

# THE IMPACT OF SIGNAL MODEL DATA COMPRESSION FOR TDOA/FDOA ESTIMATION

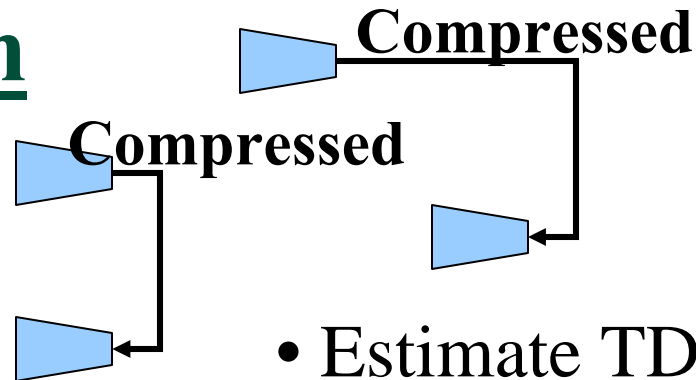
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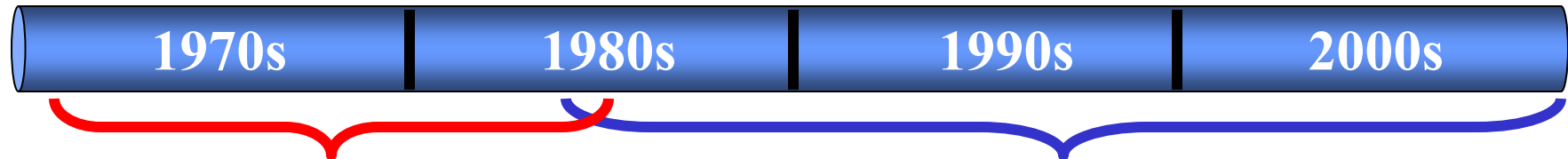
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# The Problem

Source  

- Estimate TDOA/FDOA for Pairs
- Use TDOA/FDOA to Locate



## Sonar-Driven Research

Hann, Tretter, Knapp, Carter,  
Schultheis, Weinstein, Etc.

## Radar/Comm-Driven Research

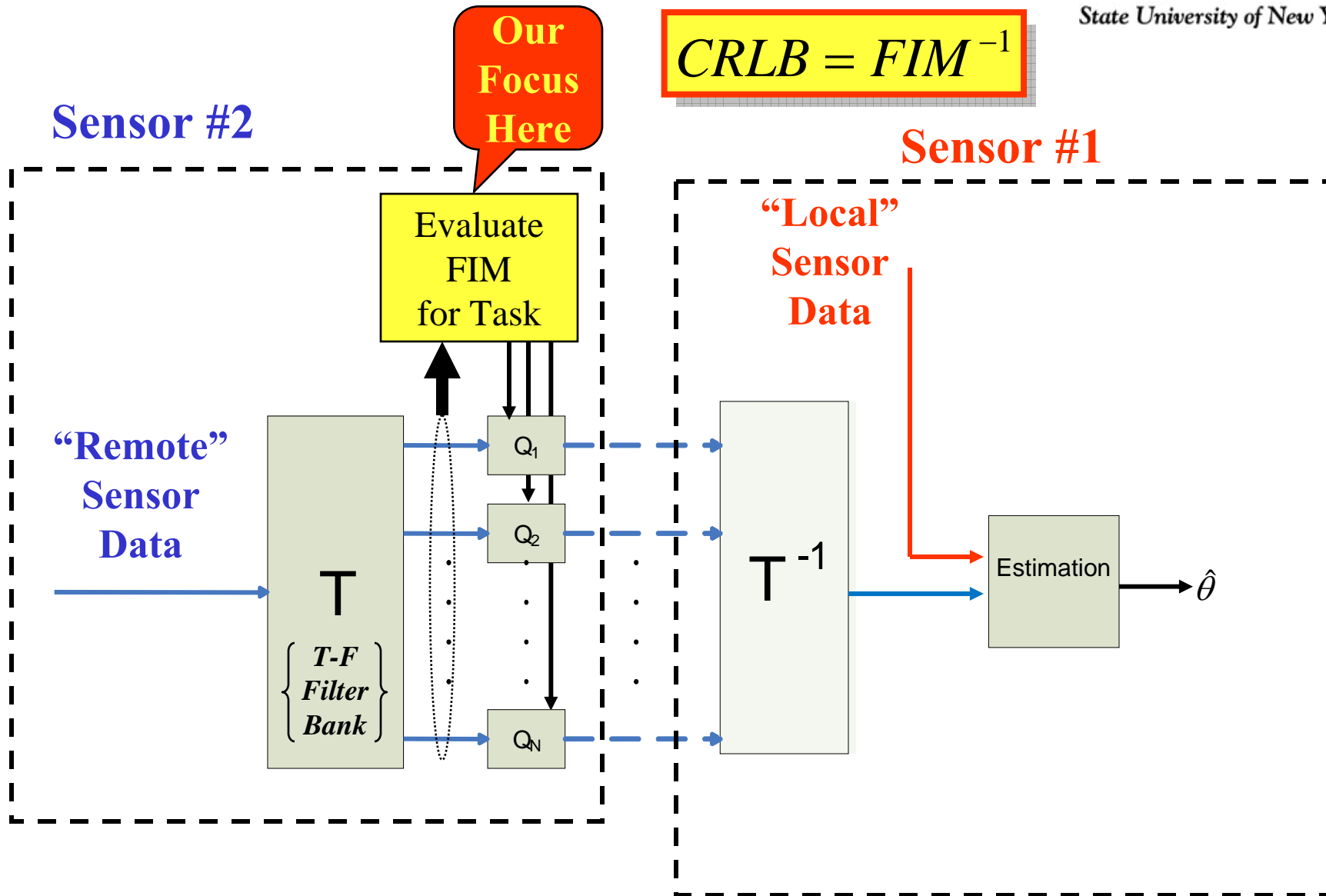
Stein, Chestnut, Berger, Blahut,  
Torrieri, Etc.

