

#### **Seminar in NTNU**



#### Our recent research...

**Dr. Baoping CAI** 

25 November 2016, Trondheim, Norway



#### Personal profile



#### **Dr. Baoping CAI**

- ➤ Associate professor in China University of Petroleum
- > "Hong Kong Scholar" researcher in City University of Hong Kong

#### **Research interests:**

- > Reliability engineering
- > Fault diagnosis
- Risk analysis
- > Bayesian networks methodology
- > Bayesian networks application
- Resilience



#### **Contents**

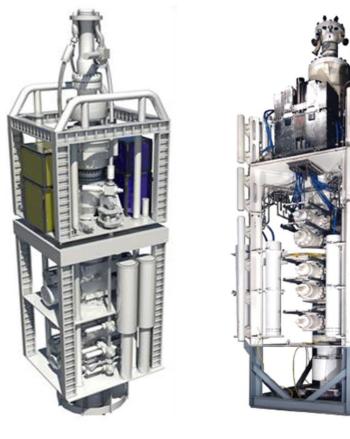


- **▶1. Subsea systems**
- >2. Reliability methodology
- >3. Fault diagnosis methodology





#### 1.1. Subsea BOP system





Hydril

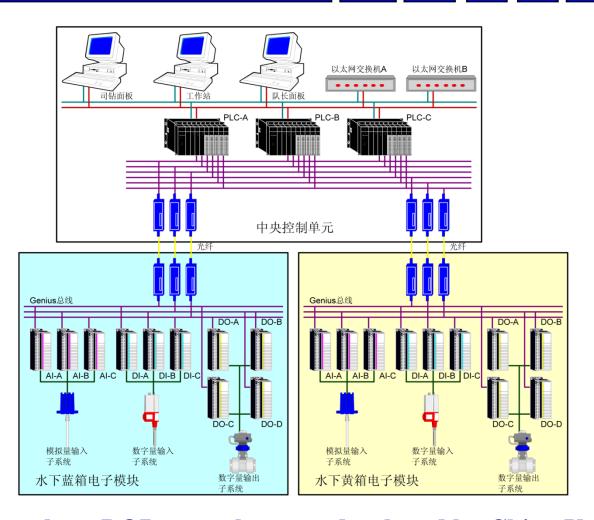


**NOV** 

**Deepwater subsea BOP systems** 



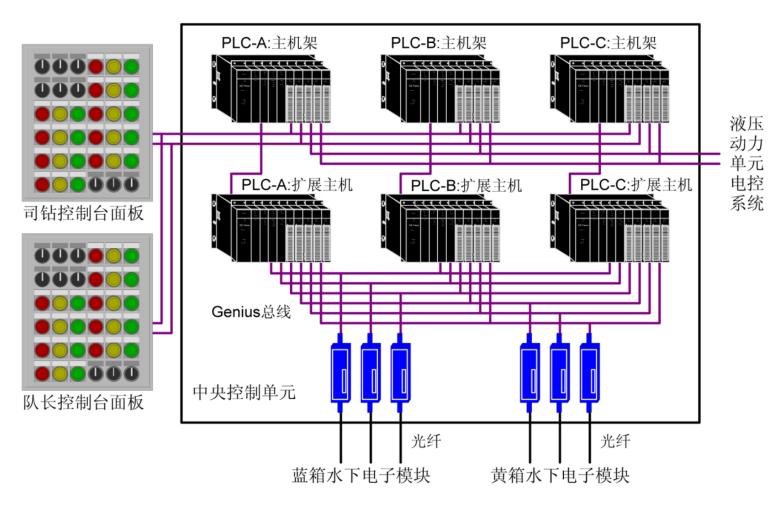




3000 m subsea BOP control system developed by China University of Petroleum (Cai, ISA, 2012)



