

Multihypothesis Motion Estimation for Video Coding

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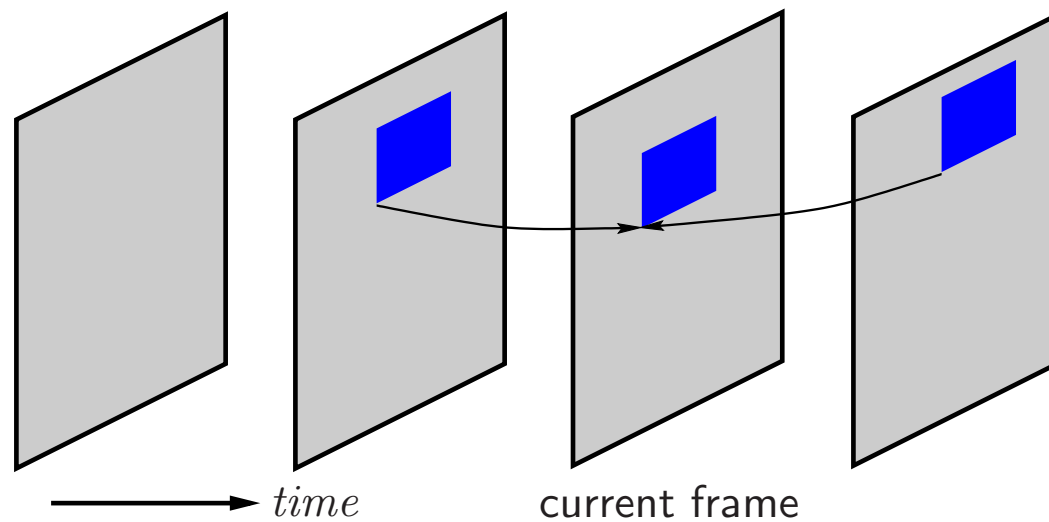
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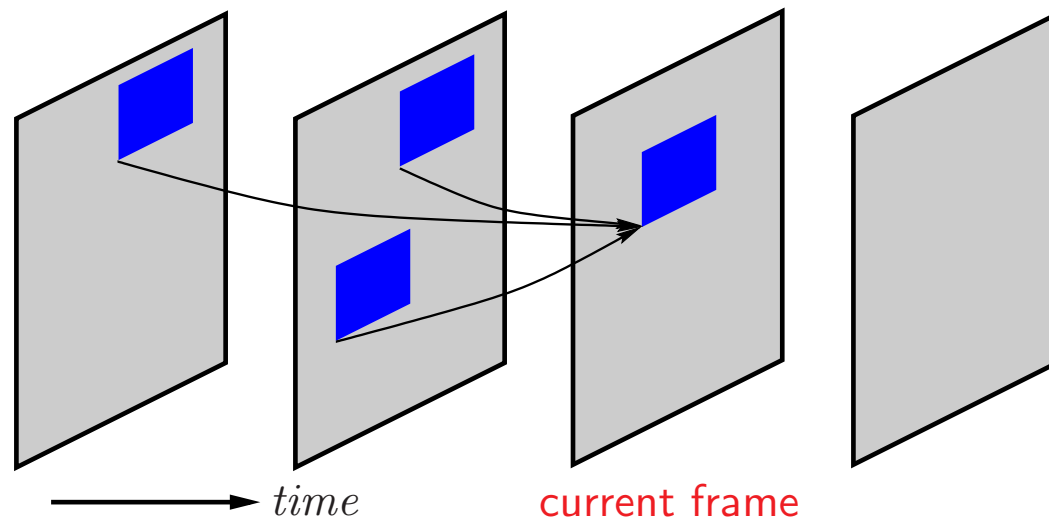
Bidirectional Prediction for B Pictures



- Joint estimation of forward and backward motion vectors [Wu and Gersho, 1994]

Multihypothesis Motion-Compensated Prediction

- Linear combination of multiple motion-compensated signals



- Joint estimation of multiple hypotheses [Flierl, Wiegand, and Girod, 1998]

This Talk ...

