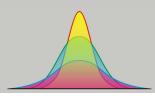
## 大话成像之

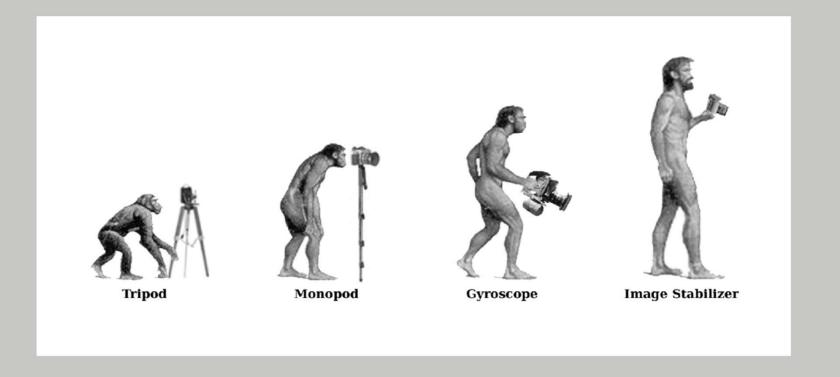
# 数字成像系统 32讲

图像防抖

Zhang Eric

imaging algorithm specialist staff camera engineer zxzombie@msn.com







## 拍照抖动引起的问题







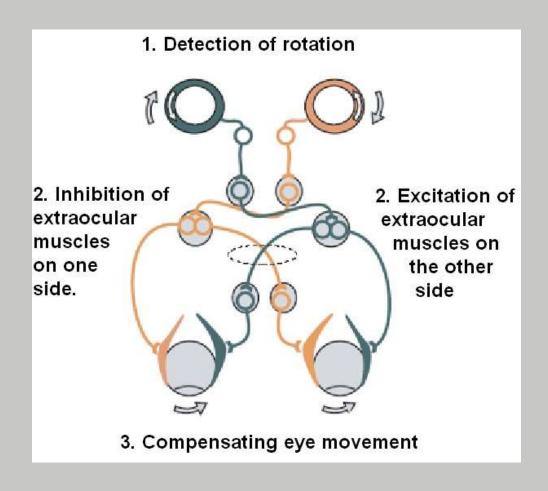


### 图像防抖的分类

- 光学防抖
  - 镜头移动
  - Sensor 移动
  - 两者一起移动
- 电子防抖
- 视频后处理过滤器
- 外置的防抖支架
- 防抖CCD



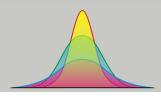
## 人眼的防抖方式



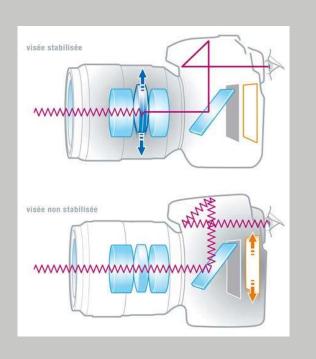


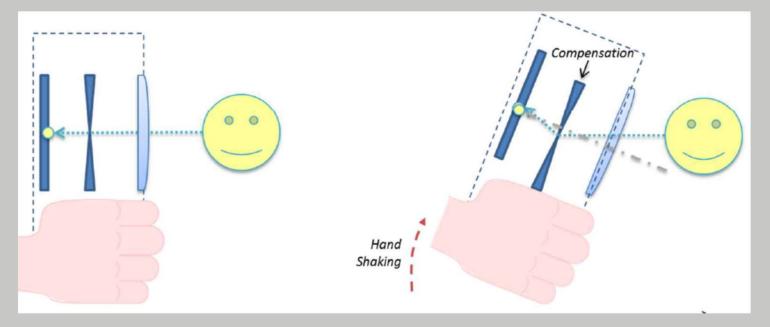


## 外置的稳像设备



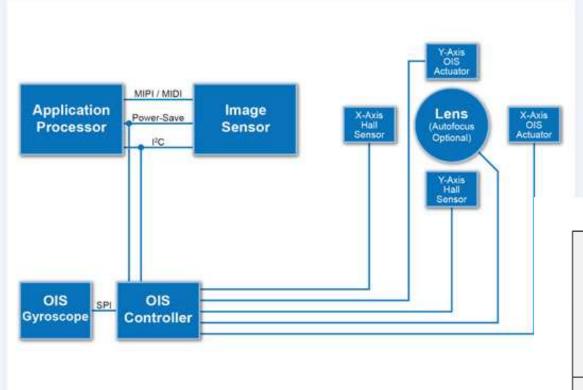
## 单反中的OIS

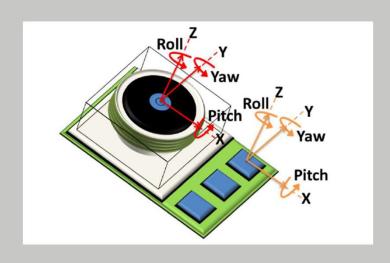


