









#### OUTLINE

Definitions

Effects

Sleep Inertia

Biomathematical
models

FRMS





## ICAO DEFINITION OF FATIGUE

## PHYSIOLOGICAL STATE

Reduced
 mental or
 physical
 performance
 capability

#### **CAUSES**

- **Sleep** loss
- Extended wakefulness
- Circadian phase mismatch
- Workload (mental/physic al)

#### **EFFECTS**

• Impaired alertness

#### SAFETY IMPACT

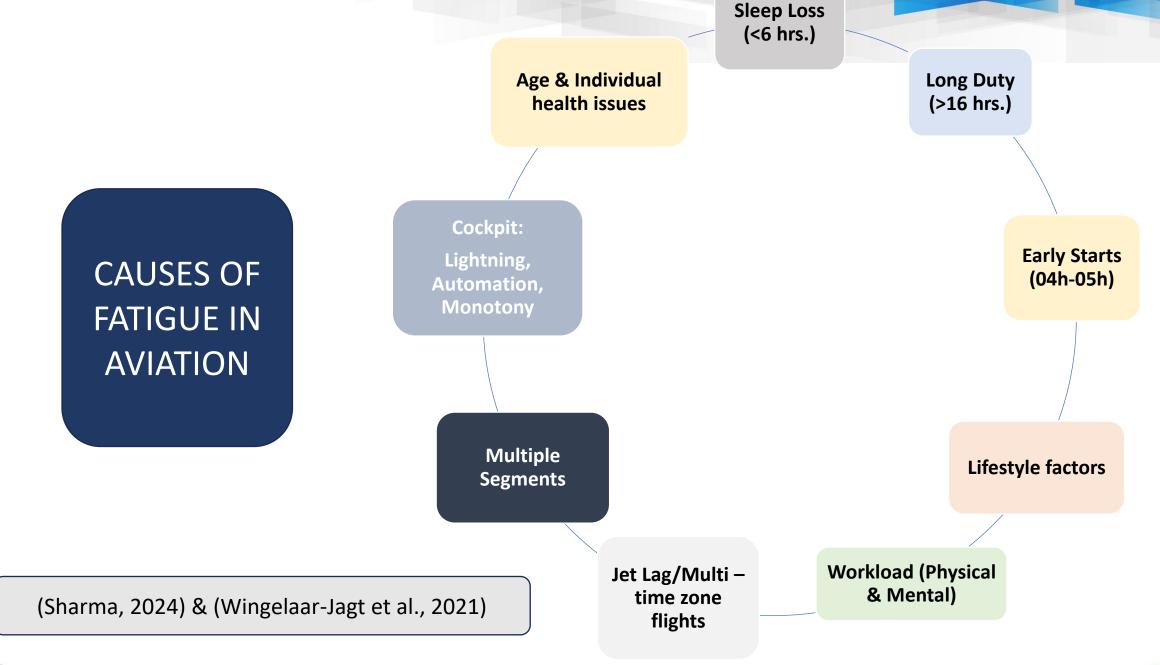
Reduced

 ability to
 perform
 safety related duties

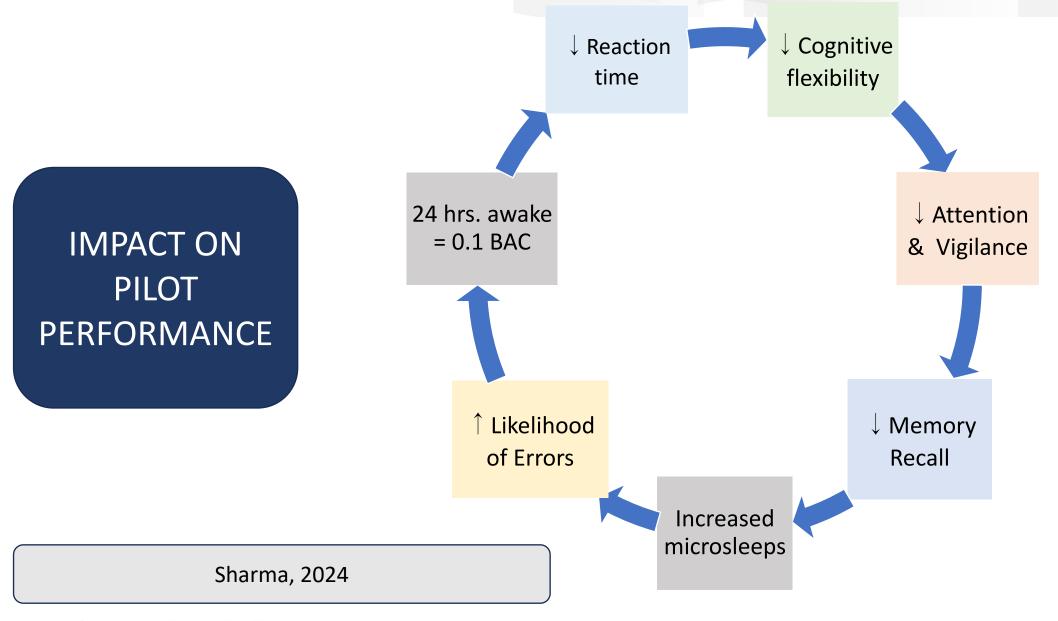
(ICAO, 2020)















