



Building Physiology-Based Models for Predicting Performance Impairment

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- The study protocol was approved by the Naval Submarine Medical Research Laboratory Institutional Review Board in compliance with all applicable Federal regulations governing the protection of human subjects (UCONN No. H14-328).
- This work is supported by funding work numbers F1710 and F1704.
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Goal

- Predict performance decrement due to fatigue
- Using noninvasive, nondisruptive monitoring
- To assist with watchstanding management



Background

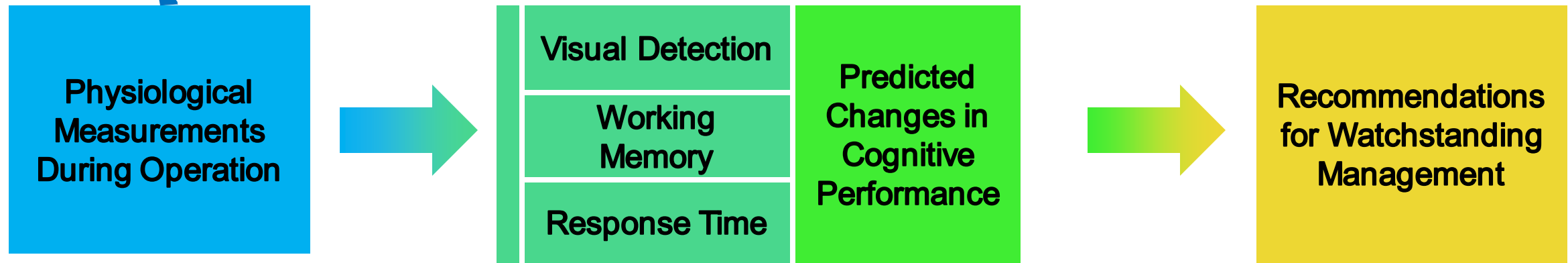
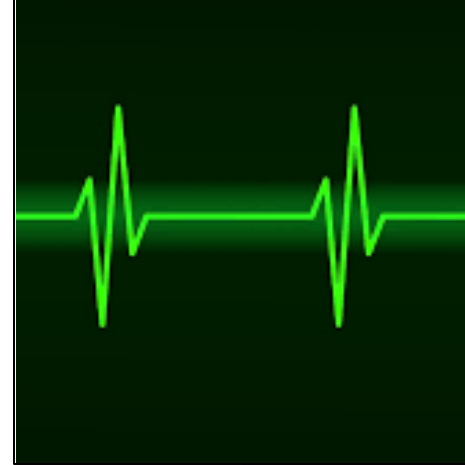
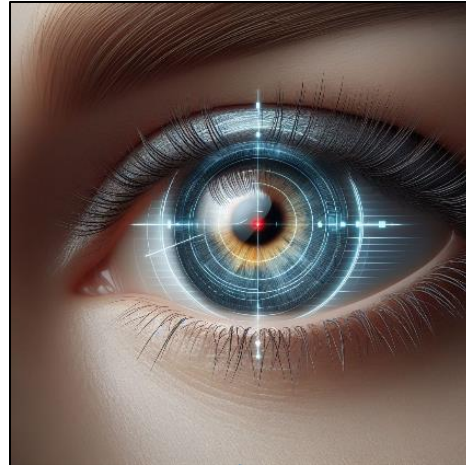