**Question: How much of the Sonar TDOA/FDOA estimation work can be carried over to the Radar/Comm arena??**

**Answer: Not as much as many Radar/Comm researchers/practitioners think!**

# Compression Framework

$$CRLB = FIM^{-1}$$



# Signals: Sonar vs. Radar/Comm

Two sampled passively-received complex-valued baseband signals:

$$r_1[n] = s(nT - \tau_1)e^{j\nu_1 nT} + w_1[n]$$
$$r_2[n] = s(nT - \tau_2)e^{j\nu_2 nT} + w_2[n]$$

## Noise Model

- Zero-mean WSS processes
- Gaussian
- Independent of each other

This much is the same for each case...

At least when the narrowband approximation can be used...  
which we assume here so we can focus on the impact of  
differences in the statistical model.

# Models: Sonar vs. Radar/Comm

## • Passive Sonar

- Signal = Sound from Boat
- Erratic signal behavior
- **Model as Random Process**
  - Zero-mean WSS
  - Gaussian
  - Independent of Noise
- Expected values taken over signal + noise ensemble
  - Estimation accuracy is average over all possible noises and signals

## • Passive Radar/Comm

- Signal = Pulse Train
- Structured signal behavior
- **Model as Deterministic**
  - Specific pulse shape
  - Pulse width & spacing
- Expected values taken over only noise ensemble
  - Estimation accuracy is average over all possible noises for one specific signal

# PDFs: Sonar vs. Radar/Comm

- For both cases the received data vector... is Gaussian.
- But how TDOA/FDOA is embedded is very different.

**This is the key... it impacts significant differences in:**

- Fisher Info Matrix (FIM) / Cramer-Rao Bound (CRB)
- ML Estimator Structure

## Passive Sonar PDF:

$$p_{ac}(\mathbf{r}; \boldsymbol{\theta}) = \frac{1}{\det(\pi \mathbf{C}_{\boldsymbol{\theta}})} \exp\{-\mathbf{r}^H \mathbf{C}_{\boldsymbol{\theta}}^{-1} \mathbf{r}\}$$

TDOA/FDOA in  
Covariance

## Passive Radar/Comm PDF

$$p_{em}(\mathbf{r}; \boldsymbol{\theta}) = \frac{1}{\det(\pi \mathbf{C})} \exp\{-(\mathbf{r} - \mathbf{s}_{\boldsymbol{\theta}})^H \mathbf{C}^{-1} (\mathbf{r} - \mathbf{s}_{\boldsymbol{\theta}})\}$$

TDOA/FDOA in  
Mean

# FIM/CRB: Sonar vs. Radar/Comm

- For general Gaussian case the elements of the FIM:

$$[J_{gg}]_{ij} = 2 \operatorname{Re} \left( \left[ \frac{\partial \boldsymbol{\mu}_\theta}{\partial \theta_i} \right]^H \mathbf{C}_\theta^{-1} \left[ \frac{\partial \boldsymbol{\mu}_\theta}{\partial \theta_j} \right] \right) + \operatorname{tr} \left( \mathbf{C}_\theta^{-1} \frac{\partial \mathbf{C}_\theta}{\partial \theta_i} \mathbf{C}_\theta^{-1} \frac{\partial \mathbf{C}_\theta}{\partial \theta_j} \right)$$