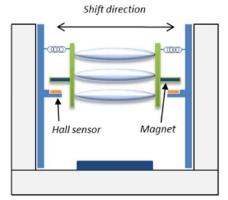


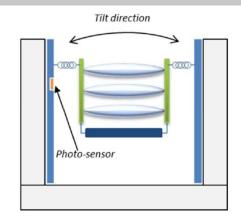


## 手机中的OIS模组





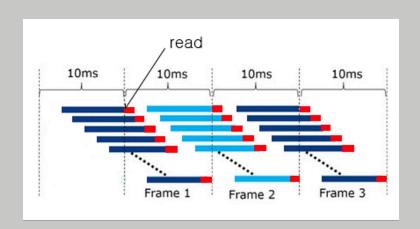


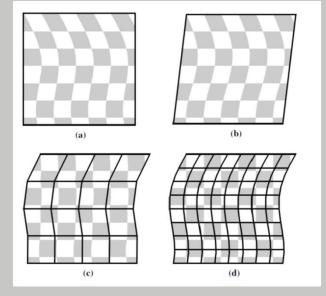


(a)

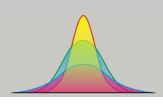
(b)

## 卷帘门效应

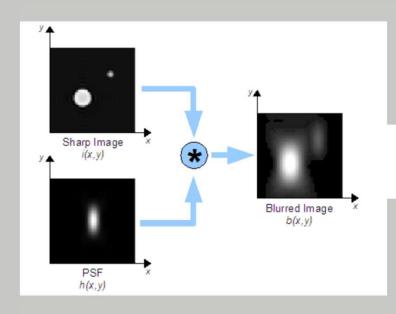








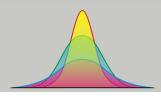
#### Motion Blur 模型



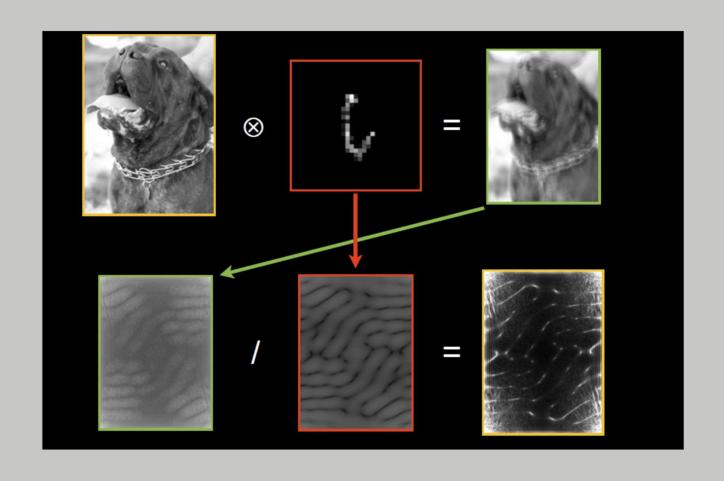
$$b(x,y)=i(x,y)*h(x,y)$$

$$b(x,y) = i(x,y) * h(x,y) + n(x,y) = \int_{-\infty}^{+\infty} \int_{-\infty}^{+\infty} i(\alpha,\beta)h(x-\alpha,y-\beta) \, d\alpha d\beta + n(x,y)$$