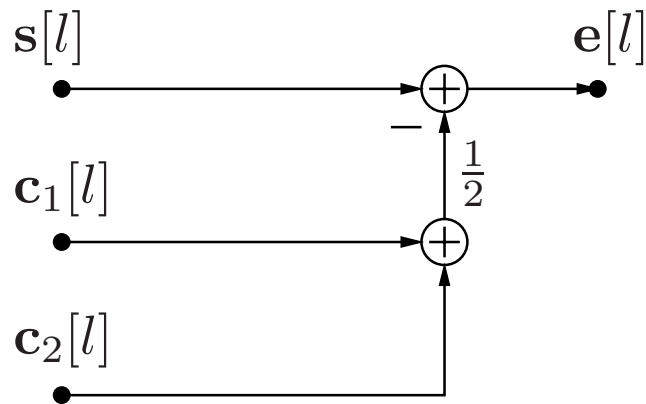
will extend an analytical model for multihypothesis motion-compensated prediction [Girod, 2000]

- Capture a property of jointly estimated motion-compensated signals
- Investigate the gains of optimal hypothesis sets.

Overview

- Model for multihypothesis motion compensation
- Modeling the joint displacement error PDF
- Optimal multihypothesis motion estimation
- Hypotheses with additive noise

Model for Multihypothesis Motion Compensation



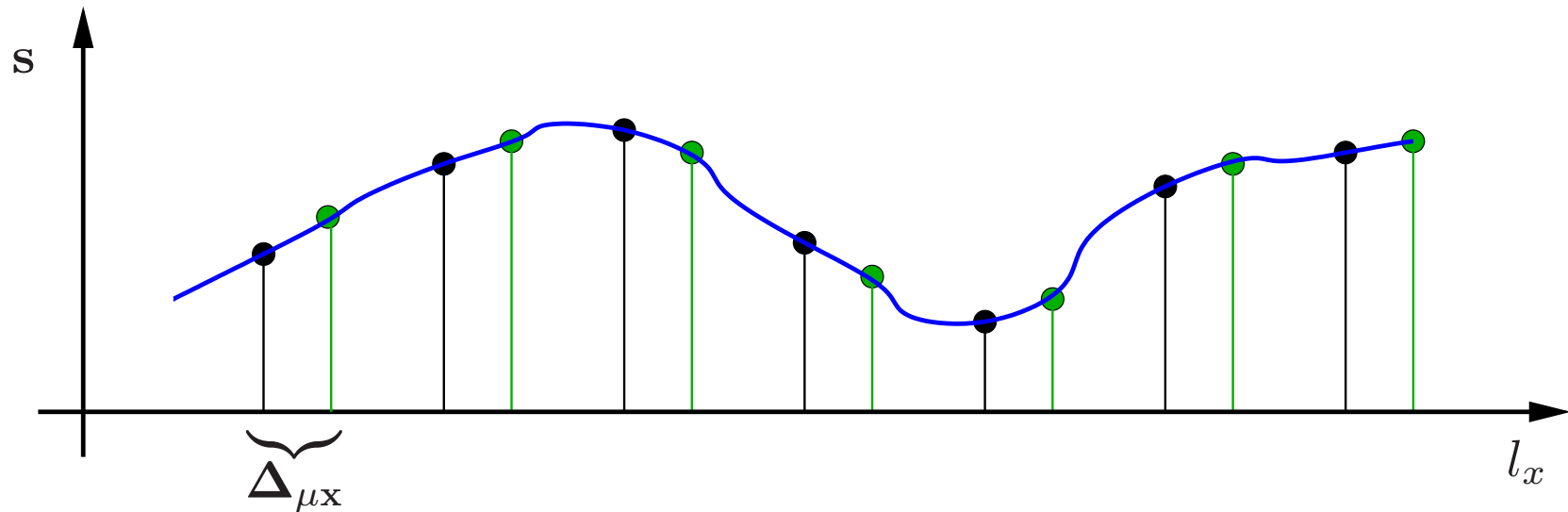
$s[l]$ current frame signal

$c_\mu[l]$ μ -th hypothesis

$e[l]$ prediction error

- All hypotheses c_μ are shifted versions of the current frame signal s
- Prediction error results from motion inaccuracy only
- Hypotheses are just averaged