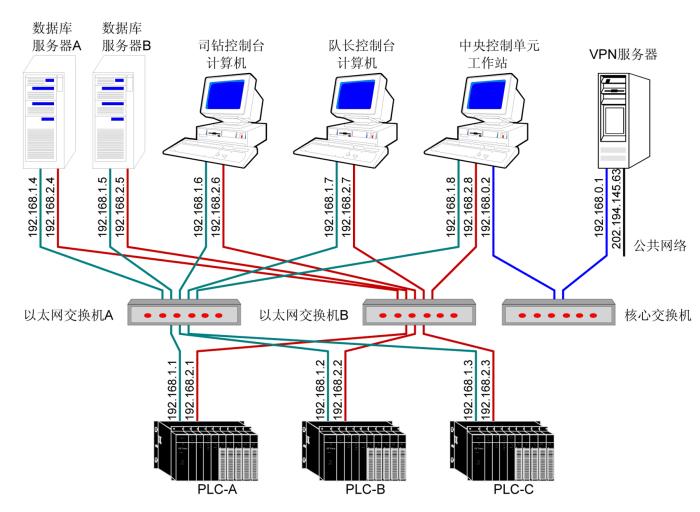




System configuration of triple redundant controller



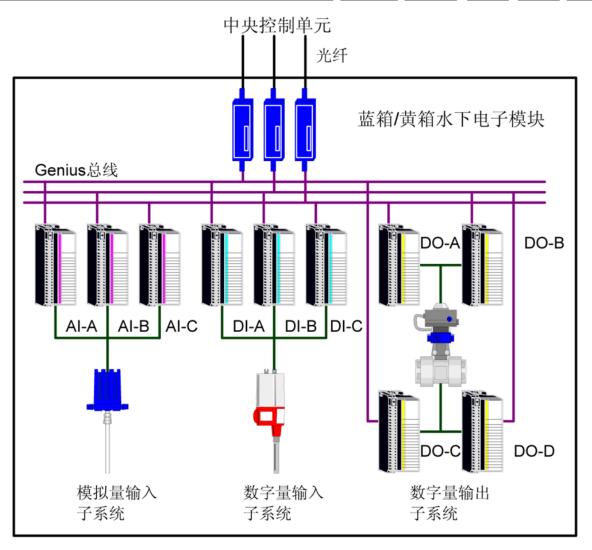




Architecture of dual redundant Ethernet.







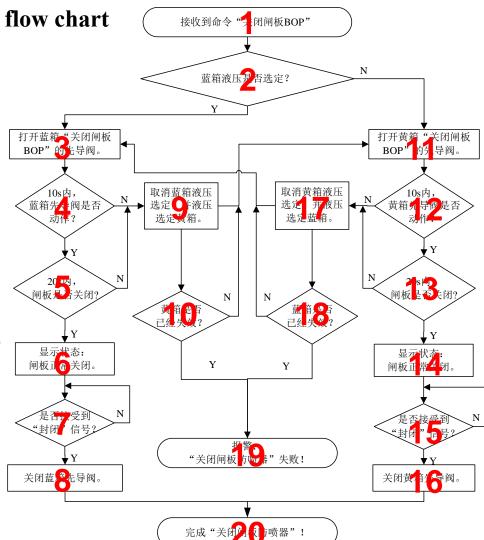
Subsea electronic module (SEM)





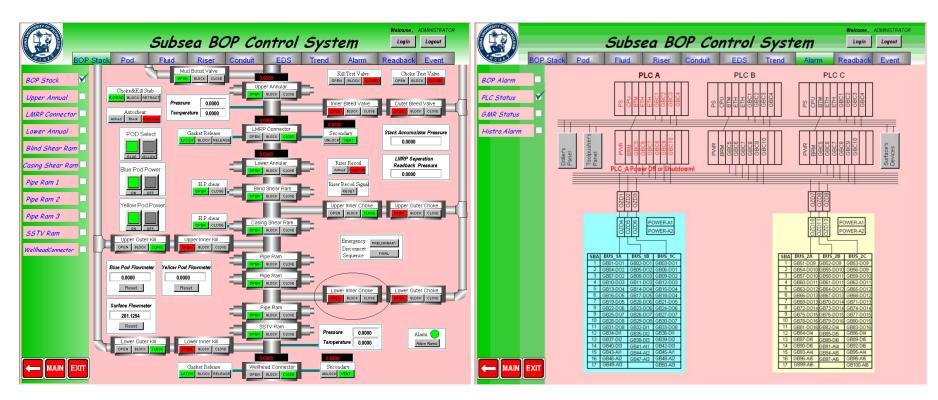
#### "Turn off ram BOP" control logical flow chart

- ✓ 1. Receive the order "turn off flashboard BOP".
- ✓ 2. Is the hydraulic pressure chosen?
- ✓ 3. Turn on the pilot valve "turn off flashboard BOP" in blue box.
- ✓ 4. Whether the pilot valve in blue box take action in 10 seconds.
- ✓ 5. Whether the flashboard turn off in 20 seconds.
- ✓ 6. Display status: the flashboard turns off normally.
- ✓ 7. Whether receive the "turn off" signal.
- **✓ 8. Turn off pilot valve in blue box.**
- ✓ 9. Cancel blue box hydraulic pressure and choose yellow box.
- ✓ 10. Whether the yellow box loses efficacy.
- ✓ 11. Turn on the pilot valve "turn off flashboard BOP" in yellow box.
- √ 12. Whether the pilot valve in yellow box take action in 10 seconds.
- **✓** 13. Whether the flashboard turn off in 20 seconds.
- ✓ 14. Display status: the flashboard turns off normally.
- ✓ 15. Whether receive the "turn off" signal.
- ✓ 16. Turn off pilot valve in yellow box.
- √ 17. Cancel yellow box hydraulic pressure and choose blue box.
- ✓ 18. Whether the blue box loses efficacy.
- ✓ 19. Alarm: "turn off flashboard BOP" fails!
- ✓ 20. Complete "turn off flashboard BOP"!