$$b_e(x,y) = \sum_{i=0}^{M-1} \sum_{j=0}^{N-1} ie(i,j)he(k-i,l-j) + ne(k,l)$$

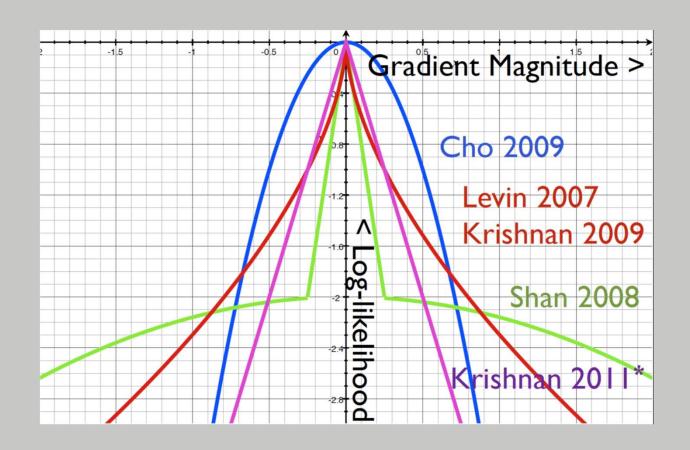


## 盲目解卷积



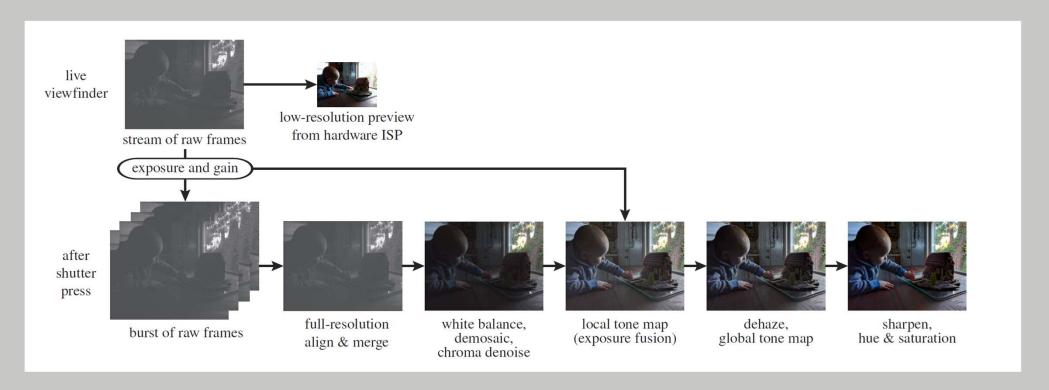


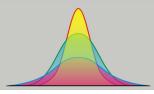
## PSF的估计



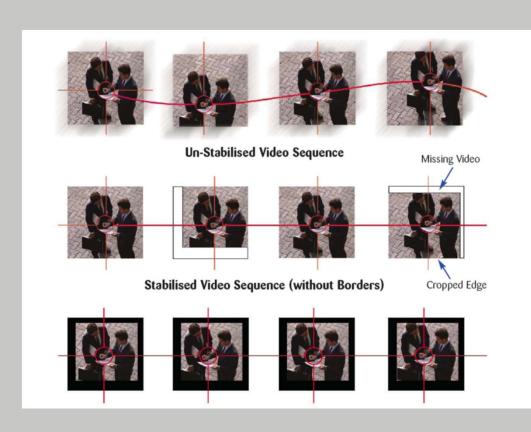


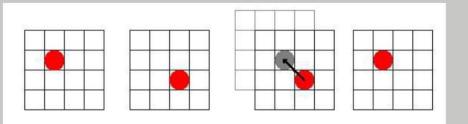
## 多帧短曝光

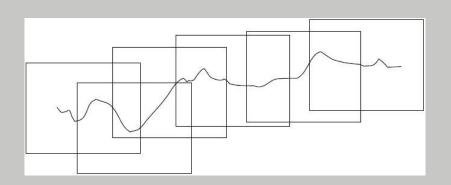


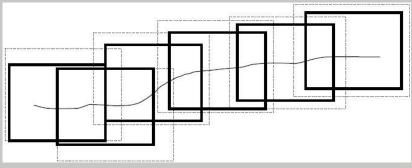


## 视频防抖











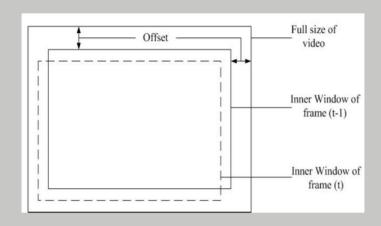






GMV (Global motion vector ) CMV (Compensating motion vector )

$$HMV(n) = GMV(n) - SMV(n)$$



#### 运动矢量分析方法

- (a) 灰度投影法
- (b) 块匹配法
- (c) 位平面匹配法
- (d) 特征点匹配法

•

$$I_{\Sigma}(x,y) = \sum_{i=0}^{i \le x} \sum_{j=0}^{j \le y} I(x,y)$$

$$D_i = (C_i - GMV_i + R_i)$$



#### 比较信号相似度的方法

1绝对平均误差函数

2互相关函数

3均方误差函数

4最大误差最小函数

5 绝对差之和SAD