Image Sources: Microsoft Copilot, Wikimedia Commons



Biometrics and Performance Decrement

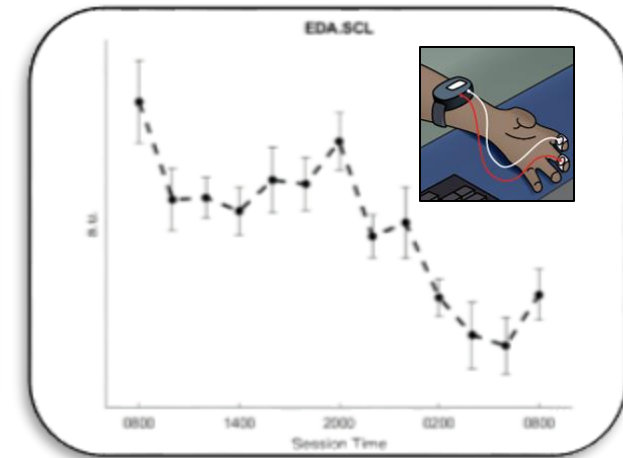
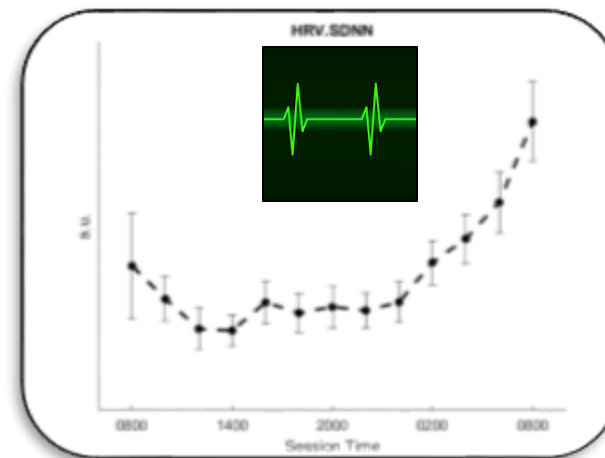
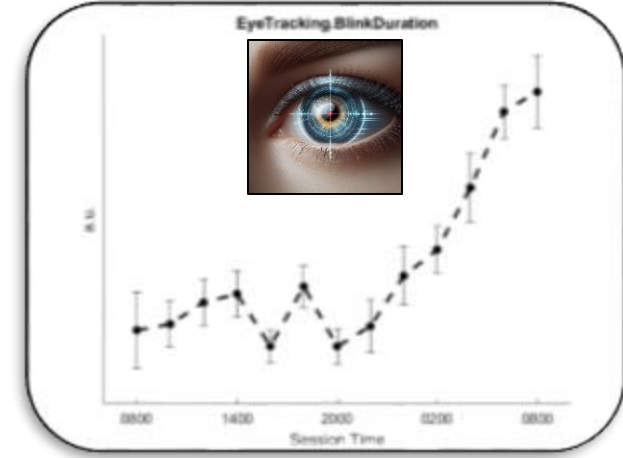
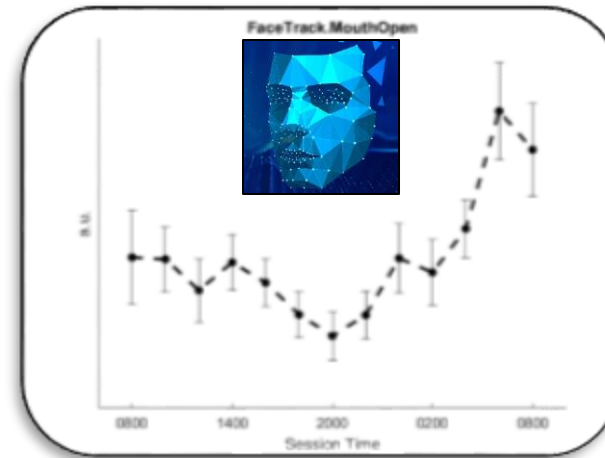
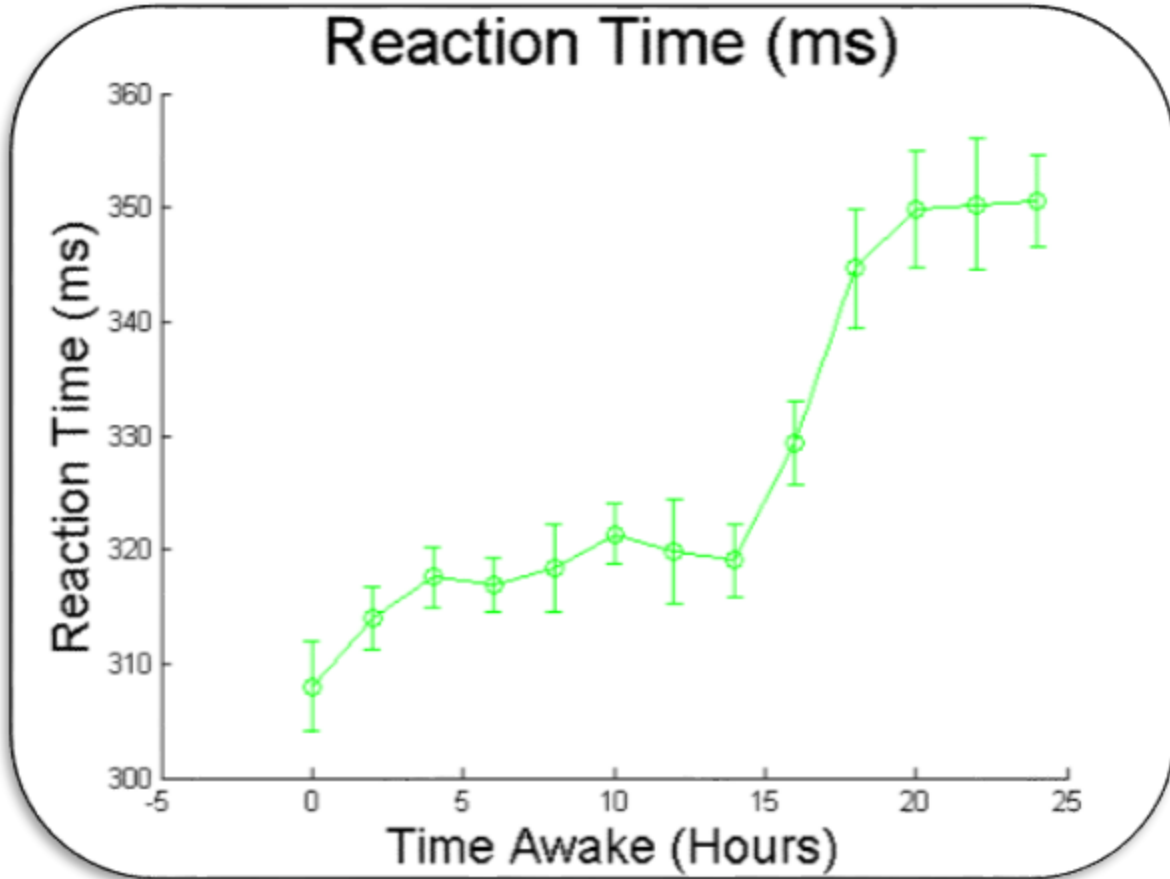