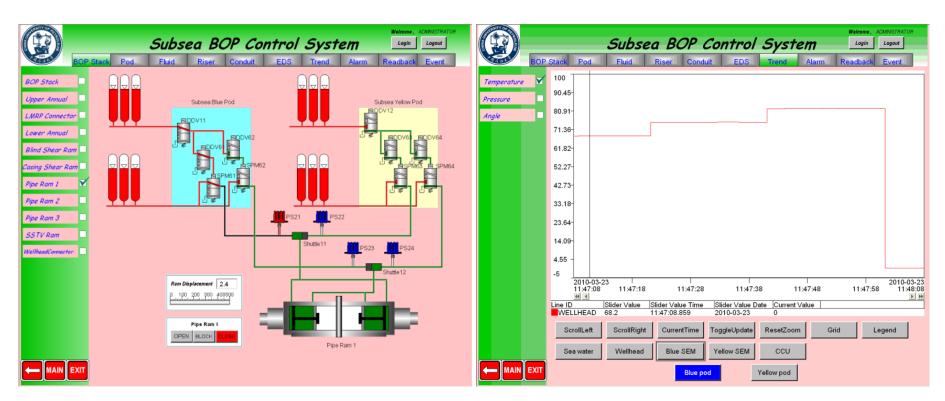


Subsea BOP stacks main control screen

**PLC** screen





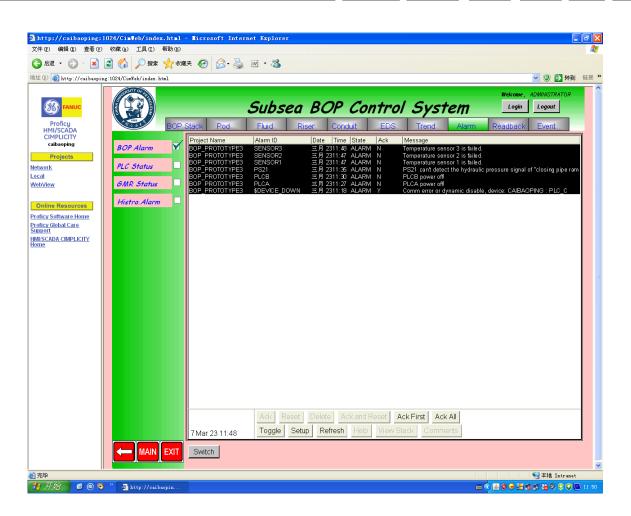


Pipe ram control screen

Data screen





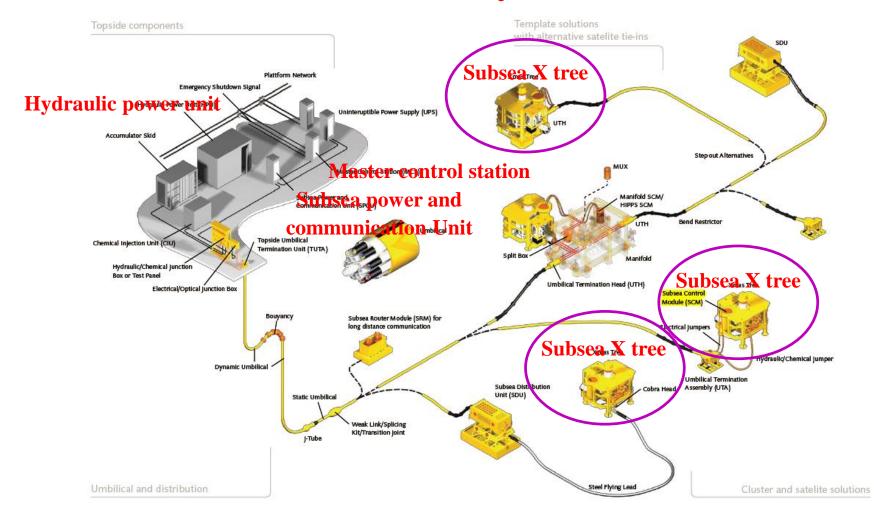


Remote monitoring alarm screen





#### 1.2. Subsea all-electric tree system











Electro-hydraulic tree by One Subsea

All-electric tree by Cameron





#### 1.3. Subsea X tree test system



Liuhua 11-1/4-1 oil filed in South China Sea





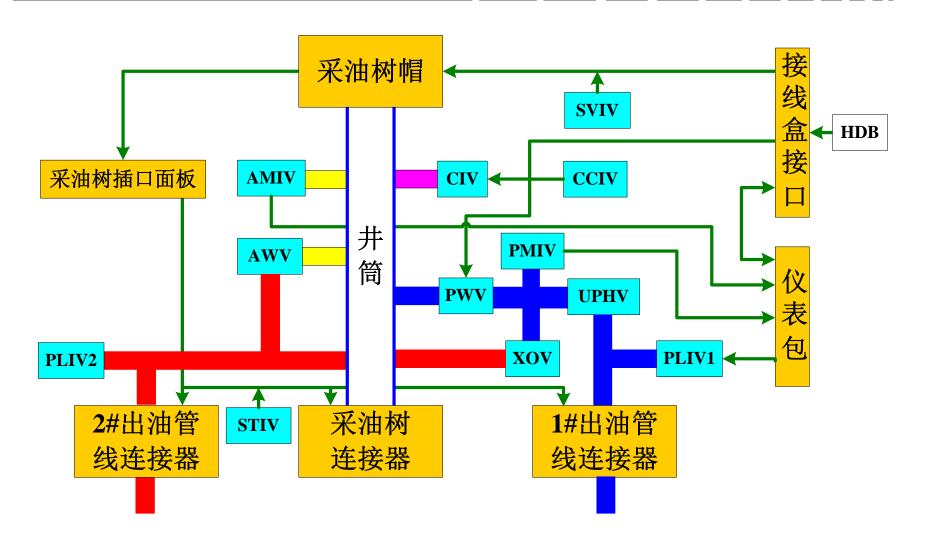
#### 1.3. Subsea X tree test system



Subsea hydraulic tree in Liuhua 11-1 oil