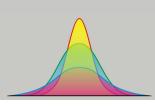
$$MAD(i,j) = \frac{1}{N^2} \sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} \left| I_k(m,n) - I_{k-1}(m+i,n+j) \right|$$

$$CCF(i,j) = \frac{\sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} I_k(m,n) I_{k-1}(m+i,n+j)}{\left[\sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} I_k(m,n)\right]^{1/2} \left[\sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} I_{k-1}(m+i,n+j)\right]^{1/2}}$$

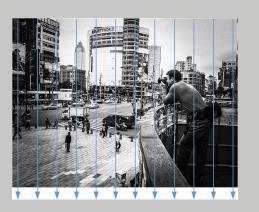
$$MSE(i, j) = \frac{1}{N} \sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} \sqrt{\left|I_k(m, n) - I_{k-1}(m, n)\right|^2}$$

$$MME(i, j) = \max \left| I_k(m, n) - I_{k-1}(m+i, n+j) \right|$$

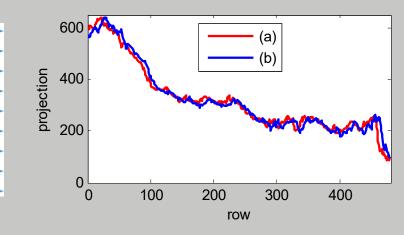
$$SAD(i,j) = \sum_{m=x}^{x+N-1} \sum_{n=y}^{y+N-1} \left| I_k(m,n) - I_{k-1}(m+i,n+j) \right|$$