## HOW WE MEASURE FATIGUE

#### Objective

- PVT
- EEG/eye tracking
- Wearables (PPG, HRV, ST, ACC)
- ECG/EMG/GSR
- Facial and gaze analysis
- Actigraphy
- Flight Performance deviations

#### Subjective

- Karolinska
- Samn-Perelli
- Peer assessment
- ASR (Aviation Safety Reports)
- VAS (Visual Analogue Scale) fatigue scale

#### Prediction

- Biomathematical models (SAFTE, FAST)
- Al-based fatigue detection models
- Readiness screening tools
- FRMS operational data modelling





#### Gaze Tracking

 Uses a camera or infrared sensors to examine blinking, eye closure, and gaze stability strong markers of drowsiness.

#### Heart Rate (HR)

Measures
 cardiac
 response;
 fatigue reduces
 heart rate
 variability.

#### Galvanic Skin Response (GSR)

Measures
 electrical
 changes on the
 skin when
 sweat glands
 activate—linked
 to mental and
 physical fatigue.

#### EEG

 Measures brain electrical activity; fatigue increases slowwave activity and reduces alertnessrelated brain rhythms.





#### Photo plethysmography (PSG)

 A light-based sensor in smartwatches that tracks blood flow, used to infer fatigue-related cardiovascular changes.

#### Skin Temperature (ST)

 Peripheral temperature drops slightly when fatigued.

## Accelerometer (ACC)

 Detects body motion; fatigue causes small tremors and decreased posture control.

#### **ECG**

 Records the heart's electrical signals; fatigue reduces heart rate variability and alters cardiac rhythm patterns.





# Electro myography (EMG)

Measures
 muscle electrical
 activity; fatigue
 reduces muscle
 tone and
 increases small
 tremors.

# Blood Pressure (BP)

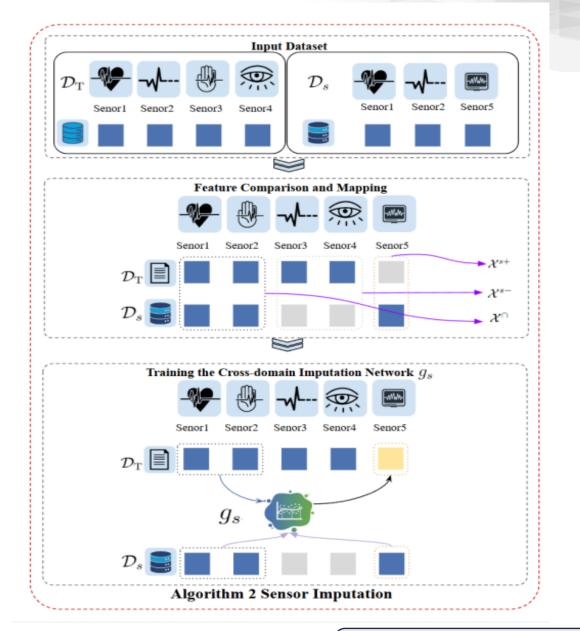
Monitors
 vascular
 pressure;
 prolonged fatigue
 can lower blood
 pressure and
 affect autonomic
 regulation.

# Facial Features (FACE)

 Uses video to track yawning, eyelid drooping, and facial muscle relaxation strong behavioral markers of drowsiness.









# Al learns missing sensors



# Al reconstructs EEC/ECG



Accurate fatigue detention with wearable only





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#### COMPARISON OF AN ACCURACY FOR CLASSIFYING FATIGUE LEVELS WITH THE STATISTICAL ANALYSIS AMONG THE CONVENTIONAL MODELS AND THE PROPOSED MODEL.

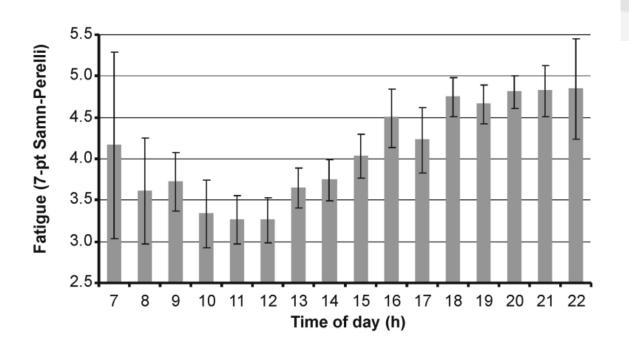
Subject	PSD-SVM [19]	DeepConvNet [20]	EEGNet [21]	MFB-CNN [22]	Proposed
S1	0.7008	0.7312	0.7618	0.7826	0.8519
S2	0.7033	0.7403	0.7774	0.7926	0.8841
S3	0.6315	0.7716	0.8003	0.8153	0.8796
S4	0.7157	0.7698	0.7997	0.8139	0.8706
S5	0.7558	0.8045	0.8506	0.8818	0.8799
S6	0.7344	0.8191	0.8529	0.8783	0.9404
<b>S</b> 7	0.6069	0.7206	0.7601	0.7841	0.8626
S8	0.7408	0.7988	0.8126	0.8316	0.8912
S9	0.7256	0.7792	0.7991	0.8211	0.9003
S10	0.6819	0.7534	0.7879	0.8006	0.8406
Avg.	0.6997	0.7689	0.8002	0.8202	0.8801
Std.	0.0478	0.0327	0.0320	0.0353	0.0278
<i>p</i> –value	< 0.05	< 0.05	< 0.05	< 0.05	-