Schematic diagram of the subsea X tree





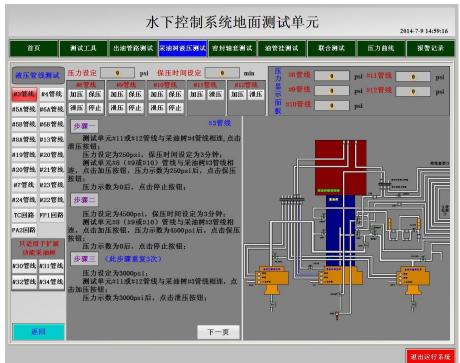


Control system of the subsea X tree test platform









Screen of the subsea X tree test system



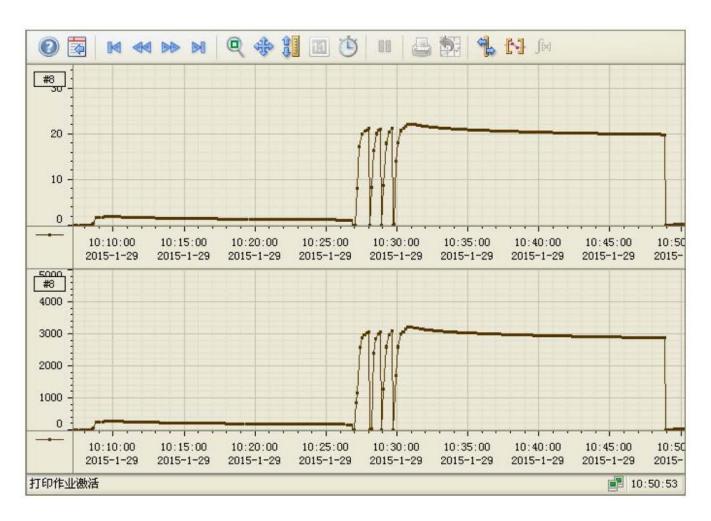




Screen of the subsea X tree test system







Detected pressure trend for a certain pipeline



#### **Contents**



**≻1. Subsea systems** 

- >2. Reliability methodology
- >3. Fault diagnosis methodology





#### What can BNs do?

✓ BN can perform forward or predictive analysis as well as backward or diagnostic analysis.

#### **Forward:**

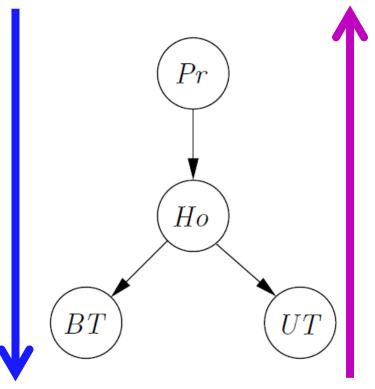
**Predictive** 

Such as:

> Reliability

> Risk

> Safety



#### **Backward:**

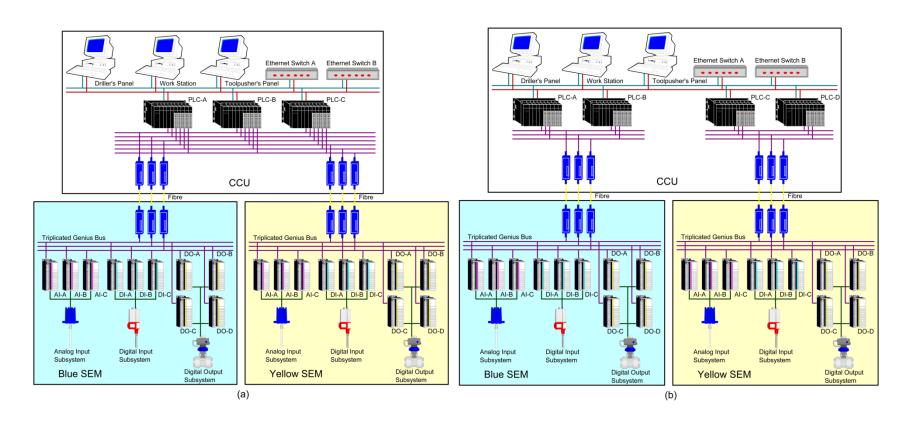
**Diagnostic** 

Such as:

- > Fault diagnosis
- Disease diagnosis



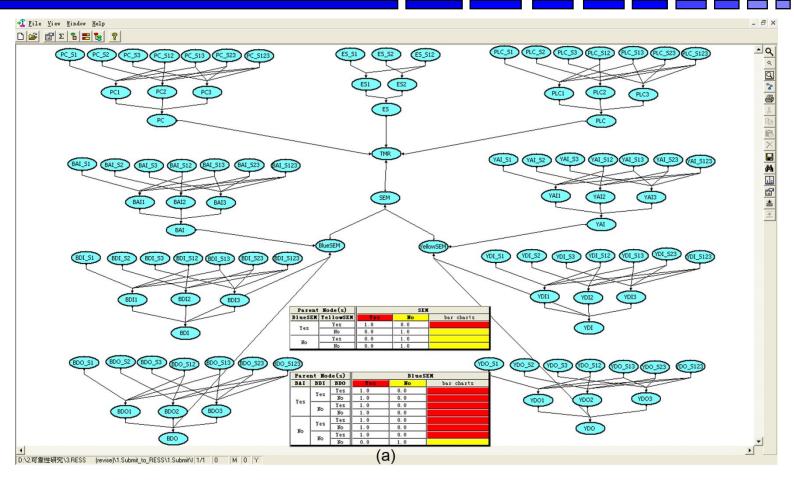




Configurations of Triple Modular Redundancy (TMR) and Double Dual Modular Redundancy (DDMR) control systems for subsea BOP



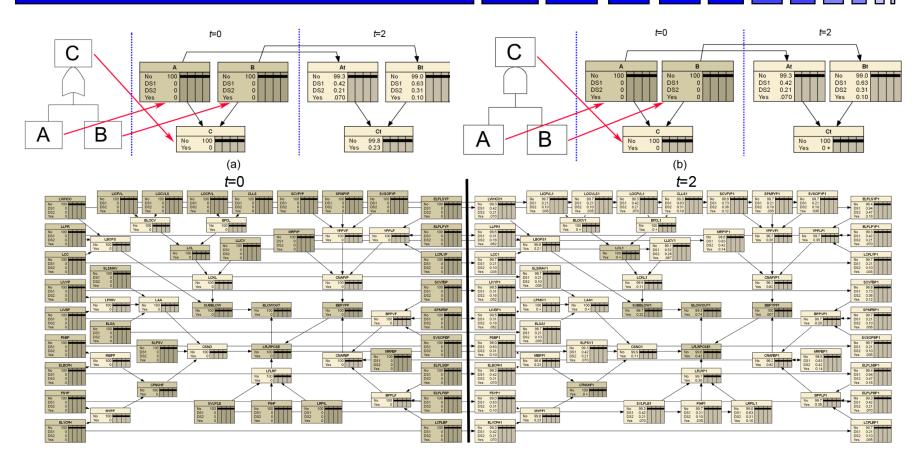




Using Bayesian networks in reliability evaluation for subsea blowout preventer TMR and DDMR control system, taking account of common cause failure and imperfect coverage (Cai, RESS, 2012).