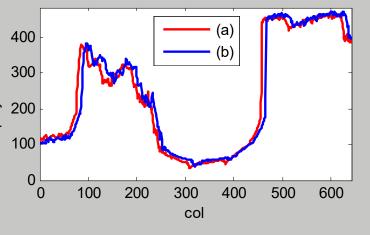


#### 灰度投影法



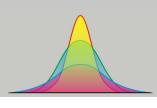




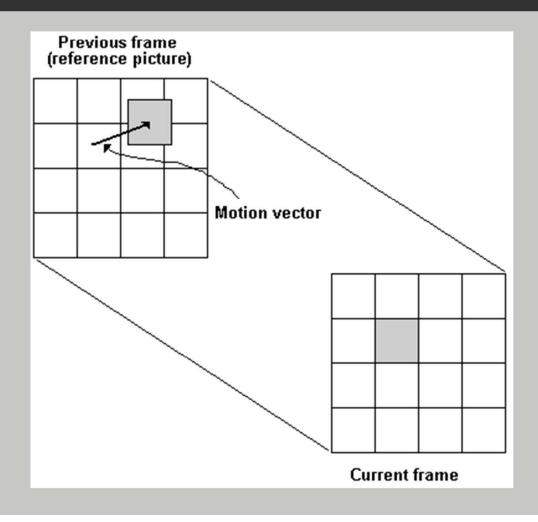


$$G_k(i) = \sum_{j=1}^{N} G_k(i, j)$$

$$G_k(j) = \sum_{j=1}^{M} G_k(i, j)$$

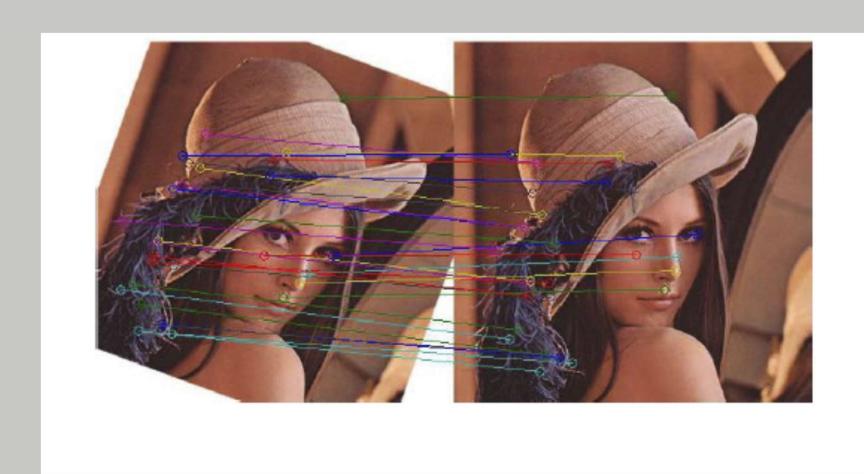


#### 块匹配法



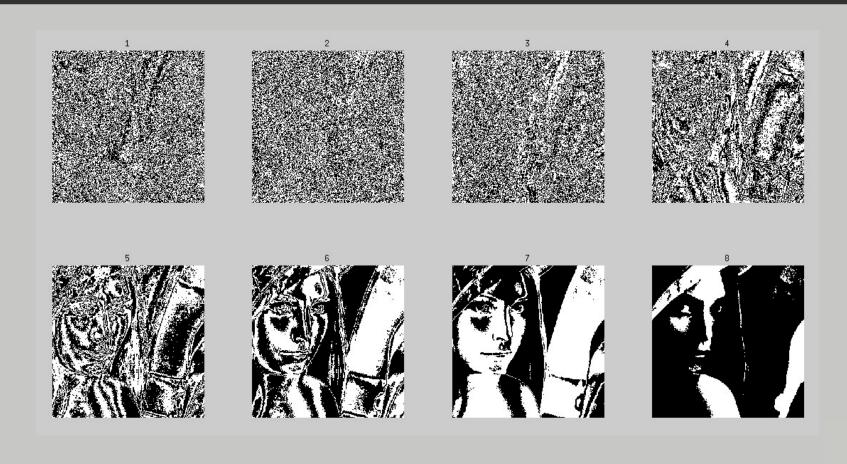


#### 特征点匹配

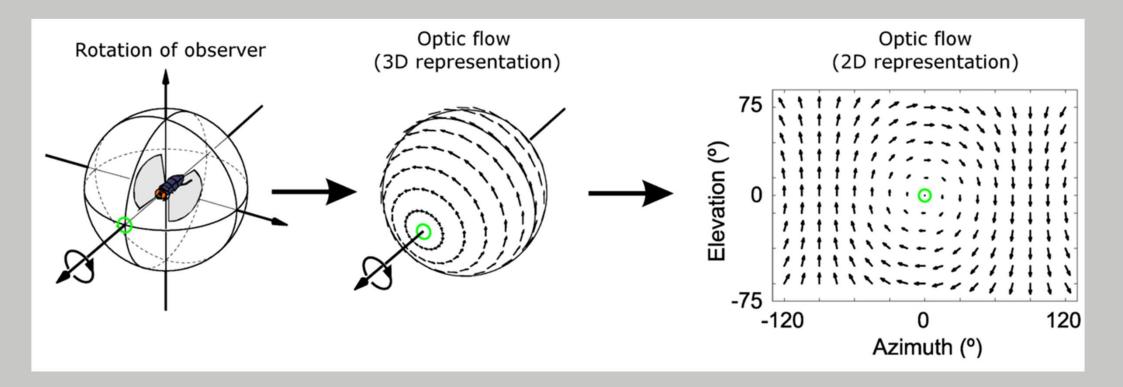




#### 位平面法

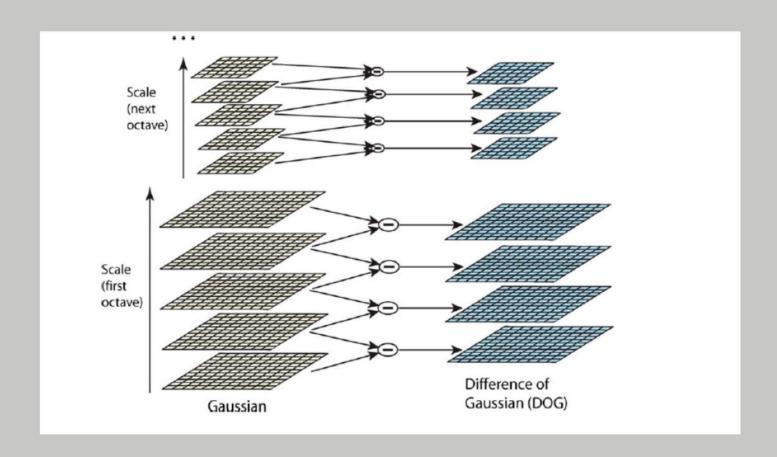