- Leads to VERY different forms for the two cases:

## Passive Sonar FIM:

$$[J_{sonar}]_{ij} = \operatorname{tr} \left( \mathbf{C}_\theta^{-1} \frac{\partial \mathbf{C}_\theta}{\partial \theta_i} \mathbf{C}_\theta^{-1} \frac{\partial \mathbf{C}_\theta}{\partial \theta_j} \right)$$

Difficult to assess... usually use “Whittle’s Theorem”  
Depends on Covariance Sensitivity to Parameter

## Passive Radar/Comm FIM:

$$[J_{radar}]_{ij} = 2 \operatorname{Re} \left( \left[ \frac{\partial \mathbf{s}_\theta}{\partial \theta_i} \right]^H \mathbf{C}^{-1} \left[ \frac{\partial \mathbf{s}_\theta}{\partial \theta_j} \right] \right)$$

Easy to numerically assess...  
Depends on Signal Sensitivity to  
Parameter

# Impact of FIM: Sonar vs. Radar

- Because the forms are different... any sonar-case result is unlikely to carry over to radar-case:

- **Passive Sonar**

- TDOA and FDOA Estimates are Uncorrelated
  - Holds under mild assumption of large BT

- **Passive Radar/Comm**

- TDOA and FDOA Estimates are Correlated

$$[\mathbf{J}_{em}]_{12} = 2 \operatorname{Re} \left\{ \frac{1}{\sigma_1^2} \sum_n -jnTs^*(nT - \tau_1)s'(nT - \tau_1) + \frac{1}{\sigma_2^2} \sum_n -jnTs^*(nT - \tau_2)s'(nT - \tau_2) \right\}$$

- This has an impact on data compression...

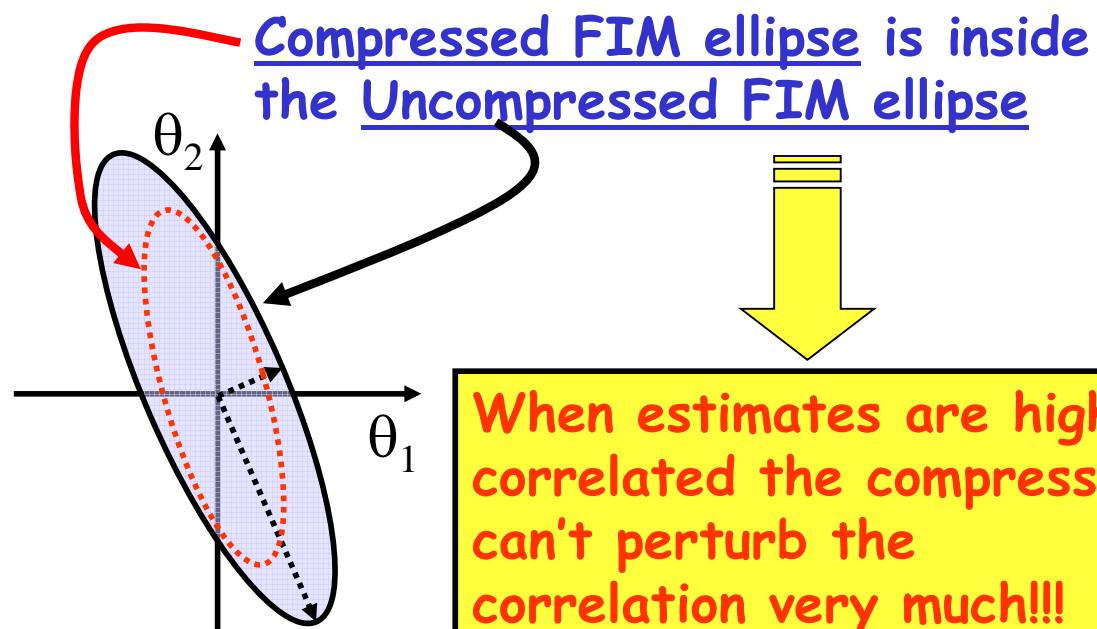


# Compression: Sonar vs. Radar/Comm

- Doing data compression for radar case we need to account for the non-zero off-diagonal FIM elements