Model for Multihypothesis Motion Compensation



- The shift is determined by the displacement error $(\Delta_{\mu x}, \Delta_{\mu y})$ of the μ -th hypothesis
- The ideal reconstruction of the band-limited signal $s[l]$ is shifted by the continuous valued displacement error

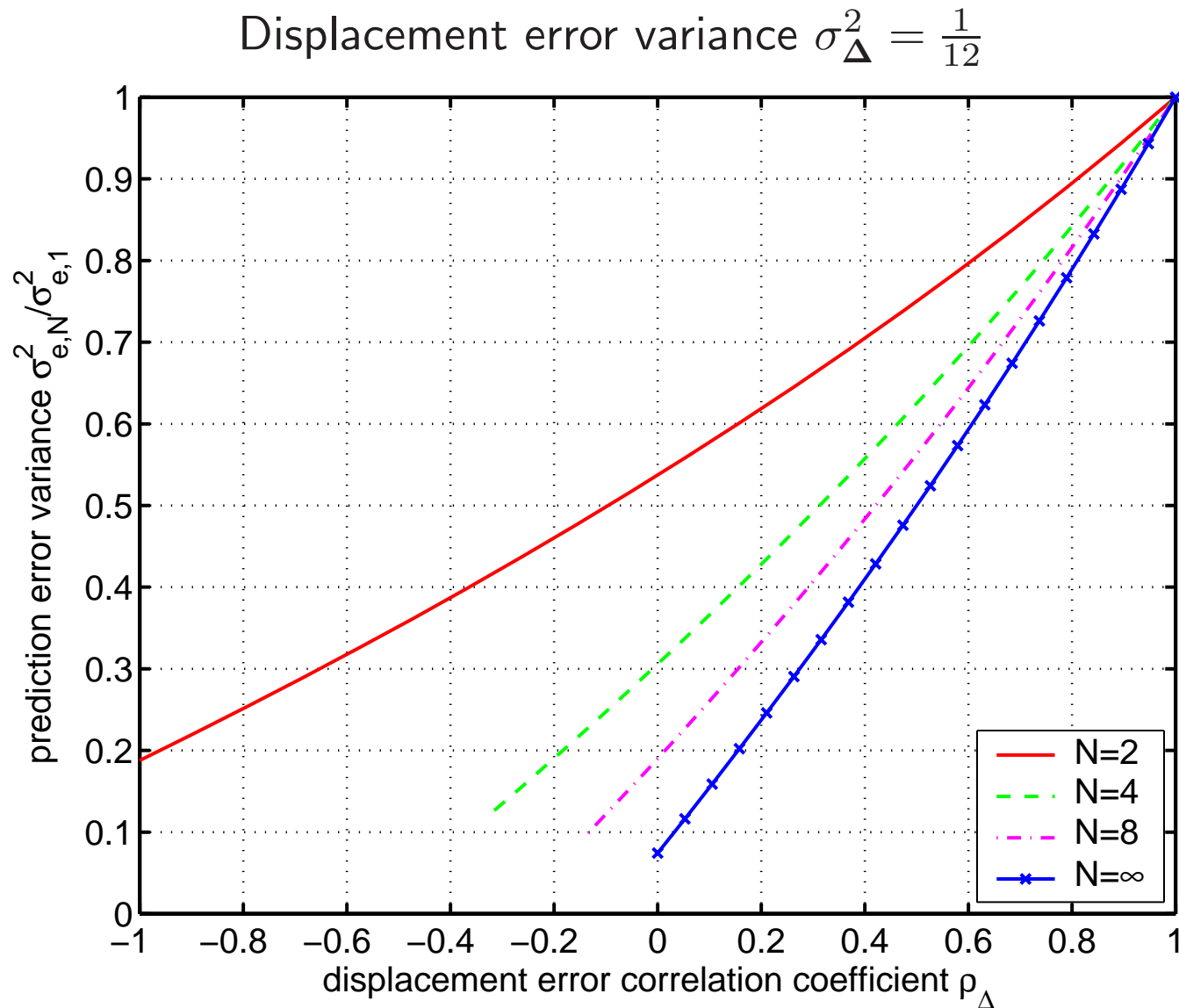
Modeling the Joint Displacement Error PDF