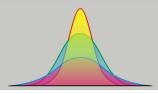
## 光流法





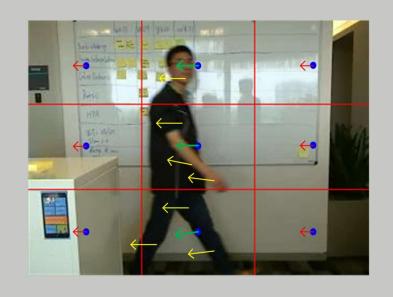
#### SIFT

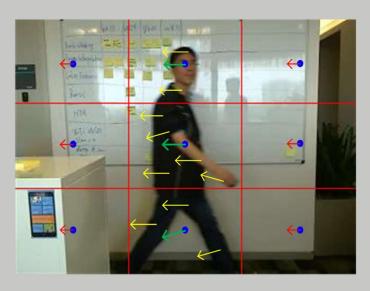


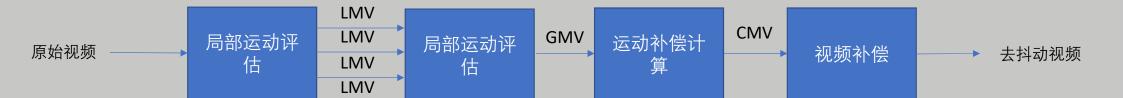




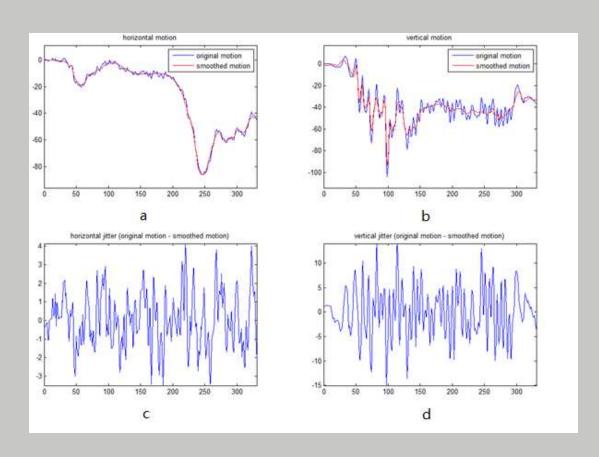
### 局部运动矢量和全局运动矢量







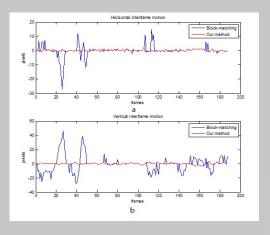
### 运动和抖动分离

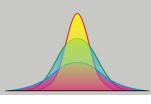


- 1滑动平滑滤波器
- 2 曲线拟合法
- 3卡尔曼滤波法
- 4 高斯核滤波法