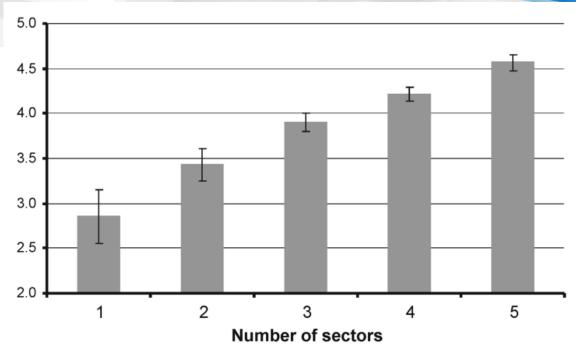
The Proposed Model was able to score at an average of 88% of all the cases of Fatigue

Lee et al., 2024









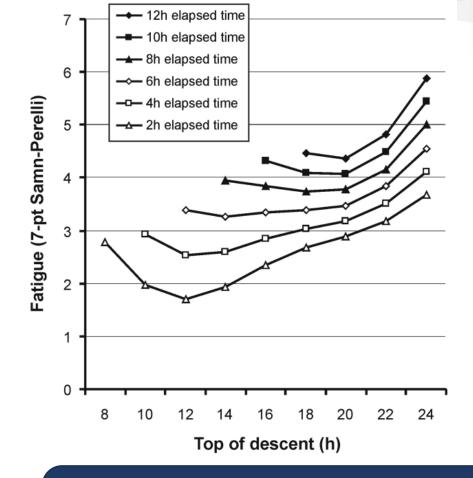
Circadian Effects and Workload Effects on Fatigue

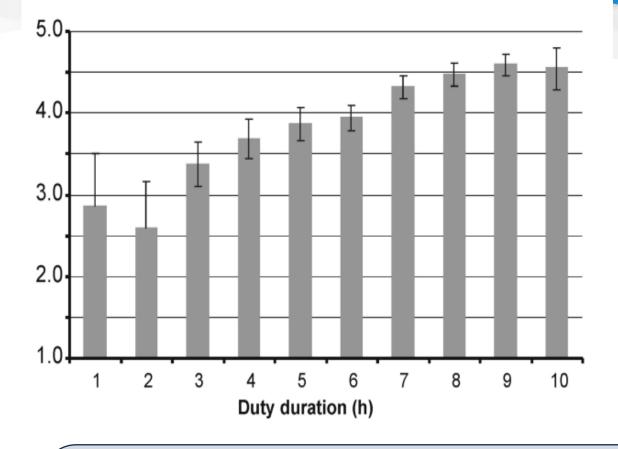
(Powell et al., 2007)

- Fatigue is **lowest around midday** and rises steadily, reaching its **highest levels in the evening**.
- Each additional sector adds cumulative workload, leading to progressively higher fatigue.









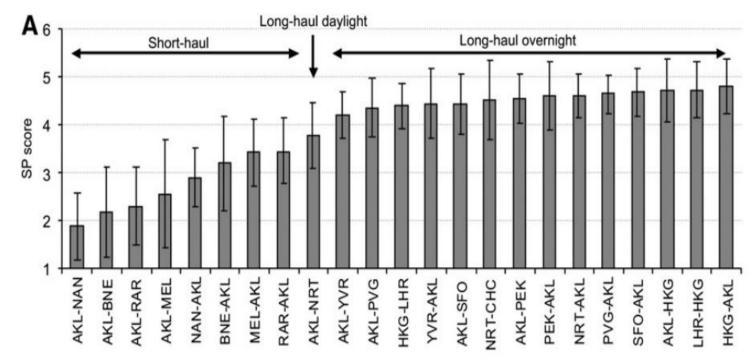
# Fatigue vs Duty Length & Time of Day

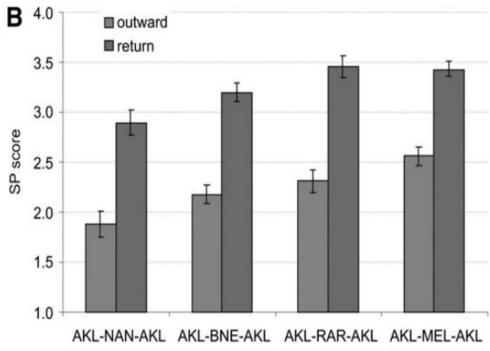
(Powell et al., 2007)

- Fatigue rises steadily as duty time increases, becoming notable after 6–8 hours.
- Fatigue is higher when top-of-descent occurs later in the day, especially after 18:00.
- The highest fatigue levels occur when long duties finish in the late evening.









