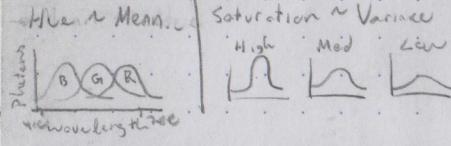


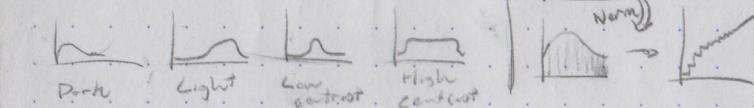
COLOR



- RGB: Easy for devices, not perceptual
- HSV: Hue, Sat., Value (Bright), intuitive
- L*a*b*: Perceptually uniform

Histogram Normalization

- Want linear cumulative contrast
- $S = T(r)$, T is cumulative hist.
- Map to y -axis

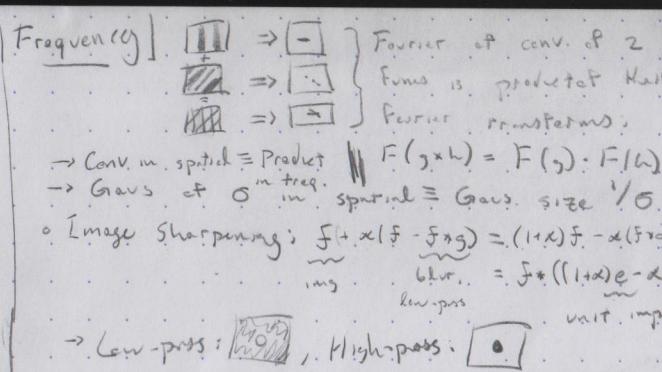


- Aliasing: Due to undersampling
 - Fix 1: Sample more; Twice per period
 - Fix 2: Remove high freq., less "wiggly"
 - ↳ Low-pass Filter

FILTERS:

- Linear: Blur/sharpen imgs, good for sand
 - ↳ Filter(f_{avg}) \equiv filter(f) \star filter(g)
 - ↳ Shift Invariant
- Cross-Corr.: $H \star F = \sum_{u=-n}^n \sum_{v=-n}^n h[u, v] f[i+u, j+v]$
- Convolution: $H \star F$; same but flipped $\xrightarrow{\text{flipped}}$
 - ↳ Flipped horizontally + vertically, thus commutative
 - ↳ Full: $\xrightarrow{\text{valid}}$, Same: $\xrightarrow{\text{valid}}$, Valid: $\xrightarrow{\text{valid}}$ + associative
- Gaussian: Low-pass filter, removes high freq.
 - ↳ Convolve twice w/ width σ \Rightarrow once w/ width $= \sqrt{2}\sigma$
- Edge: $M_x = \begin{bmatrix} 1 & 0 & -1 \end{bmatrix}$ gives vertical lines: $\xrightarrow{\text{edge}} \boxed{1 \ 0 \ -1}$
- Image Pyramids: Repeated filter \rightarrow subsample
 - Good for search at many scales
 - $4/3$ size of original img (maximally)
- Gaussian: Low-pass Images
- Laplacian: Sub-band images
 - $L_S(i, j) = \underbrace{G(i, j)}_{\text{Gauss of mask}} \cdot L_A(i, j) + (1 - G(i, j)) \cdot L_B(i, j)$

FREQUENCY



- Blending window: want smooth + no ghosting
 - Avoid seams: $w = \text{size of biggest feature}$
 - Avoid ghosting: $w = 2 \times \text{size of smallest feature}$
 - In Freq: Largest freq $\leq 2 \times$ smallest freq.

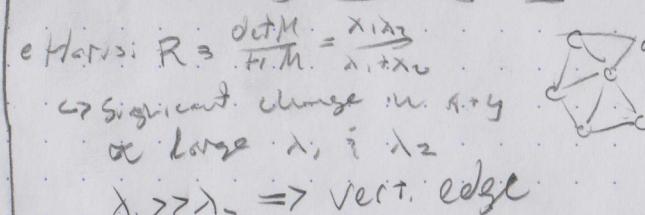
- JPEG: 8x8 Block S.ze
 - Larger \rightarrow nice smooth regions
 - Smaller \rightarrow Fosters, corr. between neighbors

TEMPLATE MATCHING

- 1) Zero-mean Filter: Fast, no great
- 2) SSD: Next fastest, sensitive to overall intensity
 - ↳ Fails w/ color changes
- 3) NCC: Slower, but invariant to local area contrast/intensity

RANSAC

DELAUNAY TRIG: MINIMIZES LARGE ANGLES



- A. NMS: Fixed # pts distributed evenly, sort by radius to next

- Feature Desc: Look at local patches, find most sim SSD(p_i, p_j) \leq thresh.