- 5长特征路径的直接优化法

$$MTraj_{o}(t) = \sum_{i=1}^{t} GMV(i),$$

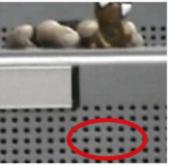
$$MTraj_{c}(t) = \left(\sum_{i=1}^{t} GMV(i)\right) - CMV(t),$$





#### 影响EIS系统的几个原因



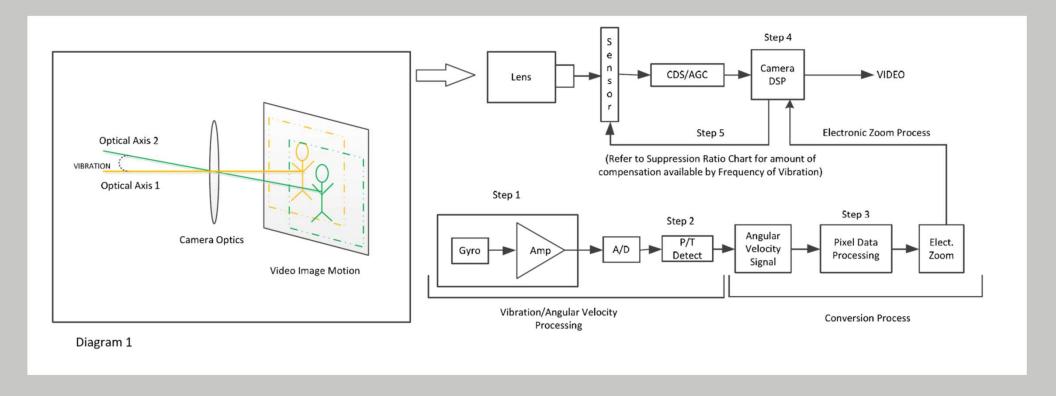




- 缺乏特征(Lack of Feature, LOF);
- 重复模式(Repeated Pattern, RP);
- 低信噪比(Low SNR, LowSNR);
- 存在运动物体(Moving Objects)。
- 透视角造成同一物体远近运动量不同;
- 光照突然变化,如闪光灯;
- 运动模糊(Motion Blur);
- 大面积阴影