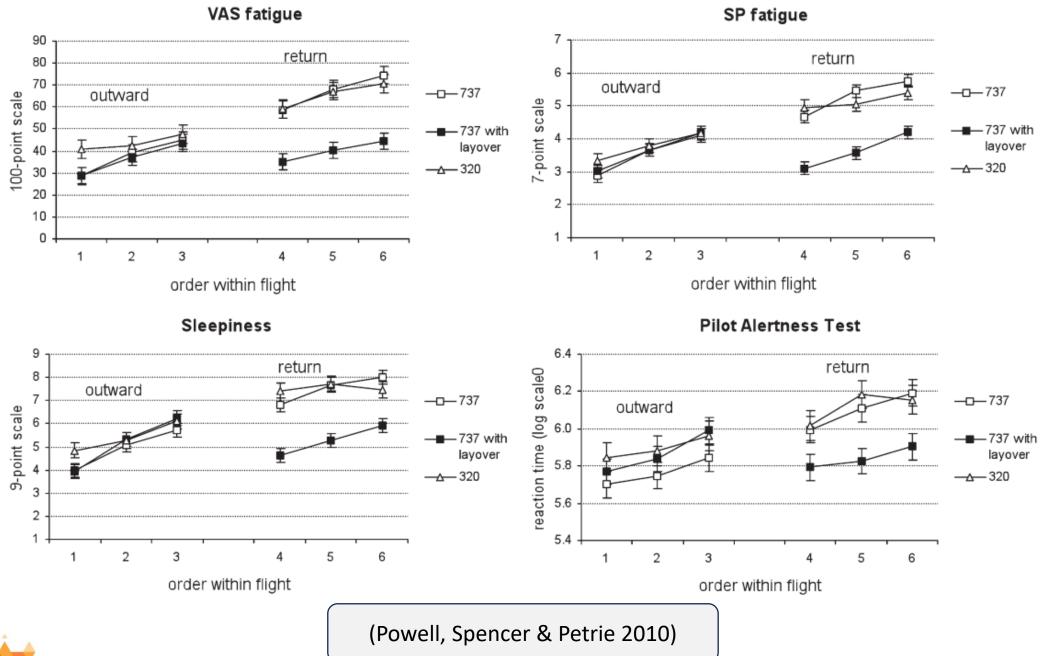
### Fatigue Patterns Across Routes and Duty Sectors

(Powell et al., 2011)

- Short-haul daylight flights show the lowest fatigue.
- Long-haul overnight flights produce the highest fatigue levels.
- Return sectors consistently show greater fatigue than outbound sectors.
- Circadian timing (night vs day) strongly influences fatigue,
   even when flight duration is similar.



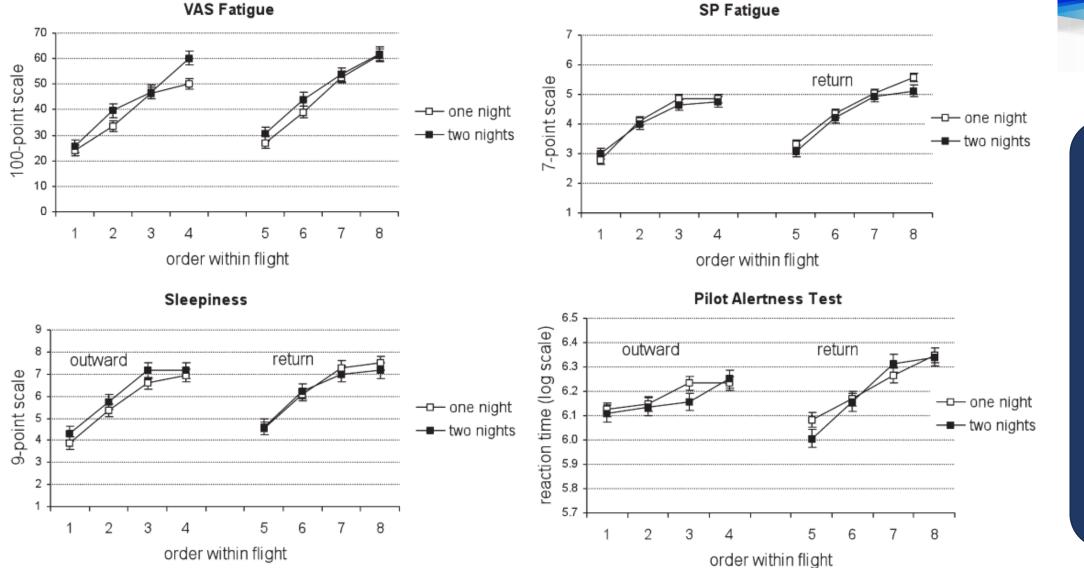




Impact of
Layover
on Pilot
Fatigue
and
Alertness







One vs Two **Nights** Layover: No Difference in Long-**Haul Pilot** Fatigue

(Powell, Spencer & Petrie 2010)