- Lowe's Trick: Look at these with only one nearest neighbor

TRANSFORMATIONS

- Linear: Origin, lines, parallel go to themselves
- Ret. [Ces. \rightarrow sm] \rightarrow Shear: $\begin{bmatrix} 1 & s_x \\ 0 & 1 \end{bmatrix} \rightarrow$ s_x

| | |
|---|---|
| • Scale: $\begin{bmatrix} s_x & 0 \\ 0 & s_y \end{bmatrix} \rightarrow$ | $\begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$ |
| • Rigid: Trans. + rot Ces | $\begin{bmatrix} \sqrt{2}/2 & \sqrt{2}/2 \\ \sqrt{2}/2 & -\sqrt{2}/2 \end{bmatrix} \rightarrow e$ |
| ↳ Ex. Flip (Def=3) | $\begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \rightarrow$ |
| • Similarity: Rigid+scale | $\begin{bmatrix} \sqrt{2}/2 & \sqrt{2}/2 \\ \sqrt{2}/2 & -\sqrt{2}/2 \end{bmatrix} \rightarrow e$ |

- Affine: Linear transform + translate
 - ↳ origin \neq origin
 - ↳ $\text{Def} = B$

Homography

- Projective: Affine + proj. wrap
 - origin \neq origin, parallel \neq \perp , ratio \neq ...
 - line = line
 - ↳ $\text{Def} = B$

RANSAC

Splines deg = defined by n+1 pts
 Catmull-Rom: $\frac{1}{6}(y_1 - y_0) + \frac{1}{2}(y_3 - y_2)$

Match derivative w/ neighbors then Hermite interp.

Cubic Hermite & Given P_0, P_1, P_2, P_3

Find cubic poly of form at 3D reflected

$h = \begin{bmatrix} P_0 \\ P_1 \\ P_2 \\ P_3 \end{bmatrix} = \begin{bmatrix} c & u & v & 1 \\ 1 & u & v & 0 \\ 0 & v & u & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix}$

$x = \begin{bmatrix} 2 & -2 & 1 & 1 \\ 3 & 3 & -2 & -1 \\ 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 1 \end{bmatrix} h \Rightarrow P(t) = (t^3, t^2, t, 1)^T x$

For $H_0(t) = -2t^3 - 3t^2 + 1$
 $H_1(t) = -2t^3 + 3t^2$
 $H_2(t) = t^3 - 2t^2 + t$
 $H_3(t) = t^3 - t^2$

Basis Functions for cubic poly

- Updated project (only conv pt effects two splines)
- Discontinues 2nd-ord derive at control pts

Casteljau $b^{(n)}(t) = \sum_{i=0}^n b_i^{(n)} B_i^{(n)}(t)$ (control pts)

$b'_i = \text{lerp}(b_i, b_{i+1}, t) = \binom{n}{i} t^i (1-t)^{n-i}$

$[s \ t] [s \ t \ 0] [s \ t \ 0 \ 1] [s \ t \ 0 \ 0 \ 0 \dots]$
 $p_{in} = s + t \quad S = 1 - t \quad \# \text{Interp. pts.} = \sum_{i=1}^{n-1} i$

Russian Roulette / Contour w.r.t. Per eye terminate expected depth

Geometric dist. \rightarrow scale value / per term point

$E[X_{\text{rec}}] = P_{\text{rec}} E[\frac{X}{P_{\text{rec}}}]$

Numbers $+ (1 - p_{\text{rec}}) E[0]$

Mesh Loop: $4 \times \# \text{ triangles}$

Catmull-Clark Subdivision:

1. Add vertices to centers of each Face
2. Add vertices to middle of each edge
3. Connect all new nodes

\rightarrow Non-quadrilateral \rightarrow extraordinary pt

- Meshes homeomorphic to spheres must have some extraordinary pt (node w/ 6+ degree)
- Edge Flips can improve (symmetry) degrees

For $H_0(t) = -2t^3 - 3t^2 + 1$
 $H_1(t) = -2t^3 + 3t^2$
 $H_2(t) = t^3 - 2t^2 + t$
 $H_3(t) = t^3 - t^2$