Image Sources: Microsoft Copilot, Wikimedia Commons



Studies and Non-Disruptive Monitoring

Multi-Modal Sensor Data Collection

Non-Invasive, Non-Disruptive Monitoring

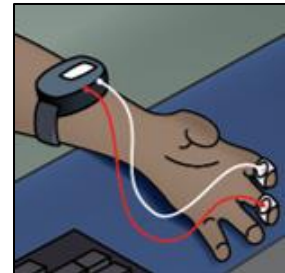
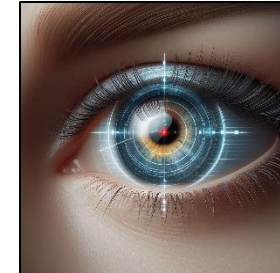
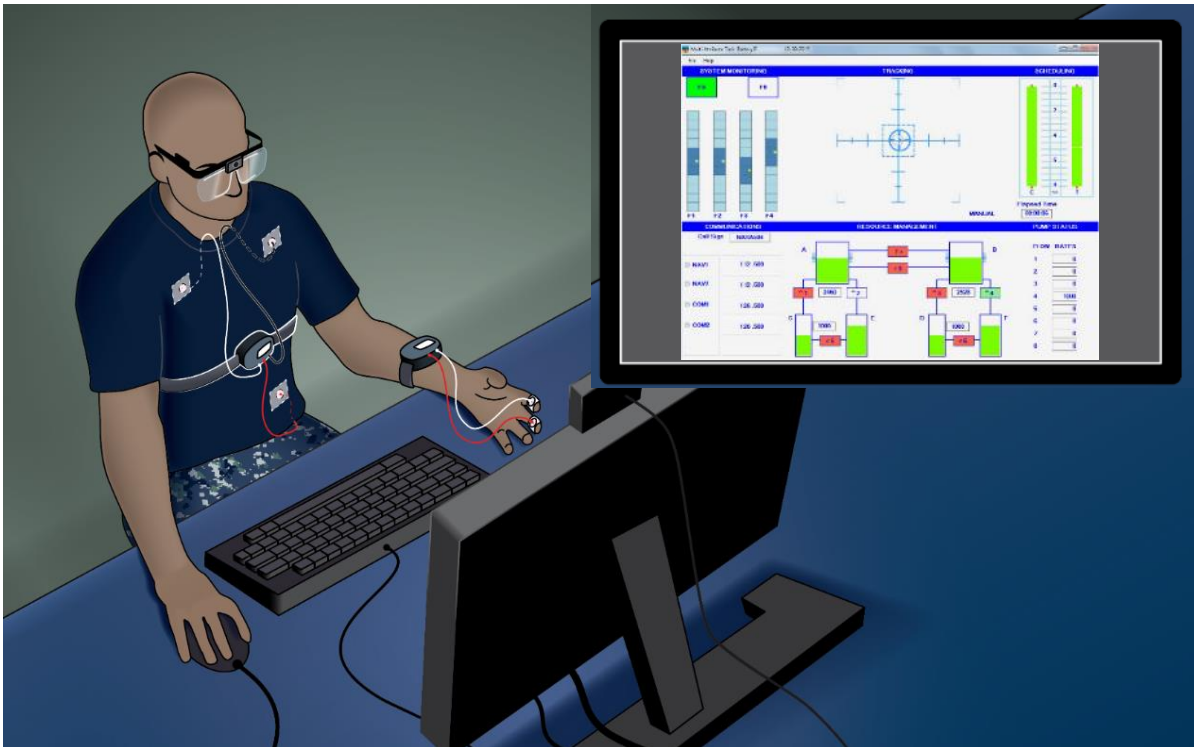