- 2-D stationary normal distribution with variance σ_{Δ}^2 and zero mean for each hypothesis
- x - and y -components are statistically independent
- Each displacement error pair is assumed to be **jointly Gaussian** with no preference among the N hypotheses
- Covariance matrix of a displacement error component:

$$C_{\Delta_x \Delta_x} = C_{\Delta_y \Delta_y} = \sigma_{\Delta}^2 \begin{pmatrix} 1 & \rho_{\Delta} & \cdots & \rho_{\Delta} \\ \rho_{\Delta} & 1 & \cdots & \rho_{\Delta} \\ \vdots & \vdots & \ddots & \vdots \\ \rho_{\Delta} & \rho_{\Delta} & \cdots & 1 \end{pmatrix}$$

- Covariance matrix is nonnegative definite: $\frac{1}{1-N} \leq \rho_{\Delta} \leq 1$

Prediction Error vs. Displacement Error Correlation



Decreasing displacement error correlation reduces prediction error variance

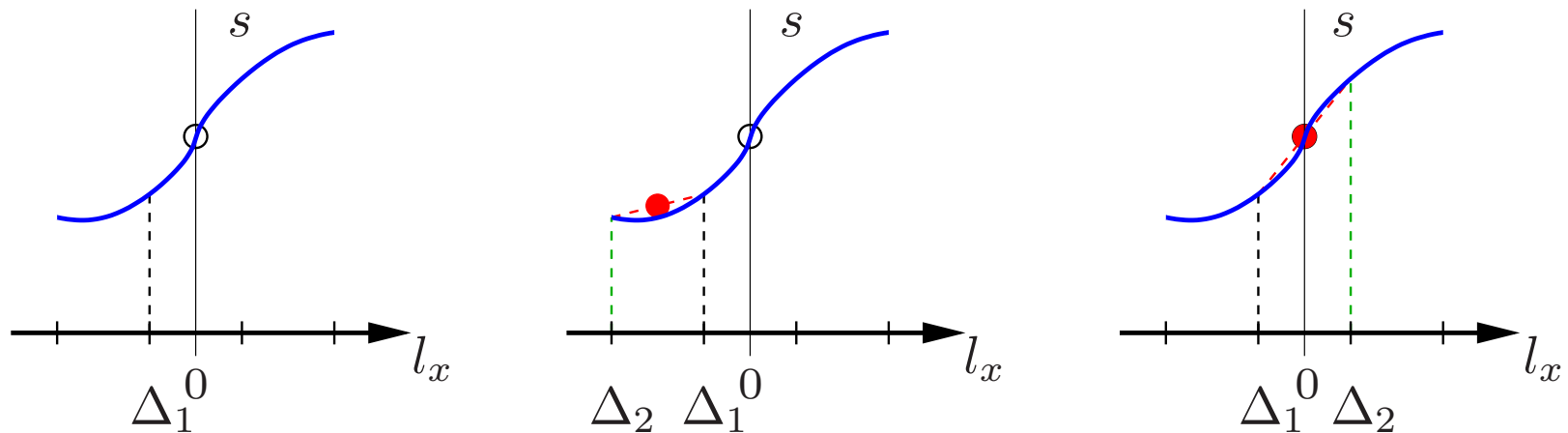
Optimal Multihypothesis Motion Estimation

- The **optimal multihypothesis motion estimator** in the MSE sense minimizes the prediction error variance.
- Consequently, the optimal estimator minimizes also the displacement error correlation coefficient:

$$\rho_{\Delta} = \frac{1}{1 - N} \quad \text{for } N = 2, 3, 4, \dots$$

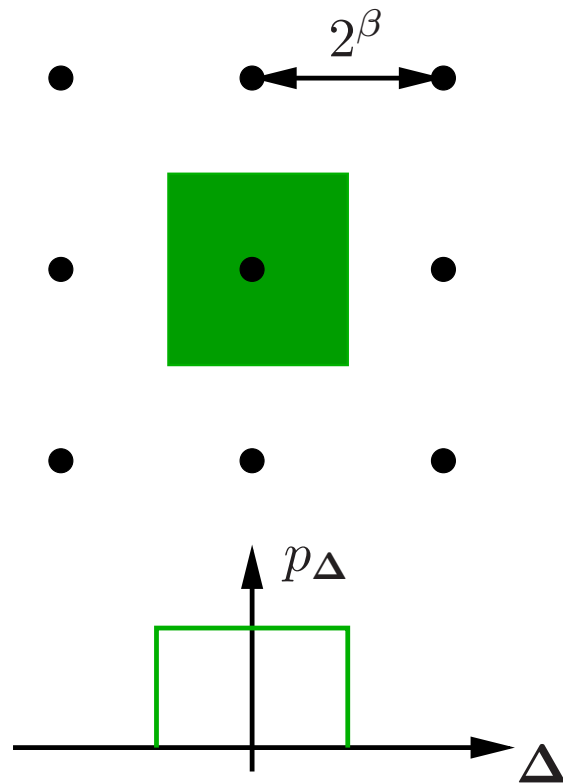
Maximally negatively correlated displacement errors

Maximally Negatively Correlated Displacement Errors



- Displacement error Δ_1 due to quantization
- How to select the second hypothesis?
- $\Delta_2 = -\Delta_1 \rightarrow \rho_{\Delta} = -1$