Basis Functions for cubic poly

Grass. lens Egn: $f^{-1} = \frac{z_1}{z_0} + \frac{z_2}{z_0}$

$C = \frac{(z_0 - z_1)}{z_1}$ opt. ht + f
 $A = \frac{z_1}{z_0}$ Blurry subject

Lens Eqn: $\frac{1}{f} = \frac{1}{z_0} + \frac{1}{z_1}$

Convex / Concave \rightarrow sensor

- Aperture: F32, 22, 16, 11, 8, 5.6, 4, 2.8, 2, 1.4
 \rightarrow F-stop / f-number \rightarrow blurry bg
- Shutter: View Time \rightarrow Exposure = Irradiance \times Time \times Irradiance Gain
- Gain: \rightarrow Amplification at sensor to digital values
- Decreasing F-stop \rightarrow increase FOV
- F-Number $N = f/D$ For Diameter of aperture, focal length
- Can't focus at objects closer than the long focal length
- $z_1 > z_0 \equiv$ Magnified, $z = 2f$
- $z_1 = z_0 \equiv$ 1:1 image

Manifold Properties

- Edge connects 2 faces
- Edge composed of 2 nodes
- Face = Ring of edges: nodes
- #F = #E + #V = 2
- All nodes of Face: All Edges around Node
- HE \times h = F \rightarrow HE;
- do { process(h \rightarrow vert); h = h \rightarrow next; } while(h != F \rightarrow HE);
- do { process(h \rightarrow edge); h = h \rightarrow next; } while(h != V \rightarrow HE);

Monte Carlo

Numerical integration w.r.t. area $\sim 1/N^{1/2}$ (close to 1/m)

white random sampling $\sim 1/\sqrt{N}$

$MCI: F_N = \frac{1}{N} \sum_{i=1}^N F(x_i)$

For $x_i \sim P(x)$ Unbiased PDF

$E[F_N] = \frac{1}{N} \sum E[\frac{F(x)}{P(x)}]$

Same \rightarrow OG int. $\int_0^1 F(x) dx$

$\text{Var}(F_N) = \frac{1}{N^2} \sum_{i=1}^N \text{Var}(Y_i)$

Norm: $I = \int_0^1 e^x dx \Rightarrow C = 2$

$E[x] = \frac{1}{2}$

$E[x^2] = \frac{1}{3}$

$E[x^3] = \frac{1}{4}$

$E[x^4] = \frac{1}{5}$

Rendering Eqs

$L_o(p, w_o) = L_o(p, w_o) + \int_{H_o} F_o(p, w_o) L_o(t(p, w_i), -w_i) dw_i$

$L_o(p, w_o) = L_o(p, w_o) + \int_{H_o} F_o(p, w_o) L_o(t(p, w_i), -w_i) dw_i$

$\int_{H_o} F_o(p, w) dw$ For Nat., $X_i \in [c, r]$ For $X_i = \text{sample}$

$\int_{H_o} F_o(p, w) dw \rightarrow \frac{F_o(p)}{\sin(\theta)} \cdot \pi \cdot \frac{1}{2}$

$P(w) = \frac{1}{\pi} \cos \theta$

$\int_{H_o} L_o(w) \cos \theta dw \rightarrow \frac{L_o}{N} \sum_{i=1}^N L(w_i)$

$E[p] \approx \frac{A'}{N} \sum_{i=1}^N L_o(p, w_i) \Pi(p \rightarrow p_i) \frac{\cos \theta_i \cos \theta'_i}{|p - p_i|^2}$

Sampling

$E(p) \approx \frac{A'}{N} \sum_{i=1}^N L_o(p, w_i) \Pi(p \rightarrow p_i) \frac{\cos \theta_i \cos \theta'_i}{|p - p_i|^2}$

$w = p - p'$

$\theta = \frac{\pi}{2} - \arctan \frac{w}{p}$

$\theta' = \frac{\pi}{2} - \arctan \frac{w}{p'}$

$\cos \theta = \frac{w \cdot p}{|w||p|}$

$\cos \theta' = \frac{w \cdot p'}{|w||p'|}$

$\int_{H_o} g(x, w) dw$

$\int_{H_o} g(x, w) dw = \frac{1}{N} \sum_{i=1}^N g(x, w_i)$

Frequency

- Depends on geo. + view transforms and texture coord. from
- Nyquist Thm: No aliasing from freq. less than Nyquist freq.
- Nyquist Freq = $\frac{1}{2} f_{\text{sampling}}$
- Nyquist Rate $\Rightarrow f_{\text{sampling}} > 2f_{\text{signal}}$
- Eg 6 fan blades, 120 FPS camera
fastest RRM? 10 rot/sec $\Rightarrow 120 > 2(6 \cdot \pi)$
- Low-pass Filter: Attenuate high freq.
 \hookrightarrow Ex Box II
- Supersampling: Avg. $n \times n$ samples per pixel; approx. 1-pixel box filter
 \hookrightarrow Samples higher freq. than downsample
- Increasing exposure (longer shutter time) introduces motion blur \hookrightarrow less aliasing

