



SAFE DIVING

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OUTLINE

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5. Heart rate determines VO_2 consumed
6. Controller
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8. Future work

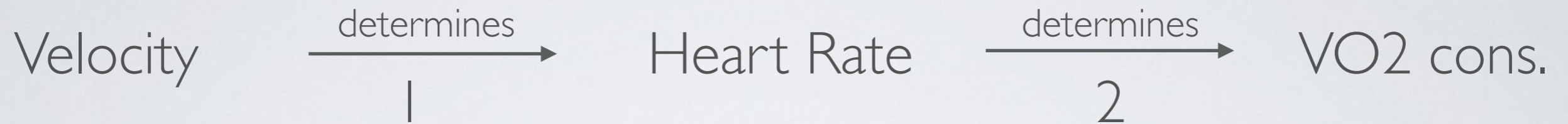
MOTIVATION

- There are over 1,000 cases of Decompression Sickness (DCS) per year
- Many cases are due to lack of awareness of remaining air supply
- Prevent DCS and Arterial Gas Embolism
- Most computers do not display remaining dive time, the ones that do cost over \$2,000

RELATED WORK

- US Navy most knowledgeable body on SCUBA diving
 - Almost all of their results come from testing
- Implantable Cardiac Medical Devices
 - Verification performed via clinical studies
- Haque et al. noted a lack of verification systems for CPS

MODEL*



* Time Triggered

SAFETY

$$\text{O}_2 \text{ in tank} \geq \text{depth} / v_{\text{ascent}} * \text{VO}_{2\text{max}}$$

more conservative
than $\text{VO}_{2\text{ascent}}$

I. VELOCITY $\xrightarrow{\text{determines}}$ HEART RATE

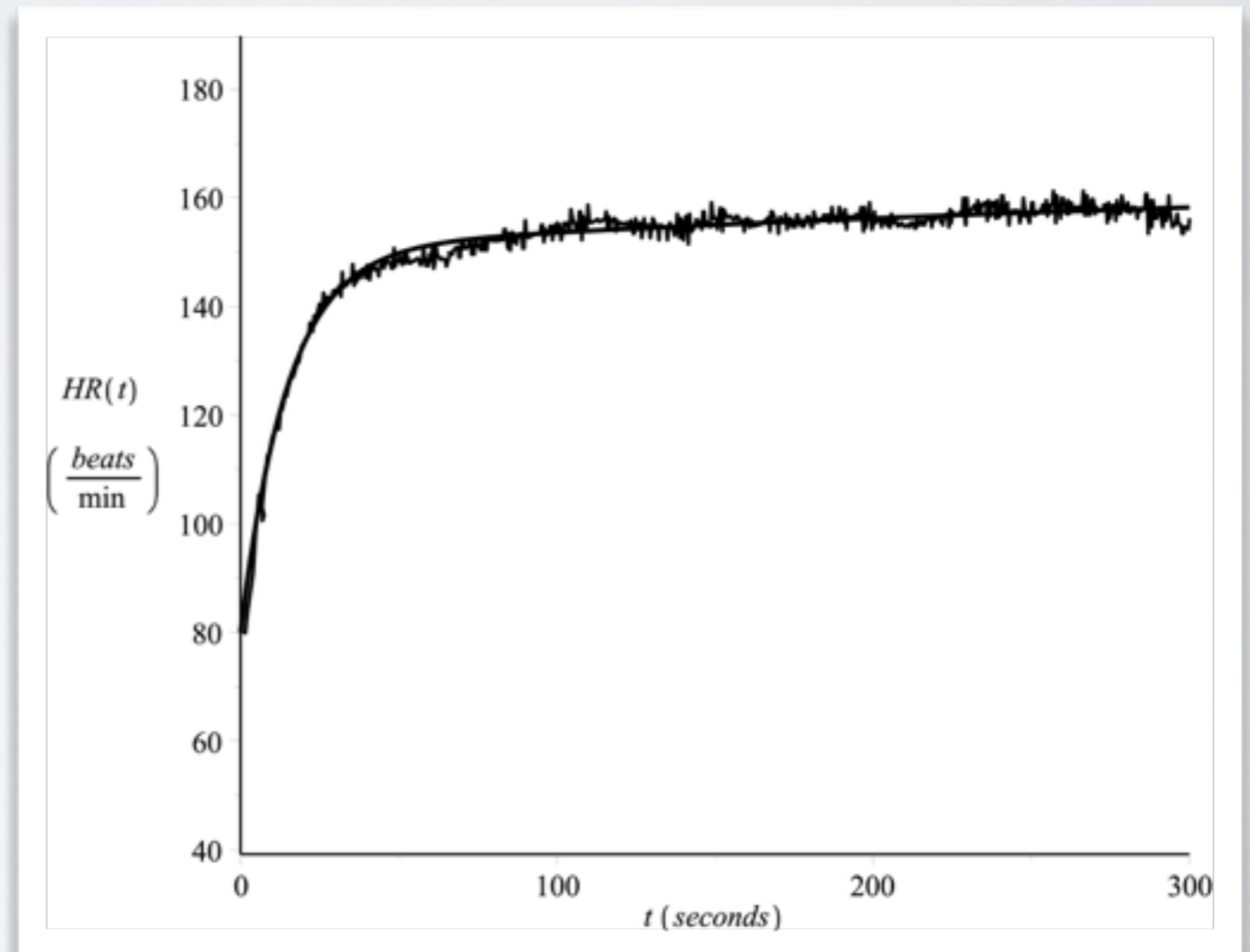
$$HR' = f_{\min} \cdot f_{\max} \cdot f_d$$