Displacement Inaccuracy



$\beta = 0$: integer-pel accuracy

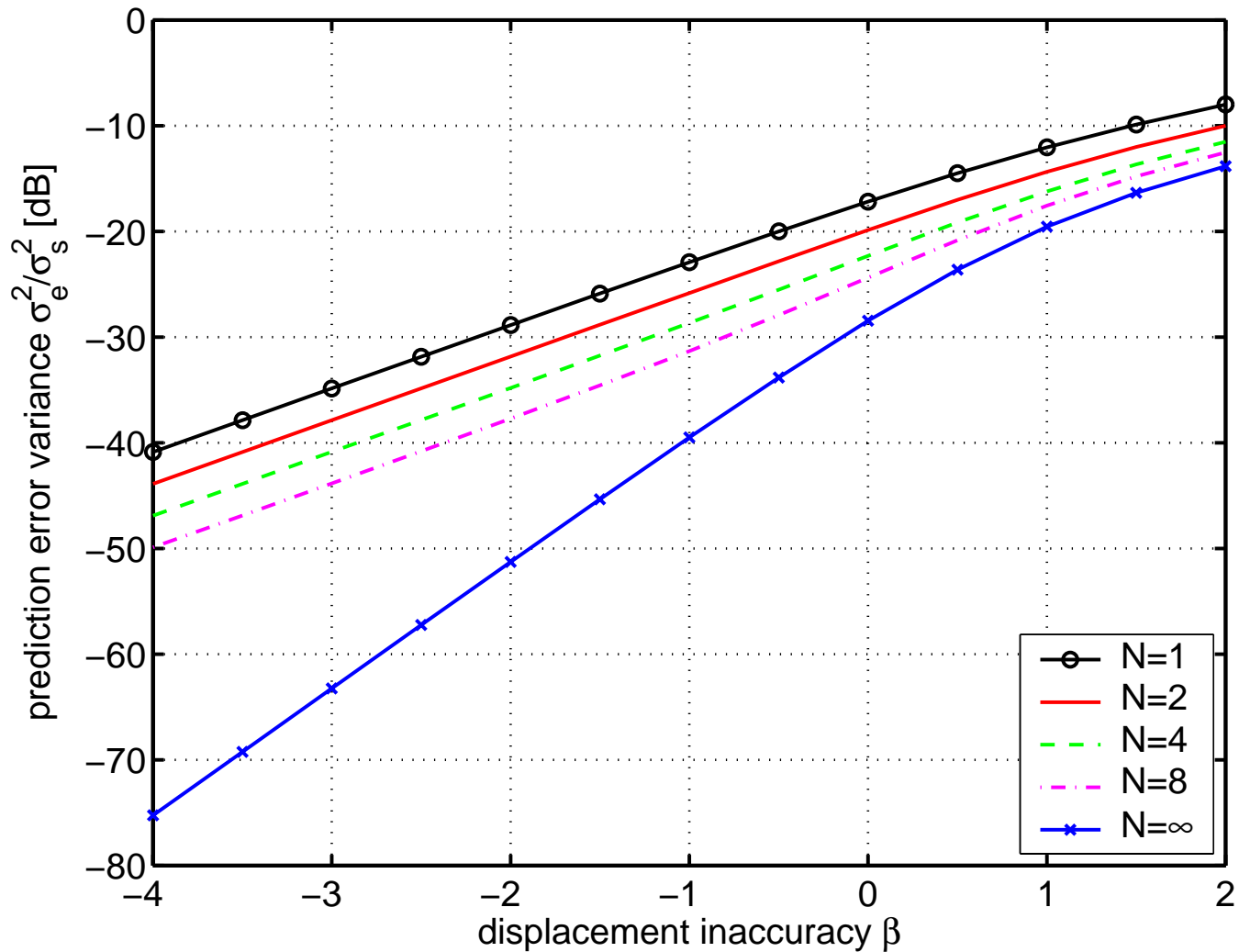
$\beta = -1$: half-pel accuracy

$\beta = -2$: quarter-pel accuracy

$$\sigma_\Delta^2 = \frac{2^{2\beta}}{12}$$

The displacement error is entirely due to rounding and is uniformly distributed.