Image Sources: Logitech, Empatica, Tobii, Microsoft Copilot, Wikimedia Commons Internal



Methodology for Prediction

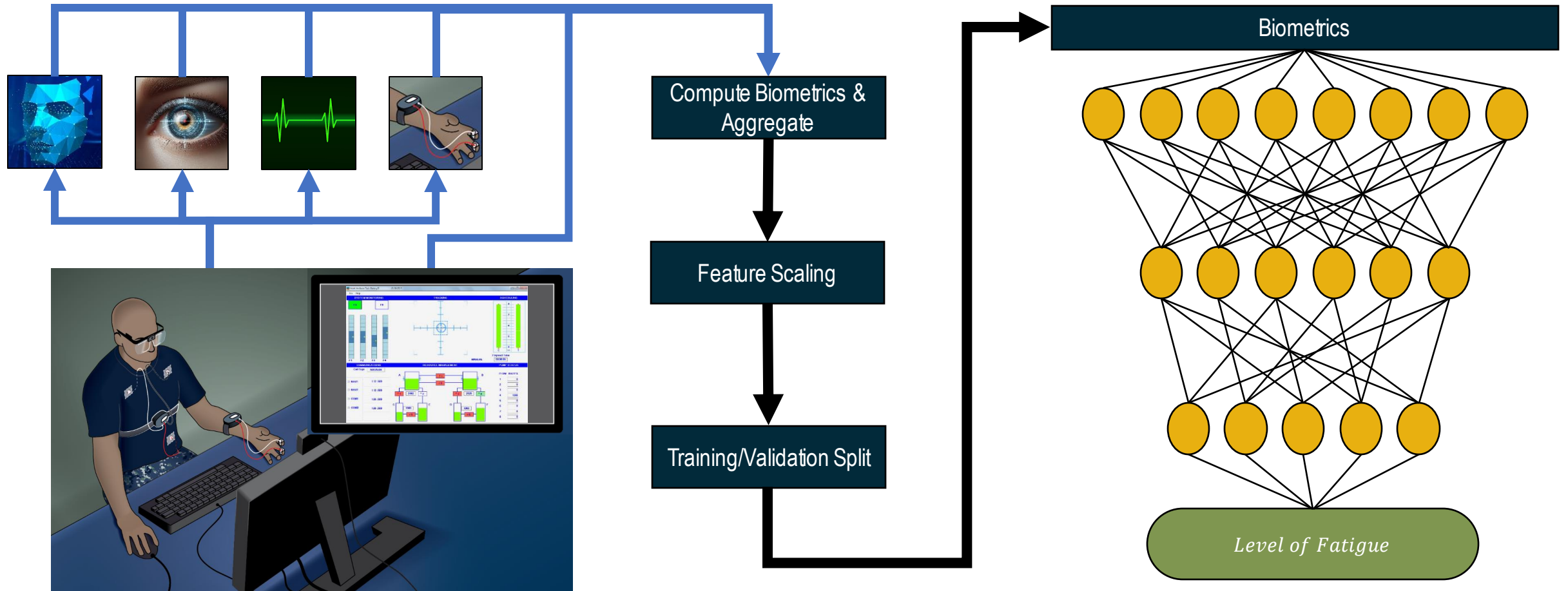


Image Sources: Microsoft Copilot, Wikimedia Commons



Watchstanding Management

- For Watchstanding Management, NSMRL partnered with Pulsar Informatics to develop the Optimized Watchstanding and Logistics (OWL) Tool



Watchbill

Select the Name of Potential Watchstander

All Positions available for that Name are boxed and the individual's Qualification Status for that Position is highlighted

- Not Qual'ed / has not started Qual
- Not Qual'ed / has started Qual
- Fully Qual'ed (How to show Proficiency?)

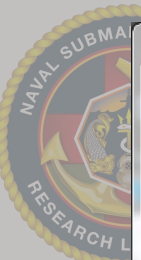
Plan of Day/Week

Fatigue Monitor



All tactical data presented is fabricated for presentation purposes

Watchbill

 OWL

Watchbills ▾

All changes are saved. ⚙

Underway

Maneuvering

Battlestations Torpedo

Battlestations Strike

WQSB *Read Only*

Optimize

Clear All

	Section One	Section Two	Section Three	Kickouts
OOD	LT B.Torres DCA	LT G.Day WEPS	LT B.Peterson NAV	
JOOD/CM	LTJG N.Cox CRA LT S.Ricketts SUPPO	LTJG B.Boyd AWEPS	LTJG S.Simmons COMMO	
Contact Manager STP	LCDR W.Marshall ENG	LT A.Butler AOPS	LT B.Torres DCA	
DOOW/Control Room Coordinator	MMC R.Collins ALCPO ETC J.Dillon	ETC B.Gray ANAV	FTC S.Bryant FTLCPO FT2 B.Bonden DECKLPO	
COW	STSCS N.Graham STLCPO	FTC S.Bryant FTLCPO	MM1 J.Stewart	
HELM/Lookout	ETSN L.Price	ETSA J.Bennett	ETSN M.Powell	
PLANES/Lookout	ETSA R.Barnes	YNSN C.Wilson	MMFN F.Stevens	
Messenger	LS3 T.Warren	FT3 B.Hayes	FT3 L.Meyers	
FTOW	FT3 B.Hayes	FT1 A.Griffin	FT2 D.Diaz	
AFTOW	FT2 B.Bonden DECKLPO	FTSN S.Ford	FTSA L.Hamilton	
QMOW	ET1 F.Watson	ET2 W.Brooks	ET2 W.Kelly	
AEO/Radar OP	ET2 R.Jenkins ETSN E.Long	ET1 H.James	ET3 V.Young	
LTOW (EPO) STP	ITS2 B.Cruz	ITS1 P.Patterson LANLPO	FT2 J.Flores	
AOW	MM3 S.Bailey	MM2 T.Morgan	MM3 G.Bell	
AMR	MM1 J.Morris MM2 J.Cook	MM2 A.Rogers	MM1 J.Sanchez	
Radio OP STP	ETC H.Ross RMLCPO	ET2 C.Coleman	ET1 E.Henderson	
Sonar SUP	STSCS N.Graham STLCPO	STS1 D.Sullivan	STS1 M.Gomez	
ASO	STS2 N.West	STS2 M.Owens	STS2 C.Coleman	
ASO	STS2 C.Washington	FT3 T.Hughes	FT1 E.Russell	
ASO	STS3 J.Ellis	STS3 V.Reynolds	STSSN T.Harrison	
BSO/Fathometer OP MPP	STSSN C.Gibson	STSSA J.Cruz	STSSA L.Marshall	

1

Select the Name of Potential Watchstander

2

All Positions available for that Name are boxed and the individual's Qualification Status for that Position is highlighted

Not Qual'ed / has not started Qual

Not Qual'ed / has started Qual

Fully Qual'ed

(How to show Proficiency ?)