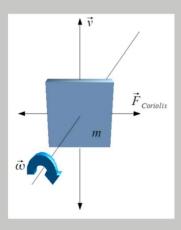


#### EIS use gyro

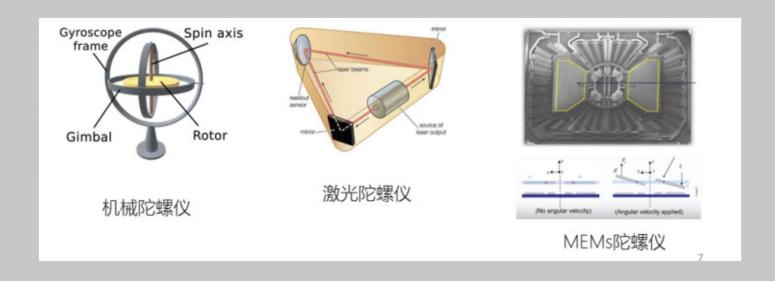




#### Gyro

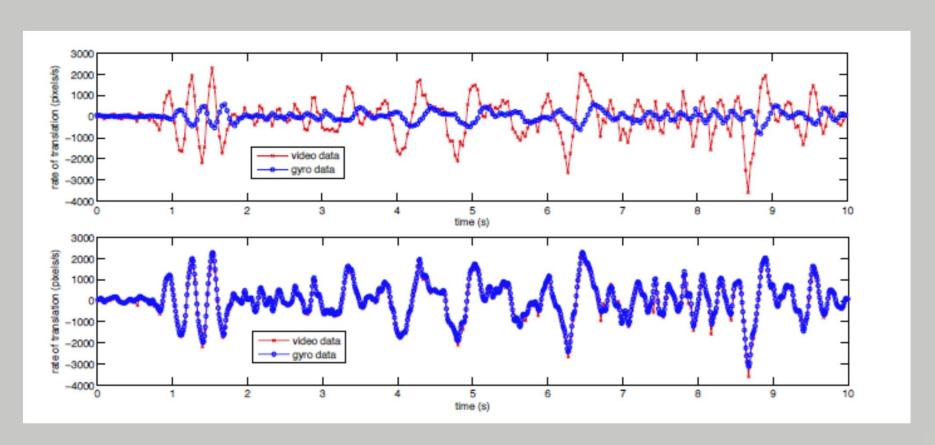


$$\vec{F}_{Coriolis} = -2 \, m(\vec{v} \times \vec{\omega})$$





## Gyro和图像匹配的问题

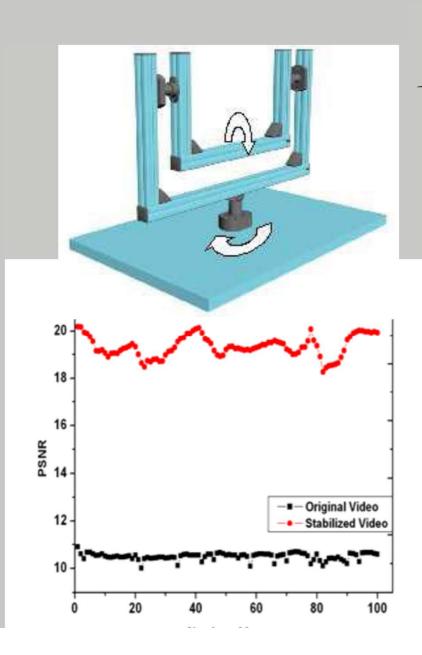




#### 防抖效果的评估

$$PSNR(I_t, I_{t+1}) = 10 \lg \frac{255^2}{MSE(I_t, I_{t+1})}$$

$$\begin{split} MSE(I_t, I_{t+1}) &= \\ &\frac{1}{M \times N} \sum_{m=1}^{M} \sum_{n=1}^{N} \left(I_t(m, n) - I_{t+1}(m, n)\right)^2 \end{split}$$



## THANKS

本课程由 Eric Zhang提供



#### 大话成像之 数字成像系统 32 讲

#### 内容目录

- 1. 数字成像系统介绍
- 2. CMOS image sensor基础
- 3. 光学基础
- 4. 颜色科学基础
- 5. ISP 信号处理基础
- 6. 3A概述
- 7. 黑电平与线性化
- 8. Green Imbalance
- 9. 坏点消除
- 10. Vignetting与Color shading
- 11. SNR 与Raw Denoise
- 12. Dynamic Range与Tone Mapping
- 13. MTF与Demosaic
- 14. 色彩空间与色彩重建
- 15. Color Correction Matrix与3D LUT
- 16. Gamma与对比度增强
- 17. Sharpening

- 18. Color Space Conversion
- 19. 空域去噪
- 20. 时域去噪
- 21. Color Aberrance Correction and Depurple
- 22. ISP 的统计信息
- 23. 自动曝光
- 24. 自动白平衡
- 25. 自动对焦
- 26. 闪光灯
- 27. HDR
- 28. Exif 和DNG
- 29. Encoder
- 30. 图像防抖
- 31. 图像质量评价工具与方法
- 32. 画质调优