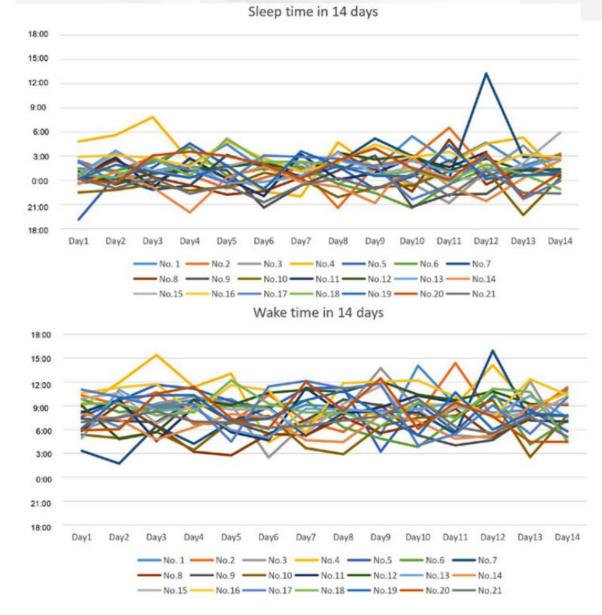




# EXTREME VARIABILITY IN PILOT SLEEP – WAKE PATTERNS

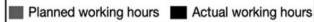
- No Pilot demonstrated a stable sleep wake pattern across 14 days
- Bedtimes & wake times vary by up to 7
   hours
- Irregular schedules destroy circadian stability
- Results: chronic fatigue & impaired alertness

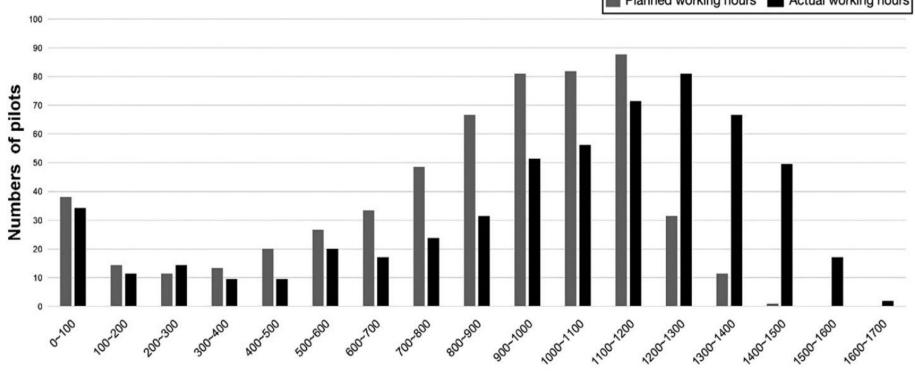
(Yang et al., 2024)











ACTUAL PILOT
WORKING
HOURS EXCEED
PLANNED LIMITS

Annual working hours (h)

- Actual hours significantly higher than planned across most pilots
- Many pilots accumulate 1200–1500 hours/year
- Actual duty hours reveal hidden fatigue exposure

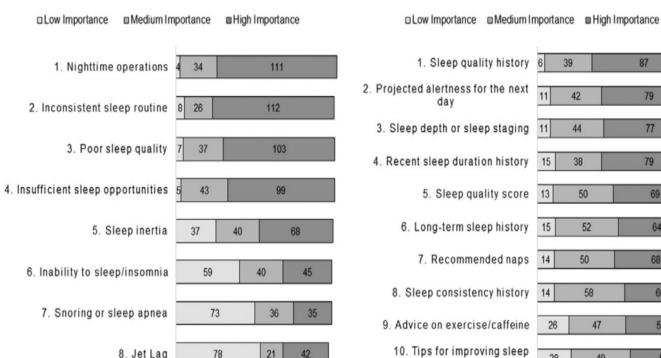
(Yang et al., 2024)





#### WHAT AIRCREW SAY DRIVES FATIGUE AND THE **INFORMATION** THEY WANT

- Night operations = biggest fatigue driver
- Inconsistent routines disrupt alertness
- **Quality of sleep** matters more than hours



A Perceived Importance of Sleep Issues to Performance B

Perceived Importance of Information About Sleep



(Devine, Choynowski & Hursh, 2024)





MAXIMUM DAYS SAFE	MAXIMUM DA	YS WORKED		% PILOTS WHO BUILD	
MEDIAN*	MEDIAN*	RANGE	% PILOTS EXCEEDING THEIR OWN LIMIT	BACK-TO-BACK ROTATIONS	
6	8	4-15	67.6%	10.1%	
8.5	8	4-19 <sup>†</sup>	27.5%	34.3%	
5	7	4-26	68.8%	8.2%	
5	7	3-18	71.2%	14.0%	
14	12	7-14	6.3%	43.8%	
7	6	3-15	55.6%	18.9%	
7	8	4-16	48.1%	18.8%	
7	9	4-22	49.6%	18.4%	
5	7	4-23 <sup>‡</sup>	75.9%	11.5%	
	6 8.5 5 5	MEDIAN*         MEDIAN*           6         8           8.5         8           5         7           5         7           14         12           7         6           7         8	MEDIAN*         MEDIAN*         RANGE           6         8         4-15           8.5         8         4-19†           5         7         4-26           5         7         3-18           14         12         7-14           7         6         3-15           7         8         4-16           7         9         4-22	MEDIAN*         MEDIAN*         RANGE         **PILOTS EXCEEDING THEIR OWN LIMIT           6         8         4-15         67.6%           8.5         8         4-19†         27.5%           5         7         4-26         68.8%           5         7         3-18         71.2%           14         12         7-14         6.3%           7         6         3-15         55.6%           7         8         4-16         48.1%           7         9         4-22         49.6%	