Crew Members

All Hands

LTJG B . Boyd AWEPS

LT A . Butler AOPS

LT G . Day WEPS

LCDR W . Marshall ENG

LT B . Peterson NAV

LTJG S . Simmons COMMO

LT B . Torres DCA

LT B . Ward MPA

EM2 R . Adams

EM2 L . Allen

ETC C . Anderson RCLCPO

LCDR J . Aubrey XO

MM3 S . Bailey

MMC G . Baker MLCPO

ETSA R . Barnes

MM3 G . Bell

ETSA J . Bennett

FT2 B . Bonden DECKLPO

ET2 W . Brooks

MMC W . Brown 3MC

FTC S . Bryant FTLCPO

MM2 H . Campbell

MM1 D . Carter

MM2 A . Clark

STS2 C . Coleman

ET2 C . Coleman

MMC R . Collins ALCPO

CS3 D . Cook

MM2 J . Cook

MMSN R . Cooper

LTJG N . Cox CRA

STSSA J . Cruz

ITS2 B . Cruz

YN1 A . Davis

ET2 D . Diaz

v1.5.4479.0

All tact



Plan of the Day / Plan of the Week

Calendar Scratch Q5 7days - Windows Internet Explorer

http://127.0.0.1:32767/start.html#p=calendar_scratch_q5_7days&c=1

FavoritesCalendar Scratch Q3 onedayCalendar Scratch Q5 7d... X

Home _ USS VirginiaManning >Training >AssignmentsReferences >Maintenance >Help >

Logged ON:

Log OFF

New AppointmentNew Meeting >New Items >

TodayNext 7 DaysDayWork WeekWeekMonth >

Open Calendar >Calendar Groups >

E mail CalendarShare CalendarCalendar Permissions

☐ USS Sub Ship ALL

☐ Executive Div

☐ ENG Div

☐ NAV / OPS Div

☐ Supply Div

☐ WEPS Div

☐

☐ crew mess

☐ ward room

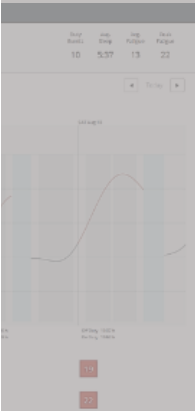
☐ eng room

To Do List:

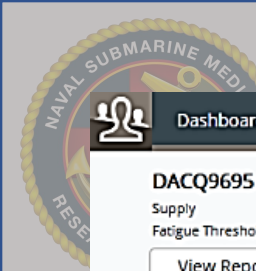
Add Event

5/12	WHO						WHERE				WHAT
	ALL	EX	OPS	WEPS	SUPPLY	ENG	CM	WD	TR	OpC	
0000											
0100											
0200											
0300											
0400											
0500											
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Plan of Day/Week