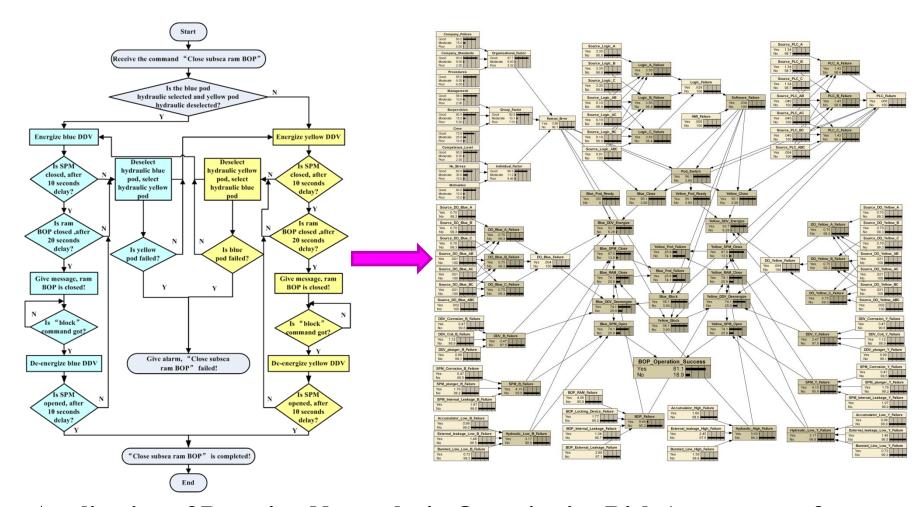




Performance evaluation of subsea BOP/control systems using dynamic Bayesian networks with imperfect repair and preventive maintenance (Cai, ESWA, 2012; Cai, EAAI, 2012)





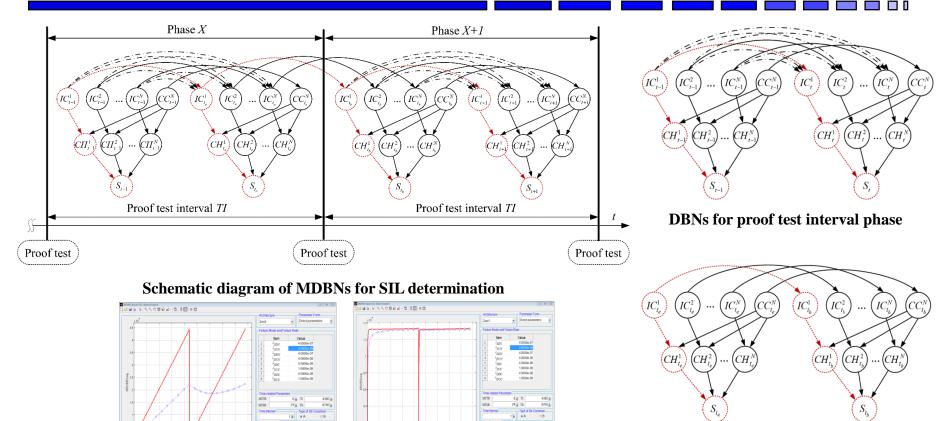


Application of Bayesian Networks in Quantitative Risk Assessment of Subsea Blowout Preventer Operations (Cai, RA, 2013)





DBNs for proof test phase



A multiphase dynamic Bayesian networks methodology for the determination of safety integrity levels (Cai, RESS, 2016)





#### Reliability Modeling and Evaluation of Subsea Blowout Preventer Systems

Yonghong Liu Baoping Cai Renjie Ji Zengkai Liu Yanzhen Zhang



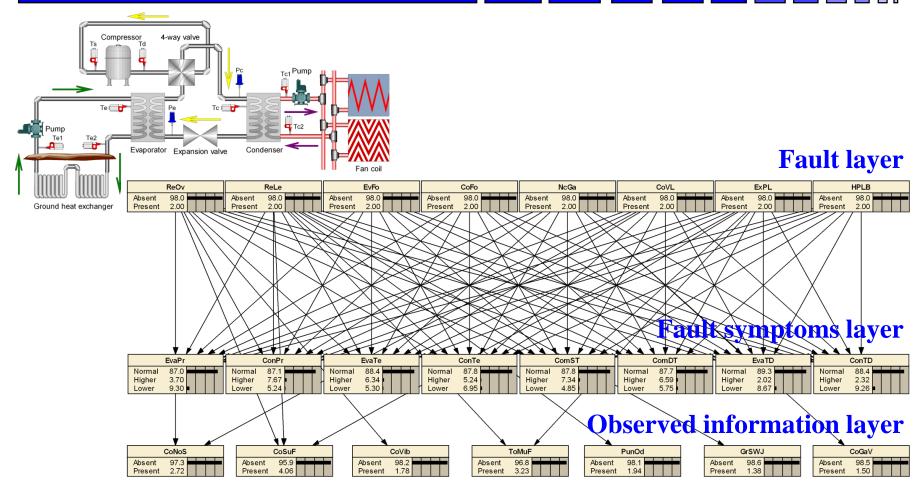


#### **Contents**



- **▶1. Subsea systems**
- **≥2.** Reliability methodology
- **≻3. Fault diagnosis methodology**





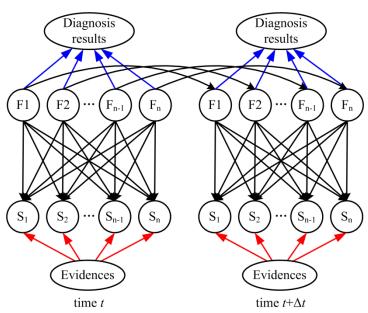
Structure of BNs for FD of ground-source heat pump (Cai, APEN, 2014)



#### 3. Types of BNs for FD

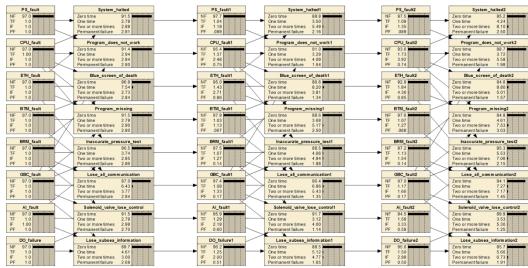


#### 3.2. DBNs for fault diagnosis



DBN-based fault diagnosis model for GMR control systems (Cai, TASE, 2016) Given same fault symptoms, the diagnostic result may be totally different in different time periods because of the performance degradation of components.