Transforms

Rotation CCW = $\begin{bmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{bmatrix}$

scale = $\begin{bmatrix} s_x & 0 \\ 0 & s_y \end{bmatrix}$ shear = $\begin{bmatrix} 1 & 0 \\ t \cdot \tan \phi & 1 \end{bmatrix}$

flip over y-axis $\hookrightarrow s_x = -1$

Perspective = $\begin{bmatrix} s_x & 0 & 0 \\ 0 & s_y & 0 \\ 0 & 0 & 1 \end{bmatrix}$

Affine $\Leftrightarrow \theta = g = h$
Linear + translation

Barycentric

$x = \frac{L_{BC}(x,y)}{L_{BC}(x_0,y_0)}$

If any $\{x, y, z\} < 0 \Rightarrow$ pt outside

$\Leftrightarrow x + y + z = 1 \Leftrightarrow$ pt on same plane

Ex: $(0, 3, 2), (0, 3, 2), (0, 3, 2)$ \Rightarrow C
 $(0, 3, 2), (0, 3, 2), (0, 3, 2)$ \Rightarrow B
 $(0, 3, 2), (0, 3, 2), (0, 3, 2)$ \Rightarrow A

Plane Int.: check if $x < 0$
 $t = (P - P_0) \cdot N / d \cdot N$

Sphere Int.:

$t = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}$

For $a = d \cdot d$, $b = 2(o - w) \cdot d$, $c = (o - c) \cdot (o - c) - R^2$

Consider real, positive roots

Vertex Processing
 \downarrow (vertex stream)
Triangle Processing
 \downarrow (triangle stream)
Rasterization
 \downarrow (frag. stream)
Fragment Processing
 \downarrow (shaded frag.)
Framebuffer calc
 \downarrow (display)

World Space: $V \leftarrow \begin{bmatrix} \text{view dir} \\ \text{eye pos} \\ \text{up} \end{bmatrix}$

Box Int.:

$t_{\min} = \max(\min\{t_x, t_y, t_z\})$
 $t_{\max} = \min(\max\{t_x, t_y, t_z\})$

$y \equiv \frac{\partial z}{\partial x} = -\frac{\partial x}{\partial z}$

Shading: Blinn-Phong: Per-pixel, local shading given view dir., surface norm/pos/light dir.

Diffuse: Light uniform surface, indep. view dir.
 $L_d = K_d (\frac{I}{r^2}) \max(0, \frac{n \cdot l}{d})$

Specular: Intensity \propto viewing dir.
 $L_s = K_s (\frac{I}{r^2}) \max(0, \frac{n \cdot h}{d})^p$

Ambient: Indep., const. shadow/color
 $L_a = K_a I_a$

Material Reflections:

- Reflections: Light incident on surface leaves on [l] w/o freq. shift
- Diffuse: Light uniform surface, indep. view dir.
- Specular: Intensity \propto viewing dir.
- Ambient: Light reflected into each outgoing dir. w/o freq. shift

BRDF (Bidirectional Reflectance Distribution Function): Models light reflected into each outgoing dir. w/o freq. shift

$F_r(w_i \rightarrow w_o) = \frac{\partial L_r(w_o)}{\partial E_i(w_i)} = \frac{\partial L_r(w_o)}{L_i(w_i) \cos \theta_i dw_i}$

Differential increasing irradiance

Texture Filtering: Bilinear: Interpolate area filter = $\int_{w_i}^{w_o} p(t) dt$

Trilinear: Linear interp. between two screen coords \Rightarrow $\frac{w_o - w_i}{w_o - w_i} \cdot \text{Bilin}(w_i, w_o) + \text{Bilin}(w_o, w_i)$

Anisotropic: Anisotropic filtering

Inverse Sampling: $\text{Ex: } P_2(x) = 2 \exp(-2x)$

Sample ξ via F^{-1} : $F_2(x) = \int_0^x p(t) dt \Rightarrow -2F^{-1}(x) = -\log(1-x)$

Solve for $F^{-1}(\xi) = x$: $\Rightarrow 2 \left[\frac{1}{2} \exp(-2x) \right]_0^x = 1 - \exp(-2x)$

or choose $x = \xi$; s.t. $F^{-1}(\xi) \leq F_1$ via BS.