All tactical data presented



DACQ9695 — Quinn Dach

Supply
Fatigue Threshold: 12

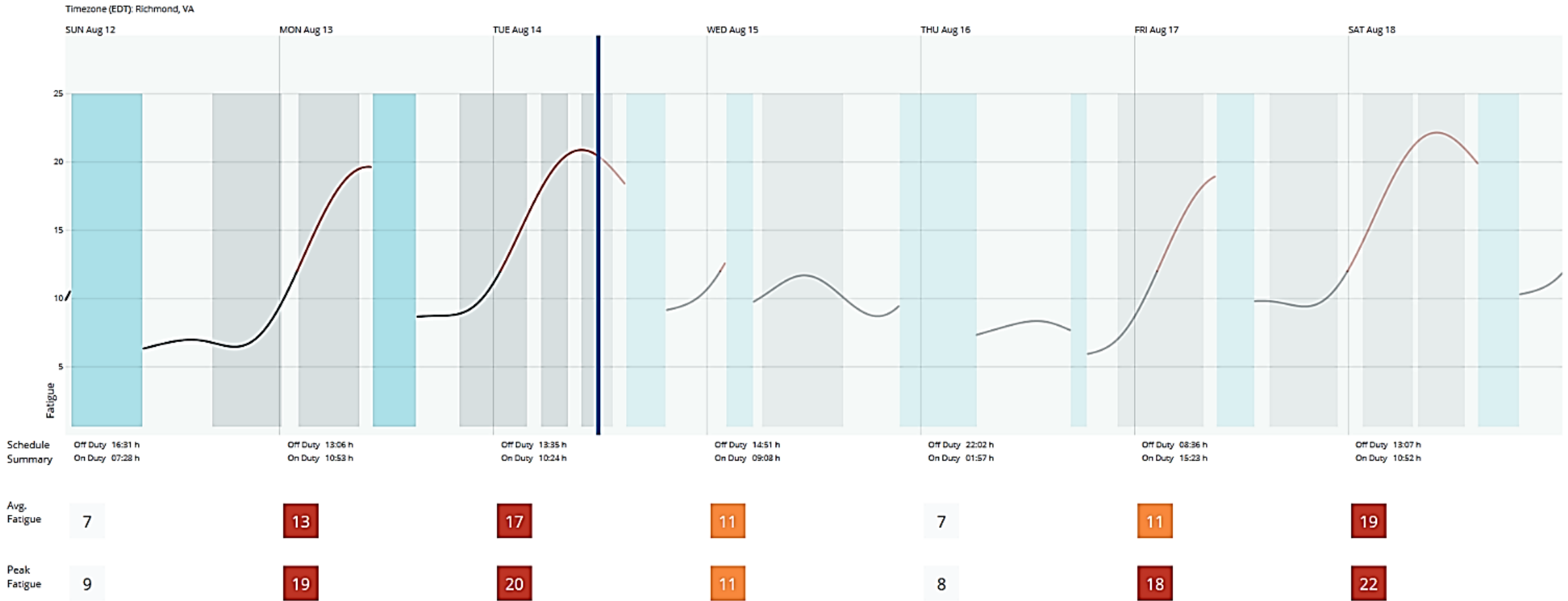
View Report

Fatigue Monitor