In other words, a new system is more likely to work well than an aged system in a next time point if it works well at present time. It can increase the accuracy and reliability of fault diagnosis by involving the dynamic and temporal features in fault diagnosis models.

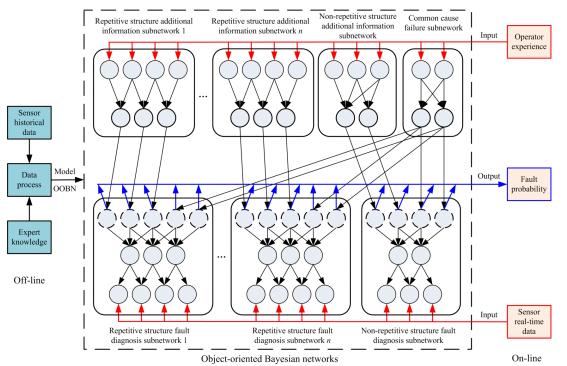




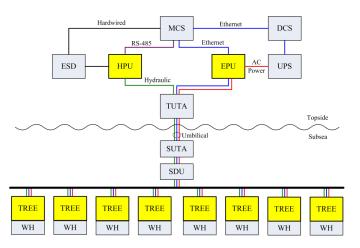
#### 3. Types of BNs for FD



#### 3.3. OOBNs for fault diagnosis



Object-oriented-BN-based fault diagnosis modeling methodology (Cai, MSSP, 2016)

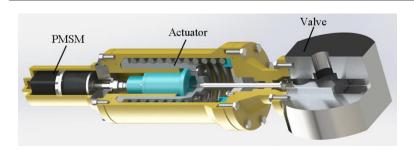


#### OOBNs have the following advantages:

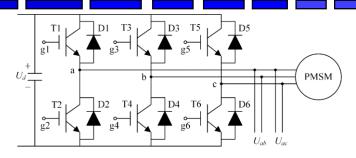
- (1) supports top-down model construction process;
- (2) are constructed by integrating small and understandable network fragments, benefiting knowledge acquisition and communication between modelers and domain experts;
- (3) reduces the complexity of building BNs, and improves the reusability of models;
- (4) have high average rate of convergence and time efficiency thanks to the characteristic of encapsulation and hierarchy.



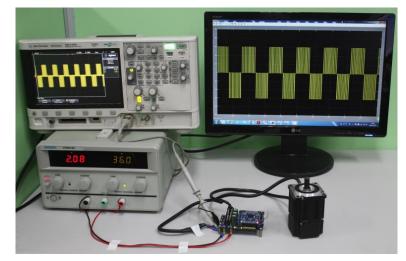
# 2. Procedures of FD with BNscityl



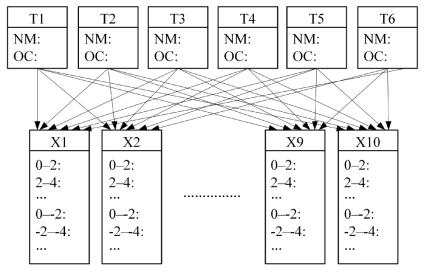
Subsea electric actuator



Topology of a typical three-phase inverters



**Experimental setup of the PMSM drive** system



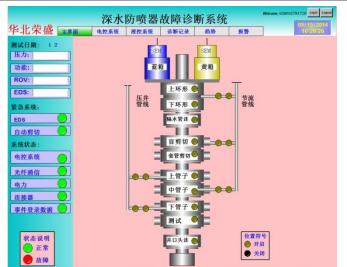
Two-layers BNs for fault diagnosis

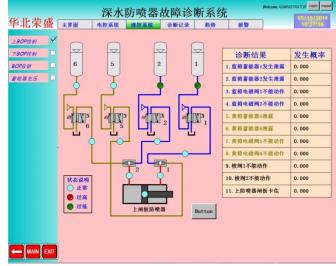
A Data-Driven Fault Diagnosis Methodology in Three-Phase Inverters for PMSM Drive Systems (Cai, TPE, 2016)