$$f_{\min}(HR) = 1 - e^{\left(\frac{HR - HR_{\min}}{stdev}\right)^2}$$

$$HR_{\min} = \frac{35 \text{ beats}}{\text{cond min}}$$

$$f_{\max}(HR) = e^{\left(\frac{HR_{\max} - HR}{stdev}\right)^2} - 1$$

$$HR_{\max} = 200 \frac{\text{beats}}{\text{min}}$$



I. VELOCITY $\xrightarrow{\text{determines}}$ HEART RATE

$$f_d(HR, v, t) = -\alpha \cdot cond \cdot (HR - L(v, t))$$

$$L(v, t) = \alpha_3 \cdot L_{cond}(v) \cdot L_t(t)$$

$$L_{cond}(v) = L_{base} + (L_{max} - L_{base}) \cdot e^{\alpha_6(v - v_{max})}$$

$$L_t(t) = 1 - e^{-\frac{t}{\alpha_7}}$$

$$\alpha = 0.08 s^{-1}$$

$$\alpha_3 = 4 \text{beats} \cdot \text{min}^{-1} \cdot \text{mM}$$

$$L_{base} = 1 \text{mM}$$

$$L_{max} = 9 \text{mM}$$

$$\alpha_6 = 1.8$$

$$v_{max} = 8.88 \sqrt{\text{cond}}$$

$$\alpha_7 = 2700 s^{-1}$$

PROBLEM?

- TOO COMPLICATED
 - Multiple exponential terms in the differential equation — ‘e’ not in the syntax for $d\mathcal{L}$
 - No algebraic intuition of solution — author numerically fit the data for runners

SOLUTION?

- SIMPLIFY !
- Aspects to replicate in simplified dynamics:
 - intensity (velocity) should determine max heart rate achieved (steady state)
 - velocity should affect time taken to reach that steady state
 - “reach” = come within 1 beat/min of steady state

SOLUTION

$$HR = HR_{ss} - (HR_{ss} - HR_{init}) e^{\frac{t \ln(HR_{ss} - HR_{init})}{(-20 \frac{v}{v_{max}} + 30)}}$$