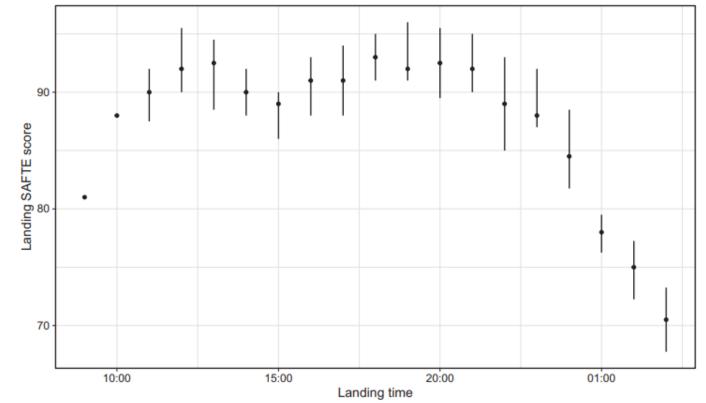
Pilots Often
Work Beyond
Their Safe
Rotation Limits

- Short-haul pilots tolerate 5–6 days but often work longer.
- Most pilots (60–76%) exceeded their own fatigue limits.
- B747 pilots manage long rotations and rarely exceed limits.
- Few pilots choose back-to-back rotations except A330/B747 crews.

(Gander et al., 2018)



#### SAFTE score at time of landing vs landing time



- SAFTE (Sleep, Activity, Fatigue, and Task Effectiveness Model)
- Is a biomathematical model that predicts a person's cognitive effectiveness (0–100%) based on their sleep, circadian rhythm, and sleep pressure.

### RAPID DECLINE IN SAFTE AFTER 22:00

- Pilot cognitive performance decreases progressively after 22:00.
- Past midnight, SAFTE consistently signals operational fatigue risk.
- These effects occur even when pilots have adequate sleep.
- Highlights need for FRMS in night operations.

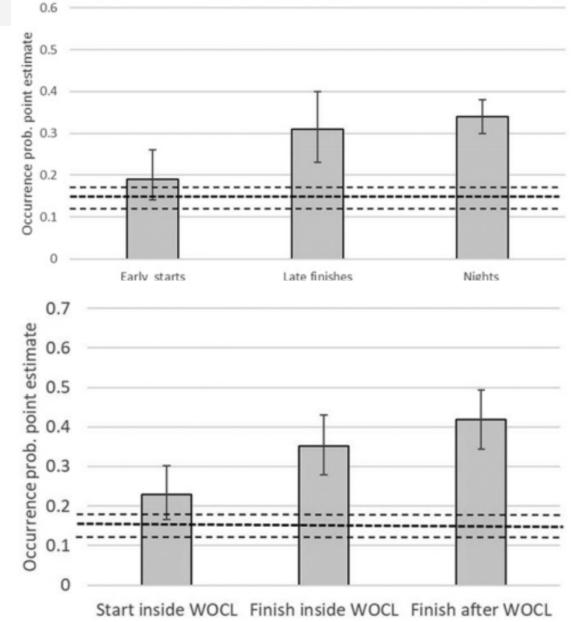
(Pelham et al., 2025)



# FATIGUE PATTERNS ACROSS DUTY TYPES

- Night and late-finish duties show the highest fatigue (~0.4)
- Early starts only slightly increase fatigue compared to day duties.
- Fatigue is highest when flights finish after the Window of Circadian Low (WOCL).
- WOCL timing—not duty length—is the strongest predictor of fatigue.

(Sallinen et al., 2020)









#### **Controlled Rest**



Caffeine +Naps

COUNTER MEASURES THAT WORKS



Light Exposure



Scheduling Reforms



Pre-flight sleep strategies



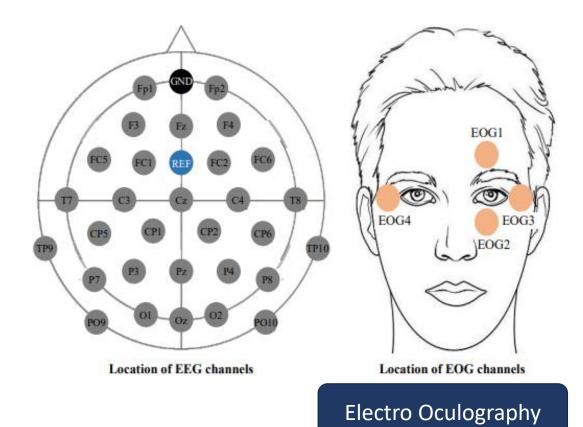
FRMS integration in SMS

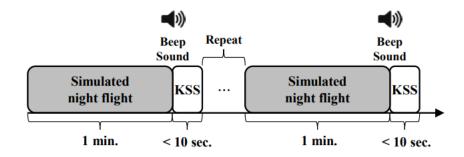
(Sharma, 2024) & (Wingelaar-Jagt et al., 2021)