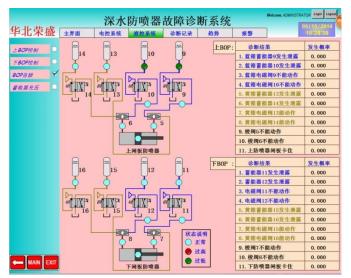


### 3. Fault diagnosis











Subsea BOP fault diagnosis system



### 3. Fault diagnosis



#### **Future research directions of FD:**

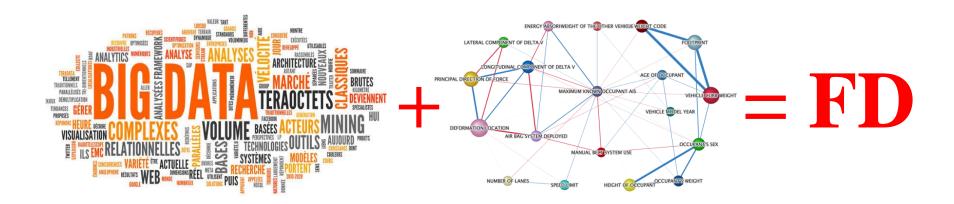
- 1. Integrated big data and BNs FD methodology
- 2. BN-based non-permanent FD
- 3. Fast inference algorithms of BNs for on-line FD
- 4. BNs for closed-loop control system FD
- 5. Fault identification rules

Based the submitted review paper (Cai, TII)



# 6. Future research directions City

#### 6.1. FD methodology integrated big data and BNs



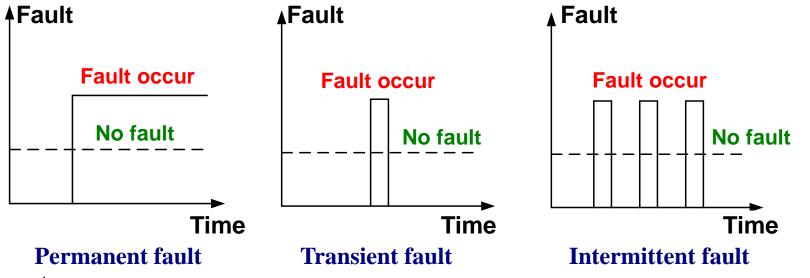
#### Two important parts:

- ✓ Fault feature extraction method from big data;
- **✓** BN-based fault diagnosis method using theses fault features.



# 6. Future research directions City

#### **6.2. BN-based non-permanent FD**

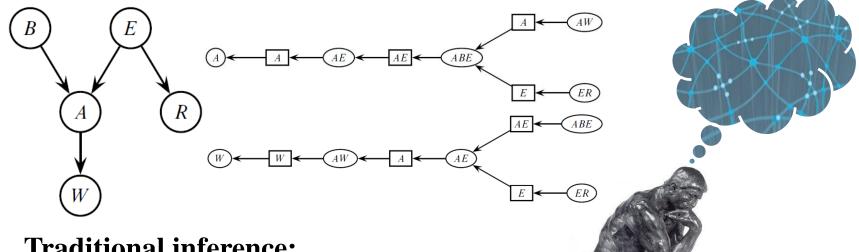


- How to:
- ✓ Analyze the nature and the root causes;
- **✓** <u>Identify the failed components</u>;
- ✓ <u>Distinguish the fault type using BN-based FD.</u>



# 6. Future research directions CityU

#### 6.3. Fast inference algorithms of BNs for on-line FD



#### **Traditional inference:**

- Becomes increasingly expensive;
- Costs lots of time;
- Hardly perform real-time FD.

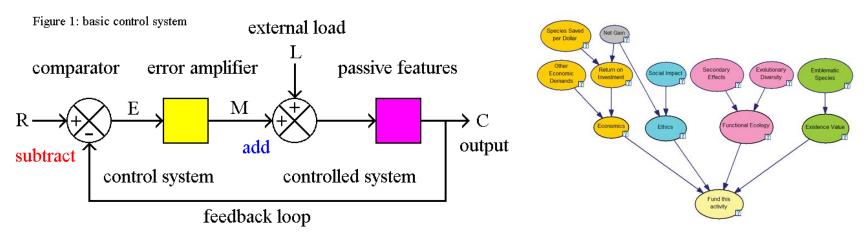
#### It is necessary to:

✓ <u>Develop fast approximate inference algorithms of BNs for on-</u> line FD.



# 6. Future research directions City

#### 6.4. BNs for closed-loop control system FD



closed-loop control system

BN: acyclic directed graph

#### How to:

- ✓ Establish the FD models of closed-loop feedback control systems with acyclic directed BNs
- ✓ Investigate the effects of control algorithm on FD



### 6. Future research directions

#### 6.5. Fault identification rules



False alarm rate is a significant assessment indicator for fault diagnosis, and high false alarm rate cannot be accepted by users of industrial systems.

#### **Developing:**

- ✓ Suitable fault identification rules for a certain system, by
  - using posterior probability directly
  - integrated prior and posterior probability