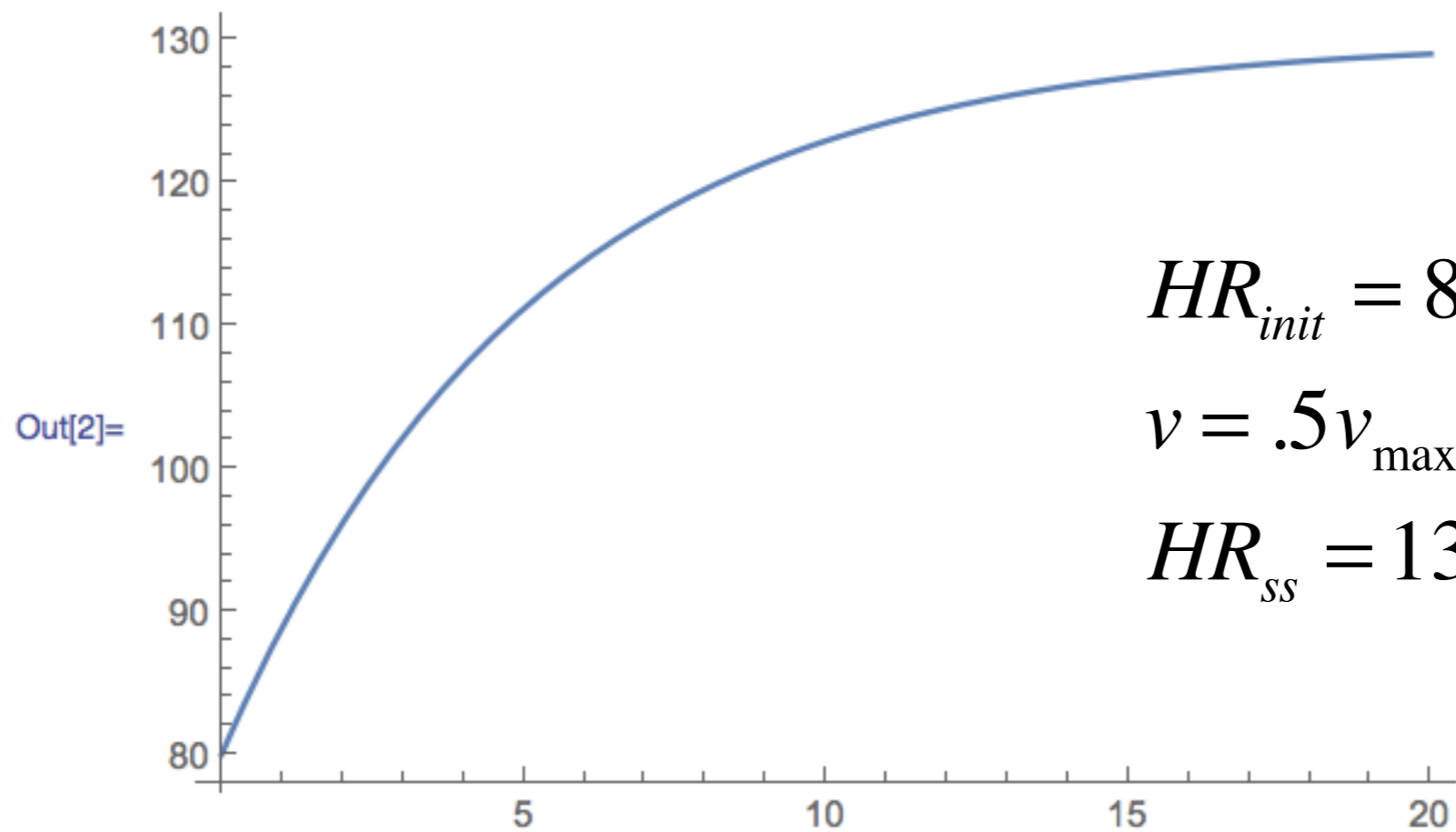
Steady State: $HR_{ss} = HR_{min} + \frac{v}{v_{max}} (HR_{max} - HR_{min})$

Time scale: $\frac{\ln(HR_{ss} - HR_{init})}{(-20 \frac{v}{v_{max}} + 30)}$ As $v \rightarrow v_{max}$, $HR \rightarrow HR_{ss} - 1$

Good approximation.
usually within 1% of HR_{ss}

$$HR = HR_{ss} - (HR_{ss} - HR_{init}) e^{-\frac{t \ln(HR_{ss} - HR_{init})}{(-20 \frac{v}{v_{max}} + 30)}}$$

```
In[2]:= Plot[x = 130 - 50 * Exp[-t * Log[50] * 1 / 20], {t, 0, 20}]
```



$$HR_{init} = 80bpm$$

$$v = .5v_{max}$$

$$HR_{ss} = 130bpm$$

DYNAMICS

$$HR' = -(HR - HR_{ss}) \frac{c}{-20\left(\frac{v}{v_{\max}}\right) + 30}$$

$$2.71828^c = HR_{ss} - HR_{init}$$

OK to approximate **e** because:

- c is a constant, not part of dynamics
- computer also approximates value of e

2. HEART RATE $\xrightarrow{\text{determines}}$ VO2 CONS

$$\%HR_{\max} = 0.6463 * \%VO2_{\max} + 36.8$$

$$VO2_{\max} = 60 \frac{ml}{kg * min} = 288 \frac{l}{min} \quad (\text{for } 80\text{kg diver})$$

$$HR_{\max} = 200\text{bpm}$$

$$VO2 = \frac{VO2_{\max}}{0.6463 * HR_{\max}} * HR - \frac{36.8}{0.6463}$$

$$VO2' = \frac{VO2_{\max}}{0.6463 * HR_{\max}} * HR'$$



FINAL VO2 DYNAMICS

$$VO2' = \frac{VO2_{\max}}{0.6463 * HR_{\max}} \left(-(HR - HR_{ss}) \frac{c}{-20\left(\frac{v}{v_{\max}}\right) + 30} \right)$$