## Fatigue Induction Protocol in Simulated Night Flight





– level 1: extremely alert

- level 2: very alert

- level 3: alert

– level 4: rather alert

- level 5: neither alert nor sleepy

- level 6: some signs of sleepiness

– level 7: sleepy, but no difficulty remaining alert

- level 8: sleepy, some effort to keep alert

– level 9: extremely sleepy

Karolinska Sleepiness Scale





SLEEP INERTIA SEVERITY AND DURATION 3-15 mins

Most Severe Impairment

First 30 mins

Significant Impairment

30 – 60 mins

Full recovery

- Some cases take over 1 hour to normalize
- Deep Sleep and Sleep debt prolong impairment







FACTORS
AFFECTING
SLEEP
INERTIA



Prior sleep loss

Waking at the

circadian low

Unpredictable

awakenings



Waking from deep sleep



Long prior wakefulness



Sleep Disorders

Accuracy

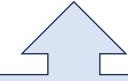
Impairing



Attention



High Level Executive Functions



Decision Making
Tactical Planning
Multitasking
Problem Solving





# INTERVENTIONS BEFORE FLIGHT

#### Be fit to fly

- Treat sleep apnea, insomnia, restless legs.
- These conditions worsen sleep inertia by increasing baseline sleepiness.

#### Avoid Sleep Debt

 Increasing sleep duration in nights before duty reduces risk.

#### Sleep Education

 Educating pilots on sleep cycles, circadian rhythms, and nap strategy.

## Limit Wakefulness

 Example: take an afternoon nap before a night duty.





# INTERVENTIONS BEFORE NAP PERIOD

#### DO RISK ASSESSMENT

- Risk factors include:
- long nap
- night-time nap
- unpredictable waking
- sleep debt

#### Nap outside Circadian Night

If possible:

 naps in
 daytime or
 early night
 produce less
 inertia.

#### Anticipate Wake- Ups

 Wake 15 min before duty to give buffer time.

## Use Progressive Alarms

 Light-based or soundbased gradual alarms reduce abrupt wakeups.

#### For High Risk

- Take caffeine before nap (caffeine-nap strategy)
- Nap <30 min to avoid deep sleep





# INTERVENTIONS AFTER NAP PERIOD

## Take Caffeine (60-80mg)

 Quickest and strongest countermeasure.

#### Physical Exercise

Increases
 sympathetic
 activity →
 improves
 alertness.

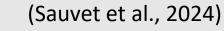
## Exposure to bright light

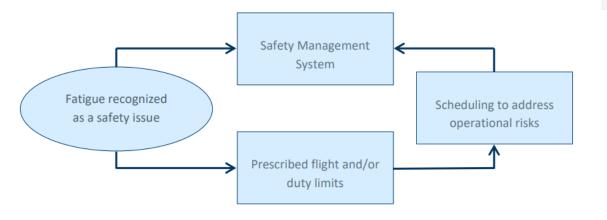
Improves
 alertness,
 though effect on
 performance
 may vary.

## Operational Briefing

Increase
 situational
 awareness
 before resuming
 control.

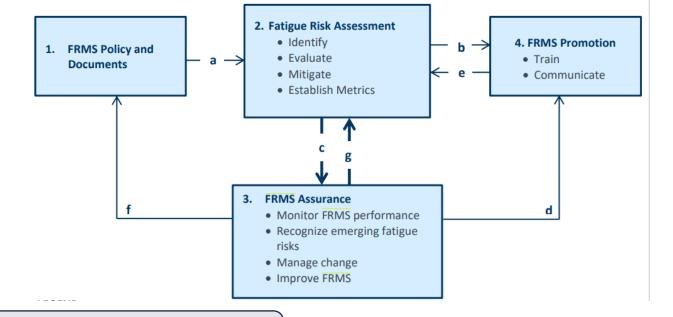
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# Evolution of Fatigue Management in Aviation

- Traditional approach uses fixed Flight Time & Duty Time Limits (FTL).
- FRMS allows data-driven scheduling to manage fatigue risk.





(ICAO, 2020)



Implemented FRMS software/system	Number of airlines	Percentage (%)
SAFTE/SAFTE-FAST	12	38,7%
Jeppesen Concert	8	25,8%
Internal FRMS (various versions)	8	25,8%
NASA Alertness Solutions + other models	2	6.5%
SIRA + biomodels	1	3.2%

### Global Distribution of FRMS Tools Used by Airlines

- FRMS improves safety through data-driven fatigue prediction.
- SAFTE-FAST leads globally in reducing fatigue risks.
- FRMS outperforms FTL by identifying fatigue before it becomes a threat.