Rescale PDF to sum to 1

$1 = \int_{w_i}^{w_o} c \cdot p(w) = \int_{w_i}^{w_o} c \cdot x^2 = \frac{c x^3}{3} \Big|_{w_i}^{w_o} \Rightarrow c = \frac{3}{8}$

$\Rightarrow x = 1 - \exp(-2F^{-1}(\xi)) \Rightarrow \text{use } \frac{3}{8} \text{ of } p(x)$

In: CDF calc

$F^{-1}(x) = -\log(1-x)/2$

Ex: Cosine

$\Rightarrow \cos^2 \theta / \pi \text{ const}$

Depth of Field: $= 2x^2 NC / f^2$

F-number: circle of conf. \downarrow
dist. to subject \downarrow

Physics / $F = \Sigma m_i a_i$; $F_{\text{ext}} = -F_{\text{int}}$

Spring: $F_{\text{ext}} = k_s \frac{\theta - \theta_0}{l(l - l_0)} (\theta - \theta_0)$

Spring: $F_x = -k_s ((\theta - \theta_0) \cdot \frac{\theta - \theta_0}{l(l - l_0)}) \frac{\theta - \theta_0}{l(l - l_0)}$

↳ Different resolution of meshed cause diff spring behavior

Particles: $F_g = G \frac{m_1 m_2}{r^2}$

Numerical Methods

- Explicit
- Euler's: $x_{\text{next}} = x_t + \Delta t \dot{x}_t$
- $\dot{x}_{\text{next}} = \dot{x}_t + \Delta t \ddot{x}_t$
- Error accumulates
- Diverges quickly, proportional to Δt

Avg. Euler: Add $\frac{(\Delta t)^2}{2} \ddot{x}_t$ to x_{next}

can be made uncond. stable

Good term of Taylor Expansion

Implicit E.: $x_{\text{next}} = x_t + \Delta t \dot{x}_{\text{next}}$

Verlet: Constrains pos/velocity, dissipating energy \Rightarrow stabilizing

Signal-to-Noise-Ratio $\equiv S/N \sim \text{SNR}$

$\approx \text{Number of photons} (N_p) = 20 \log_{10} \left(\frac{N_p}{\sigma^2} \right)$

• Ex: $10^{11} \rightarrow 20^{11}$ improvement if $20 \log_{10} (20^{11}) - \log_{10} (10^{11}) = +6 \text{ dB}$

• Model photon arrivals as Poisson process: $\sigma = \sqrt{N_p}$

[If 2 events occur in time int. τ , the Probability n events occur instead $\rightarrow P(n|\tau) = \frac{e^{-\lambda}\lambda^n}{n!}$]

• Shot noise: $\text{SNR} \sim \frac{N_p}{\sigma^2} = \frac{N_p}{N_p} = \sqrt{N_p}$

↳ Fundamental noise: # photons

Ex: $2^{11} \text{ photons} \approx 10^{11} \text{ photons} \approx 3.5 \text{ dB}$

$\text{SNR} \approx 2^{11} \text{ photons} \approx 5.2 \cdot 3.5 \text{ dB}$

Animation

- Forward Kinematics: Ex. Animator determines angle, computer determines position
- ↳ Animation described with $\Theta(t)$

- Inverse Kinematics: Given end pts, find intermediary angles
- ↳ Hard! Many feasible solns

Superposition (wave)

Tristimulus Theory of Color:

Any color composed of 3 basis colors as summation of 3, or sum & 2 and subtract other

↳ Color vision is roughly 3

↳ S/M/L-cone cells for B/G/R each have different response for different wavelengths

- S best captures short wavelength resp.
- L most " ", high " "

↳ Metamers: Two different spectra (iso-dim signal) that map to same (S,M,L)-response; crucial to color reproduction

Color Sensors

- Photoelectric effect: Light's electromagnetic radiation causes emission of electrons from surface it hits; leaving "electron hole", acting as signal for camera sensors.
- ↳ Quantum efficiency: $QE = \frac{\text{# electrons}}{\text{# photons}}$
- Not all photons produce electron
- Human vs. ~5% smartphone cam. ~60%
- COLOR Sensors measure green most common as Human Vs. most sensitive to green spectrum (given by luminosity filtering work)
- ↳ Most difficult to color in the 2/3 of unknown information
- ↳ Can also be applied to HDR to interpolate images of various exposures
- Pixel Fill Factor: % sensor area that integrates incoming light
- ↳ Optimizes w/pixel correlation
- ↳ Optical cross talk also improved, leading to less washed out img; metamerics back-side illumination (BSI)