Duty Events	Avg. Sleep	Avg. Fatigue	Peak Fatigue
10	5:37	13	22

Days Timeline Aug 12 - Aug 18

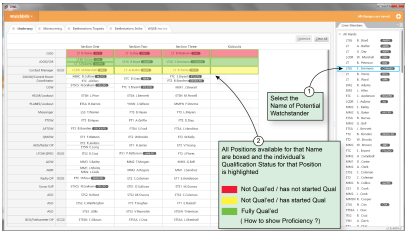
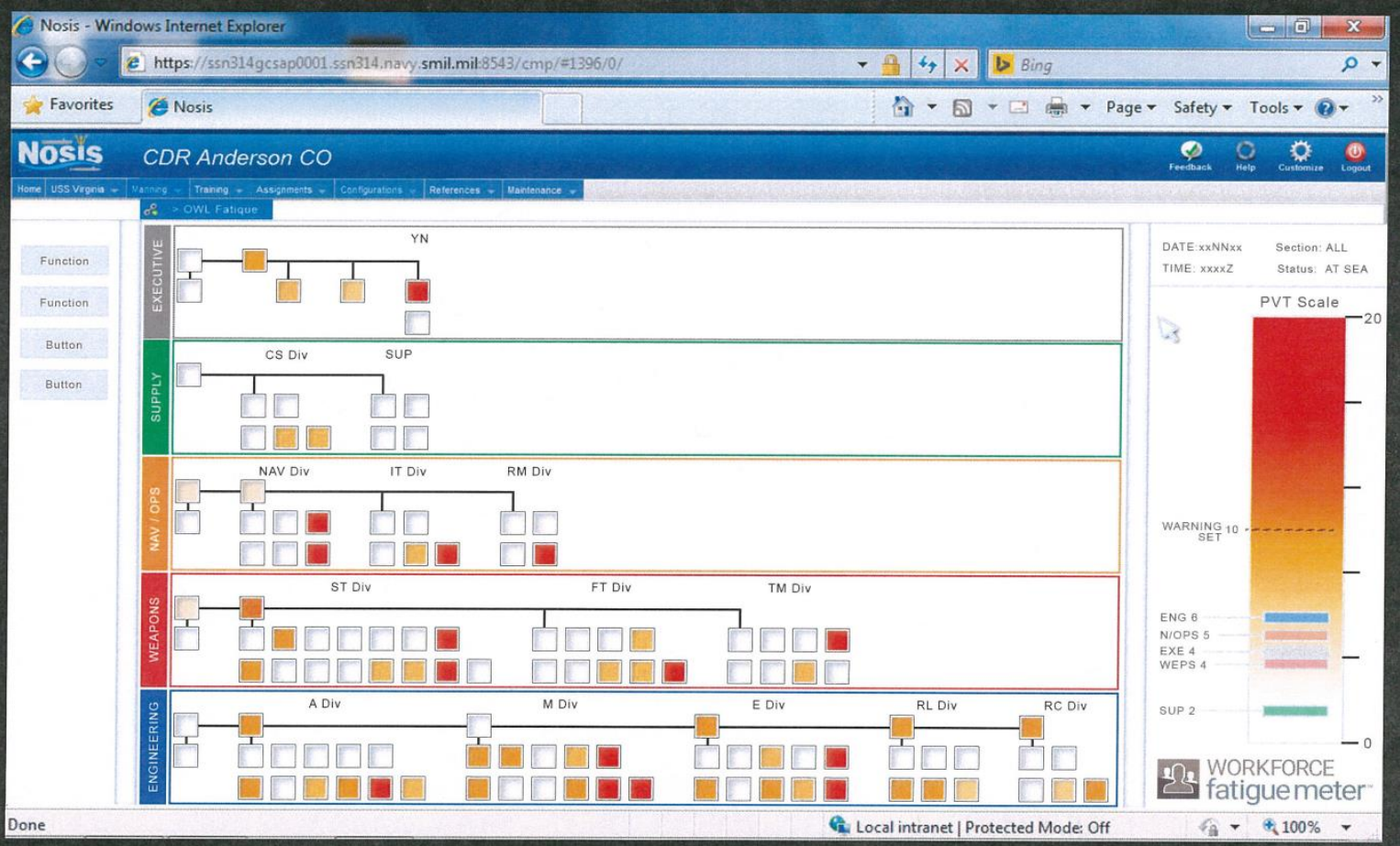
◀ Today ▶



