case		X
Autopsy Requested		X
Death within 24 hrs admission (unless known palliative on admission)		X
Was death anticipated on admission		X
Did death occur during a procedure		X
Death in Operating Theatre		X
Death in Cardiac Cath Lab		X
Death during diagnostic procedure		X
Age <50 and death NOT from chronic illness		X
Sentinel event occurred (a clear cut events that occur independently of a patient's condition and result in unanticipated death or serious physical/psychological injury to patient – see below)		X
Elective surgical admission	X	
Did the Patient have an Advanced Care Plan/Directive	X	
Did CPR occur?		X
Was the patient transferred from external healthcare facility		X
- Did the transfer occur out of hours?		X
Death following readmission <72 hours post discharge (incl. ED)		X
Death following transfer between hospitals sites (unless to Palliative Care Unit/Aged Care with expectation of death)		X
Readmission to ICU <24 post discharge to ward		X
Complications/Adverse events (unexpected / resulting in) death	X	
Death Status – Select the most appropriate		
Expected death no care management issues		
Expected death with care management issues		
Unexpected death which occurred despite taking all necessary preventative measures	X	
Preventable death where steps may not have been taken to prevent it		
Unexpected death resulting from medical intervention		

Thurs M+M



SARC



Patient review committee (PRC)



Executive / Legal

Audit of in-hospital cardiac arrests

- Recommended
 - ACHS
 - ACSQHC
 - iSRRS
- Need to have a process to identify / capture
 - ICU most likely method = attend all
- How many do you have?

- Utstein template for audit of cardiac arrests
- Simplified version
 - Demographics
 - Co-morbidities / functional status
 - Shockable / non-shockable
 - Measure of quality of resuscitation
 - Antecedent warning signs (e.g. MET criteria)
 - Was the MET activated ?

Summary

- In-hospital mortality 2-4%
- 4 common trajectories of death
- Predictive equations exist
- 5 ways to use data to identify dying patients
 - Big data
 - Audit of resuscitation plans
 - Audit of your end of life care MET calls
 - Morbidity and mortality meetings
 - Audits of in-hospital cardiac deaths
- Audit processes need to be transparent / open & have process for escalation