Color Def.: Visual experience/sense arising from seeing light at varying spectral distributions

Spectral Power Dist.: Amount of light present at each wavelength [watt/nm]

↳ Very across lightbulb types

Grammars:

- 1) sRGB / Apple P3: For displays
- 2) CIE: $\text{L}^*\text{a}^*\text{b}^*$ basis that
 - Matching Fctns strictly positive
 - $\text{Y} \approx \text{luminance}$, brightness about color
 - $= \int \text{E}(\lambda) V(\lambda) d\lambda$
 - radiance visual luminance
 - perceived brightness
- Chromaticity
 $x = \frac{X}{X+Y+Z}, y = \frac{Y}{X+Y+Z}, z = \frac{Z}{X+Y+Z}$
 - Typically standardize $x+y+z=1$, usually (x,y,z)
 - White at $(x,y) = (1/3, 1/3)$, saturation increases at colors

Color Spaces:

- Hue-Saturation-Value:
 - H : "Hue", dominant wavelength
 - S : "Saturation", purity
 - V : "brightness", luminance
- L*a*b: Perceptually Uniform
 - Defined by CIE basis, non-linear mapping
 - Formulas for hue/chroma/lightness
 - $l_2 - l_1 \approx \text{difference between colors, perceptually}$
- 3) Read Noise: Thermal noise in readout circuitry
- 4) Avg. Frames $\rightarrow \text{SNR} + \sqrt{\# \text{frames}}$ (neglecting read noise); can also downsize the

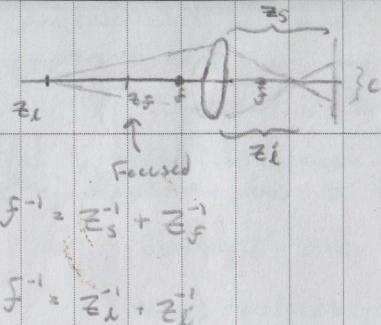
Noise Sources:

- Dark current: Electrons discharged due to thermal noise
- Includes shot noise, random thermal
- Electron Leaks: non-photocurrent sources, charges over time

JPEG Exploits Human Visual System
Low-Freq. content predominant in images of real-world

Our Vision sys. is:
1) less sensitive to chromaticity than lum.
2) less sensitive to high-freq. errors

Encode w/ Y'CbCr; ~ like L*a*b*
↳ Luma (lightness)/ Blue-Yellow/ Red-green
↳ Downsample chrom channels; for each we take 8x8 luma patches;
compute DCT
Quantize (prioritizing low-freq.)
Reorder + Huffman encode



VR

3D Visual Cues:

- Stereo: diff perspective views in L/R eyes; send 2 diff imgs

- Parallax (user motion): diff views as moving user head tracking coupled to perspective rendering

- Eyepiece Lens: Creates wide FoV while placing focal plane 'close to ∞'
↳ Tricks eye into more relaxed state

- Accommodation: Changing in optical power at lens (eye) to focus at diff distances

- Vergence: Rotation of eye in its socket to ensure projection of image centered on retina

- Convergence: Depth cues differ

- Eyes accommodate to far distance to (ensure img on screen's focused)

- Converge in attempt to fuse stereoscopic imgs of object up close

- ↳ Could be avoided w/lightfield display

- Fovested Rendering: Track user's gaze and lower resolution further away from gazing pt

- Planar projection distorts high FoV, solved w/lens-matched shadowing to render four quadrants/plane

- Judder: Eye moving to track moving obj. Img lags eye motion, simulating strobing effect

Spectrometer: Determine emission spectra of R/G/B

- Turn on just R pixels.
- Measure power at every wavelength
- Obtain Sp, repeat

Monochromator: Determine color matching Fets at display

- Color match displays w/single wavelength light
- Repeat for all visible wavelengths giving F/G/B (row vectors repr. color match fets)

Reprojection:

- Decouple high-res (slow) rendering at frames from fast re-projection before displaying

- Homing uses then-current head-tracking (possibly stale at render time)

- Reproj needs img + depth maps possibly motion derivatives to warp to very latest head-track data

Light-Field Camera:

4D light fields capture radiance along each ray