No.	Airline	Name of FRMS system/software	Year of implem entation	Advantages	Efficiency study/analysis	Obtained results
1	JetBlue	NASA Alertness Solutions	2006	Fewer operational errors	Study in Journal of Occupational and Environmental Medicine	~30% fewer errors
2	easyJet	SIRA + biomodels	2009	Less fatigue reports by pilots, reduced fatigue risk	HILAS project / easyJet FRMS case study	93% pilots less fatigued
3	Lufthansa	SAFTE-FAST	2010	Reduced fatigue risk on long-haul flights	Lufthansa FRMS internal study	Fewer delays and incidents
4	British Airways	SAFTE-FAST + internal system	2012	Reduced crew fatigue and incidents	British Airways FRMS Evaluation	Reduced fatigue incidence
5	KLM	SAFTE-FAST	2012	More efficient crew scheduling, reduced fatigue	KLM FRMS Performance Review	15% reduction in fatigue-related events
				<u>U</u> ,		6
6	Qantas	Internal FRMS + SAFTE biomodel	2013	Better roster management and reduced fatigue	Qantas Fatigue Risk Management Review	Improved efficiency and safety
6 7	Qantas Singapore Airlines		2013 2013	Better roster management	_	Improved efficiency and
6 7 8	Singapore	SAFTE biomodel		Better roster management and reduced fatigue Reduced fatigue and	Management Review Singapore Airlines	Improved efficiency and safety Higher crew satisfaction,
7	Singapore Airlines	SAFTE biomodel SAFTE-FAST	2013	Better roster management and reduced fatigue Reduced fatigue and increased productivity Decreased fatigue-related	Management Review Singapore Airlines FRMS internal review SAS FRMS Safety	Improved efficiency and safety Higher crew satisfaction, less fatigue 25% fewer fatigue-

Impact of FRMS
Across
Major
Airlines

(Bartulović & Grgić, 2025)





11	Virgin Atlantic	Internal FRMS + biomodel	2014	Improved safety culture, better fatigue awareness	Virgin Atlantic FRMS Safety Study	Improved reporting and awareness
12	TAP Air Portugal	SAFTE-FAST	2014	Improved roster management, decreased fatigue	TAP Air Portugal FRMS Safety Study	22% reduction in fatigue-related incidents
13	Emirates	Jeppesen Concert	2015	Fewer fatigue complaints and improved safety	Emirates FRMS implementation report	Improved crew performance
14	Korean Air	Internal FRMS + SAFTE biomodel	2015	Reduced fatigue and improved roster management	Korean Air FRMS Analysis	30% reduction in fatigue
15	Aer Lingus	Jeppesen Concert	2015	More balanced rosters, reduced fatigue levels	Aer Lingus FRMS Pilot Survey	30% reduction in fatigue symptoms
16	Air France	Internal FRMS + Jeppesen Concert	2015	Improved roster optimization, better fatigue risk control	Air France FRMS Program Review	20% reduction in fatigue

(Bartulović & Grgić, 2025)

Impact of FRMS Across Major Airlines





No.	Airline	Name of FRMS system/software	Year of implem entation	Advantages	Efficiency study/analysis	Obtained results
17	Etihad Airways	Jeppesen Concert	2015	Enhanced fatigue monitoring and reporting	Etihad Airways FRMS Implementation Report	20% decrease in fatigue incidents
18	Delta Air Lines	Internal FRMS + NASA biomodel	2016	Increased awareness and fewer incidents	Delta Air Lines FRM Analysis	Significant reduction in fatigue reports
19	Air Canada	Jeppesen Concert	2016	Improved safety and crew satisfaction	Air Canada FRMS Safety Study	Improved safety
20	Air New Zealand	Jeppesen Concert	2016	Reduced fatigue reports, better roster flexibility	Air New Zealand FRMS Effectiveness Study	~25% reduction in fatigue reports
21	Philippine Airlines	SAFTE-FAST	2016	Improved crew alertness, reduced errors	Philippine Airlines FRMS Study	20% fewer fatigue incidents
22	Japan Airlines	Internal FRMS system	2017	Increased safety, fatigue reporting	JAL Fatigue Risk Management Program	Increased reporting and incident reduction
23	Alaska Airlines	NASA SAFTE- FAST	2017	Better crew efficiency and reduced fatigue	Alaska Airlines Fatigue Management Study	Improved crew efficiency
24	Turkish Airlines	SAFTE-FAST	2017	Enhanced alertness, fewer fatigue-related errors	Turkish Airlines FRMS Implementation Review	20% reduction in errors
25	Avianca	Jeppesen Concert	2017	Better fatigue risk controls, less fatigue complaints	Avianca FRMS Implementation Review	25% reduction in fatigue symptoms
26	Ryanair	Internal FRMS	2018	Reduced fatigue on short- haul flights	Ryanair FRMS Pilot Survey	25% reduction in subjective fatigue

Year of

Impact of FRMS
Across
Major
Airlines

(Bartulović & Grgić, 2025)









Predictive Fatigue Assessment



Training and Education



Supporting irregular operations.



Optimizing rest/napping strategies



Support FRMS decisions beyond prescriptive FTL.



Compare duty rosters and identify high-risk fatigue windows.



Individual Fatigue Prediction e.g. phone apps



Can be used in Safety Investigations

(IATA, n.d.)