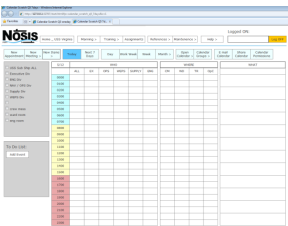


Watchstanding Management

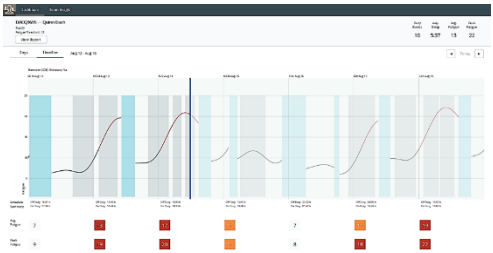
Watchbill



Plan of the Day / Week



Fatigue Monitor

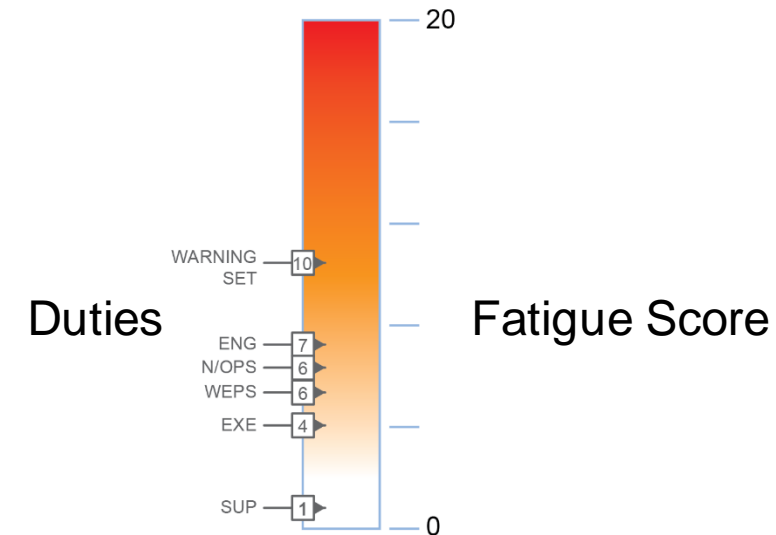


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Future Research

- Machine Learning can use non-invasive monitoring to predict performance
- Future steps:
 - Develop larger data set with more operational predictions
 - Align fatigue scores to duties
 - Refine algorithms to update in real-time
 - Integrate wearables





Questions

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Thank you to:

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Dr. Timothy Dunn

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Dr. Youngsun Kong

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Research Collaborators



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