CONTROLLER

```
{
  v:=*;
  {
    ?(v = vAsc);          /* velocity should be = vAsc during ascent */
    depthV := -1*v;
  }
  ++
  {
    ?(Tank - V02max*T >= depth/vAsc * V02max); /*guard for case with no change in depth*/
    ?(v <= vMax & v >= 0);
    depthV := 0*v;
  }
  ++
  {
    ?(depth + v*T <= depthMax); /* guard on v to ensure we don't go below maximum depth in T */
    ?(Tank - V02max*T >= (depth - vMax*T)/vAsc * V02max); /* guard on case with increasing depth */
    ?(v = vAsc);          /* velocity should be = vAsc during decent */
    depthV := 1*v;
  }
}
```

INVARIANT

$$HR_{\min} \leq HR \leq HR_{\max}$$

$$Tank \geq \frac{depth}{v_{asc}} * VO2_{\max}$$

$$VO2 \leq VO2_{\max}$$

$$v < v_{\max}$$

$$depth < depth_{\max}$$

$$HR_{\max} = 200$$

$$HR_{\min} = 60$$

$$v_{asc} = .54$$

$$v_{\max} = 3$$

$$VO2_{\max} = 288$$

INITIAL CONDITIONS

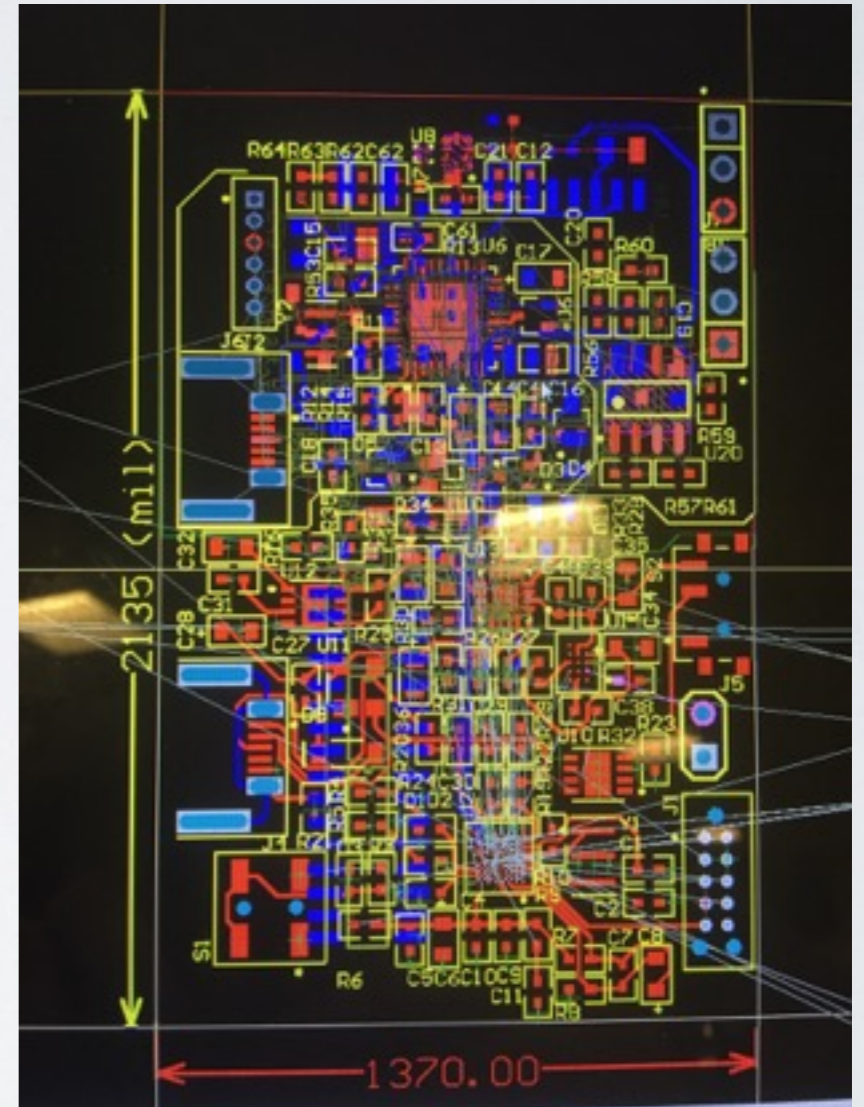
Invariant ... +

$$depth_{\max} = \frac{Tank}{VO2_{\max}} * v_{asc}$$

$$T > 0$$

FUTURE WORK

- Require lots of test data for divers to better fit model parameters
- Prove safety of Maria's (complex) model
- Omar designed a wrist computer for under \$300
 - Prototype expected this summer





Thanks!