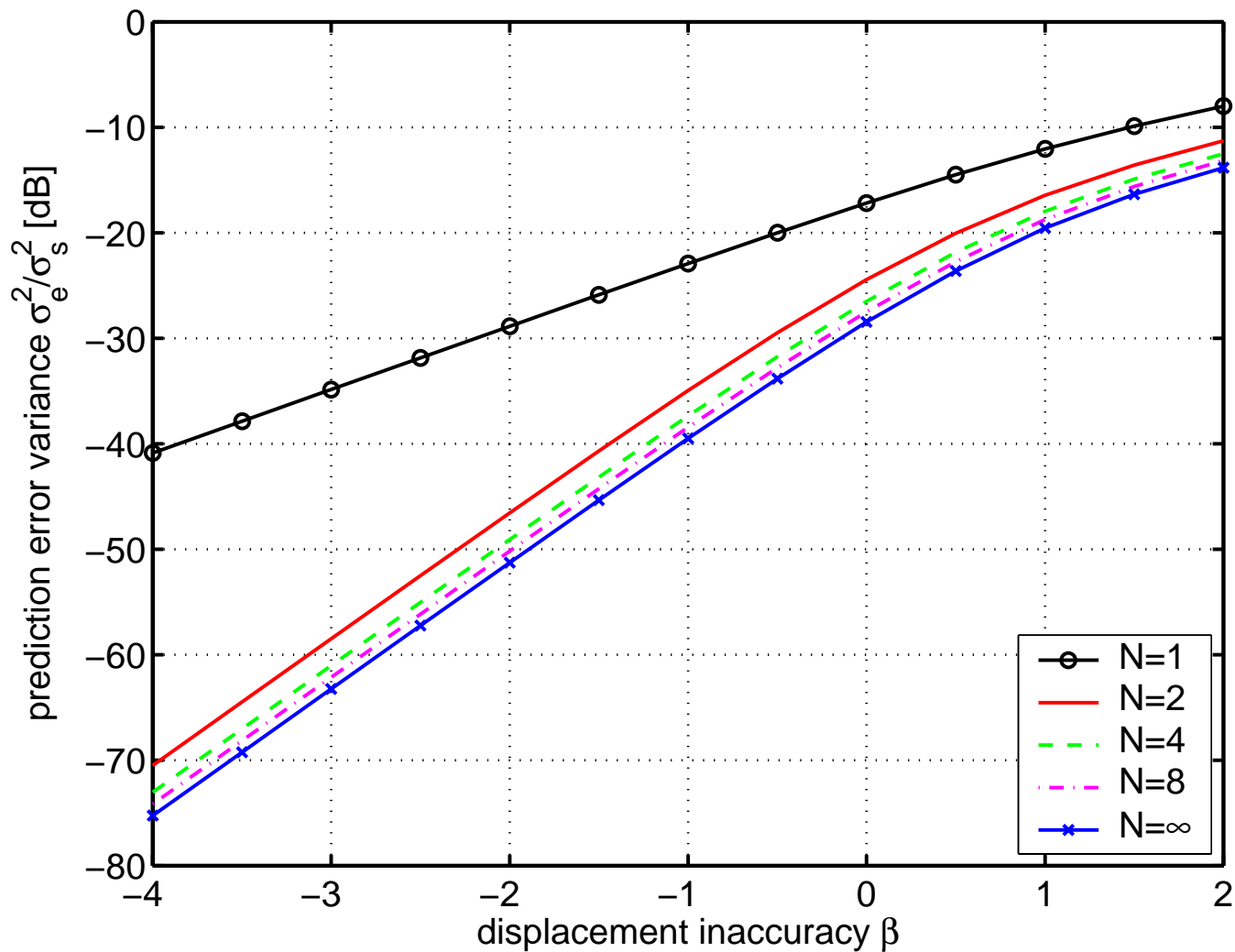
Multihypothesis Motion Estimation I



Uncorrelated displacement errors $\rho_{\Delta} = 0$

Slope of 12 dB per inaccuracy step for $N = \infty$

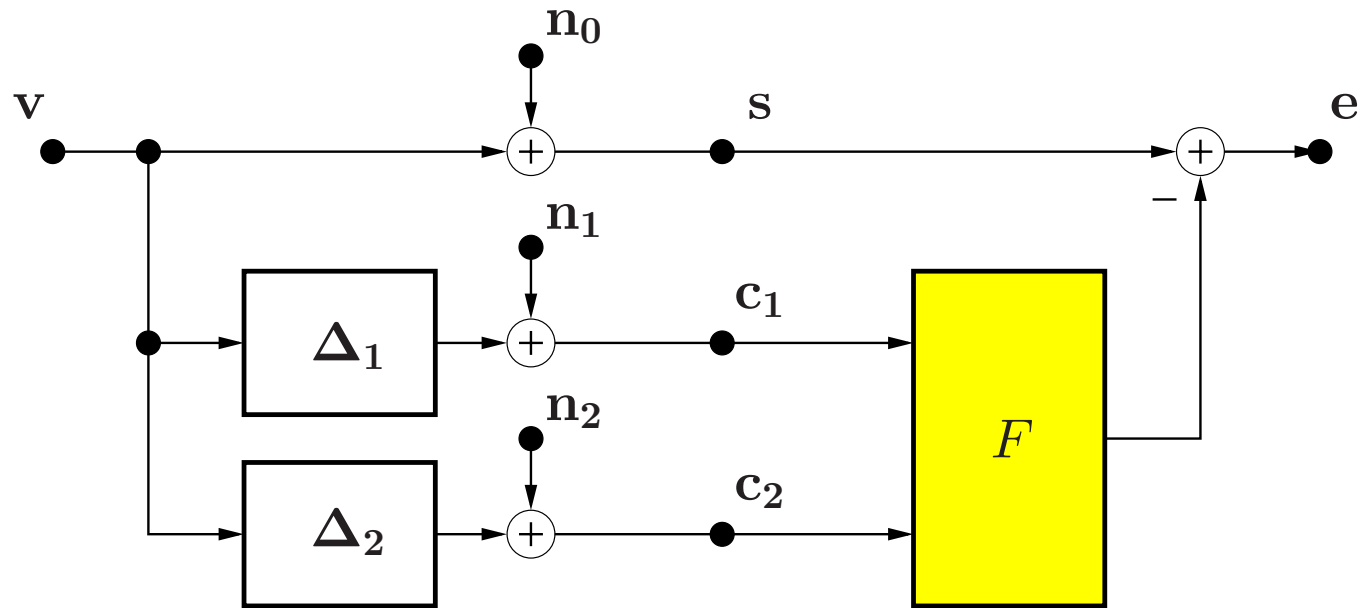
Multihypothesis Motion Estimation II



Optimized displacement error correlation $\rho_{\Delta} = \frac{1}{1-N}$

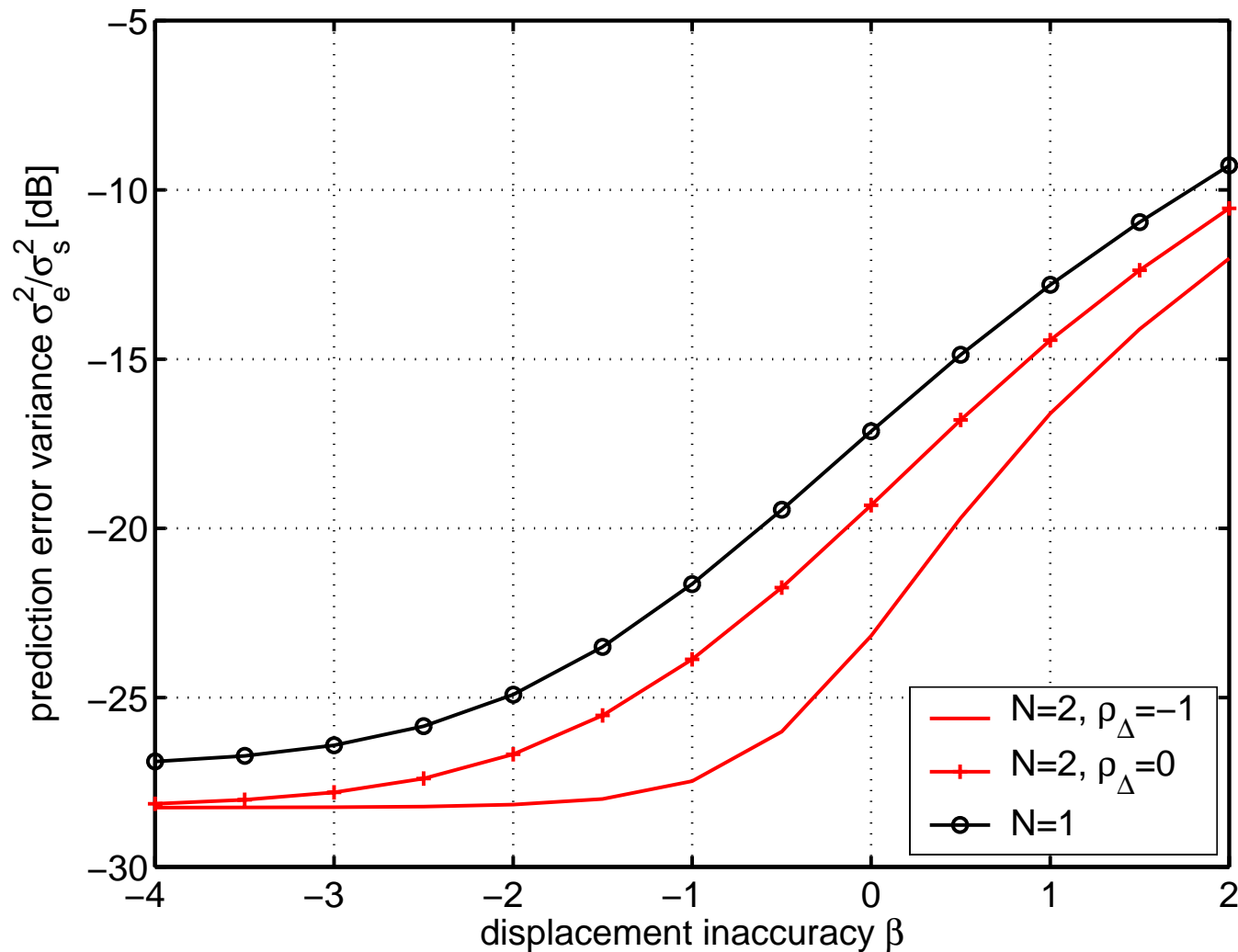
Slope of 12 dB per inaccuracy step is already reached for $N = 2$

Hypotheses with Additive Noise



- Current frame signal s originates from a “clean” video signal v
- Noise signals n_μ are mutually statistically independent

Hypotheses with Additive Noise



Band-limited frame signal, residual noise level $RNL = 10 \log_{10}(\sigma_n^2) = -30\text{dB}$

Summary and Conclusions

- We discussed the efficiency of multihypothesis motion compensation dependent on the estimated hypothesis set.
- Optimal multihypothesis motion estimation results in maximally negatively correlated displacement errors.
- In the case of “noisy” hypotheses, we obtain improved prediction performance for optimal multihypothesis motion estimation with the optimum Wiener filter.