Fowler/Chen ICASSP 2005

## The "Correlation Issue"

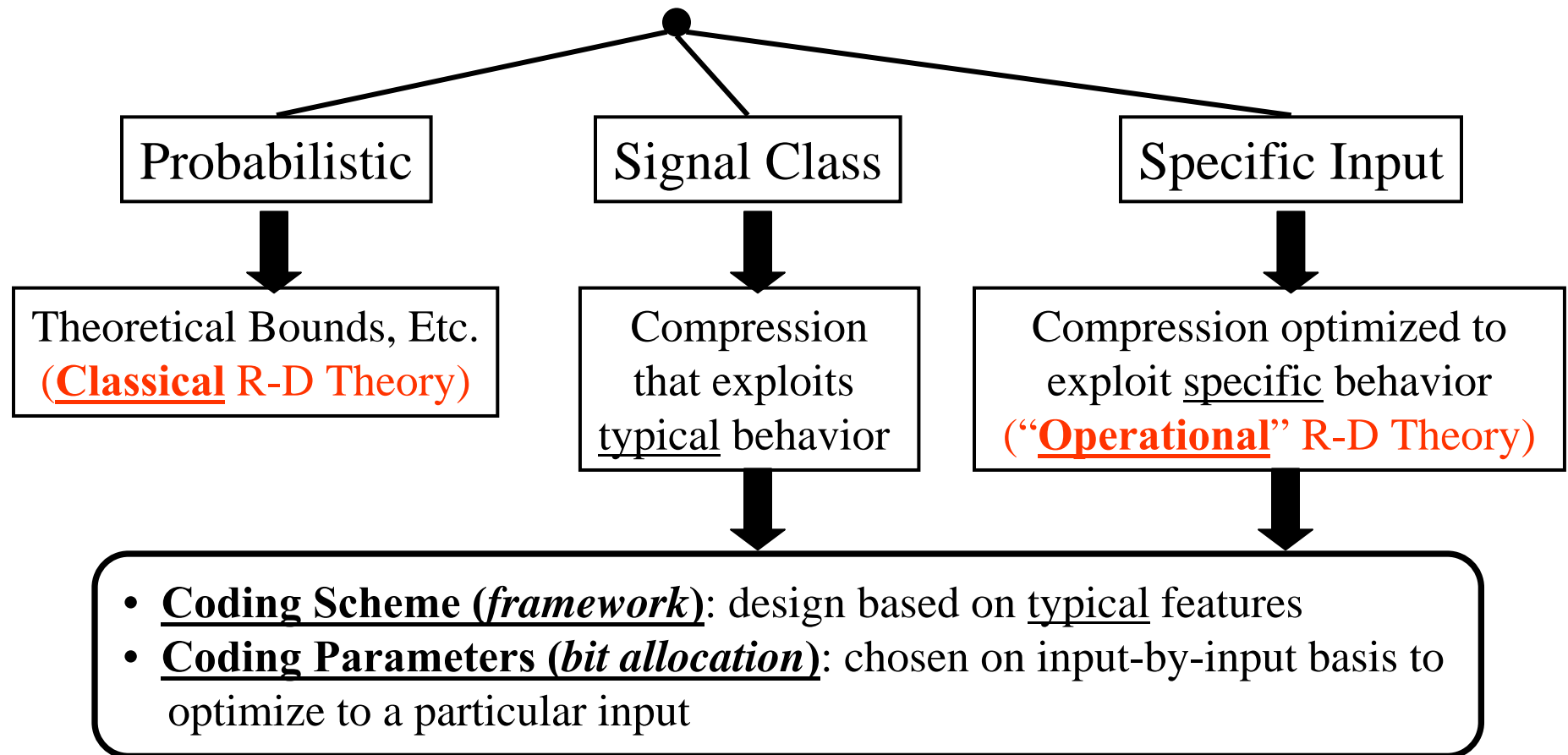


Fowler/Chen Sbmt. to T-AES

**Theorem:** For the transform coding framework outlined above, the post-compression FIM has an information ellipse that lies inside the original FIM ellipse .

# R-D Viewpoints

## Three Views of “Source”



**Operational R-D methods don't “care” what other possible realizations might occur “next time” – the only thing that matters is what does the data actually collected look like... → **Deterministic Signal Model!!!****

# Comments

The two signal models lead to important differences in the results for the FIM.

We have argued... regardless of the type of signal expected, when using the FIM as a distortion measure in an operational rate-distortion sense the signal should be viewed as deterministic.